Customer Loyalty through Improved Customer Service: A Case Study of Biman Bangladesh Airlines Limited

By

Muhammed Tamzid Al Arafat



Department of International Business

Faculty of Business Studies

University of Dhaka

Dhaka-1000, Bangladesh

A dissertation submitted to the Department of International Business, Faculty of Business Studies in partial fulfillment of the curriculum of Doctor of Business Administration under the University of Dhaka

Dhaka University Institutional Repository



Customer Loyalty through Improved Customer Service: A Case Study of Biman Bangladesh Airlines Limited

By

Muhammed Tamzid Al Arafat

DBA Registration Number: 19/2016-2017
Re-registration Number and Session-05/2022-2023
Department of International Business, Faculty of Business Studies
University of Dhaka
Dhaka-1000, Bangladesh

December 2025

Under the Supervision of

Prof. Dr. S.M. Mahfuzur Rahman

Department of International Business, Faculty of Business Studies
University of Dhaka
Dhaka-1000, Bangladesh

A dissertation submitted to the Department of International Business, Faculty of Business Studies in partial fulfillment of the curriculum of Doctor of Business Administration under the University of Dhaka

Dhaka University Institutional Repository

Attestation on Plagiarism and Other Forms of Dishonesty

I, Muhammed Tamzid Al Arafat, DBA student of the Department of International Business, Faculty of Business Studies, University of Dhaka, Dhaka-1000, Bangladesh, approved title reference number Reg:/Shikhha-1/64226-C 2023 with registration number 19/2016-2017, Re-registration Number and Session-05/2022-2023, hereby solemnly attest that the paper titled:

"**Customer Loyalty through Improved Customer Service: A Case Study of Biman Bangladesh Airlines Limited**"

is my original work and has been prepared in accordance with academic integrity and ethical research standards. I affirm that:

a. I have properly acknowledged and cited all sources used in this paper, including but not limited to direct quotations, paraphrased material, ideas, and data.
b. This paper contains no instances of plagiarism, including but not limited to copying text, data, or ideas from any source without proper attribution.
c. I have not engaged in any other form of academic dishonesty, such as fabrication, falsification, or unauthorized collaboration, in the preparation of this paper.
d. This paper has not been submitted, in whole or in part, for any other academic assessment or purpose, either at the University of Dhaka or any other institution.

I understand that any violation of this attestation may result in serious academic penalties, as determined by the University of Dhaka.



Muhammed Tamzid Al Arafat
DBA Researcher
Department of International Business
Faculty of Business Studies
University of Dhaka
Dhaka-1000, Bangladesh

Date: *24* December 2025

Dhaka University Institutional Repository

পিএইচ.ডি./ডি.বি.এ/এম.ফিল.

(থিসিসে Plagiarism নেই মর্মে প্রত্যয়নপত্র)

গবেষকের নাম (ক) বাংলায় : মুহাম্মদ তামজিদ আল আরাফাত।

(খ) ইংরেজীতে : Muhammad Tamzid Al Arafat

বিভাগ/ইনস্টিটিউট: ইন্টারন্যাশনাল বিজনেস বিভাগ, ফ্যাকাল্টি অব বিজনেস স্টাডিজ ।

থিসিসের শিরোনাম: "Customer Loyalty through Improved Customer Service: A Case Study of Biman Bangladesh Airlines Limited"

তত্ত্বাবধায়কের নাম: অধ্যাপক ড. এস. এম. মাহফুজুর রহমান।

যুগ্ম-তত্ত্বধায়কের নামঃ (১) প্রযোজ্য নহে

থিসিসে Plagiarism (অন্যের লেখা নিজের বলে চালানো) নেই মর্মে সংশ্লিষ্ট অনুষদের ডিন মহোদয়ের/গ্রন্থাগারিক মহোদয়ের ঢাকা বিশ্ববিদ্যালয়ের প্রত্যয়নপত্র:

The similarity index of this thesis is 16%, ~~and~~ less than acceptable level of 20%. And hence this thesis can be distributed for evaluation.

তারিখ 28/12/2025

ডিন/গ্রন্থাগারিক 28/12/2025

(স্বাক্ষর ও সীলমোহর)

Dean (Acting)
Faculty of Business Studies
University of Dhaka.

বি.দ্র. থিসিসে Plagiarism (অন্যের লেখা নিজের বলে চালানো) নেই মর্মে বিভাগ সমূহের গবেষকদেরকে সংশ্লিষ্ট অনসুষদের ডিন মহোদয়ের নিকট থেকে এবং ইনস্টিটিউট সমূহের গবেষকদেরকে ঢাকা বিশ্ববিদ্যালয়ের গ্রন্থাগারিক মহোদয়ের নিকট থেকে প্রত্যয়নপত্র সংগ্রহ করে থিসিসের সাথে জমা দিতে হবে।

Dhaka University Institutional Repository

Certification

This is to certify that the dissertation titled "**Customer Loyalty through Improved Customer Service: A Case Study of Biman Bangladesh Airlines Limited**" submitted by Muhammed Tamzid Al Arafat, DBA student of the Department of International Business, Faculty of Business Studies, University of Dhaka with Registration Number 19/2016-2017 and Re-registration Number and Session-05/2022-2023 for the fulfillment of the requirements for the Degree of Doctor of Business Administration (DBA) is a Bonafide outcome of research work carried out by him under my supervision and guidance. The research provides valuable insights into the relationship between improved customer service and loyalty within the context of the aviation industry in Bangladesh, and identifies practical implications for Biman Bangladesh Airlines and similar organizations seeking to enhance customer relationships.

I further certify that, to the best of my knowledge:

- The work is original and has not been submitted elsewhere for the award of any degree or diploma.
- The research has been conducted according to established academic standards and ethical guidelines.
- All sources used in this dissertation have been properly acknowledged and cited.

Dr. S.M. Mahfuzur Rahman
Professor
Department of International Business,
Faculty of Business Studies
University of Dhaka
Dhaka-1000, Bangladesh

Date: 24 December 2025

Dhaka University Institutional Repository

Copyright Statement

© 2023 Muhammed Tamzid Al Arafat. All rights reserved.

The paper titled "**Customer Loyalty through Improved Customer Service: A Case Study of Biman Bangladesh Airlines Limited**", authored by Muhammed Tamzid Al Arafat, DBA student, Department of International Business, Faculty of Business Studies, University of Dhaka, Dhaka-1000, (Registration No. 19/2016-2017, Re-registration Number and Session-05/2022-2023) is an original academic work produced under Bangladesh.

No part of this paper, including text, data, analysis, tables, figures, or conclusions, may be reproduced, distributed, or transmitted in any form or by any means (electronic, mechanical, photocopying, recording, or otherwise) without the prior written permission of the author, except for brief excerpts or quotations permitted under fair use for academic or non-commercial purposes, provided proper citation is given.

This work is protected under national and international copyright laws. All references to third-party materials, including books, journals, articles, and digital content, have been appropriately acknowledged in accordance with academic standards.

By submitting this document, the author asserts moral and intellectual ownership of the work and retains exclusive rights to its content, except where explicitly stated otherwise.

For permissions or inquiries, contact:



Muhammed Tamzid Al Arafat
DBA Researcher
Department of International Business
Faculty of Business Studies, University of Dhaka
Dhaka-1000, Bangladesh
Email: muhammedtamzidalarafat@gmail.com
WhatsApp: +8801622068473

Date: *24* December 2025

Dhaka University Institutional Repository

Dedication

To my father, **Md. Mukhlesur Rahman Bhuiyan**, the architect of my dreams, whose wisdom and unwavering faith in me have been my guiding light.

To my beloved son, **Md. Azmayeen Intesar Ruhan**, whose silent sacrifices and boundless love have been a source of strength beyond words.

To my precious daughters, **Aazeen Intesar Runmoyee** and **Ayesha Intesar Rodela**, my guiding stars, whose innocence and laughter have illuminated even my darkest days.

And most profoundly, to my beloved wife, **Israt Ara Runa**, whose steadfast love, patience, and unwavering support have been the silent force behind every challenge, every triumph, and every step forward.

This work is not merely mine, it is a testament to your sacrifices, your belief in me, and the love that has carried me through. My gratitude to you is immeasurable, my devotion eternal.

Dhaka University Institutional Repository

Acknowledgement

With profound gratitude and deep reverence, I extend my sincerest appreciation to the extraordinary individuals whose wisdom, guidance, and encouragement have shaped my academic journey and made this research possible.

First and foremost, I owe an immeasurable debt of gratitude to my **Supervisor**, **Professor Dr. S.M. Mahfuzur Rahman**, whose unparalleled mentorship, intellectual rigor, and unwavering belief in my potential have been the bedrock of this endeavor. From conceptualizing the research framework to refining its execution, his visionary insights, meticulous feedback, and patient guidance transformed my ideas into a coherent academic work. His ability to challenge my assumptions while fostering creativity has not only elevated this dissertation but also instilled in me a lifelong commitment to scholarly excellence. His kindness, humility, and dedication to nurturing students like myself embody the very essence of academic leadership.

I owe a lot to **Professor Dr. Suborna Barua**, Department of International Business, University of Dhaka and I express my deepest appreciation for his advice in developing the analytical framework and methodology of my research. His suggestions on statistics management equipped me with the analytical precision required to generate the complex datasets, their analysis and interpretation of findings and drawing meaningful conclusions. He had also voluntarily reviewed work on methodology of my research, suggested how to use some advanced statistical tools, and ensuring the robustness of my findings. This dissertation's scientific rigor stands as a testament to his mentorship.

My heartfelt thanks go to **Professor Dr. Chowdhury Saima Ferdous** for her exceptional guidance in Research Methodology, particularly during the

unprecedented challenges of the COVID-19 pandemic. Her innovative virtual teaching methods, unwavering patience, and commitment to ensuring methodological rigor empowered me to design a resilient research framework despite logistical constraints. Her lessons on balancing qualitative and quantitative approaches have left an indelible mark on my academic philosophy.

I am eternally grateful to **Professor Dr. Shobod Deba Nath** for his transformative teachings in International Business. His profound knowledge of global business dynamics, coupled with his ability to simplify intricate theories, laid the theoretical foundation for this research. His lectures, enriched with real-world case studies and thought-provoking debates, inspired me to critically analyze the interplay between customer loyalty and service excellence in a multinational context.

I am deeply indebted to **Dr. Abul Khayer** for his exceptional instruction in Business Mathematics, which sharpened my quantitative acumen and enabled me to apply advanced mathematical models to this study. His ability to demystify complex equations and align them with practical business scenarios has been pivotal in strengthening the statistical validity of my work.

To **all faculty members of the Department of International Business, University of Dhaka**, I extend my warmest gratitude. Your collective wisdom, interdisciplinary teachings, and unwavering support have enriched my understanding of global commerce and research ethics. Special thanks to **Associate Professor Mohammad Rakib Uddin Bhuiyan** for his infectious enthusiasm, approachable demeanor, and relentless motivation. Beyond academia, his mentorship in balancing perseverance with well-being has been a beacon of inspiration during moments of doubt.

I am also deeply grateful to **Engineer Israt Ara**, Data Analyst for this project, for her invaluable support throughout the empirical phase of this research. Her contributions encompassed meticulous data cleaning, rigorous data imputation, and the comprehensive execution of exploratory and descriptive data analyses (EDA). She further played a pivotal role in conducting the Exploratory Factor Analysis (EFA) and in developing regression models using both traditional statistical approaches and advanced machine learning techniques. Her exceptional patience, technical expertise, and unwavering dedication significantly enhanced the analytical rigor and overall quality of this study.

Finally, I acknowledge the invisible hands of countless peers, military colleagues, family members, and friends whose silent encouragement sustained me. To the **participants and stakeholders of Biman Bangladesh Airlines Limited**, thank you for trusting me with your insights.

This dissertation is not merely my own but a mosaic of the knowledge, generosity, and spirit bestowed upon me by these remarkable individuals. Any shortcomings herein are mine alone.

With boundless respect and humility,



Muhammed Tamzid Al Arafat

DBA Researcher

Department of International Business

Faculty of Business Studies
University of Dhaka
Dhaka-1000, Bangladesh

Date: *24* December 2025

Dhaka University Institutional Repository

Abstract

This dissertation presents a comprehensive, data-driven investigation into the determinants of customer satisfaction and loyalty at Biman Bangladesh Airlines, addressing a critical gap in the literature on aviation in emerging markets. The research employs a rigorous mixed-methods approach, integrating quantitative analysis of survey data from 425 passengers with qualitative insights from 43 semi-structured interviews with stakeholders. The study examines two primary dependent variables (DVs) as Customer Satisfaction and Customer Loyalty, against eight independent variables (IVs) operationalized through 40 distinct attributes, while controlling for three key demographic variables (CVs): Age, Education Level, and Travel Frequency.

A novel Multivariate-Machine Learning Synergistic Model (MML-SM) was developed, synergizing traditional statistical methods with advanced machine learning to uncover both linear and non-linear relationships. The Ordered Logistic Regression (OLogit) analysis identified Improved Customer Service ($\beta=1.365$, $p < 0.001$) as the most powerful predictor of satisfaction, with Brand Reputation ($\beta=0.586$, $p< 0.01$) and Price ($\beta=0.541$, $p<0.001$) also showing strong significant effects. The Multivariate Linear Regression (MLR) analysis specifically quantified the drivers of loyalty, revealing Improved Customer Service ($\beta=0.341$, $p<0.001$) as the strongest predictor, followed by Brand Reputation ($\beta = 0.138$, $p < 0.01$) and Price ($\beta = 0.133$, $p < 0.001$). The OLS regression further confirmed Improved Customer Service as loyalty's primary driver ($\beta = 0.7413$, $p < 0.001$; $R^2 = 0.659$).

The machine learning models revealed critical, non-intuitive realities. Random Forest not only validated the hierarchy of drivers, attributing 56.0% importance to

Dhaka University Institutional Repository

Improved Customer Service, but also uncovered the phenomenon of diminishing returns on service quality (R^2 = 0.718–0.784), indicating that blanket improvements beyond a certain point are inefficient. Most strikingly, the XGBoost model assigned 100% feature importance to Improved Customer Service, suggesting that in the complex reality of passenger behavior, all other factors are subsumed by this central construct.

The study challenges conventional wisdom by uncovering a paradoxical positive Price-Loyalty relationship across all models (MLR β = 0.133, OLogit β = 0.541), where Bangladeshi travelers perceive premium pricing as an indicator of quality. Conversely, it exposes a critical "service visibility gap" where Staff Services, despite a strong correlation with satisfaction, demonstrated statistically insignificant impacts on loyalty in both MLR and OLogit models, revealing that frontline efforts fail to translate into enduring allegiance.

The implications provide a strategic roadmap for Biman to transform operational challenges into a sustainable competitive advantage. Recommendations include targeted interventions such as AI-driven personalization to overcome diminishing returns, value-tiered bundling to leverage the price-perception paradox, and a comprehensive service excellence framework to bridge the identified gaps. The research establishes a new benchmark for customer-centric aviation in emerging markets, demonstrating the power of a triangulated analytical framework to reveal the complex, non-linear drivers of passenger behavior.

Keywords: Customer Loyalty, Customer Satisfaction, Service Quality, Biman Bangladesh Airlines, MLR, OLS Regression, Ordered Logit, Random Forest, XGBoost, Emerging Markets, Aviation Service Optimization.

Dhaka University Institutional Repository

Table of Contents

Content	Page No.
Attestation on Plagiarism and Other Forms of Dishonesty	i
Certification	ii
Copyright Statement	iii
Dedication	iv
Acknowledgment	v-vii
Abstract	viii-ix
List of Tables	xxii
List of Illustrations	xxiv
List of Appendices	xxv
List of Acronyms	xxvi
Content in Brief	xxx
Chapter 1: Introduction	1
1.1 Background of the Study	1
1.2 Aim of the Study	2
1.3 Problem Statement	2
1.4 Scope of the Study	3
1.5 Research Objectives	4
1.6 Research Questions	4
1.7 Rationale for the Research	5
1.8 Challenges and Limitations of the Study	5
1.9 Significance of the Study	6

Dhaka University Institutional Repository

1.10 Organization of the Study 7

Chapter 2: A Review of the Literature on the Aviation Industry in Bangladesh: Examining Performance, Constraints, and Opportunities for Development 8

2.1 Introduction 8
2.2 Aviation Industry and its Services 9
2.3 The State of Airlines Business in Bangladesh 9
2.4 Contribution of Aviation Industry to National Revenue 12
2.5 Role of Foreign Airlines Operation in Bangladesh and Observations on Some Aspects of Their Future Business in the Country 13
2.6 Operational State of Aviation Industry of Bangladesh 15
2.7 Engineering and Maintenance State of Aviation Industry of Bangladesh 16
2.8 Contribution of Bangladeshi Airliners to Tourism Growth through Enhanced Connectivity and Strategic Partnership 16
2.9 The State of Administrative and other Affairs of Aviation Industry of Bangladesh 18
2.10 Potentials of Bangladesh Aviation Industry 19
2.11 Findings 20
2.12 Identification of Latent Constructs and Measured Variables from Review Data 21
2.13 Research Gap 22
2.14 Area of Future Studies 23

Dhaka University Institutional Repository

2.15 Chapter Summary 24

Chapter 3: The Satisfaction-Loyalty Nexus: A Focused Literature Review 26

3.1 Introduction 26

3.2 Operationalization of Variables: Factors and Measurable Attributes 27

3.3 Customer Satisfaction 29

3.3.1 Passenger's Trust 32

3.3.2 Airliner's Brand Reputation 33

3.3.3 Airlines Staffs Service 35

3.3.4 Airline Safety 36

3.3.5 Route Availability and Convenience 38

3.3.6 Frequent Flyer Program 40

3.3.7 Price/Ticket Fare 42

3.4 Service Quality 46

3.5 Customer Loyalty 48

3.6 Conceptual Structure and Development of Hypotheses 51

3.6.1 Customer Loyalty: Exploring the Interconnected Factors through Integrated Hypotheses 53

3.6.2 Justifying the Exclusion of Service Quality (H_9) and Focusing on Specific Drivers of Customer Loyalty (H_1) 58

3.7 Theoretical Framework of the Study 59

3.8 The Conceptual Research Model 61

3.9 Research Gap 62

3.10 Chapter Summary 63

Chapter 4: Civil Aviation Sector of Bangladesh: Development, Challenges, and The Role of Biman Bangladesh Airlines Limited 65

4.1 Introduction 65

4.2 Early Records of Development of Aviation Industry in Bengal 67

4.2.1 Flight over South Asian Arakan Coast. 67

4.2.2 Military Flights at Cox's Bazar, Feni, and Comilla Area of Arakan Coast 67

4.2.3 US and British Military Air Operation over the Territory of Present Bangladesh 68

4.2.4 Evolution of Bangladesh Aviation: Insights from Indo Pak Air Operation over the Sky of Bangladesh 69

4.2.5 Dream of Bangladesh Air Force 70

4.2.6 Birth of Bangladesh Air Force (BAF) 71

4.3 Regulatory Framework of Civil Aviation Activities in Bangladesh 72

4.3.1 Birth of Civil Aviation 72

4.4 Commercial Airliners of Bangladesh Aviation Industry 74

4.4.1 Biman Bangladesh Airlines 77

4.4.2 US-Bangla Airlines 79

4.4.3 Novo Air 80

4.5 Current State of Biman Bangladesh Airlines Limited 81

4.5.1 Administrative Structure of Biman 82

4.5.2	National and Global Network of Biman	82
4.6	Drawbacks of Biman Bangladesh Airlines	83
4.6.1	Biman's Dilemma	83
4.6.2	Lack of Authority and Accountability of the Executive Body	84
4.6.3	Shortage of Aviation Experts in the Authoritative Bodies	84
4.6.4	Political Influence	84
4.6.5	Corruption	85
4.7	Contribution of Aviation Industry to Bangladesh Economy	92
4.7.1	Role of aviation Industry in Employment and Income Generation	93
4.7.2	Growth of Aviation-Associated Industries	94
4.7.3	Promotion of Trade through Aviation	95
4.7.4	Contribution of Biman Bangladesh Airlines to the National Economy of Bangladesh	97
4.8	Prospects of Aviation Industry in Bangladesh	99
4.9	Chapter Summary	100

Chapter 5: Methodology – A Pragmatic Mixed-Methods Investigation of Customer Loyalty Through Service Quality at Biman Bangladesh Airlines

5.1	Introduction	103
5.2	Research Paradigm	103
5.3	Research Approach	106
5.4	Research Design	109
5.5	Hypothesis Development and Empirical Testing Framework	110
5.5.1	Methodological Role and Operationalization of Hypotheses	110

5.5.2	Hypotheses for Empirical Testing	112
5.5.3	Variables Under Investigation and Operationalization	114
5.6	Sources of Research Data for Hypothesis Test and Mixed-Method Research Approach	115
5.7	Phase-I: Quantitative Research Phase	117
5.8	Population	119
5.8.1	Current Passengers and Other Service Seekers of Biman Bangladesh Airlines Limited	120
5.8.2	Past Passengers and Other Service Seekers of Biman Bangladesh Airlines Limited	121
5.8.3	Biman Bangladesh Airlines Limited Staff.	121
5.8.4	Academicians and Aviation Industry Experts.	121
5.8.5	High Officials of Biman Bangladesh Airlines Limited.	121
5.8.6	Civil Aviation Authority of Bangladesh (CAAB).	122
5.9	Sample	122
5.10	Sampling Strategy	124
5.11	Sample Size Determination	126
5.11.1	Addressing Finite Population Correction	129
5.12	Sample Distribution	130
5.12.1	Stratified Random Sampling and Weighted Allocation	130
5.12.2	Sample Distribution for 425 Respondents for this Study	131
5.12.3	Supplementary Considerations for Sample Distribution	132
5.12.4	Justification on Sample Distribution	133
5.13	Implementation of The Sampling Method on Distributed Sampling	133

Dhaka University Institutional Repository

5.13.1	Primary Data Collection: Stratified Sampling and Mixed-Mode Survey Administration	134
5.13.2	Design and Deployment of the Data Collection Instrument on Distributed Sampling	137
5.13.3	Pilot Study and Instrument Reliability Analysis	138
5.14	Justification of Sampling Distribution	139
5.14.1	Data Cleaning and Exploratory Data Analysis (EDA) Process	139
5.14.2	Integrated Statistical and Machine Learning Framework	142
5.14.3	Implementation of Methodological Synergy (Classical and Machine Learning Model)	154
5.14.4	Statistical Models for Hypothesis Testing	154
5.14.5	Performance Analysis of Adopted Regression and Machine Learning Models	156
5.15	Phase-II: Qualitative Research Phase	160
5.16	Qualitative Data Collection Process	160
5.16.1	Interview Sampling and Data Collection Protocol	163
5.16.2	Thematic Organization of Interview Questions	164
5.16.3	Interview Procedure	165
5.16.4	Qualitative Data Analysis Process & Tools	166
5.17	Phase III: Secondary Data Collection and Sources	167
5.18	Methodological Framework for Data Interpretation for Visualizations	168
5.19	Data Triangulations: Integration and Synthesis of Multi-Method Findings	170
5.20	Validating Hirschman's Exit-Voice Theory: A Customer	171

Dhaka University Institutional Repository

	Response Analysis at Biman Bangladesh Airlines Limited	
5.22	Conclusion	171

Chapter 6: A Quantitative Analysis of Factors Affecting Customer Satisfaction and Loyalty at Biman Bangladesh Airlines 173

6.1	Introduction	173
6.2	Rationale and Procedure of Questionnaire Survey	174
6.3	Exploratory Descriptive Analysis	175
6.3.1	Reliability and Validity Test (Cronbach's Alpha) Trough Pilot Survey	175
6.3.2	Reliability Analysis of 40 Attributes/Indicators.	176
6.4	Normality Test of Data	179
6.5	Implications of Non-Normality and Mitigation Strategies	
6.6	Descriptive Statistics	181
6.7	Inferential Statistics: Objective I: Key Variables that Significantly Influence Customer Satisfaction and Loyalty	184
6.7.1	Correlation Analysis	184
6.7.2	OLogit Regression	184
6.7.3	Multivariate Regression	185
6.7.3	Random Forest Regression (Machine Learning)	185
6.8	Integrated Analytical Framework for Customer Satisfaction and Loyalty in Bangladesh's Aviation Sector	185
6.9	Multivariate-Machine Learning Synergistic Model (MML-SM)	186
6.9.1	Correlation Analysis: Interpretation of Pearson Correlation	187

	Coefficients	
6.9.2	Strategic Takeaways	187
6.9.3	Ordered Logistic Regression (OLogit) Analysis	188
6.9.4	Multivariate Regression Analysis (MLR)	192
6.8.5	Model Overview	192
6.9.6	Ensuring Model Stability: Multicollinearity Assessment and Its Implications	192
6.9.7	Multicollinearity Assessment (Variance Inflation Factor - VIF)	193
6.9.8	Ensuring Result Stability: Robustness Check and Heteroscedasticity Adjustment	194
6.9.9	Key Determinants of Customer Satisfaction and Loyalty	194
6.10	Random Forest Regression (Machine Learning)	196
6.10.1	Model Performance Evaluation	196
6.10.2	Customer Satisfaction	196
6.10.3	Customer Loyalty	197
6.10.4	Comparison of Customer Satisfaction and Loyalty	197
6.10.5	Customer Satisfaction Drivers	197
6.10.6	Customer Loyalty Drivers	198
6.10.7	Key Findings for Objective 1	198
6.10.8	Strategic Implications	199
6.11	Objective II: Impact of Improved Customer Service on Customer Loyalty Towards Biman Bangladesh Airlines	200
6.12	XGBoost and OLS Regression	201
6.12.1	Assessing Multicollinearity: Variance Inflation Factor (VIF)	201
6.12.2	Ordered Logistic (OLogit) Regression Analysis	201

Dhaka University Institutional Repository

6.12.3	Regression Analysis Using Robust Standard Errors (HC3) in OLS	202
6.12.4	XGBoost Analysis for Non-Linear Relationships and Feature Importance	203
6.12.5	Summary of Key Insights for Objective 2	203
6.13	Comparative Model Performance and Application in the MML-SM Framework	204
6.14	Findings and Strategic Imperatives for Objective 1 & 2	205
6.15	Objective III: Suggestion for Improving Customer Service Quality to Retain Passengers in Biman Bangladesh Airlines Limited.	207
6.16	Suggestion to Retain Customer in Biman Bangladesh Airlines	207
6.17	Validation of Research Objectives	210
6.18.	Comprehensive Hypothesis Validation with Multi-Method Statistical Evidence	212
6.19	Empirical Insights into Exit-Voice Dynamics at Biman Bangladesh Airlines Limited	214
6.20	Conclusion	215

Chapter 7: A Qualitative Analysis of Factors Affecting Customer Satisfaction and Loyalty at Biman Bangladesh Airlines 217

7.1	Introduction	217
7.2	Rationale for Conducting Interviews and Procedure	218
7.3	Key Variables Influencing Customer Satisfaction and Loyalty	220
7.3.1	Improved Customer Service	221

7.3.2	Passenger Trust	222
7.3.3	Staff Service	223
7.3.4	Airline Brand Reputation	223
7.3.5	Frequent Flyer Program	224
7.3.6	Route Availability and Convenience	225
7.3.7	Airline Safety	226
7.3.8	Price/Ticket Fare	227
7.4	Key Drivers of Customer Satisfaction and Loyalty at Biman Bangladesh Airlines	227
7.4.1	Improved Customer Service	228
7.4.2	Passenger Trust	228
7.4.3	Staff Service	228
7.5	Impact of Improved Customer Service on Customer Loyalty Towards Biman Bangladesh Airlines.	229
7.5.1	Service Quality as a Pillar of Loyalty.	230
7.5.2	Customer Engagement and Personalization	231
7.5.3	Collaboration and Regulatory Compliance	232
7.5.4	Benchmarking and Strategic Improvements	233
7.5.5	Competitive Pricing and Convenience	234
7.5.6	Continuous Improvement and Innovation	235
7.6	Suggestion for improving customer service quality to retain passengers in Biman Bangladesh airlines limited.	236
7.7	Chapter Summary	239

Chapter 8: Discussion And Conclusion 241

Dhaka University Institutional Repository

8.1	Introduction	241
8.2	Summary of the Study	241
8.2.1	Justification of Research Objective 1	248
8.2.2	Justification of Research Objective 2	250
8.2.3	Justification of Research Objective 3	251
8.2.4	Validation of Research Hypothesis	253
8.2.5	Theoretical Alignment with Exit–Voice Theory (Albert Hirschman, 1970	254
8.4	Conclusion	254
8.5	Implications of the Study	257
8.6	Contribution and Significance of the Study	261
8.7	Limitations Affecting Interpretation and Generalization of Findings	262
8.8	Areas for Future Research	263
8.9	Reflective Account: A Journey of Resilience, Adaptability, and Growth	264
8.10	Work-Life Balance: The Art of Juggling Roles	266
8.11	Methodological and Personal Transformation	266
8.12	A New Lens on Life and Leadership	267
8.13	Chapter Summary	268
	References	269
	Appendices	277

Dhaka University Institutional Repository

List of Tables

Table	Description	Page No.
Table 3.1	Operationalization of Research Variables: Selected Factors and Their Attributes	28
Table: 3.2	Conceptual Structure and Development of Hypotheses	53
Table 4.1	Fleet Size & Seat Capacity of Biman Bangladesh Airlines Limited	73
Table 4.2	The Contribution of Air Transport Industry in GDP	94
Table 4.3	Biman's Share in Export Cargo Transportation	96
Table 5.1	Research Paradigm Suitability Matrix for Biman Bangladesh Airlines	105
Table 5.2	Research Objectives and Methodological Approaches for Examining Customer Satisfaction and Loyalty at Biman Bangladesh Airlines	107
Table: 5.3	Variables Under Investigation and Operationalization	114
Table 5.4	Sample Size (n) Requirements for Specified Population Sizes and Precision Levels (95% Confidence Level, P=.5)	127
Table 5.4	Respondent Categories and Proportional Representation in Sample (n=425)	131
Table 5.5	Respondent Profile: Proportional Representation of Key Stakeholder Groups (n = 425)	132
Table: 5.6	Performance Analysis of Adopted Regression and	157

Machine Learning

Table 5.7 Distribution of Interview Participants by Stakeholder Stratum 162

Table 6.1 Customer Loyalty Drivers: Ordered Logit Regression Results 190

Table 6.2 Variance Inflation Factor – VIF for IVs 193

Table 6.3 MLR Coefficients and Significance for Customer Satisfaction & Loyalty 195

Table 6.4 Model Performance and Application in the MML-SM Framework 205

Table 6.5 Customer Loyalty Dynamics for Objective I & II 206

Table 6.6 Research Objectives Validation Through Regression Analysis 211

List of Illustrations

Figure No.	Figure Title	Page No.
Figure 3.1	Theoretical Framework of the Study	61
Figure 4.1	Top 10 Most Popular City Destination from Bangladesh 2023	75
Figure 4.1	Biman's Share in Export Cargo Transportation	96
Figure 5.1	Research Methodology: A Process Model	110
Figure 5.2	Hypothesis Formulation Framework	111
Figure 5.3	Stakeholder Population Clusters	120
Figure 5.4	Population Stratification Model for Sampling	123
Figure 5.5	Research Methodology: Exploratory Data Analysis Model	141
Figure 5.6	Integrated Statistical and Machine Learning	142
Figure 6.1	Result of Reliability and Validity Test (Cronbach's Alpha)	178
Figure 6.2	Q-Q Plot of Residuals	179
Figure 6.3	Histogram of Residuals	179
Figure 6.4	Participant's Gender Perspective Views	181
Figure 6.5	Participant's Academic Strength	182
Figure 6.6	Participant's Type (Passenger Type) in Terms of Travel with Biman	183
Figure 6.7	Participant's Travel Frequency with Biman	184
Figure 6.8	Pearson Correlation Coefficients between the Independent Variables with Customer Satisfaction & Customer Loyalty	187

List of Appendices

Appendices	Description	Page No.
Appendix 1	Variables and Attributes Derived from the Review of Literature	277
Appendix 2	Conceptual Model of Determining Loyalty Dynamics	281
Appendix 3	A survey questionnaire for data collection	282
Appendix 4	Result of pilot test (Cronbach's Alpha test results)	289
Appendix 5	Interview questions to be asked during interview	294
Appendix 6	List of personnel/high officials to be interviewed	300
Appendix 7	Secondary data sources used in this research	305
Appendix 8	Survey database along with outcome through traditional statistical tests.	306
Appendix 9	Details of Normality Test of survey data in R & Python with outcome	334
Appendix 10	Detailed Descriptive Test Statistics	345
Appendix 11	Outcome of Correlation Analysis in SPSS	355
Appendix 12	OLogit Model Summary	358
Appendix 13	Outcome of Multivariate Regression Analysis	405
Appendix 14	Outcome of Random Forest Regression	427
Appendix 15	Outcome of XGBoost and OLS Regression	434
Appendix 16	Outcome of Survey Data Analyzing Through Natural Language Toolkit (NLTK) of Python	437

List of Acronyms

Acronym	Description
AOC	Air Operator Certificate: Certification required to operate commercial flights
ASA	Air Service Agreement: Agreement between countries allowing air services
BAF	Bangladesh Air Force: The aerial warfare branch of the Bangladesh Armed Forces
BATC	Bangladesh Airlines Training Center: Training Facility of Biman Bangladesh Airline
BFCC	Biman Flight Catering Center: Center produces airline meal for passengers
CAAB	Civil Aviation Authority, Bangladesh: The regulatory body for aviation in Bangladesh
CEO	Chief Executive Officer: The highest-ranking executive in an organization
CLTV	Customer Lifetime Value: The predicted revenue a customer will generate
DATT	Domestic Air Travel Tax: Tax from domestic passengers in Bangladesh
DBA	Doctor of Business Administration: Postgraduate degree program
DCA	Department of Civil Aviation (Pakistan): Responsible for civil aviation until 1971
FAA	Federal Aviation Administration (United States): Authority with

	powers to regulate all aspects of civil aviation
FATT	Foreign Air Travel Tax: Tax from international passengers departing from Bangladesh
FPC	Finite Population Correction: Adjustment to sample size formula for smaller populations
FSC	Full-Service Carrier: Airline offering a comprehensive range of services
GDP	Gross Domestic Product: Monetary value of all finished goods and services
GSA	General Sales Agent: Representative for an airline in a specific region
HC1	Heteroscedasticity-Consistent Standard Errors: (HC1 estimator is for OLS model to test heteroscedasticity)
HSIA	Hazrat Shahjalal International Airport: The primary international airport in Bangladesh
IATA	International Air Transport Association: Trade association for airlines
ICAO	International Civil Aviation Organization: A UN agency for international air navigation
IT	Information Technology: The use of computers and software to manage information
LCC	Low-Cost Carrier: Airline offering lower fares by reducing passenger services
MD	Managing Director: Person in charge of the direction and control an organization

MLR	Multivariate Linear Regression: Statistical method for modeling multiple variables
MML-SM	Multivariate-Machine Learning Synergistic Model: An integrated analytical framework to identify key drivers of customer satisfaction and loyalty
MSE	Mean Squared Error: used to asses predicted accuracy of machine learning models
NLTK	Natural Language Toolkit: A Python library for working with human language data
NLP	Natural Language Processing: The ability of a computer to understand human language
OLS	Ordinary Least Squares: A type of linear least squares method for estimating the unknown parameters in a linear regression model.
P2C	Passenger to Cargo: Convert the passenger flight into cargo flight
PAF	Pakistan Air Force: The aerial warfare branch of the Pakistan Armed Forces
PCA	Principal Component Analysis: statistical procedure that uses an orthogonal transformation to convert a set of observations of possibly correlated variables into a set of values of linearly uncorrelated variables.
PIA	Pakistan International Airlines Corporation: The flag carrier airline of Pakistan
PRO	Public Relation Officer: manage organization relation with government and stakeholders
RAF	Royal Air Force: The United Kingdom's aerial warfare force

R&D	Research and Development: All activities related to systematic study
RIAF	Royal Indian Airforce: An aerial warfare force played a crucial role by providing tactical reconnaissance and extensive support to the army
RMG	Ready Made Garments: a clothing products sector based on export of Bangladesh
SPSS	Statistical Package for the Social Sciences: A software package used for statistical analysis
TAF	Tactical Air Force: Royal Air Force Third Tactical Air Force
TDS	Tax Deducted at Source: Indian system through which income tax is deducted from source of income
UN	United Nations: An intergovernmental organization to promote international co-operation.
USB	Universal Serial Bus: cable connection
USD	United States Dollar: A kind of Currency
VIF	Variance Inflation Factor: A measure of multicollinearity in regression analysis
VVIP	Very Very Important Person: Top officials in Government
Wi-Fi	A kind of Wireless Fidelity for internet connection
WWII	World War II: a global war
XGBoost	Extreme Gradient Boosting: Implements the gradient boosting machine learning algorithm.

Contents in Brief

Chapter	Title	Description	Page No.
1	Introduction	Overview of the study, including background, research objectives, research questions, significance, scope, and limitations.	1
2	A Review of the Literature on the Aviation Industry in Bangladesh: Examining Performance, Constraints, and Opportunities for Development	Review of existing literature on customer service quality, customer loyalty, and key factors influencing customer satisfaction and loyalty.	8
3	The Satisfaction-Loyalty Nexus: A Focused Literature Review	Specific literature review focusing on how enhanced customer service influences customer loyalty in the context of Biman Bangladesh Airlines Limited.	26
4	Bangladesh's Aviation Sector: Development, Challenges, and The Role of Biman Bangladesh Airlines.	Overview of the aviation sector in Bangladesh and a detailed examination of Biman Bangladesh Airlines Limited, including its operational challenges and market position.	65
5	Methodology – A Pragmatic	Explanation of the research	103

	Mixed-Methods Investigation of Customer Loyalty Through Service Quality at Biman Bangladesh Airlines.	design and Methodology, sampling techniques, data collection methods, and data analysis approaches employed in the study.	
6	A Quantitive Analysis of Factors Affecting Customer Satisfaction and Loyalty at Biman Bangladesh Airlines	Statistical analysis of survey data, interpretation of findings, and key insights derived from quantitative research.	173
7	A Qualitative Analysis of Factors Affecting Customer Satisfaction and Loyalty at Biman Bangladesh Airlines	Thematic analysis of semi-structured interviews, exploring expert and stakeholder perspectives on customer satisfaction and loyalty.	217
8	Discussion and Conclusion	Summary of key findings, practical implications, recommendations, and potential areas for future research on Biman Bangladesh Airlines Limited.	241

Chapter 1

INTRODUCTION

1.1 Background of the Study

In recent years, the airline industry has been characterized by intense competition and increasing customer expectations. That is why an airline's ability to provide excellent customer service is essential to its success. Customer satisfaction is impacted by customer service quality, and then comes loyalty. Customer satisfaction and loyalty are crucial for the long-term sustainability of an airline. Therefore, airlines must comprehend the factors that influence customer satisfaction and loyalty to enhance their customer service quality. Improving customer service is an ongoing process that requires dedication and a customer-centric approach. By using this approach, Biman Bangladesh Airlines may improve client retention and solidify its place in the fiercely competitive airline sector.

Biman Bangladesh Airlines Limited as the national flag carrier airline of Bangladesh has been striving to provide the best customer service quality to its passengers to enhance their satisfaction and loyalty towards the airline. However, there is a lack of research on the relationship between customer service quality and customer loyalty in Biman Bangladesh Airlines Limited. Therefore, this study aims to investigate the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines, identify the dominant factors that significantly influence customer satisfaction and loyalty, and the possible measures for improving customer service quality and enhancing customer loyalty in Biman Bangladesh Airlines Limited.

1.2 **Aim of the Study**

The aim of the research is to determine the impact of improved customer service as well as some key variables on customer loyalty towards Biman Bangladesh Airlines

1.3 **Problem Statement**

Due to fierce competition from other airlines, Bangladesh's national airline, Biman Bangladesh Airlines Limited, has had difficulty holding onto its market share. One of the major challenges that the airline faces is customer loyalty. Despite efforts for improving its customer service quality, the airline has not been successful in retaining its customers. The problem lies in taking due to care of the factors that significantly influence customer loyalty and satisfaction in Biman Bangladesh Airlines Limited. As of now no study has been conducted to ascertain how improved customer service at Biman Bangladesh Airlines Limited affects customer loyalty. That is why this study is planned to ascertain it, meanwhile, while doing so this study will also evaluate the key variables that have a major impact on customer loyalty and satisfaction with Biman Bangladesh Airlines.

Not much literature on the aviation industry of Bangladesh is available till now and there is practically no published research on Biman’s client retention or the Bangladesh Airlines' customer loyalty. Studies on factors influencing airline customer satisfaction have been conducted globally, but the link between customer service and loyalty for Biman Bangladesh Airlines is not yet assessed. Also, the research papers available on Biman Bangladesh Airlines are very limited, mostly unpublished reports and university thesis papers. Such studies are often subjective and erroneous, and do not provide a comprehensive and reliable picture of the Biman Bangladesh Airline's services.

Given the above backdrop, an inclusive study using sound statistical and machine learning procedures is considered necessary to reveal a comprehensive view of the impact of improved customer service on the customer loyalty of the passengers of Biman Bangladesh Airlines. The study results and analysis can contribute to the practical understanding of the issue of concern and fill in some knowledge gaps in the area of Biman's customer services and the loyalty of customers to Biman Bangladesh Airlines. The findings of this study may help Biman Bangladesh Airlines to take time-sensitive business decisions and help the relevant authorities in the government to make policy decisions so that Biman can emerge as a more popular and a revenue-generating organization.

1.4 **Scope of the Study**

This research has its focus on the relationship between customer service quality and customer loyalty in Biman Bangladesh Airlines Limited. The study is however, limited to the perceptions of the passengers Biman Bangladesh Airlines Limited and some key professionals of both Civil Aviation Authority of Bangladesh (CAAB) and Biman Bangladesh Airlines Limited. Research on policy issues, including the investigation on whether the results support or contradict political and bureaucratic interests, the policies and practice of procurement, leasing, route planning, maintenance of flight schedule, repair and maintenance of fleet at home and abroad, command and control, supply chain, revenue earnings, losses and causes for them are considered sensitive. Biman does not allow access to data (and information) on most of these aspects, for which the study had to be kept limited in scope and it does touch on many issues that are associated with inefficiencies and leakages, as well as, failure in meeting customer service standard for non-availability of authentic and proper

data under a system that often does not allow adequate transparency and disclosure.

1.5 **Research Objectives**

The primary objective of this research is to investigate the relationship between customer service quality and customer loyalty in Biman Bangladesh Airlines Limited. The specific objectives are:

1. To identify the key variables that significantly influence customer satisfaction and loyalty in Biman Bangladesh Airlines Limited.

2. To examine the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines.

3. To provide suggestion for improving customer service quality to retain passengers in Biman Bangladesh Airlines Limited.

1.6 **Research Questions**

The research questions are:

1. What are the key variables that significantly influence customer satisfaction and loyalty in Biman Bangladesh Airlines Limited?
2. What is the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines?
3. What are the suggestions for improving customer service quality to enhance customer loyalty in Biman Bangladesh Airlines Limited?

1.7 Rationale for the Research

The airline industry in Bangladesh is rapidly growing and becoming more competitive. Therefore, it is important for airlines to provide high-quality services to their customers to remain competitive and retain their customers. This study will contribute to the existing literature by providing insights into the relationship between different factors of customer service quality and customer loyalty in Biman Bangladesh Airlines Limited, identifying the dominant factors that significantly influence customer satisfaction and loyalty, and providing suggestions for improving customer service quality to enhance customer loyalty. The findings of this research will be valuable for Biman Bangladesh Airlines Limited, all domestic and international airliners of Bangladeshi origin, and airliners of other developing countries as well.

1.8 Challenges and Limitations of the Study

The study may face several significant challenges and limitations, including the following:

a. The impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines is multi-dimensional and some factors and their impacts may remain beyond the analysis in the study.

b. Many among the respondents of the survey conducted for the study have fair and complete understanding of the factors influencing customer satisfaction and loyalty in Biman Bangladesh Airlines Limited.

c. Biman Bangladesh Airlines Limited appears to have clear strategies for improving customer service quality and enhancing customer loyalty.

d. The access to accurate and reliable data on many issues related to Biman Bangladesh Airlines management and its customer service is limited.

e. Not all customers have been found to be comfortable in giving time in surveys and interviews, especially at the time of their arrival at and departure from the airport.

f. In many cases it seems that there is bias in responses from customers based on their assessment of the authenticity of sources, or the ranking of the airline and their responses are mostly based on personal comfort or discomfort without adequate understanding of circumstantial situations.

g. It is difficult to control external factors that may influence customer loyalty, such as changes in the economy or competitive landscape.

h. Some potential for confounding variables that may impact the relationship between different factors of customer service quality and customer loyalty and could not be considered/analyzed in the study.

1.9 **Significance of the Study**

Despite potential limitations, the findings of this research are expected to provide valuable insights into the relationship between different factors of customer service quality and customer loyalty in Biman Bangladesh Airlines Limited. The study will help the airline to identify the dominant factors that significantly influence customer satisfaction and loyalty and to improve their customer service quality accordingly. The study will also contribute to the existing literature on customer service quality and customer loyalty in the airline industry. It will also help the government of Bangladesh to take time-sensitive decisions and policy making to help Biman in becoming an attractive airline and a reasonably sound revenue earning organization.

1.10 **Organization of the Study**

This dissertation consists of eight chapters. Chapter 1 introduces the research, including the background of the study, aim, problem statement, scope, objectives, research Questions, rationale for conducting the research, challenges and limitations of the Study and significance of the study. Chapter 2 reviews the relevant literature on customer service quality, customer loyalty, and factors influencing customer satisfaction and loyalty. Chapter 3 also presents a review of but literature, but on those relating to factors involved in customer service quality and customer loyalty to airliners, including specially to Biman Bangladesh Airlines Limited, the content of which helped identifying the research gap in the area and formulating the likely research framework for the present dissertation, including a set of hypotheses. Chapter 4 provides a narrative of the development of aviation industry in Bangladesh. Chapter 5 presents the research methodology as a whole, including the research paradigm, research design, approach, population sampling techniques, data collection methods, and data analysis techniques to justify research objectives and validate research hypothesis. Chapter 6 provides an analysis and discussion on survey data through classical statistical and machine learning methods, their interpretation, findings, and their implications to align research objectives, hypotheses and customer satisfaction theorem. Chapter 7 presents the thematic analysis of semi-structured interview. Finally, Chapter 8 provides justifications of research objectives, validations of research hypotheses and alignment of customer loyalty theorem basing on the triangulated findings of qualitative and Quantitive outcomes, conclusions and some indications on possible new research on Biman Bangladesh Airlines Limited.

Chapter 2

A REVIEW OF THE LITERATURE ON THE AVIATION INDUSTRY IN BANGLADESH: EXAMINING PERFORMANCE, CONSTRAINTS, AND OPPORTUNITIES FOR DEVELOPMENT

2.1 Introduction

The chapter presents a review of the literature on aviation industry of Bangladesh for understanding its existing status and issues in the area. The review is also made for revealing the challenges and prospects of aviation industry of Bangladesh and to see how some international airliners operate in South Asia. Two major concerns in the context are: the problems in aviation industry of Bangladesh and the ways to make the county's aviation sector profitable.

Following the part on introduction with the number 2.1, this chapter has eleven sections (from 2.2. to 2.12, the first two of which (2.2. and 2.3) provide a review of literature on aviation industry in general and on that in Bangladesh in particular. Section 2.4 says about the contribution of aviation industry to national revenue. Issues like the operational state, engineering and maintenance, and administration of aviation industry are addressed in sections 2.5, 2.6 and 2.7 respectively. The potentials of aviation industry of Bangladesh are discussed in section 2.8. The last two sections (2.9 and 2.10) briefly present an account of the constraints of aviation industry of Bangladesh and the probable solutions. The chapter on literature review concludes with (a) a statement on findings of the available literatures on the challenges and prospects of aviation industries of Bangladesh, the research gaps i.e., areas and issues that had not been so far researched or have been researched only in part and (b) a summary of the unexplored and understudied areas and the need for further studies.

2.2 **Aviation Industry and its Services**

The aviation industry encompasses all aspects of air travel and the activities that help to facilitate it and its services include facilitating business and personal travel, search and rescue, medical transport, aerial firefighting, agricultural aviation, law enforcement, overnight delivery, sightseeing (Ahsan, 2021). The term ‘aviation’ is most used to describe mechanical air transportation carried out by using aircrafts. The two main types of aircraft are airplanes and helicopters, but most modern definitions of the word ‘aviation’ extend beyond to include the use of unmanned aircraft, such as drones (Anon., 2022). Aviation industry of Bangladesh includes passenger services, ticketing and reservations, cargo services, aeromedical transportations, catering services, lounge services, baggage handling, seating, lavatories, entertainment, the cabin crew’s customer-centric ethos, the provision of entertainment packs for travelers, public address system, clear information on onward flights, Wi-Fi facilities, and the like. Today, helicopter uses include transportation of people and cargo, military uses, construction, firefighting, search and rescue, tourism, medical transport, law enforcement, agriculture, news and media, and aerial observation, among others(Anon., 2023).

2.3 **The State of Airlines Business in Bangladesh**

The birth of the aviation industry of Bangladesh and its chronological development considers four main domestic airliners: Biman Bangladesh Airlines Limited, Regent Air, Novo Air, and US Bangla (Sultana, 2018). The aviation industry provides the fastest transportation network to support travel and tourism and domestic and international cargo transfers. This industry is contributing directly to the world’s economic growth and ensuring numerous economic and social benefits to the world

community (Sultana, 2018). Main factors for the squeezes of the airline business include variation in costs due to fluctuation of fuel price, changes in security arrangements including passengers' security checks and safety of cargo shipments, increased price competitions, and limitations in expanding the network of fly towards lucrative destinations (Daniels, et al., 2018). Conservative aviation policy, bureaucracy, absence of a level playing field for private entrepreneurs, inadequate government patronization for private airliners is identified as potential barriers for the growth of aviation business in Bangladesh (Haque, 2014). As such, to survive in the aviation business, airliners have implement cost-saving practices, electronic ticketing, and airport self-service check-in, offer promotional options to passengers (e.g., "buy now, pay later" which deliver tickets in advance and allow buyers to pay after arrival at destination), welcome government subsidies, and move to privatization (Daniels, et al., 2018). Despite many constraints, aviation sector of Bangladesh has an emerging prospective and a potential like some other sectors such as RMG, pharmaceuticals, electronics and agriculture. Formulation of long-term plans, development of infrastructure, enlarging the fleet of carriers with modern aircrafts, improvement in customer service, safety and security, reduction of fare and tariffs, and among many others, introduction of promotional offers or frequent flyer packages are necessary for future development of the aviation industry of Bangladesh (Sultana, 2018).

Biman Bangladesh Airlines is the national flag career airliner and 100% government-owned (Shamsuddula, et al., 2018). But Biman does not seem to have success in creating any significant impact in the local and international market (Hasan, 2006). On the other hand, Turkish Airlines are ascending faster in the world of aviation business for giving due importance to the passenger's expectations, holding loyalty

and satisfaction relationship and priority over successive hard competition (Gures, et al., 2014). Some experts have the opinion that in order to survive in the international market, Bangladesh aviation industry should have more state of art aircraft in the fleet to operate some more new destinations and engage more skilled professionals to ensure at least an acceptable level of customer service (Shaleh & Reza, 2020). Some have also emphasized security issues as an influential factor for the reputation of the airliners (Parvin, 2018); (Shamsuddula, et al., 2018). However, with the existing infrastructure, Biman can provide passenger services, cargo services, catering, mail services, and training of her operational and admin staff.

Successive price hike of aviation fuel, slow infrastructural development, unserviceability rate of commercial aircraft and training facilities, poor repair, and maintenance facilities, and overdue bills are the significant constraints and limitations of aviation industry (Haque, 2014). Bangladesh's aviation industry severely lacks in safety procedures, online reservation and booking system, staff attitude, access to information, cleanliness, entertainment facilities, and maintaining flight schedule (Rahman, et al., 2010). The rapid growth of operation of multinational airliners and private airliners, government intervention, and shift of potential customers of Biman to other airlines are the threats of Biman (Hasan, 2006). Aviation friendly national policy, joint venture airport development, attraction of private entrepreneur and foreign investors, increase of tariffs, taxes and some other charges, schedule payment of overdue bills, massive training for pilots, engineers and flight/ground crews, proper utilization of existing national aviation infrastructure are considered as means of remedy for those constraints(Haque, 2014). The rapid improvement of ground services like terminal services, internet facilities, maintaining flight schedule,

in-flight and on-ground customer services, staff training, luggage facilities, seating facilities for the children, aged and ailing passengers can increase the service quality to the air passengers (Rahman, et al., 2010).

2.4 **Contribution of Aviation Industry to National Revenue**

Airliners' revenue solely depends on customer satisfaction, and the revenues in turn, contribute directly to the national economy (Ahmed, 2018). Biman Bangladesh Airlines has been struggling hard to excel in the competitive domestic and international aviation market. Biman has taken numerous steps to establish itself as a profitable organization (Rahman, et al., 2020). One researcher (Hossain, 2010) explored four ‘P’s of Biman: Product, Price, Promotion and Place/Distribution and found that the Biman’s main sources of revenue are: Hajj-flight, Biman Cargo, Biman maintenance, Bangladesh Airlines Training Center (BATC) foreign flight handling service, Travel classes/Cabin classes and amenities, Barman’s flight catering service, and Biman Poultry Complex. It was estimated in a study (Yousuf, 2017) that about 85% of the revenue of Biman came from ground handling services., Biman is earning 80% of its total yearly revenue from the passenger’s service, 11% from cargo services, and 9% from other services (Shamsuddula, et al., 2018). Among 80% revenue of passenger’s service, 91% comes from international flights and 4.5% earned from domestic and regional flights. As such, Biman needs to take a holistic approach to uplift customer satisfaction level as it directly related to raising revenue (Ahmed, 2018). Another study (Sultana, 2018) has opined that the current trend of domestic airlines to evaluate the social and financial benefits of Bangladesh have a direct impact on contribution to GDP in the future. Wrecked financial situation, continuous delay of flight schedule, operating fleet with technically old aircraft, higher landing and operating costs, and poor quality of customer service are the reasons for

failing. All these problems in an organization made it unprofitable (Shamsuddula, et al., 2018). Biman Bangladesh Airlines is closing its domestic and international routes. As a result, other domestic private airliners/Biman's rivals have emerged and found prospects as a replacement of BIMAN in its domestic and international routes. As a result, Biman is incurring huge financial deficits/losses resulting in significant reduction in Biman's contribution to GDP (Hasan, 2006). The trend of increasing the aviation fuel price and falling rate of customer service, lack of far-sighted route planning has put Biman's survival at stake. Also, private airlines like US Bangla are suffering because of increased operating cost and find difficulties in gaining profit (Parvin, 2018). The trend of rising global air market has a significant impact on the national economy, as well (Islam, 2019).

2.5 Role of Foreign Airline Operations in Bangladesh and Observations on Some Strategic Aspects of Their Future Business in The Country

The operation of foreign airlines in Bangladesh presents a multifaceted scenario with both potential benefits and inherent challenges. Studies indicate that the entry of carriers like Emirates, Qatar Airways, and Singapore Airlines has enhanced international connectivity, facilitating trade, tourism, and foreign direct investment (FDI) in Bangladesh. Also, foreign airlines help the country's export-oriented industries, such as garments and pharmaceuticals, to access global markets more efficiently (Journal of Transport Economics, 2021). Foreign airlines indirectly play a significant role in overall socio-economic development of Bangladesh through their support to travelers coming to Bangladesh from different countries to visit the country and also, to a huge number of Bangladeshis going abroad for various purposes (studies, job, business and tourism). Notably, Biman Bangladesh Airlines has been operating for more than fifty years, 10 private airlines of the country operated

between 1993 and 2010 (with license issued by the government; ceased operation because of financial problems and management failures) and 4 domestic private airlines are in operation. But the existing air transport market share is still predominantly captured by foreign carriers which is the biggest drawback (Civil Aviation Authority of Bangladesh, 2022). This dominance of foreign airlines can stimulate the economy, particularly through increased tourism and foreign currency influx and through creation of employment within the aviation value chain (Khan & Murad, 2021), (Islam S. , 2022) and (Dev, et al., 2023). Their operation raises concerns about the competition faced by national carriers which may need government protection to facilitate growth and to enable them to have meaningful impact on development of the domestic airlines business in the country. At the same time, the government can also improve an environment for fair competitive for all airlines, including the foreign ones, by improving the aviation infrastructure, bringing an end to corruption, and strengthening the monitoring of the quality of services at all points of contact in the airlines business. An Important area of further work is the management of risk for building confidence in the aviation industry and the tasks involved are making the air space more safe and secure following the rules of the civil Aviation Authority of Bangladesh and international rules and standards and identifying the challenges from both inside and outside, and maintaining air transport security, and public health protocols in air travel. The review of literature on aviation industry further reveals that airports in Bangladesh, especially Hazrat Shahjalal International Airport, suffer from problems like insufficient cargo handling capacity and the absence of a network of smart services units. Some experts emphasize that strategic partnerships and airport modernization under public-private partnerships

(PPPs) could position Bangladesh as a regional aviation hub, aligning with its aspirations for middle-income status (Khan & Murad, 2021).

2.6 **Operational State of Aviation Industry of Bangladesh**

Biman is not rated high in terms of quality of services, comparative fare and tariff, maintenance of flight schedule unscheduled (also, flight cancellations and unscheduled departure and arrival of flights), neatness and cleanliness, in-flight customer service, display of flight information flight information, information service on the ground and transit stopover, orientation to passengers in transit/stopovers, aircraft spaces and charges in terminals, refund procedure and practices (Ahmed, 2018).

The change of loss-making route to profitable route, cutting down of ineffective staffs, purchasing new generation aircraft, upgrading in-flight customer services, improvement of professionalism for cabin crew were few options to make Biman as a revenue earning airliner (Azad, 2016). Biman also requires devoted and skilled manpower to excel as a regional leader in South Asian Region. Notably, out of the seven best practices like employment security, selective hiring, self-managed teams and decentralization of decision making, comparative high compensation contingent on organizational performance, extensive training, rationalization of discrimination in status and sharing information of human resource, Biman maintains only three (Employment Security, Selective Hiring & Extensive Training). The implementation of rest four best practices (Self-managed teams and decentralization of decision making, comparative high compensation contingent on organizational performance, rationalization of discrimination in status and sharing information can make it more profitable and prosperous (Hashmat, 2014).

2.7 Engineering and Maintenance State of Aviation Industry of Bangladesh

In 2005, Biman held a dozen of aircraft in her fleet including DC-10s, Airbus 310s, and a few other brands of aircraft in the short routes. With this fleet Biman Bangladesh Airlines carried out the flights over Middle East routes and hajj flights (Hasan, 2006). Though some researchers (Shaleh & Reza, 2020) argued that inauguration of more state of art aircrafts in the fleet of Bangladesh Aviation industry could make it a profitable organization. Meanwhile, on-board device powering system, in-flight Wi-Fi, USB ports, and flexibility for using spas and hotels, shopping malls, and food outlets in the lounge may improve Biman's profitability (Farzana & Hossain, 2015).

2.8 Contribution of Bangladeshi Airliners to Tourism Growth through Enhanced Connectivity and Strategic Partnerships

Bangladeshi airliners play a key role in boosting tourism by improving connectivity and making travel easier for both domestic and international visitors. National carriers like Biman Bangladesh Airlines, along with private airlines such as US-Bangla Airlines and Novoair, have expanded routes that bring more tourists to destinations like Cox's Bazar, Sylhet, and the Sundarbans (Hossain & Rahman, 2018). Research publications highlight that increasing flight frequencies and direct routes to destinations make these places more accessible, attracting both local and foreign visitors (Islam, 2020). Airlines also use strategic marketing and competitive pricing to promote Bangladesh as a tourist-friendly country (Rahman & Haque, 2022).

In addition to connectivity, airlines collaborate with tourism boards through discounts in fares and promotional campaigns like "Visit Bangladesh 2024" to encourage travel

(Chowdhury, 2023). Improvements in infrastructure such as modernizing Hazrat Shahjalal International Airport, further support tourism growth (World Bank, 2021). While Biman Bangladesh Airlines has strategically positioned itself as a key promoter of the tourism sector of Bangladesh through targeted marketing campaigns, its limited global connectivity confined primarily to London as its sole non-Asian destination disproportionately inflates travel costs for visitors originating from non-Asian markets. This infrastructural shortfall has significantly impeded competitiveness of Bangladesh in global aviation, and the country was ranked 111th worldwide and positioned as the lowest-ranked Asian nation in aviation connectivity. The limitations of Biman had not only restricted its market accessibility but also undermine the nation's potential to capitalize on its UNESCO-listed attractions and emerging tourism offerings (Saha, et al., 2024). However, efforts like code share agreements with international carriers aim to improve connectivity (Bangladesh Tourism Board, 2023). Code share agreements may enable Biman Bangladesh Airlines to extend its global reach by partnering with international carriers, allowing seamless travel for passengers without the need for additional direct flights. Collaborations with airlines like Turkish Airlines, Etihad Airways, and Malaysia Airlines enhance connectivity across Europe, the Middle East, and Asia covering the gaps in Biman's network of international routes. While the aviation sector has significantly contributed to tourism, experts suggest further policy reforms to enhance competitiveness and sustainability. Future research should focus on measuring the economic impact of airlines on tourism and identifying new collaboration opportunities between aviation and tourism industries.

2.9 **State of Administrative and other Affairs of Aviation Industry of Bangladesh**

Poor aircraft maintenance, inferior technology, corruption, increasing debt, and scarcity of skilled workforce are the fundamental weaknesses of Biman and the threats identified are aircraft scarcity, continuous price hikes of aviation fuel, political interventions, business rivals, and new entrants (Mostari, et al., 2015). Moreover, the security issues pose a potential factor affecting the reputation of the airliners (Parvin, 2018).

Biman failed to turn into a profitable organization because of several administrative and operational problems like dilemmas in decision making, lack of accountability and authority of executive body, inadequate number of skilled aviation experts, the undue pressure from vested interest groups, inefficiencies and sometimes, corruption in aircraft leasing and purchase, as well as in repair, overhauling and maintenance, tender process, settlement of outstanding dues, management of outstations of Biman, and in ticketing, reservation, and reconfirmation. Problems also include lack of institutional capacity, mismanagement, shortage of skilled manpower, unplanned routing, poor planning in corporate strategy and improper vision, failure in application of up-to-date avionics and IT. There are also problems in policies and image building and revenue build up, capacity building for in-house repair, overhauling, and maintenance, and failure in product improvement to increase customer satisfaction, fleet renewal, and up-gradation (Shamsuddula, et al., 2018). As such improvement of services (traveler accommodation, in-flight food and beverage, entertainment and recreation, visitor travel services, ground services and other on-and-off airport purchases of goods and services), schedule and capacity

building of Biman as well as of entire aviation industry seems to be an option to keep Bangladesh aviation industries alive in global business (Haque, 2014).

Biman management is said to suffer from political influence, rigid bureaucratic system, employee dissatisfaction, and obsolete aircrafts in the fleet. Fuel price hikes and strong competition from foreign careers are considered potential threats to Biman (Hossain, 2010). Most of the mid and entry-level jobs in Bangladesh Biman are unsecured, the employees are not familiar with teamwork strategy and recruitment, the induction policy is very stringent, and the employees are dissatisfied with the compensations and information compartmentalization (Hashmat, 2014). In this regard, proper HR planning, performance-based reward system, judicious performance management, escalation of business competitiveness, the work of virtual working team, employee reduction, centralized management, realistic policymaking, succession planning, training and development, open-book management, customer-centric management, privatization, and value chain analysis were recommended for the development of Biman (Hasan, 2006).

2.10 **Potentials of Bangladesh Aviation Industry**

Despite the fact that Biman has many limitations, airliner is relatively strong in terms of skilled pilots and competitively priced of tickets that help in retaining customers (Hasan, 2006). Biman's major strength includes its brand image, skilled manpower, hospitality, and huge operational investment (Hossain, 2010). Biman introduced direct flight in Dhaka-London route, about 75% of British Bangladeshi/Sylheti's choose Biman over its rivals because of native crews, homely environment, food with known taste, and extra baggage allowances(Mostari, et al., 2015).

2.11 **Findings**

Bangladesh's sky is not fully exploited by the foreign carriers. As such, Bangladesh is yet to place a concerted effort to benefit from the vast potentials of aviation sector. Demand for aviation industry is closely linked to the economic development of a country and at the same time, is said to be the one of the drivers in an economy. So, this sector needs to maintain the pace with the global development in the same field. A major problem for Bangladesh is the inadequate infrastructure and poor logistics support for which foreign carriers' operation in the country is limited. There is no denying the fact that air travel promotes tourism but Bangladesh is yet to synchronize a successful coupling of these two industries.

In the present context, Biman Bangladesh Airlines significantly suffer from many problems and limitations, including in service qualities including (in-flight service to passengers and to transit passengers entering the terminal), comparative fare and tariff, flight schedule, neatness and cleanliness, airport security, aircraft spaces and charges, refund procedure and amounts, display of flight information and others. Though Biman is emerging as a foreign currency earner, the airliner faces problems as mentioned above, as well as in handling issues like inadequate training of staff, managing low demand routes, successive price hike of aviation fuel, scanty infrastructural development, unserviceability rate of commercial aircraft, repair and maintenance facilities and overdue bills. Measures required for overcoming the constraints and limitations include development and modernization of training and fleet, improvement of the customer services, ensuring performance evaluation of the staff, formulating a better decision-making process, establishing chain of command, and developing an efficient communications system. However, despite the fact that Biman has many problems, according to the assessment of some researchers, the

airliner performs good thanks to continuous funding by the government, the airline's team of skilled pilots, the comparatively low price of tickets, and a fair acceptability of its hospitality, in flight homely cuisine and extra baggage allowances, which altogether helps in retaining customers.

2.12. **Identification of Latent Constructs and Measured Variables from Review Data**

Based on the comprehensive review of literature, this study has systematically derived a total of 18 key variables critical to understanding the dynamics of the Bangladeshi aviation industry. The framework comprises 3 Dependent Variables (DVs) that represent core outcomes of interest: Airline Profitability/Financial Performance, Customer Loyalty, and Customer Satisfaction. These are influenced by 15 distinct Independent Variables (IVs) spanning multiple operational dimensions, including Service Quality, Operational Efficiency, Fleet Modernity, Human Resource Management, and Government Policy, among others.

Collectively, these variables encompass 48 specific attributes and indicators that provide measurable facets for each construct. The detailed breakdown of these variables, including their complete operational definitions and attribute mappings, is documented in Annex 2 of this study. The distribution reveals important analytical insights: the operational and customer-facing domains (Service Quality, Operational Efficiency, Human Resources) contain the highest concentration of attributes (13 total), emphasizing their perceived criticality in the literature. Furthermore, the variables are supported by citations from 21 different scholarly sources published between 2006 and 2024, demonstrating a robust foundation in existing research while highlighting the multi-faceted nature of the industry's challenges and opportunities as identified by various experts over nearly two decades.

This foundational framework will guide the subsequent phases of the research. A further extended literature review and specific theoretical deep-dives will be conducted, focusing precisely on the relationships between these identified DVs, IVs, and their attributes. The development of the study's specific research hypotheses will be directly structured around testing the influence of the independent variables on the dependent variables. The scope and depth of this continued review will be strategically tailored to the final research objectives, title, and the specific causal relationships proposed within the hypothesis framework.

2.13 **Research Gap**

In the process of review of literature, it is found that so far, the following areas and issues had not been researched or had remained under-researched:

a. The literature on the aviation industry of Bangladesh is scanty and many aspects still remain beyond the attention of researchers;

b. There is practically no significant professional study on the prospect of aviation industry of Bangladesh and there are hardly any analysis and assessment of the factors leading to success or failure of aviation industry of Bangladesh as a whole or of any individual airline operating in the country, as well as on the factors responsible for success or failure in the sector;

c. Many of the few papers so far written by experts on aviation industry of Bangladesh are, not published and are not easily available;

d. No study on stakeholders of civil aviation in Bangladesh and airlines (Biman Bangladesh Airlines, private sector carriers such as US Bangla, Novo

Air, Regent Air, United Air), individually for an airliner or in general as a group, has been conducted so far;

e. The available studies on aviation industry of Bangladesh are mostly based on secondary sources and they have rarely used any empirical data base generated through any survey;

f. There is practically no study on impact of airlines' operation in Bangladesh on tourism or even broadly, the socio-economic development and also, on the opportunities of collaboration between aviation and tourism industries for such impact.

g. No study has been found to identify the means and ways to make the passengers loyal to the specific airliners and assess how the loyal customer in varied in the commercial and cultural contexts remained unexplored;

h. Some researchers working on the global aviation industry do have used survey-based data through large sample sizes and they analyzed the data through SPSS, Amos, and Smart PLS.

This dissertation is the outcome of an effort in filling up the gaps in research on customer loyalty and customer services in aviation business in Bangladesh, and especially in Bangladesh Biman Airlines. The standard data collection and sampling procedure have been followed. To get optimum result, sample size was kept adequate and data analysis and interpretation have been done by using data analysis and visualization programming languages python and R along with modern statistical packages.

2.14 **Area of Future Studies**

Aviation Industry of Bangladesh is an understudied area for research and requires attention of researchers and policymakers. So far, no study has been conducted on

all the stakeholders of the aviation industry of the country and the performance Biman Bangladesh Airlines and domestic private airliners like US Bangla, Novo Air, Regent Air, United Air and others. Studies may be conducted on measuring the economic impact of airlines on tourism and identifying new collaboration opportunities between aviation and tourism industries on the basis of the industry's real-time larger data and using modern programming languages/statistical packages/software for data processing, analysis and interpretation.

Special studies may be conducted with focus on the factors or failures of the industry in Bangladesh, the aviation management, commercial issues, customer service, flight safety, engineering issues, travel and tour operation, ground services and flight operations. Biman's customer service poses a special issue of research as the carrier needs to improve customer service in order to enhance the customer loyalty. Such studies will enhance the existing body of knowledge in respect of different facets of customer loyalty and the factors which may affect it.

2.15 **Chapter Summary**

This chapter has presented key findings and observations from a review of literature on customer service of airlines and customer loyalty to them, especially to Biman Bangladesh Airlines Limited. The review has revealed an overall picture of the stated area and also, the contribution of the aviation industry of Bangladesh to national economy, and some dimensions of the operational, administrative, financial, engineering and maintenances aspects of the industry. Also, a few observations have been made on the constraints and challenges.

The review considered some empirical results presented in the studies of the past and could identify some challenges of its passengers using Biman Bangladesh

Airlines. It has been found that the passengers of Biman Bangladesh Airlines are not satisfied to the airliner's service and they are not loyal to the airliner. Some researchers have found that the Biman Bangladesh Airlines is good in terms of customer services, but according most others, the airliner does not enjoy much of customer loyalty because of poor customer service. Researchers draw their attention to the need for improvements in many areas including in-flight and on-the-ground customer service, regularity in flight schedules, upgrading the ticketing and refund system, information availability, passenger safety etc., and the suggestions proposed are improvising in promotional offers such as frequent flyer program, adjustment of fares and tariffs, planning and implementation of infrastructure development designs, addition of modern aircraft into the fleet, flight safety and ground security, improvement in display of information at terminals. The brand image of the Biman Bangladesh Airlines may be enhanced by maintaining the schedule payment of overdue bills, massive training for pilots, engineers and flight/ground crews, and proper utilization of the national aviation infrastructure.

The review led to identification of the research gap and the scope of contribution of the present study. Accordingly, the methodology of the study had been designed, data had been collected and analyzed and the findings and interpretations had been presented in chapters 4, 5, 6, 7 and 8.

Chapter 3

THE SATISFACTION-LOYALTY NEXUS: A FOCUSED LITERATURE REVIEW

3.1 Introduction

Aviation industry is a huge sector in terms of services and air transportations. It has been observed that the formation of the aviation industry of Bangladesh and its chronological development is associated with Biman Bangladesh Airlines Limited and three domestic private airliners (Regent Air, Novo Air, US Bangla) (Sultana, 2018). The business and services provided in aviation industry is quite large. This study has been kept limited only on issues involving the relationship among the factors involved in customer service quality and customer loyalty. A review of literature has been carried out to reveal how enhancement of customer loyalty can be achieved through improved customer service. Although Bangladesh aviation industry has long been associated with four main airliners like Biman Bangladesh Airlines Limited, Regent Air, Novo Air and US Bangla, however, Biman Bangladesh Airlines, the national flag carrier airliner of the country, has the largest share of the clients and this study examines the impact of factors involved in customer service quality on customer loyalty of Biman only.

This chapter presents a review of the literature on customer services quality and loyalty within the aviation industry with a view to understanding the status and issues in the area and developing the hypotheses and the theoretical framework of research under the proposed DBA study. The review has been made for revealing the challenges and prospects of aviation industries of Bangladesh and, some of international airliners operating in South Asia. Some of the works reviewed (Webster & Watson, 2002), (Hart, 2001) and (Black, 1994) are directly relevant for the topic of

the present research and two major concerns in the context are: the shortcomings in customer service of Biman Bangladesh Airlines and the ways to resolve the problems and retain the customers loyal to the airline.

This chapter has been organized in three sections. Key terms have been discussed in section 3.2 to 3.4, which focus on the major aspects covered in the study. Sections 3.5 and 3.6 propose theoretical and conceptual framework of the research. Section 3.7 provides details of research gaps i.e., areas and issues that had not been so far researched or remained under-researched. A summary of the unexplored and understudied areas and the need for further studies are also discussed in this section. Finally, section 3.8 presents a summary of all sections of this chapter.

3.2 Operationalization of Variables: Factors and Measurable Attributes

Based on the extensive literature review of the previous chapter, a comprehensive set of factors and their attributes influencing customer satisfaction and loyalty in the airline industry has been identified. The earlier review revealed 18 independent variables and 3 dependent variables (Chapter 2, para 2.12) and as shown in table 3.1. Considering research objectives, scope of the study and accessibility of information, from these, 10 key factors were selected for further study, which are broken down into 40 specific, measurable attributes. The dependent variables, Customer Satisfaction and Customer Loyalty, are also defined by 4 and 7 attributes, respectively. A detail about the variables and attributes derived from the literature review is attached in Appendix 1 and factors and attributes studied are shown in table 3.1. The following section reviews these 10 critical factors and their attributes in detail to justify the research objective 1 and 2. The following table details this final selection.

Table 3.1: Operationalization of Research Variables: Selected Factors and Their Attributes

Variable	Factors Revealed (18)	**Factors Studied (10)**	Attributes (40)
Independent Variable (18)	Aviation Industry & Services, **Airliner's Brand Reputation**, Aviation Industries of Bangladesh, **Passenger's Trust**, **Staffs Service**, Strategic Implications of Foreign Airlines, **Price/ Ticket Fare**, Contribution to National Revenue, **Airline Safety**, Operational State, **Frequent Flyer Program**, Engineering & Maintenance, Administrative State, **Route Availability and Convenience**, Service Quality	Passenger Trust	5
		Brand Reputation	6
		Staff Service	4
		Airline Safety	3
		Route Availability	2
		Frequent Flyer Program	2
		Price	4
		Improved Customer Service	3
Dependent Variable (03)	Customer Satisfaction	Customer Satisfaction	4
	Customer Loyalty	Customer Loyalty	7
	Airline Profitability/Financial Performance		

Source: Author

Based on an extensive and systematic review of scholarly literature, the ten core factors selected for this study as Passenger Trust, Brand Reputation, Staff Service, Airline Safety, Route Availability and Convenience, Frequent Flyer Program, Price, Improved Customer Service, Customer Satisfaction, and Customer Loyalty have been rigorously identified to address a critical research gap: the lack of an integrated

model that examines their collective influence on passenger behavior specifically within the unique context of Biman Bangladesh Airlines, a national carrier in a developing economy. This comprehensive literature review not only justifies the research objective to pinpoint the key drivers of loyalty but also provides the necessary theoretical foundation to formulate the study's testable hypotheses, which posit specific relationships between these factors, ultimately aiming to explain how they converge to shape passenger satisfaction and foster lasting loyalty.

3.3 **Customer Satisfaction**

Satisfaction refers to a person’s feeling or emotions perceived from their expectation and wish (Hao, et al., 2015). Satisfaction is a kind of cognitive appraisal process in the comparison between the actual product performance and the previous expectation by customers (Filip, 2013) and satisfaction of customers is a temporary phenomenon based on emotional reaction of consumers (Oliver, 1980). Satisfaction is the level of pleasant feeling when customers receive products or services. It is the result of the correlation of a customer’s comparison between perceived service and expected service. If the quality of the products or services that customers receive is less than expected, then dissatisfaction occurs. Equally, satisfaction occurs when the product or service match with expectations. That is, the higher the perceived quality of products or services than expected, the higher the satisfaction (Kotler, 1997). Satisfaction of customers is a result of the purchase and use, which is produced by the comparison of the remuneration of expected results and the investment cost by buyers (Surprenant, et al., 1982). Satisfaction can generate from and depend on the salesperson’s performance, attitude, and service quality when they buying or using the goods from them (Vieira, et al., 2008). Other scholars confirmed the direct positive relationship between satisfaction and behavioral intention (Park, 2010) and

(Kim, et al., 2016). Consumers will use emotional statements to express the positive or negative emotion on the usage of products, thereby affecting their satisfaction (Cadotte, et al., 1987). Moreover, many studies found that satisfaction positively affects loyalty (Forgas, et al., 2010).

Satisfaction is the result of expectation, while the expectation is partly derived from previous experience (Cardozo, 1965). Customer satisfaction is defined as a measurement that determines how happy customers are with a firm's product, service and capabilities. Customer satisfaction is also one of the hot topics in marketing for all time because it plays a vital role in achieving organizational goal. However, it is not only a measurement of performance, it also characterizes the quantity and the quality of organization (Munusamy & Chelliah, 2011). According to some experts, customer satisfaction is defined as 'pleasurable fulfillment' (Oliver, 1999), it is "an emotional response to the experiences provided by, associated with particular products and services purchased, retail outlets, or even molar patterns of behavior such as shopping and buyer behavior, as well as the overall market place" (Yi, 1990). A consumer senses that consumption fulfils some need, desire, goal, or so forth, and that this fulfillment is pleasurable.

Customer satisfaction is determined by the gap between the services that customers get and the expected services (Parasuraman, et al., 1988). In that sense, customer satisfaction determines the gap between the expectations of customers and the quantity satisfied. Customer satisfaction of airline may be measured by the number and service quality of an airline's employees, technical and physical resources, the specifications and facilities of the aircraft, food, and responses to queries of passengers (Gronroos, 1984). The list of the drivers of customer satisfaction in airline industry also includes pre-flight services, in-flight services, baggage handling,

in-flight digital services, and post-flight services (Archana & Subha, 2012) . Passenger satisfaction ranking in Biman Bangladesh Airlines depends on schedule and duration of flights, baggage and fare policy, security, and service quality. Some other factors involved are smooth take-off and landing, cabin crew offering for fastening seat belts, food and refreshment, extra baggage allowance, and overall flight safety issues (Parvin, 2018).

Airlines enjoy more satisfied customers and consequently, more passengers when they deliver more quality services (Gronroos, 1984), (Archana & Subha, 2012) and (Khan & Khan, 2013). Therefore, understanding passengers' needs and expectations and then developing high quality service to meet them will provide airline companies a competitive advantage in comparison with their rivals. There exists quite a broad consensus that customer satisfaction is an antecedent of loyalty (Morgan & Hunt, 1994) and (Forgas, et al., 2010).

Airlines of all types and sizes have started since long to give more emphasize on customer satisfaction because they have realized that getting new customer is costly as compared to just keeping existing customers (Hill & Alexander, 2006). If a customer gets satisfied with an airline, s/he returns to it for new purchases and recommends the airline to others (Kim, et al., 2016). The demonstration of such impact of customer satisfaction and customer loyalty is not the same for all industries. Loyal customers are not necessarily satisfied customers, but satisfied customers tend to be loyal customer (Fornell, 1992). This leads us to the following hypothesis:

> **General Hypothesis**: Customer satisfaction has a positive and significant effect on customer loyalty in the airline industry.

Specific Hypotheses for Biman Bangladesh Airlines Limited:

Hypothesis H_1 (Main Hypothesis): Customer satisfaction has a positive and significant effect on customer loyalty among passengers of Biman Bangladesh Airlines Limited.

Hypothesis H_{10} (Null Hypothesis): Customer satisfaction has no significant effect on customer loyalty among passengers of Biman Bangladesh Airlines Limited.

Hypothesis H_{1a} (Alternative Hypothesis): Customer satisfaction has a positive and statistically significant effect on customer loyalty among passengers of Biman Bangladesh Airlines Limited.

3.3.1 **Passenger's Trust**

Trust is defined as users' perception, opinions, emotions, or feelings that occur when consumers think that the provider can be relied upon to act in their benefits (Patrick, 2002). Customer trust is the real circumstance when certain people support the service by exchanging reliability and integrity (Moorman, et al., 1993), which are assessed by the confidence of customers. Trust refers to the will of consumers to believe their exchange partner with honesty and integrity (Wang, 2009). Each service provider receives multiple level of trust from customers based on the customers perceived quality of service compared with the provider's definition of such services. Furthermore, trust is important for defining the relation model, which presents the relationship between brand and customers (Morgan & Hunt, 1994). Trust is built when customers do not hesitate to believe in the provider of services or the organization's intentions and customers think that they will not deliberately do

anything to harm them. Trust exists when consumers have positive perception regarding the performance of product, its brand and the organization's behavior (Chaudhuri & Holbrook, 2002). Some studies found that trust is directly and positively related to loyalty(Forgas, et al., 2010). The hypothesis developed on the basis of the above is:

General Hypothesis

H_2: Customer trust in a service provider is positively related to customer loyalty.

Specific Hypothesis for Biman Bangladesh Airlines Limited

H_2 (Main Hypothesis): Customer trust has a positive and significant effect on customer loyalty among passengers of Biman Bangladesh Airlines.

H_{20} (Null Hypothesis): Customer trust has no significant effect on customer loyalty among passengers of Biman Bangladesh Airlines.

H_{2a} (Alternative Hypothesis): Customer trust has a positive and statistically significant effect on customer loyalty among passengers of Biman Bangladesh Airlines.

3.3.2 Airliner's Brand Reputation

Brand image is defined as "perceptions about a brand as reflected by the brand associations held in consumer memory" (Keller, 1993) including an attitude that reflects the blending of beliefs, impressions, and ideas of customers to products, services, persons, companies, or brands (Kotler, et al., 1993). Corporate reputation means the perception of the consumer about the airline's general operation, safety, and other factors (Graham & Bansal, 2007). Organizations with a positive image can retain current customers, attract new customers, and stand out from competitors

(Connor & Davidson, 1997). Several distinct factors influence the corporate reputation of an airline. These include (at least) financial performance, safety endorsements (such as the FAA in the United States), size and age of the airline, and safety record, particularly, recent incidents (Graham & Bansal, 2007). (Graham & Bansal, 2007) also examined consumer willingness to pay based on airline's reputation and found an increased willingness-to-pay for induced by the airline's reputation. Customers evaluate the efficiency and provided services of an airline, which is a factor that positively influences behavioral intentions(Park, 2007) and the also the loyalty to the airline industry (Mikulic & Prebezac, 2011). In Bangladesh perspective, recruitment of skilled manpower, practicable training, in-flight customer service monitoring mechanism, customer information system in emergency, accountability and bureaucracy-free management are recommended as the most potential steps to gain the image of Biman (Parvin, 2018).

National carriers are perceived to have a better reputation than regional or local carriers and, in some countries, the national carriers gained an increase in loyalty of customers (Dolnicar, et al., 2011). In any case, the studies differ on their observations on what is to be considered the determining factor in assessing airline's brand image. For example, a study on Chinese passengers observed that they were far more concerned about on-time performance than airline's reputation otherwise (Zhang, 2011). This study also found that Chinese domestic carriers did not generally have strong brand identities or significant public reputations. A study in Saudi Airline identified that the airline's reputation is created by a cluster of factors related to the consumer's airline choice (Bukhari, et al., 2012). This sub-section of the literature review helps developing the hypothesis as under:

General Hypothesis H_3: A positive brand reputation of an airline is positively related to customer loyalty.

Specific Hypotheses for Biman Bangladesh Airlines Limited:

H_3 (Main Hypothesis): A positive brand reputation has a positive and significant effect on customer loyalty among passengers of Biman Bangladesh Airlines.

H_{30} (Null Hypothesis): Brand reputation has no significant effect on customer loyalty among passengers of Biman Bangladesh Airlines.

H_{3a} (Alternative Hypothesis): Brand reputation has a positive and statistically significant effect on customer loyalty among passengers of Biman Bangladesh

3.3.3. **Airlines Staffs Service**

Staffs' services are the services provided by the airline's staff and cabin crews (Ekiz & Hussain, 2006). Personnel play a vital role in service quality as they are the ones who have contact with the passengers (Babbar & Koufteros, 2008). Personnel factors work as how the employees treat/give services to the customers (Farooq, et al., 2018). Personnel have a significant impact on customer satisfaction (Ali, et al., 2015). The list of factors considered to have significant contribution to improving the revenue earnings of Biman Bangladesh Airline cutting down of ineffective staffs, improvement of professionalism of the cabin crew and development of devoted and skilled manpower along with alteration of loss-making route to profitable route, purchase of new generation aircraft, and upgrading in-flight customer services which can turn Biman into a regional leader in South Asia (Rahman, et al., 2020). The sector is emerging as one to earn foreign exchange but the problems that it continues to face now are the failure in sales at competitive fare, maintaining quality

customer services, airline security, regular flight schedules, and adequate ground handling capacity, and lack of facilities for continuous training and upgrading of skills of its staffs (Sultana, 2018). Some researchers (Shamsuddula, et al., 2018) observed that poor passenger and in-flight service, failure in flight schedule and in informing passengers about flight delays and cancellations, lack of skills of the crew, non-availability of shuttle flight, unplanned route planning, disruptions in ticket reconfirmation etc. are some major reasons why Biman Bangladesh Airlines lose passengers. The hypothesis developed on this basis is:

General Hypothesis H_4**:** The quality of airline staff services is positively related to passenger satisfaction.

Specific Hypotheses for Biman Bangladesh Airlines Limited:

H_4 (Main Hypothesis): The quality of staff services has a positive and significant effect on passenger satisfaction with Biman Bangladesh Airlines.

H_{40} (Null Hypothesis): The quality of staff services has no significant effect on passenger satisfaction with Biman Bangladesh Airlines.

H_{4a} (Alternative Hypothesis): The quality of staff services has a positive and statistically significant effect on passenger satisfaction with Biman Bangladesh Airlines.

3.2.4 Airline Safety

Airline safety is also one of the major components of airline reputation (Graham & Bansal, 2007). In fact, it is one of the most important components, both on its own and when recognized by external endorsement from a safety agency such as the FAA (Graham & Bansal, 2007). In general, airline safety is increasing with a reduction in the rate of accidents despite a significant increase in passenger figures

since the 1970s (Barros, et al., 2010). This study also showed that airlines responded to safety demands by making safety improvements and marketing them in order to inform consumers about them (Jou, et al., 2008). This is probably due to improved engineering and airline safety improvements because of increased competition. It can be expected that airline safety will play a role in airline choice (Buaphiban, 2015).

A study on Turkish airline Pegasus clearly noted that the airline safety is the most important factor to measure (Atalık & Özçelik, 2007) and similarly, at least two studies on Chinese aviation industry resonance the same by saying that “airline safety was one of the main factors in the choice of airline in the Chinese market” (Jou, et al., 2008) and that “the Chinese passengers rated safety as the most important factor in their choice of airline” (Zhang, 2011). Despite variations in scale, the perceptions of airline safety may remain as a key factor in choice of airline. The concern for airline safety in the United States had intensified after the event of the 11thSeptember and the perceived risk of air travel did increase substantially (Cunningham, et al., 2004).

A study of airlines in Malaysia suggests that there may also be a gap between passenger perceptions of airline safety and the related regulatory safety assessments (Oyewole, et al., 2007). This study found that passengers routinely rated airlines as being less safe than their actual safety records suggested. This means that passenger perceptions of safety systems may differ substantially from the actual safety of the airline, but it may still influence the airline choice. Despite that facts that Biman Bangladesh Airlines have credible safety records, it is often a passing remark that the airports it uses at home do not have proper safety procedures, the online reservation and booking system often fails, staffs often fail to

show proper attitude, access to information is weak, the spaces lack cleanliness and entertainment facilities, and flight schedule frequently fail (Rahman, et al., 2010).

In general, airline safety perceptions are part of the decision process for airline choice. However, the exact role of individual factors is not measurable because of the lack of specific information about the status and individual components of the airline safety. This is a gap in the research that might be filled in by the current study. The airline safety perceptions are therefore included in the research framework for this study. This led to formulation of the next general hypothesis as under:

General Hypothesis H_5: Passenger perceptions of airline safety are positively related to their choice of airline.

Specific Hypotheses for Biman Bangladesh Airlines Limited:

H_5 (Main Hypothesis): A positive perception of safety has a positive and significant effect on the loyalty of Biman Bangladesh Airlines among potential passengers.

H_{50} (Null Hypothesis): Passenger perceptions of safety have no significant effect on the loyalty of Biman Bangladesh Airlines.

H_{5a} (Alternative Hypothesis): Passenger perceptions of safety have a positive and statistically significant effect on the loyalty of Biman Bangladesh Airlines.

3.3.5 Route Availability and Convenience

Several studies have shown that route availability and convenience is a major factor in the choice of airlines. This is an obvious factor because of the way airline networks are structured. With only a limited number of airlines operating from any one airport and with varying routes from that airport, the passengers' choice of airlines is constrained (Hess & Polak, 2006). Typically, passengers will have the choice of only

one or a few airlines at the origin and desired destination and may have to accept new airlines for transfers or for some special reasons (Hess & Polak, 2006). Thus, the choice of airline is a two-stage problem, with the origin and destination selected first, and a choice of transfer airlines for special reasons.

One of the reviewed studies showed that the origin/destination pairs, transfer requirements, and departure times were the main reasons for selection of an airline (Eggermond, et al., 2007). Schedule convenience was also a factor (Atalık & Özçelik, 2007). Chinese passengers are known to place a high value on a large network, which maximizes their choices (Zhang, 2011). Transfers and itineraries can also affect choice; for example, passengers that are highly risk-averse are likely to avoid transfers and short connections if possible (Theis, et al., 2006). This is because of the anticipated risk of missing a flight and the stress of a short connection. A study of South African passengers indicated that flight frequency was significantly more important for full-service passengers than LCC (Low-Cost Carrier) passengers (Fourie & Lubbe, 2006). This suggests that passengers make a tradeoff between frequency and price. A study of Spanish passengers showed that route timings (such as weekend or weekday travel), as well as route availability, were major factors in the choice between an LCC and an FSC, as was the requirement for a transfer (Castillo-Manzano & Marchena-Gomez, 2010).

The empirical evidence is highly complex and suggests several factors can influence the importance of route beginning from the two-stage decision and moving through specifics such as direct flights or transfers, departure and arrival time, and requirement to transfer, and even down to the time of day. The general hypothesis developed on the basis of all these is:

General Hypothesis H_5: Route availability and convenience significantly influence passenger airline choice.

Specific Hypotheses for Biman Bangladesh Airlines Limited:

H_6 (Main Hypothesis): Route availability and convenience have a positive and significant effect on the customer loyalty of Biman Bangladesh Airlines among potential passengers.

H_{60} (Null Hypothesis): Route availability and convenience have no significant effect on the customer loyalty of Biman Bangladesh Airlines.

H_{6a} (Alternative Hypothesis): Route availability and convenience have a positive and statistically significant effect on the customer loyalty of Biman Bangladesh Airlines.

3.3.6 Frequent Flyer Program

Frequent flier programs are incentive programs offered by the airline which offer benefits (such as free tickets, enhanced service levels, or routing and ticket preferences) to passengers who consistently choose the airline or its partners (Carlsson & Lofgren, 2006). In the airline industry, frequent flyer programs have become one of the most used marketing tools for retaining customers and stimulating product or service usage. Despite their growing popularity, little is known about the factors that influence customer's perceptions and responses to such programs (Kivetz & Simonson, 2003). A frequent flier program influences passenger choice because it increases the switching costs by introducing opportunity costs for selecting another airline. Simply put: if a frequent flier chooses a different airline, he or she will not earn frequent flier points and subsequent benefits. This means that where they are routine, especially in full-service carriers, frequent flier programs are a major factor in the passenger's airline choice (Carlsson & Lofgren, 2006). Airline

choice is a two-step process, where consumers first select a subset of airlines into their choice set and then determine the winning airline in a second step (Suzuki, 2007). Factors that play a significant role in airline choice include the price of the airfare, frequency of flight services provided to the required destination and frequent flyer membership status (Suzuki, 2007). Frequent flier programs are also known to be a key driver in airline behavioral loyalty or routine selection of the airline by the passenger (Dolnicar, et al., 2011).

In a study of 497 actual business flights taken by employees of three medium-sized companies it was found that the factor that had the biggest impact on airline choice had been the number of flights to the destination and the other factors that followed were the percent of direct flights to the destination, the total travel time, frequent flyer programs, fares, and the records on arrival on time (Nako, 1992). Frequent flier programs influence does influence airline choice but this loyalty is not absolute since the passenger still selects origin and destination pairs (Hess & Polak, 2006). One study, for example set a choice task for respondents, including the following characteristics to describe each airline: price, penalty for ticket changes, free food, comfort, frequency and reliability and it found that all these factors (each measured using multiple items) had a significant impact on airline choice (Espino, et al., 2008).

Assessing the role of frequent flier programs in choice of airlines is difficult because of the parallel role of other factors such as price, satisfaction, airline image or reputation, and choice of participants in a group (Park, 2010). The effects of the various factors vary depending also on the culture and practices of the airlines (Park, 2010). Some also point out that it is not enough to discuss loyalty to airlines or their special programs or packages without considering the condition of the customers (Dowling & Uncles, 1997). In some cases, for example, Biman Bangladesh Airlines

offered a special program in 2013, which could not attract travelers because the program did not match the requirement of the travelers and therefore, they did not show interest in the program (Farzana & Hossain, 2015). So, from this discussion, the next hypothesis drawn is:

General Hypothesis H_7: Frequent flyer program membership is a stronger driver of loyalty that significantly influences passenger airline choice.

Specific Hypotheses for Biman Bangladesh Airlines Limited:

H_7 (Main Hypothesis): Membership in Biman Bangladesh Airlines' frequent flyer program is a stronger driver of loyalty that has a positive and significant effect on passenger choice and loyalty.

H_{70} (Null Hypothesis): Membership in Biman Bangladesh Airlines' frequent flyer program has no significant effect on passenger choice and loyalty.

H_{7a} (Alternative Hypothesis): Membership in Biman Bangladesh Airlines' frequent flyer program has a positive and statistically significant effect on passenger choice and loyalty.

3.3.7 Price/Ticket Fare

Price is defined as what customers pay in exchange for the benefits accruing from a product or service (Lovelock & Wirtz, 2011). A theoretical economic study of passenger airline choice showed that price was one of the main determinants of airline choice (though airlines did not respond by reducing the price of airline tickets, instead they increased safety and convenience to justify the increase in price (Jou, et al., 2008). The theoretical position of price as a major was one of the most important factors in airline choice (Dolnicar, et al., 2011). Price has both monetary and non-monetary characteristics (Parasuraman, et al., 1988). Monetary characteristic is what customer pay to get the product or service and non-monetary could be how a

customer perceives the value of the price. In the past, price used to be same for the same route when there was no regulation of price in the airline industry. Now the situation has been changed. Many airline companies have started to make pricing strategy (Shaleh & Reza, 2020).In some cases the airline has a good strategy to generate extra revenue, besides core ticket price, by adding some charge on onboard food, premium seat selection, and extra legroom (Shaleh & Reza, 2020). The airline also exercises seasonal pricing, and charge enhanced price when there is an increased demand for tickets in a particular season (Shaleh & Reza, 2020).

Price is one of the main determining factors of airlines for Korean and Australian passengers, especially as compared to the perceived service received (Park, 2007). A study of airline passengers in multi-airport regions (Hong Kong) found that price was the most important factor in selection of the departing airport and destination (Loo, 2008). In another study, which surveyed a group of airline passengers (n = 687) found that price was the second most important factor in the formation of passenger loyalty in terms of repeatedly choosing to fly the same airline (Buaphiban, 2015). This study shows that the price of the ticket can be the supportive factor for the first stage of the decision as well as for the second stage (Loo, 2008). Another study of LCCs confirmed the importance of price in the choice of LCCs (Davison & Ryley, 2010).

A recent study on LCC choice examined the impact of low prices and low service quality promises in Malaysian LCC travelers ((Chan, 2014). The study found that quality problems had caused dissatisfaction and such quality problems included cramped cabins, poor seating and crowding. But the dissatisfaction ultimately did not matter as the prices were low implying that the strategy of low pricing to avoid high

expenses in quality services worked and consumer ignored the issue of quality by being satisfied with the price.

A study of Irish and Malaysian full-service and LCC (Low-Cost Carrier) airlines found that while price was a major factor for the Irish airlines, this was not the case for Malaysian airlines (O'Connell & Williams, 2005). Instead, the Malaysian airline passengers were more driven by factors like service quality (although price was also important). A study of South African passengers suggested that LCC passengers were highly price-sensitive and would readily switch to a full-service airline if the price was lower (Diggines, 2010). However, passengers on full-service airlines were price-insensitive and were reluctant to switch even in cases where the price was less by up to 30%. A study of airline choice in the San Francisco Bay Area found that fare prices were important, but the region has several major airports and passengers preferred to make a trade-off between better service, and low pricing comparing with the flying schedule, comfort, route convenience and affordability (Hess & Polak, 2006).

Not all kinds of passengers are driven primarily by the price of air tickets. For example, business passengers (especially those traveling on centrally arranged itineraries) may have little knowledge or control over prices of their tickets (Evangelho, et al., 2005). Corporate cultures, especially in larger organizations, may also encourage business passengers to select more expensive tickets without regard to cost (Evangelho, et al., 2005). This is contrary to leisure travelers, for whom price is often (though not always) highly important.

The airline industry also uses market segmentation; vacationers, business travelers and group operators to maximize their profit like other industries (Donovan, 2005).

Price is associated with the service and passengers are also sensitive regarding service. If there is a little or no difference between the services offered in the airline industry, a customer may just choose the cheapest airline (Lovelock & Wirtz, 2011).

Air ticket prices lower than those of the competitors can attract more customers and may stimulate demand in the off-peak period. Price is also associated with customer satisfaction, after buying service; the customer measures the satisfaction by comparing to services of other airlines. When a customer receives good service according to the price then she/he tends to build a relationship with the airline and gracefully agrees to buy the service at service provider's asking price. When a customer does not receive a good service from the airline, s/he is not coming next time to fly with the same airline and most likely, the customer will change airline (Low, et al., 2013).

It seems rational to include the differentiation between LCCs and FSCs in the present study largely because of the dominance of price as a factor in airline choice. This differentiation may not be the only factor, and therefore, several other factors should also be studied and such other aspects are discussed in the later sections of this chapter. The following hypothesis has been developed from the discussion made so far:

General Hypothesis H_8: Price sensitivity significantly influences passenger airline choice.

Specific Hypotheses for Biman Bangladesh Airlines Limited:

H_8 (Main Hypothesis): Price sensitivity has a significant effect on the Customer loyalty in Biman Bangladesh Airlines among potential passengers.

H_{80} (Null Hypothesis): Price sensitivity has no significant effect on the customer loyalty in Biman Bangladesh Airlines.

H_{8a} (Alternative Hypothesis): Price sensitivity has a significant effect on the customer loyalty in Biman Bangladesh Airlines.

3.4 **Service Quality**

Understanding service quality means “the overall assessment of a service by the customer” and it is “the difference between customer expectations of service and perceived service” (Sandaruwan & Pathmini, 2016). According to Sandaruwan and Pathmini, if expectations are greater than performance, then perceived quality is less than satisfactory and hence customer dissatisfaction occurs.” In other words, “service quality is a function which determines the gaps between the customer’s service expectations and perceptions of the delivered service” (Parasuraman, et al., 1988). Service quality has an association with superiority of a product, too and the concept is expressed by the statement that service quality is assessed as the judgment of consumer´s regarding the superiority of a product or service in a holistic view (Zeithaml, et al., 2009). In case of an airline’s service quality, it is both perceived value and overall satisfaction as direct influences on passengers shaping their behavioral intentions (Chen, 2008).

The two factors that influence service quality are the expected service and perceived service and when customers meet the expected service as perceived then they become satisfied and when service exceed expected service then customer become delighted (Parasuraman, et al., 1985). The service comprehensiveness is a major factor in airline passenger choice (Jou, et al., 2008). Thus, it is likely to be a more complex measurement than price. Airlines need to improve their service quality

continuously to fulfill the customer's needs and desires to make customer happy. Service quality could be a competitive advantage and by improving service quality, an airline can be beneficial in many ways such as: creation and development of a relationship with customer, increase in repurchase activities and customer loyalty, spreading of positive word-of-mouth to others by the loyal customers, who will do the free marketing as advocates of the airline (Park, et al., 2005). The cost incurred for maintaining and upgrading service quality is therefore, an investment rather than an expense to an organization (Hussain, et al., 2015).

The study of Pegasus Air (a Turkish LCC) referred earlier has found that on-time service was the second-most important factor in the choice of airlines (Atalık & Özçelik, 2007). The study also found that in air services such as food and drink, comfort, and personnel behavior were moderately important. Another study on Chinese passenger's found that the important services included on-time operation (one of the most important factors) and accurate baggage handling (Zhang, 2011). This study observed that on-time performance was a significant factor for business passengers especially, who would pay extra for guaranteed on-time performance. South African business passengers also found in-flight service and ground service (especially lounge availability) a major factor in airline choice, which tended to draw business passengers away from LCCs (Fourie & Lubbe, 2006). According to another study (Park, 2007)in-flight service, airline service, employee service, on-time operation, and overall service quality were important factors in the choice of airline. Customer satisfaction is the outcome of service quality (Sandaruwan & Pathmini, 2016) and there is a positive, significant relationship between these two although it should be noted that service characteristics make it different from product quality. The hypothesis derived from the observations is:

General Hypothesis H_9: Perceived service quality positively influences customer's loyalty toward airlines.

Specific Hypotheses for Biman Bangladesh Airlines Limited:

H_9 (Main Hypothesis): The perceived service quality of Biman Bangladesh Airlines has a positive and significant effect on passenger loyalty.

H_{90} (Null Hypothesis): The perceived service quality of Biman Bangladesh Airlines has no significant effect on passenger loyalty.

H_{9a} (Alternative Hypothesis): The perceived service quality of Biman Bangladesh Airlines has a positive and statistically significant effect on passenger loyalty.

3.5 Customer Loyalty

A few years ago, companies used to focus on brand loyalty on tangible goods which had been changed over the year (Tucker, 1964). The term Loyalty is kind of behavioral choice of a customer to buy a product or service from a service provider again, if the customer once purchases from the company or brand in the past (Cunningham, 1956). There is a theory of named exit-voice theory which has been developed to identity the relationship between customer satisfaction and customer loyalty (Hirschman, 1970). The theory says that each customer has two options when customer is not satisfied with the product or service then s/he exits the product or service that means the customer is not going to use it any more or the customer raises voice i.e., s/he makes a complaint regarding product or services. On the other hand, when customer is satisfied with the product then s/he consumes the product or service again and becomes a loyal customer (Bloemer &Odekerken-Schröder, 2002). Customer loyalty is therefore, defined as the commitment to repurchase the

same brand product or service consistently in the future without being affected by situation that could cause switching behavior (Oliver, 1999). Customer loyalty reflects the favorable attitude of a customer towards an organization like providing good word-of-mouth (Dimitriades, 2006). Customer who remains loyal to a service industry will be able to take on in favorable or unfavorable behavioral responses (Baumann, et al., 2011).

Customer loyalty indicates that customers hold a promising attitude and behavior and support products or services. This finding can be reflected in several activities such as recommending the current service operator to other consumers and repurchasing (Relationships, 1996). Most articles on customer loyalty focus on service quality, perceived value, satisfaction, airline image connected to loyalty, and the behavioral intention of passengers. The findings of the related research indicate many limitations in the research on customer loyalty to airlines. For example, the influence of commitment and attractiveness of competitors to airline passenger loyalty was overlooked in some studies, but can be found in other studies such as the study on the educational tour bus (Chonsalasin, et al., 2020). One of the studies (Ramamurti & Sarathy, 1997) suggested that the aviation industry “has shrunk the world physically” by facilitating the international travel. Another one (Prokesch, 1995) stated that “the world airline industry has racked up billions of dollars in losses in the last five years,” and referred to it as “brutally competitive”. Some other studies noted that due to the factors such as deregulation and liberalization, the airline industry has become “highly dynamic and competitive” (Appiah-Adu, et al., 1999) or, “in the context of aviation industry, loyalty can be seen as the possibilities of a customer bringing in repeat business and his willingness to work as a partner to the airline” (Kivetz & Simonson, 2003).

In the aviation business of Bangladesh also pleased customers intend to be with the airliners and the displeasures changes their mind (Shaleh & Reza, 2020). Here, airliner's passenger satisfaction ranking depends on schedule and duration of flights, baggage and fare policy, security, and service quality. Some other factors involved are smooth take-off and landing, cabin crew offering for fastening seat belts, food and refreshment, extra baggage allowance, and overall flight safety issues (Parvin, 2018). Different in-flight and on-ground services make the customer loyal to a single company and customer loyalty is the main driver to gain and maintain supremacy over the contemporary competitors (Hossain, et al., 2017). A such, to retain the customers/travelers, good in-flight services, proper maintenance of the flight schedule is a must (Hashmat, 2014). (Farzana & Hossain, 2015) states that to hold the passengers, the influence of loyalty club and some other attractive features like free trips, special discounts, inflight specialized zone, and expedite boarding passes for the elderly and ailing people, nominal reporting time, special in-flight and lounge treatment facilities is more effective. In this regard, to create an impact on the Biman's satisfied and dissatisfied customer is an impression like 'Once Biman always Biman', Biman has taken some momentous steps like care, warmth, and friendliness, traditional hospitality, and comfort safety records, but the output is insignificant (Hasan, 2006)**.** As such the observations in the literature on customer loyalty to airlines lead to the following hypothesis:

General Hypothesis H_{10}: While customer loyalty depends on a combination of factors, including competitor choices and commitment, improvements to customer service continue to have a noticeable influence.

Specific Hypotheses for Biman Bangladesh Airlines Limited:

H_{10} (Main Hypothesis): Improvements in the customer service quality of Biman Bangladesh Airlines have a significant positive effect on passenger loyalty, even when accounting for competitor choices and customer commitment levels.

H_{100} (Null Hypothesis): Improvements in the customer service quality of Biman Bangladesh Airlines have no significant effect on passenger loyalty when accounting for competitor choices and customer commitment levels.

H_{10a} (Alternative Hypothesis): Improvements in the customer service quality of Biman Bangladesh Airlines have a positive and statistically significant effect on passenger loyalty, even when controlling for the influence of competitor choices and customer commitment.

3.6 Conceptual Structure and Development of Hypotheses

This study formalizes the links between the fundamental variables reported in the literature into a testable theoretical framework. Ten carefully considered possibilities are listed in the following table. In the context of Biman Bangladesh Airlines, these hypotheses are intended to empirically validate the causal pathways through which important operational and perceptual factors from pricing and brand reputation to safety directly affect the primary dependent variables of customer satisfaction and loyalty. The critical connection between the body of prevailing literature and the approaching empirical study is provided by this systematized set of hypotheses.

Table: 3.2 Conceptual Structure and Development of Hypotheses

Factors	Hypothesizes
Customer satisfaction	H_1: Customer satisfaction has a positive and significant effect on customer loyalty among passengers of Biman Bangladesh Airlines.
Passenger's Trust	H_2: Customer trust has a positive and significant effect on customer loyalty among passengers of Biman Bangladesh Airlines.
Airliner's Brand Reputation	H_3: A positive brand reputation has a positive and significant effect on customer loyalty among passengers of Biman Bangladesh Airlines.
Staffs Service	H_4: The quality of staff services has a positive and significant effect on passenger satisfaction with Biman Bangladesh Airlines.
Airline Safety	H_5: A positive perception of safety has a positive and significant effect on the loyalty of Biman Bangladesh Airlines among potential passengers.
Route Availability and Convenience	H_6: Route availability and convenience have a positive and significant effect on the customer loyalty of Biman Bangladesh Airlines among potential passengers.
Frequent Flyer Program	H_7: Membership in Biman Bangladesh Airlines' frequent flyer program is a stronger driver of loyalty that has a positive and significant effect on passenger choice and loyalty.
Price/Ticket Fare	H_8: Price sensitivity has a significant effect on the Customer loyalty in Biman Bangladesh Airlines among potential passengers.
Service Quality	H_9: The perceived service quality of Biman Bangladesh Airlines has a positive and significant effect on passenger loyalty.
Customer Loyalty	H_{10}: Improvements in the customer service quality of Biman Bangladesh Airlines have a significant positive effect on passenger loyalty, even when accounting for competitor choices and customer commitment levels.

Source: Author

3.6.1 **Customer Loyalty: Exploring the Interconnected Factors through Integrated Hypotheses**

However, this research investigates the complex interplay of factors influencing customer satisfaction and loyalty at Biman Bangladesh Airlines. In this aspect the testable hypotheses derived regarding customer satisfaction and loyalty at Biman Bangladesh Airlines Limited is given in table 3.3 with justification. The central hypothesis (H_1) posits a significant relationship between satisfaction and loyalty, and a cluster of key drivers, including trust, brand reputation, safety, convenience, loyalty programs, and pricing. To systematically examine this multifaceted relationship, H_1 is decomposed into eight secondary hypotheses, allowing for a detailed exploration of each individual driver.

> H_1**:** Customer satisfaction and loyalty at Biman Bangladesh Airlines are significantly related to passenger trust, brand reputation, service quality, perceived safety, route convenience, the frequent flyer program, ticket price and improved customer service.

This hypothesis (H_1), encompasses multiple related concepts and variables. Therefore, H_1 is further broken down into the following seven subsidiary or secondary hypotheses. Each sub-hypothesis helps provide a clear and structured way to examine these underlying components.

Table 3.3: Hypotheses Regarding Customer Satisfaction and Loyalty at Biman Bangladesh Airlines

Serial No	Hypothesis from Review of Literature	Organized for Test (Main/Secondary Hypothesis Structure)	Justification/Action: Hypothesis Included/Excluded
1	H_1: Customer's satisfaction is positively associated with customer loyalty Among Biman Bangladesh Airlines passengers.	H_1: Main Hypothesis: Customer satisfaction and loyalty at Biman Bangladesh Airlines are significantly related to passenger trust, brand reputation, service quality, perceived safety, route convenience, the frequent flyer program, and ticket price.	Replaced with comprehensive hypothesis to be the focus of all factors. This hypothesis will justify the research objective 1 and answer research question 1.
2	H_2: Passenger trust in Biman Bangladesh Airlines is positively associated with customer loyalty towards the airline.	H_1a: Secondary Hypothesis: Passenger trust in Biman Bangladesh Airlines is positively associated with customer loyalty towards the airline.	Included as specific relationship to test under the overall main hypothesis.
3	H_3: A positive brand	H_1b: Secondary	Included as specific

	image of Biman Bangladesh Airlines is positively associated with customer loyalty towards the airline.	Hypothesis: A positive brand image of Biman Bangladesh Airlines is positively associated with customer loyalty towards the airline.	relationship to test under the overall main hypothesis.
4	H_4: The quality of staff services provided by Biman Bangladesh Airlines is positively associated with passenger satisfaction and loyalty among its customers.	H_1c: Secondary Hypothesis: The quality of staff services provided by Biman Bangladesh Airlines is positively associated with passenger satisfaction and loyalty among its customers.	Included as specific relationship to test under the overall main hypothesis.
5	H_5: Passenger perception of safety associated with Biman Bangladesh Airlines positively influences customer loyalty.	H_1d: Secondary Hypothesis: Passenger perception of safety associated with Biman Bangladesh Airlines positively influences customer loyalty.	Included as specific relationship to test under the overall main hypothesis.
6	H_6: Route availability and convenience	H_1e: Secondary Hypothesis: Route	Included as specific relationship to test under

	significantly influence customer loyalty in Biman Bangladesh Airlines Limited.	availability and convenience significantly influence customer loyalty in Biman Bangladesh Airlines Limited.	the overall main hypothesis.
7	H_7: The frequent flyer program influences customer loyalty in Biman Bangladesh Airlines Limited.	H_1f: Secondary Hypothesis: The frequent flyer program influences customer loyalty in Biman Bangladesh Airlines Limited.	Included as specific relationship to test under the overall main hypothesis.
8	H_8: Price/ticket fare Significantly influences Customer loyalty in Biman Bangladesh Airlines Limited	H_1g: Secondary Hypothesis: Price/ticket fare significantly influences customer loyalty in Biman Bangladesh Airlines Limited.	Included as specific relationship to test under the overall main hypothesis.
9	H_9: For Biman Bangladesh Airlines passengers, service quality leads to a stronger positive		Excluded as better understood as a broad principle that explains why those individual factors are important. Is already

	effect on customer loyalty.		incorporated into a number of individual effects/factors.
10.	H_{10}: Improvements in the customer service quality of Biman Bangladesh Airlines have a significant positive effect on passenger loyalty, even when accounting for competitor choices and customer commitment levels.	Main Hypothesis: H_2: Improvements in the customer service quality of Biman Bangladesh Airlines have a significant positive effect on passenger loyalty.	This hypothesis supports research objective 2 and research question 2, and is aligned with the research title.

The first one secondary hypotheses (H_1c) explore how customer satisfaction is related to customer experience with staff service:

- H_1c**:** The quality of staff services provided by Biman Bangladesh Airlines is positively associated with passenger satisfaction and loyalty among its customers.

The remaining seven hypotheses (H_1a - H_1g) examine how customer loyalty is related to other variables like the service that's provided. These include how safe a passenger feels, the convenience of flight routes, and the frequent flier programs:

- H_1a: Passenger trust in Biman Bangladesh Airlines is positively associated with customer loyalty towards the airline.

- H_1b: A positive brand reputation of Biman Bangladesh Airlines is positively associated with customer loyalty towards the airline.
- H_1d: Passenger perception of safety associated with Biman Bangladesh Airlines positively influences customer loyalty.
- H_1e: Route availability and convenience significantly influence customer loyalty in Biman Bangladesh Airlines Limited.
- H_1f: The frequent flyer program influences customer loyalty in Biman Bangladesh Airlines Limited.
- H_1g: Price/ticket fare significantly influences customer loyalty in Biman Bangladesh Airlines Limited.
- H_1h: Improvements in the customer service quality of Biman Bangladesh Airlines have a significant positive effect on passenger loyalty

The last hypothesis (on customer loyalty) are the resulting effects and impacts. This hypothesis will justify objective 2 as such, this hypothesis has been formulated as under:

H_2: Improvements in the customer service quality of Biman Bangladesh Airlines have a significant positive effect on passenger loyalty, even when accounting for competitor choices and customer commitment levels.

3.6.2 Justifying the Exclusion of Service Quality (H_9) and Focusing on Specific Drivers of Customer Loyalty (H_1)

While a strong body of literature supports the general assertion that perceived service quality positively influences customer loyalty across service industries, including airlines, this principle is not directly tested as a separate subsidiary

hypothesis within this study. Instead, perceived service quality functions as an overarching framework that helps explain the influence of several independent variables, including passenger trust, brand reputation, perceived safety, staff service, route availability and convenience, frequent flyer program value, and ticket price. The main hypothesis (H_1) posits that these factors, in combination, have a significant relationship with customer satisfaction and loyalty at Biman Bangladesh Airlines. This approach is predicated on the understanding that overall perceived service quality is derived from and reflected by a customer's evaluation of these specific, tangible elements of the Biman Bangladesh Airlines experience. By individually assessing the relationship between trust, reputation, safety perceptions, and other core variables with customer outcomes, this research aims to provide granular insights into the specific drivers of service quality that most significantly impact customer loyalty at Biman Bangladesh Airlines. In other words, focusing on those components will provide an understanding of service as well.

Furthermore, while overall customer satisfaction is acknowledged as a broad predictor of loyalty, the intention of the hypothesis is to see how specific attributes and expectations impact loyalty. H_9 is already addressed in H_1 as well, by testing, it would not add more value to the research.

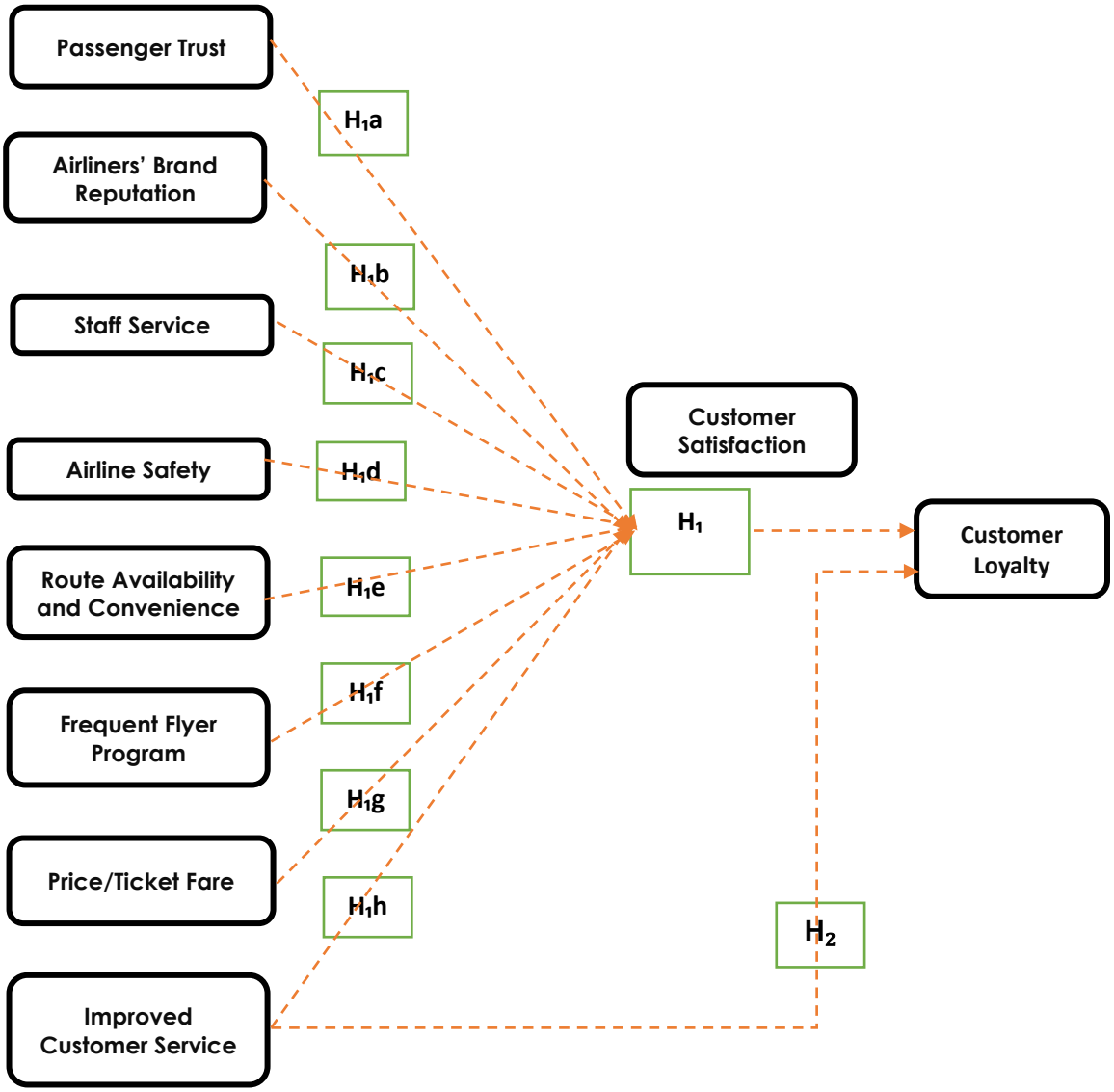
3.7 **Theoretical Framework of the Study**

Following the literature review, a theoretical framework has been developed along with testing of a number of hypotheses formulated and tested using quantitative techniques. The rationale of the theoretical framework is that it combines two distinct views on the consumer decision. The first set of elements is the customer satisfaction, (Passenger's' Trust, Airliner's Brand Reputation, Staffs Service, Airline

Safety, Route Availability and Convenience, Frequent Flyer Program, Price/Ticket Fare). These can be considered as the process elements of the decision identifying how the consumer made the decision. The second set of elements includes the service quality and customer loyalty.

Airline brand reputation is a persuading factor to influence consumer attitude towards the airline (H_1b). This is based on previous research about the formation of attitudes which suggests that public reputation of the organization as well as the experience of family and friends influence attitudes even of those with no personal experience (Ajzen, 2005). It is also based on the empirical evidence, as discussed below. While there may be other relationships between the variables, these relationships were not directly suggested by the literature. However, since the scope of the research does need to be limited for pragmatic as well as reliability reasons, the choice was made to test only a single such relationship in this study. The first aspect of the theoretical framework is the customer satisfaction process and how it is formulated. This aspect of the theoretical framework captures the decision from the consumer's internal perspective. The theoretical framework is shown in under:

Figure 3.1: Theoretical Framework of the Study



Source: Author

3.8 **The Conceptual Research Model**

The conceptual research model for the study has three parts. In the first part, all independent variable (such as passenger's' trust, airliner's brand reputation, staffs service, airline safety, route availability and convenience, frequent flyer program, price/ ticket fare and service quality) are identified and explained. The second part deals with the mediating variable which is customer satisfaction and the last part

analyzes customer loyalty. The study thus tries to reveal the effect of all the independent variable on customer satisfaction and to see whether customer satisfaction can have an output namely customer loyalty. The conceptual model of loyalty dynamics is shown in Appendix 2.

3.9 **Research Gap**

Following is a brief summary of the review of existing literature on customer services of Biman Bangladesh Airlines:

a. No published study is available on the customer loyalty of Biman Bangladesh Airlines and thus, the area is significantly unexplored.

b. Bangladesh Aviation industry is under-researched and the literature on the industry is scanty, published papers on the industry are very few in number.

c. There are some unpublished research papers on Biman Bangladesh Airlines and aviation industry of the country as a whole; any new research on this area will significantly contribute for fulfilling the knowledge gap and will be helpful for Biman Bangladesh Airline.

d. The available studies on Biman Bangladesh Airlines are mostly very general in nature and their findings are often subjective and erroneous and therefore, do not present any comprehensive and reliable picture of the Biman and its services.

e. There are a few international publications on Biman Bangladesh with reliable data and analysis but the studies need to be examined with care and with the understanding of policy issues and realities in Bangladesh.

f. It is often difficult to conduct studies on Biman Bangladesh Airlines (in terms of access to data and information about Biman’s policy matters, as well as

issues/areas like management, command and control, procurement, leasing, route planning, and sometimes, even about changes or failures in schedule, overseas maintenance, supply chain, and fund management.

g. Both domestic and foreign passengers of Biman do not seem to be loyal to Biman as the airline's services are still not at par with the internationally accepted standards and no study has so far been conducted to address this issue.

h. In general, there are many studies at home and abroad on the factors that have impact on airlines' customer satisfaction; but there is a gap in the area in terms of analysis of the related issues in Bangladesh; There is a need for study on the area and analyze the link between customer service and customer loyalty for Biman Bangladesh Airlines.

The present study is an attempt to fill in these gaps. The objective of the study is to analyze customer satisfaction in services of the Biman Bangladesh Airlines, the customer loyalty, and the ways to retain the passengers and make Biman Bangladesh a profitable and prosperous organization. The methodology of the study has been presented in Chapter 5 of the dissertation. Standard data collection and sampling procedure has been followed. Data processing has been done by using SPSS and MS Excel and Python (Matplotlib and Seaborn Library) and R programming (ggplot Library) have been used for. data visualization data analysis.

3.10 **Chapter Summary**

This chapter presents a review of literature on the customer satisfaction and customer loyalty of Biman Bangladesh Airlines Limited. The chapter has also briefly illustrated the constraints and problems of Biman Bangladesh Ltd in the context of

customer services and customer satisfaction. The review includes how customer service issues are relating to customer loyally. Considering the previous literatures, the review suggests that customer satisfaction is the key to success for aviation business. More specifically, the success of Biman solely depend on several factors like passenger's' trust, airliner's brand reputation, staffs service (both in-flight and on-ground), airline safety, route availability and convenience, price/ticket fare and many more. The service quality is essential for retaining customers and encouraging them to stay with the product or service through a quality relationship. This chapter provides an overall view on factors influencing customer's satisfaction both from national and international perspectives.

The review of literature could identify the reasons behind good customer satisfaction and the factors influencing customer's loyalty. Nevertheless, many questions regarding customer's loyalty in developing countries are yet to be answered. Based on the review of existing literature this chapter has identified the research gap and the scope of contribution of the present study. It has also identified and presented a methodology of the study comprising the theoretical framework and the set of hypotheses to be tested in it.

To ground these concepts in a specific empirical context, the following chapter shifts to an in-depth examination of the Bangladeshi aviation industry, with a particular focus on Biman Bangladesh Airlines. It will trace the airline's evolution from its inception to its current state, providing the essential background against which this research is set. Following this contextual foundation, a detailed and formidable research methodology will be outlined to systematically investigate the identified factors within this unique organizational setting.

Chapter 4

CIVIL AVIATION SECTOR OF BANGLADESH: DEVELOPMENT, CHALLENGES, AND THE ROLE OF BIMAN BANGLADESH AIRLINES

4.1 Introduction

Biman Bangladesh was formed on 04 January 1972 and the Bangladesh Air Transport Industry marked its golden jubilee in 2022 (Khan & Murad, 2021). Airliners today comprise the leading mode of transport of people and goods from one country to another and within the territory of many countries. According to some estimates, in 2021, of the total value of goods in international trade, about $6.8 trillion worth of goods annually, or $18.6 billion worth of goods every day are carried by airplanes (Khan & Murad, 2021). In the aftermath of Covid-19, the medical cargo emerged as a priority item of transportation and the world witnessed the operation of Passenger to Cargo (P2C) flights, which essentially means carrying cargo by passenger aircraft with cabins loading at times. The trends in global airlines are visible in case of the national career of Bangladesh (Biman Bangladesh Airlines Limited) and the domestic private career of the country (e.g., the US Bangla Airlines of Limited had considerable number of Passenger-to-Cargo (P2C) flights (Khan & Murad, 2021).

The aviation industry of Bangladesh has travelled a long way and recorded an encouraging growth in the decade preceding 2018 (Juniac, 2018). Biman Bangladesh Airlines Limited (Biman) is found to be the major player in Bangladesh context though private airlines such as US Bangla and Novo Air

operating as commercial airlines are also securing steady growth. However, in both passenger and cargo transport, the major share of operations is carried out by the foreign carriers, which means that the Bangladesh Air Transport Industry has a huge potential of taking over the cargo transport business and thereby of further growth (Khan & Murad, 2021).

However, Biman Bangladesh Airlines reported record financial performance for FY 2023-2024, achieving Tk 10,575 crore in revenue, a 9.5% increase from the previous year. This marks the fourth consecutive year of profitability, with a net profit of Tk 282 crore, affected by foreign exchange losses. The airline carried 3.36 million passengers, with cargo revenue growing by 60% to Tk 637 crore. Biman expanded its ground handling services, serving 32 foreign passenger and 17 cargo airlines. The airline operates without government subsidies, repaying Tk 12,574 crore towards 13 new aircraft and contributing Tk 927 crore in VAT and taxes to the government (Anon., 2024).

The present chapter provides a brief account of the aviation industry of Bangladesh and the current state of Biman Bangladesh Airlines Limited. The discussion on some of the contextual factors will clarify the industry's development in the country. The chapter outlines the early history of aviation in Bangladesh, the chronology of its development, and the birth of Biman Bangladesh Airlines as the nation's flagship career and some private airlines. This chapter then provides the summary of the operational aspects and the contribution of Biman Bangladesh Airlines to the economy of the country, especially in terms of contribution to the country's revenue earnings.

4.2 Early Records of Development of Aviation Industry in Bengal

Aviation in Bengal and the areas of India near this part of India started with the first commercial flight of airplane on 18 February 1911, and air transport in the sub-region grew during the period between the First and Second World Wars. The Allied Air Forces have built and operated some 103 small airports, aerodromes, airfields, and airstrips in the part of present Bangladesh during the Second World War. These airfields were extensively used for conducting air operations during the Burma Campaign against the Axis powers. After the War, most of these facilities of the Royal Indian Air Force were left unused. After independence from British colonial rule and the partition of the subcontinent, the aviation infrastructure, and facilities in the then East Pakistan were inherited by the Pakistan Air Force (Sultana, 2018).

4.2.1 Flight over South Asian Arakan Coast.

In August 1943, a South Asia Command was formed under Admiral Mountbatten. This included the RAF Third Tactical Air Force (Third TAF), which launched the second Burma Campaign against the Empire of Japan in the December that year. The Royal Indian Airforce (RIAF), Indian part of the Royal Air Force played a crucial role by providing tactical reconnaissance and extensive support to the army when the British Corps started advancing down the Arakan coast in January 1944 (Sultana, 2018).

4.2.2 Military Flights at Cox's Bazar, Feni, and Comilla Area of Arakan Coast

In November 1943, No. 6 Squadron were moved to Cox's Bazaar. By the end of February 1944, the Squadron pilots of this squadron had completed over 1,000 operational sorties; averaging 6 sorties a day per pilot for the entire Third Tactical Air Force (TAF). Towards the end of March 1944, 4 Squadron joined the operations when it was moved first to Feni airfield, and then to Comilla in June to replace No. 6 Squadron (Sultana, 2018). The base of the aviation in Bangladesh was founded by the British Government of India through building a Royal Indian military air strip in Tejgaon during World War II to fly war planes towards the battlefields of Kohima and war theaters in Burma. Other air strips were built in Comilla, Feni, Chittagong, Cox's Bazar, Chakaria, Sylhet, Jessore, Rajshahi and Lalmanirhat (Anon., 2021).

4.2.3 **US and British Military Air Operation over the Territory of Present Bangladesh**

Today’s Shahjalal International Airport originally founded by the British as a landing strip at Tejgaon, a place several kilometers north of Kurmitola, in 1941 Tejgaon Airport. At that time Tejgaon was a military airport for warplanes to operate over the war fields of Kohima (Assam) and Burmese war theatres. The Shah Amanat International Airport at Chittagong was originally a combat airfield as well as a supply point and photographic reconnaissance base used by the Tenth Air Force of the United States Army Air Forces during the Burma Campaign in 1944-1945. Known American units assigned to Chittagong were: the 80th Fighter Group that flew P 38 Lightning fighters over Burma between March 1944 and February 1945; the 8th Reconnaissance Group, between October and December 1944 (various detachments); and the 4th Combat Cargo Group that

flew C-46 Commando transports between January and June 1945. Meanwhile, today's Osmani International Airport in Sylhet was built during British rule as Sylhet Civil Airport, partly to resist Japanese aggression from Burma (Sultana, 2018).

4.2.4 Evolution of Bangladesh Aviation: Insights from Indo Pak Air Operation over the Sky of Bangladesh

During the Liberation War of 1971 in Bangladesh, Indian Air Force (IAF) and the Pakistan Air Force (PAF) fought with extensive engagements in the sky over Bangladesh. On November 22, 1971, Pakistani F-86 Sabres and Indian Air Force Gnats engaged in the first air battle of the 1971 war over the Boyra Salient. After the IAF shot down three Pakistani Sabres in a decisive victory, the Gnat fighter jet demonstrated its superiority and earned the nickname "Sabre Slayer. This engagement marked a significant escalation toward full-scale conflict and significantly improved India's morale" (Singh, 2013), Tejgaon Airport suffered extensive damage in the fights. On the night of 3 December 1971, Canberra bombers of Eastern Air Command struck Tejgaon, which was under protection of the 14th Squadron of Pakistan Air Force (PAF). The squadron was equipped with Sabre jets which lacked night fighting capability. By the morning of 4th December, strike missions against Tejgaon were assigned to 11 squadrons of Indian Air Force (IAF), including Hunters of the 7th, 14th, 17th and 37th Squadrons of IAF, as well as Sukhoy-7s of the 221st Squadron and MiG-21s of the 28th Squadron (Sultana, 2018).

On 4 and 5 December of 1971, IAF concentrated in attacking the aircraft on the ground. But it failed to cause significant damage to the PAF assets in well-

dispersed and camouflaged locations. By the evening of 5 December, the IAF changed tactics. On the morning of 6 December four MiG-21s (No.28 Squadron), flying from Gauhati bombed on Tejgaon airfield with 1000 lb-er" (or "thousand-pounder") (about 454 kilograms), scoring several hits on the runway. Kurmitola was attacked on the morning of 7 December, when Mig-21s of No.28 Squadron again hit the runway. No.7 Squadron was pulled out of the eastern ops on the 6 December to help the Indian Army in the west. Repeated attack by MiG-21 sands Hunters of No.14 Squadron and No.28 Squadron however, kept the runway cratered. The IAF assault effectively grounded the PAF by 7 December, and No.14 Squadron was taken out of the war. The IAF also bombed other air fields including the abandoned World War II (WWII) airfields of Comilla, Lalmanirhat and Shamsher Nagar through the war, denying Pakistan Air Force to use them (Sultana, 2018).

4.2.5 **Dream of Bangladesh Air Force**

During the period of the War of Liberation Matiur Rahman, a Flight Lieutenant of Pakistan Air Force (PAF) attempted to escape from West Pakistan by hijacking a Lockheed T-33 aircraft, which was on the runway in the take-off stage and the pilot in-charge, PAF's Flight Officer Rashid Minhas resisted Matiur Rahman, who steered the aircraft toward the Indian border. Minhas released the canopy but as he was not properly strapped, Matiur Rahman could suck him out of the cockpit. Minhas could not recover the plane and it crashed killing both Matiur and Minhas. The incident took place on 20 August 1971 and it is assumed that if Matiur could successfully take over the airplane and operate it in the War of Liberation, it could be the beginning of the of the Bangladesh Air Force, a dream that took some

more time till the end of the War of Liberation. Matiur Rahman was awarded Bir Shrestha, the highest military honor in Bangladesh and the air base in Jessore was named after him (Sultana, 2018).

4.2.6 **Birth of Bangladesh Air Force (BAF)**

The BAF was born with an abandoned airfield at Dimapur in the Indian state of Nagaland on the north-east of Bangladesh on 28 September 1971. The force initially consisted of three old and defective aircrafts given by the Indian government. One of these was a Dakota (DC-3) airplane and of the remaining two one was an Otter airplane and the other was an Alouette helicopter. India also supplied machine guns, rockets, and fuel for the aircrafts. After completing their training, the pilots, and technicians of the budding BAF formed a flying unit named ‘Kilo Flight.’ Squadron leader Sultan Mahmud was appointed the commander of the Kilo Flight with the two planes and one helicopter. The Alouette helicopter had to be first repaired to make it operational. In late November 1971, it had its maiden flight as part of Kilo Flight. The air wing was mainly deployed for communication with the Bangladesh government in exile and the top military brass. On the eve of Indo-Pak war that began on 3 December 1971, the modest air force started its combat role and launched its maiden attack under the leadership of A K Khandaker. The government in exile appointed him as the Deputy Chief of Staff of the Bangladesh Armed Forces and gave him the responsibility of training and operations of the air force. Flight Lieutenant Shamsul Alam was a member of Kilo Flight. He had flown the Otter aero plane from the Kaila Shahar airfield of the Indian state of Tripura to the main oil depot in Chittagong (Parveen, 2016).

4.3 **Regulatory Framework of Civil Aviation Activities in Bangladesh**

Air transport has always been considered as a very special sector in the international context. It facilitates global economic and social growth, international and domestic tourism, and world trade growth (Air Arabia, 2023). The Civil Aviation Authority, Bangladesh (CAAB) functions as the regulatory body for all aviation related activities in Bangladesh. All civil aviation activities in the undivided India were regulated by the Aircraft Rules, 1920. Subsequently, the Aircraft Rules, 1920 were superseded on 23 March 1937 by the Aircraft Rules 1937 (CAAB, 2019) (“Flight Safety Regulations: Introduction” (CAAB, 2019). On 19 July 1960, the then President of Pakistan issued the Civil Aviation Ordinance, 1960 abrogating the Aircraft Act, 1934 (CAAB, 2019) and (CAAB, 2019). The first commercial flight marking the start of aviation in India took off on 18 February 1911 and the industry experienced some growth during the period between the First and the Second World Wars (CAAB, 2019). The Civil Aviation Ordinance along with the Aircraft Rules, 1937 worked as the legal regulatory framework for all civil aviation activities in Bangladesh until 23 August 1984, when the Government of the People’s Republic of Bangladesh promulgated the Civil Aviation Rules, 1984. Thus, the present legal regulatory framework for civil aviation activities in Bangladesh comprises the Civil Aviation Rules, 1984 and the Air Navigation Orders issued by the Chairman Civil Aviation under this rule (CAAB, 2019).

4.3.1 **Birth of Civil Aviation**

In the year 1947, Department of Civil Aviation (DCA) of Pakistan was formed. This department has been responsible for management and operations of civil

aviation in East Pakistan till 1971. After the War of Liberation in 1971, the DCA started its journey from scratch. The aviation infrastructure was badly damaged by bombardments of the Allied Forces over the main airports of East Pakistan in order to disable the Pakistan Forces during the nine-month long War for Liberation (CAAB, 2019).

DCA of Bangladesh inherited the damaged assets left by the erstwhile DCA of the Pakistan. The aviation activities in independent Bangladesh started in the last week of December, 1971 under the Ministry of Defense. In the year 1985, the Government of the People's Republic of Bangladesh formed Civil Aviation Authority, Bangladesh (CAAB) vide Ordinance No. XXXVIII of 1985, titled The Civil Aviation Authority Ordinance, 1985. CAAB is responsible for safe, expeditious, and efficient air traffic management (Wikipedia, 2025). It provides various air traffic control services, communication, and air navigation services. Aeronautical information services are also provided by CAAB (CAAB, 2019) and (CAAB, 2024). It operates under the Ministry of Civil Aviation & Tourism. All nine operational airports (three international and six domestic) of Bangladesh are operated by the CAAB with its headquarters in Kurmitola, Dhaka. As a member of International Civil Aviation Organization, the CAAB has signed bilateral air transport agreement with 52 states (Wikipedia, 2021).

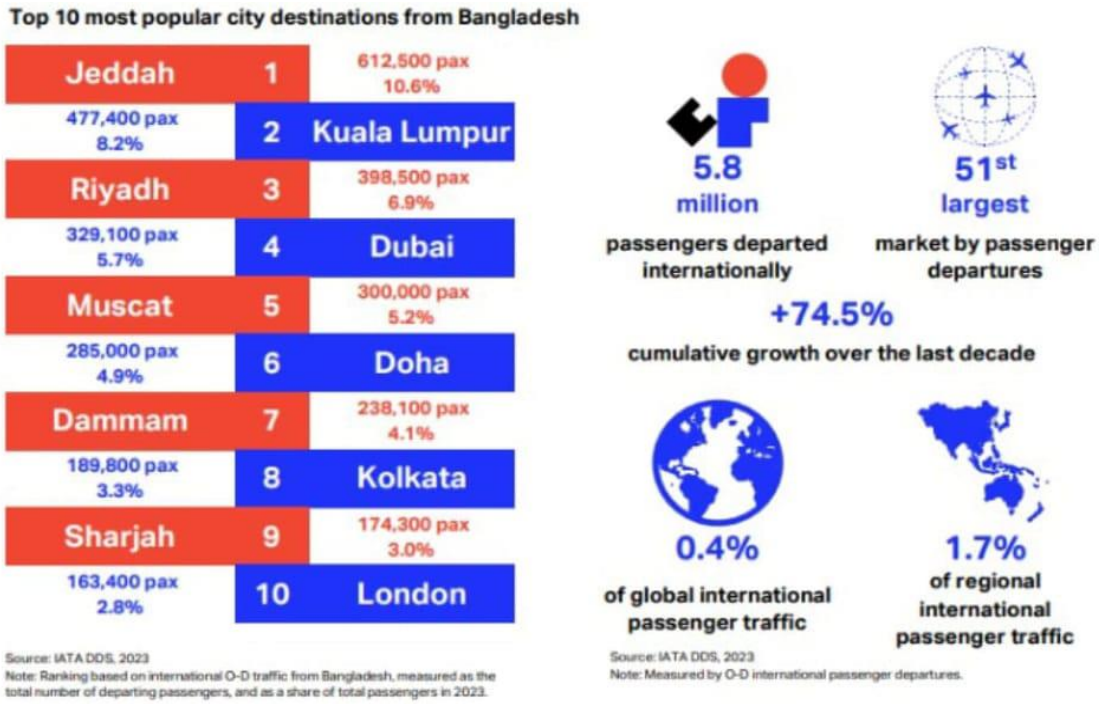
As a regulatory body, CAAB implements the rules, regulations and directives of the Government of Bangladesh and the standards and recommendations of the International Civil Aviation Organization (ICAO). As per the provisions laid down in Civil Aviation Ordinance 1960 and Civil Aviation Rules 1984, this organization acts as the aeronautical authority of Bangladesh. It also discharges the following duties and responsibilities as laid down by ICAO:

a. Flight safety and regulations
b. Air traffic services
c. Communication and navigation
d. Airport and anti-hijack security
e. Facilitation of passengers
f. Construction and maintenance of airports
g. Development planning (CAAB, 2023)

4.4 **Commercial Airliners of Bangladesh Aviation Industry**

Air transport significantly impacts Bangladesh's economy, directly employing 29,200 people and contributing USD 2.4 billion or 0.6% to GDP. The broader effects from the aviation supply chain, tourism, and related activities raise GDP contribution to USD 5.3 billion and support 474,600 jobs. Tourism aided by aviation adds USD 380.8 million and 85,500 jobs annually. Over the past five decades, global flight costs decreased by 70%, with a 39% drop in Bangladesh between 2011 and 2023, enhancing accessibility. In 2023, 83.7 million tons of air cargo were transported, crucial for supply chains and humanitarian aid. International departures, primarily to the Middle East, accounted for 70% of traffic, totaling 5.8 million passengers. Current GDP support from the air transport sector and foreign tourists amounts to USD 769 million (0.3% of GDP), with future growth forecasts predicting an increase to USD 2.1 billion and 140,000 jobs by 2038 (Shams, 2023) and (IATA, 2023).

Figure 4.1: Top 10 Most Popular City Destination from Bangladesh



Source: IATA 2023 (IATA, 2023)

Biman Bangladesh Airlines began its journey in 1972 with a single DC-3, quickly adding F-27s for domestic routes and a Boeing 707 to launch international services. By the end of the 1970s, its fleet had grown to 8 F-27s and 5 Boeing 707s. The 1980s and 1990s were marked by modernization, introducing Fokker 28s, DC-10-30s, and later replacing older turboprops with ATPs and Airbus A310-300s. A major fleet renewal began in 2008 with a landmark order to Boeing. This resulted in the acquisition of a new generation fleet, including four 777-300ERs (delivered 2011-2014), six 737-800s (delivered 2015-2019), and four 787-8 Dreamliners (delivered 2018-2019). Most recently, the airline added three Dash-8 aircraft in 2020-2021, cementing its status as having the youngest fleet in South Asia (Biman Bangladesh Airlines, 2025).

Table: 4.1 Fleet Size & Seat Capacity of Biman Bangladesh Airlines Limited

Aircraft Type	Number of Aircraft	Seat Configuration	Total Seats per Aircraft	Total Seats for Fleet
Boeing 787-8	4	Business: 24 Economy: 247	271	1084
Boeing 787-9	2	Business: 30 Premium Economy: 21 Economy: 247	298	596
Boeing 777-300 ER	4	Business: 35 Economy: 384	419	1676
Boeing 737	4	Business: 12 Economy: 150	162	648
Dash 8-400	5	Economy: 74	74	370
Total	19	4374		

Source: Biman Bangladesh Airlines (Biman Bangladesh Airlines, 2025) & Author

Private sector airlines started business in Bangladesh since 1993 and their numbers gradually grew over time, although some of them could not sustain and had to cease operation. To mention a few, GMG Airlines, established in 1997, started operation in 1998 in the domestic routes, and in 2004, in international routes. The airline closed all its business in 2012. Another private sector airline, the United Airways started its operation in 2007 and maintained 11 aircrafts before it disappeared from the sky in 2016. The recently grounded airline, Regent Airways faced cash crunch and finds it difficult to come back to the runway again.

The largest private sector airline in Bangladesh at present is the US Bangla, which started its journey in 2013 with two Dash 8 aircraft and now maintains a fleet of 4 Boeing 737-800s, 7 ATRs and 3 Dash 8s. Within a span of only 7 years, US Bangla has secured more than 800% growth in terms of seat capacity. Another private sector airline, Novo Air has also started its journey in 2013 with only two 50-seat Embraer aircraft. Novo Air has experienced a jump in seat

capacity of 400% within only 7 years of its operation by acquiring seven ATRs in phases (Khan & Murad, 2021). The ATR 72-500 is a 72-seat turboprop aircraft known for its operational efficiency on short-haul routes. It offers spacious seating and significant cargo capacity, making it popular among airlines in over 65 countries. This fleet operates 5 of these aircraft across 9 destinations in Bangladesh (Novo Air, 2025).

However, Biman Bangladesh Airlines is the leading player in Bangladesh's aviation sector, having doubled its seat capacity to 4,698 from 2019 to 2021 and plans to acquire 10 additional Airbus widebody aircraft. US-Bangla, the largest private airline, grew its seat capacity by over 800% in seven years, while Novoair increased by 400% with seven ATR aircraft. The industry is experiencing significant growth with a 22.1% international and 64.7% domestic increase in air travel from 2013 to 2017, driven by a large population, economic growth projections, and rising disposable incomes. However, 80% of transport is still performed by foreign carriers, indicating potential for further domestic growth as 12 foreign airlines show interest in Bangladesh following the opening of the new terminal at Hazrat Shahjalal International Airport (Siddiqui, 2023). The three following sub-sections of the present chapter presents a brief description of three major commercial airliners of Bangladesh.

4.4.1 **Biman Bangladesh Airlines**

Biman Bangladesh Airlines started operations in February 1972 with a slogan “Your Home in the Sky”. It was established under The Bangladesh Biman Order, 1972 (President’s Order No. 126 of 1972) (28 October, 1972). It came into being with a DC-3 aircraft donated by Bangladesh Air force (Sultana, 2018). After successfully completing a few domestic flights, this aircraft crashed on a test-

flight on 10 February 1972. One Boeing 707 and two Fokker F27 friendship aircrafts were soon included in the fleet allowing Biman to begin international flights. In 1981, Biman's fleet had 6 Boeing aircrafts, two F-28, six F-27 and three DC-10s. Meanwhile, all the Boeing 707 aircrafts were gradually phased out and the fourth DC 10-30 aircraft was added to Biman's fleet in January 1989. To modernize Biman's domestic operations, two ATP aircrafts were added in 1990 (Shamsuddula, et al., 2018). The main hub of Biman for domestic and international flights is the Hazrat Shahjalal International Airport, Dhaka and the two other international airports of the country (also used for domestic flights) are the Shah Amanat International Airport (Chittagong) and Osmani International Airport (Sylhet). Biman is a relatively small carrier but still it is the largest Bangladeshi airline and in 2018, it had 10 aircraft (all jets) and it operated had flights to 19 international and all domestic destinations (Sultana, 2018). The domestic destinations include Barisal, Chittagong, Cox's Bazaar, Dhaka, Sylhet, Saidpur, Rajshahi, and Jessore. Biman has air service agreements with 42 countries and in 2017, it had flights to 16 different countries. It is a member of International Air Transport Association (IATA) and carries passengers and cargo to its flight destinations in Asia, Europe, and Canada (Biman, 2024).

Biman is also doing C-check, D-check on DC10-30 and A310-300 in its hangar complex at Dhaka. Checks, repair, and maintenance of one DC10-30, one wide bodied Boeing and two F-28 aircraft can be done there simultaneously (Sultana, 2018). In addition to its own aircraft, Biman's ground-handling unit also provides support to Singapore Airlines, Thai Airways, Malaysia Airlines, Qatar Airways, Emirates, Kuwait Airways, Oman Air, Saudia, Gulf Air, PIA, Indian Airlines, Dragon Air, Druk Air, etc. flying to and from airports in Bangladesh. Biman Flight

Catering Center (BFCC) has the capacity of producing 8500 meals a day and is providing cuisine not only to Biman but also to Saudia, Etihad, Malaysia Airlines, Thai Airways, Emirates, Dragon Air and China Southern Airlines. Globally it has a reach to some international destinations such as Abu Dhabi, Bahrain, Doha, Dubai, Jeddah, Kuwait, Muscat, Riyad, Bangkok, Kuala Lumpur, Singapore, London, Katmandu, Kolkata, Yangon, and Toronto (The Daily Star, 2022) and (Biman, 2024) .

4.4.2 **US-Bangla Airlines**

US-Bangla Airlines has expanded its fleet, adding two new aircraft a wide-body Airbus A330-300 and a Boeing 737-800 making it the largest airline in Bangladesh with a total of 23 aircraft, surpassing Biman's 21. The Airbus A330-300, capable of seating 436 passengers, landed at Hazrat Shahjalal International Airport from Guangzhou, China, and will serve routes including Dubai, Sharjah, Muscat, Doha, and Kuala Lumpur, with future plans for London and Saudi Arabia routes. The fleet now consists of one Airbus A330-300, nine Boeing 737-800, 10 ATR 72-600, and three Dash 8-Q400. Regular flights are maintained on domestic and international routes to various destinations, including Kolkata, Chennai, and Singapore (Anon., 2024).

The US-BANGLA Airlines (Anon., 2025) is the only airline of Bangladesh to receive the ISO 9001:2008 Certification which conforms to Universal Safety Oversight Audit Program. It has also been audited and certified by the Chevron Company for their officials. The Airline's aircraft are being maintained by qualified and highly experienced foreign and local aircraft maintenance engineers. Their pilots are also highly professional and experienced (Anon., 2025). It offers some significant holiday packages to the destinations like Cox’s Bazar, Chittagong,

Barisal, Rajshahi and Sylhet of Bangladesh and Kuala Lumpur, Bangkok, Singapore, Kathmandu and Kolkata in the region (Sultana, 2018) and (Anon., 2025).

4.4.3 **Novo Air**

Novo Air is a premium brand private airline in Bangladesh that started domestic flight operations in January 2013 (Anon., 2025). The airline serves passengers with the motto “The Art of Aviation”. Within 3 years, Novo Air has been established as a premium scheduled passenger airline spreading wings in almost all domestic and several regional destinations. During 2013, Novo Air operates with three jets for flights to domestic destinations (Sultana, 2018) and (Anon., 2025). The airliner offers some significant holiday packages to the destinations like Cox’s Bazaar and Kolkata. The airliner has a plan ’to extend its destinations to Riyad, Jeddah, Dubai, Mascot, Kathmandu, Guwahati, Male, Kuala Lumpur, Colombo, Bangkok, Singapore, and Guangzhou (Anon., 2025).

With a fleet of EMB-145 Jet and standard ATR 72-500 and superior on-time performance, great comfort and excellent safety record, Novo Air achieved the honor of “Best Domestic Airline” awarded by “Monitor Airline of the Year” (Sultana, 2018). Novo Air has a host of professionals to support clients’ needs including air charter, air cargo transportation and travel and holiday services. The airline takes a great deal of pride in providing services to its clients with safety, reliability, cost effectiveness and dedication. The service ethics evolves with “You first” and therefore, it waits to listen from clients (Anon., 2025).

4.5 **Current State of Biman Bangladesh Airlines Limited**

Biman Bangladesh Airlines, also named as 'Bangladesh Biman Corporation' is a corporate entity, wholly owned and operated by the Government of Bangladesh. It functions under the Ministry of Civil Aviation and Tourism. Established on 4 January 1972, Biman began with 2,500 personnel but initially lacked both capital and aircraft. The airline officially commenced operations on 27 October 1972, with the aim of improving and expanding air transport services within and beyond Bangladesh (Shamsuddula, et al., 2018). The early years were crucial in establishing Biman as a key player in the nation's connectivity.

Over the decades, Biman has been plagued by challenges, most notably in overcoming problems like mismanagement and corruption. The problems have been manifested in numerous complaints, including on irregularities in ticket confirmations, failures in flight schedules, substandard passenger service, and corrupt practices in procurement and in purchase and leasing of aircraft, poor fleet planning, and inefficient human resource management (Shamsuddula, et al., 2018). These issues significantly impacted the airline's reputation and financial stability.

However, Biman Bangladesh Airlines with its operation over 22 international and 7 domestic destinations (Biman Bangladesh Airlines, 2025) has reported a record financial performance for the fiscal year 2023-2024, achieving its highest-ever revenue of Tk 10,575 crore, a 9.5% increase from the previous year. The national carrier maintained its profitability, marking the fourth consecutive year of profit post-COVID and a net profit in 8 of the last 10 years. Despite a strong operational

profit of Tk 1,556 crore, the net profit was Tk 282 crore, impacted significantly by foreign exchange losses due to the depreciation of the dollar (Anon., 2024). Operationally, Biman carried over 3.36 million passengers and saw a substantial 60% growth in cargo revenue, earning Tk 637 crore. Its ground handling services expanded significantly, serving 32 foreign passenger and 17 cargo airlines, and processing over 6.6 million passengers. Notably, Biman operates without government subsidies and has paid Tk 12,574 crore towards loans for 13 new aircraft, including Tk 1,274 crore in the last fiscal year. The airline also contributed Tk 927 crore in VAT and taxes to the government and is self-funding equipment purchases for the new third terminal (Anon., 2024).

4.5.1 **Administrative Structure of Biman**

As a commercial venture of the Ministry of Civil Aviation and Tourism, Biman Bangladesh Airlines is a 100% state-owned entity. The Minister of Aviation and Tourism serve as the chief of the corporation, and the airline is managed through a Board of Directors, typically headed by a chairman. The Managing Director (MD) functions as the Chief Executive Officer (CEO), according to the organizational structure. Biman's operations are divided into eight divisions: administration, finance, flight operations, store and purchase, customer service, engineering, planning, and special projects, each led by an appointed Director. The eight-member Executive Board is responsible for overseeing management and most financial matters (Shamsuddula, et al., 2018) and (Anon., 2025)

4.5.2 **National and Global Network of Biman**

As of 2018, Biman's network includes 202 approved local travel agents, with 140 based in Dhaka, 32 in Chittagong, and 30 in Sylhet. Internationally, the airline has

120 travel agents across nine key regions: Thailand, the UK and Ireland, the USA, Singapore, Nepal, Germany, Japan/Korea, Canada, and France. Additionally, Biman utilizes 19 General Sales Agents (GSA) worldwide (Shamsuddula, et al., 2018).

4.6 **Drawbacks of Biman Bangladesh Airlines**

The aviation industry is a vital contributor to a nation's economy. While all airlines in Bangladesh contribute to government revenue, Biman faces specific drawbacks that hinder its performance, in addition to broader challenges within the country's aviation sector.

4.6.1 **Biman’s Dilemma**

Legally, Biman is mandated to prioritize national interests over purely commercial objectives, preventing it from operating solely as a commercial airline. The government frequently utilizes Biman for services such as VVIP flights, relief operations, Hajj flights, and transporting perishable goods at subsidized rates. This creates a conflict, as the government expects Biman to be financially self-sufficient while simultaneously using it for national service obligations.

Consequently, assessing Biman's performance solely on profitability, without considering its broader contributions to the national interest at the government's behest, would be unfair. This inherent conflict prevents Biman from fully operating as either a purely commercial or a purely service-oriented organization ((Shamsuddula, et al., 2018). This makes it difficult for Biman to achieve profitability while fulfilling its national duties.

4.6.2 **Lack of Authority and Accountability of the Executive Body**

The structure of Biman's Board of Directors lacks a clear line of accountability. With the Minister of Aviation & Tourism serving as the Chairman, the Board is not directly accountable to any other body and has limited obligation to report its activities and performance to external authorities. While the CEO and Managing Director are theoretically accountable to the Board, their accountability is weakened by the existing hierarchy and delegation of authority (Shamsuddula, et al., 2018).

4.6.3 **Shortage of Aviation Experts in the Authoritative Bodies**

A notable deficiency exists in the availability of aviation experts within the Board, hindering its ability to guide Biman effectively in managing technical and commercial aspects. Notably, Biman has historically lacked a professional with aviation expertise as its CEO (Shamsuddula, et al., 2018).

4.6.4 **Political Influence**

As a state-owned corporation, Biman's operations have historically been influenced by government-affiliated circles, leading to the perception of political interference in several key areas (Shamsuddula, et al., 2018):

a. Operating domestic flights with wide-bodied aircraft
b. Continuing flights on loss-making routes
c. Political intervention in recruitment and promotions
d. Decision-making under political influence

4.6.5 **Corruption**

Corruption across various departments within Biman acts as a significant impediment to the organization's performance and profitability. Instances of corruption are evident in aircraft purchases and leasing, spare part procurement, the tender process, and ticketing and reconfirmation procedures (Shamsuddula, et al., 2018).

4.6.5.1 Corruption and irregularities in the leasing process

Biman’s expenditures are inflated by corruptions and irregularities, which in fact, cause increase in Biman’s excess payments of by approximately US$ 45 million in the five years between 2012 and 2017 (Shamsuddula, et al., 2018). Key issues identified include:

a. Arbitrary decision-making by the Chairman

b. Little or no involvement of technical personnel in the tender preparation process

c. Failure in compliance with legal provisions due to shortage of skilled and technically expert personnel

d. Poor planning

e. Poor overseeing of the CEO and board members in leasing and purchase processes.

4.6.5.2 Corruption in repair and maintenance of aircraft

Corruption in repair and maintenance of aircraft is a cause of substantial annual losses of Biman. The repair and maintenance expenses more than doubled from Tk 214.525 crore to Tk 489.08 crore in the last four years (2013 – 2017), despite a reduction in the number of aircraft from 17 to 13 and a 25% decrease in total

flight hours (Shamsuddula, et al., 2018). Over the past decade (2007 – 2017), most repair orders have been awarded to a limited number of agencies, allegedly due to nepotism and political interference. Some estimates suggest that Tk 50 crore of the Tk 90 crore spent on repairs annually is ‘overspent’ through misappropriation and corrupt practices (Shamsuddula, et al., 2018). A diagnostic study conducted by Transparency International Bangladesh (TIB) in 2018 revealed the following irregularities:

a. Most agents obtain certification (of eligibility to bid in tenders) allegedly through bribery of CAAB (Civil Aviation Authority of Bangladesh).

b. Agents often submit bids under fake names and addresses.

c. Qualified engineers are not assigned to assess the quality of spare parts received.

d. No inspection of stocks in store has been implemented since Biman's inception.

e. ICAO (International Civil Aviation Organization) certification is not checked during the tender process.

f. Purchases often include unnecessary and unused spare parts. (TIB, 2007)

4.6.5.3 Corruption in Tender Process:

Irregularities in Biman's tender process encompass a lack of transparency, political interference to secure unauthorized commissions, and the tainted process of scrutiny and selection of tenders. Experts have noted that these issues are so pervasive that reputable airline manufacturers are reluctant to participate in Biman's tender processes (Shamsuddula, et al., 2018).

4.6.5.4 Corruption in Relating to Outstations of Biman

Each of Biman's international stations has employees from various departments, including sales, finance, operations, traffic, and field service. However, many of these services could be outsourced (Shamsuddula, et al., 2018). Other irregularities observed in outstations include:

a. Postings to outstations made based on favoritism or political considerations.

b. Alleged misappropriation of funds by country managers.

c. Lack of investigation into reported irregularities.

d. Overstaffing in outstations.

e. Oversized outstations that are not cost-effective.

f. The continued existence of some outstation offices even after the concerned route is closed.

4.6.5.5 Irregularities in Sale of Tickets and Reconfirmation

As of 2017, a significant percentage of passengers (37.6%) who reconfirm or purchase tickets from Biman sales centers reported problems that they often encounter. These include lengthy waiting times (59.4%), demands for extra money (21%), and artificial ticket shortages (15.1%). Furthermore, some travel agents are illegally favored, while others fail to deposit collected funds or submit required sales statements (Shamsuddula, et al., 2018).

4.6.6 Biman’s Institutional Problems

4.6.6.1 Institutional Capacity

Biman's Man-Equipment Ratio (MER) is currently 1:367, which is significantly higher than the internationally acceptable standard of 1:200. In addition to the fact that Biman has a larger staff compared to other airlines with similar service coverage, Biman's remuneration levels are relatively low. Biman does not recruit

any staff at the officer level directly; officer-level staff are the promotees from within the organization. This limits Biman's ability to recruit qualified staff from external applicants and excludes the option of choosing skilled experts through a competitive process. The existing staff are often reluctant in improving their skills since they feel that their promotion is taken as almost guaranteed and too often, may also be expedited by favor under special considerations and lobbying. Sometimes it is alleged that Biman does not want to equip their staff with modern technology, which is a factor that keeps their productivity at lower levels (Shamsuddula, et al., 2018).

4.6.6.2 Lack of Planning

Unlike professional airlines that develop and implement plans with specific objectives, Biman appears to operate without a clear vision, mission, or target-oriented plan. Significant gaps exist in planning in the following areas:

a. Corporate vision and strategy
b. Improvement of procedures
c. Employee productivity
d. Improved information technology
e. Image of the airline
f. Revenue enhancement
g. Increase in market share and improvement in yield
h. Product improvement driven by total customer satisfaction
i. Reduction in expenses
j. Increase in in-house capability in maintenance and engineering
k. Phased fleet renewal (Shamsuddula, et al., 2018)

Biman's operations remain inefficient due to the absence of time-bound plans, specific targets, and monitoring mechanisms. Decisions regarding the opening of new routes are often made ad hoc, and in the past, Biman has launched numerous domestic and international routes without conducting cost-benefit analyses. Some experts consider it simply unbelievable as a practice in business dominated by cut-throat competition and they also hold the view that sometimes, the routes are operated on political intentions even though the routes opened are not viable (Shamsuddula, et al., 2018).

4.6.6.3 Poor Financial Situation

Biman's capital base is weak, and it does not receive sufficient financial support from the government to offset the significant losses it incurs annually. This forces Biman to rely on external borrowing, resulting in a heavy burden of debt service liabilities. The cumulative losses of Biman from its inception until 2017 amounted to approximately Tk 1,900 crore, and its debt liability to various organizations has exceeded Tk 2,100 crore, which it cannot manage without government support (Shamsuddula, et al., 2018).

4.6.6.4 Flight Schedule Failures

Flight delays are a common occurrence for Biman Bangladesh Airlines, leading to substantial expenses in passenger compensation. These disruptions negatively impact Biman's commercial viability and drive travelers to choose other airlines.

4.6.6.5 Flights Operated with Old Aircrafts

Operating with older aircraft leads to frequent repair and maintenance and therefore, higher maintenance and operational costs, increased risks of incidents and accidents, and elevated insurance premiums. Also, there are corrupt

practices in the repair process including payment. Experts estimate that the per day savings in cost of operating a DC-10 aircraft 10 hours a day is US$30,000 and accordingly, if four new generation DC-10 aircraft are used 10 hours per day, the monthly savings in operating cost of them could be US$1.2 million. The use of new aircraft with higher capacity utilization and better regularity in schedule is expected to generate higher revenue (Shamsuddula, et al., 2018). At present, Biman has three types of aircrafts manufactured by three different companies. To maintain its fleet, Biman needs to employ different categories of pilots, engineers and, use various kinds of spare parts. This is another reason causing higher operating cost (Shamsuddula, et al., 2018).

4.6.6.6 Poor Quality Customer Service

Biman's service quality suffers from a lack of credibility. A 2018 study revealed that approximately 85% of respondents were not provided with any information about flight delays, 77% reported that no one from Biman met with passengers to inquire about their problems because of the flight delays and specially, during their waiting in the period of delay. About 65% held the opinion that Biman's in-flight services had deteriorated (Shamsuddula, et al., 2018).

The same study further disclosed that the service quality in 42% of surveyed regular domestic flights, 87% of surveyed shuttle flights, and 82% of surveyed international flights was below standard. A majority of passengers indicated that they would not prefer flying with Biman in their next travels. About 50% of passengers flying from the East, Middle East, and Southeast Asia also stated the same feeling. (Shamsuddula, et al., 2018). When asked about the reasons for dissatisfaction, 49% cited failure in flight schedule, and 39% mentioned

unhappiness with the management and quality of flight services (Shamsuddula, et al., 2018).

4.6.6.7 Poor State of Boarding Bridge Servicers

Hazrat Shahjalal International Airport in Dhaka has an insufficient number of boarding bridges. The limited number of such bridges (only 8) cannot serve all arriving and departing international and domestic flights. Same (maybe, even worse) is situation in the airports at Chattogram and Sylhet (each having only two boarding bridges) (Khan & Murad, 2021).

4.6.6.8 Inadequate Transit Facilities

Airports in Bangladesh lack adequate lounge space, and readily available access to wireless internet throughout the terminal area. Furthermore, no airside hotel is available for transit passengers, and there is no proper duty-free shopping facility at all airports. Airport personnel are often not passenger friendly, customer service managers are practically absent, and airports need trained customer care staff with the skills to manage and improve the customer experience (Khan & Murad, 2021).

4.6.6.9 Unethical Price War

Biman's fares are neither the most expensive nor the cheapest, they are rather competitive with parity in price in the domestic market (Mostari, 2015). Still sometimes it may so happen that the local operators wage a kind of price war in various ways. For some operators their prices appear so low that with 75% cabin factor (load) they cannot secure the breakeven position. Also, it is observed that at times, the daily number of passengers in routes like Dhaka-Rajshahi-Dhaka or Dhaka-Barishal-Dhaka fluctuates between 150 and 250, which is not sufficient to

yield operating profit for the airlines. Some experts suggest that the operators may explore new routes like Saidpur-Cox's Bazar, Saidpur-Chattogram, and Jashore-Cox's Bazar to minimize their loss (Khan & Murad, 2021). But passengers traveling to many destinations in Bangladesh often prefer traveling by bus than by air and the reason is: the time taken to travel to most locations by air is almost the same as that taken by bus (sometimes even longer) considering the fact that while travel by bus is often almost a door-to-door long haul movement, air passengers spend extra time in travel to airport, checking in and the taxi on the runway and also, in collection of luggage after arrival at the destination points and then traveling to their final arrival point. With improvements in intercity roads and highways and introduction of quality buses the travel by bus now became much more comfortable than before and last but not the least, the plane fares are higher than the bus ticket prices.

4.7 Contribution of Aviation Industry to Bangladesh Economy in The Global Context

The aviation industry has been making great contribution to global economy since long. The global airline industry generated USD 838 billion in 2019 and it has been worth USD 372 billion in 2020 showing a 55% drop from the previous year primarily due to COVID-19 (Khan & Murad, 2021). The proceeding year of 2022 had shown a clear recovery of the global air transport industry.

In 2020, a total of 1303 airlines with a total of 31,717 commercial aircraft had been in operation in 45,091 routes connected through 3,759 airports and there were about 1,770 dedicated cargo aircraft to help boost global trade (Khan & Murad, 2021). Cargo however, is also carried in the belly of passenger aircraft. It

may be mentioned that around 60% of international cargo is carried on passenger planes, under the passenger deck (Biman, 2024). Globally, the highest growth of air transport industry is being enjoyed by the Asia-Pacific region. The Asia-Pacific aviation market was valued at US$ 50.92 billion in 2020, and it is projected to reach US$ 97.13 billion by 2026, registering a compound annual growth rate of 8.75%. The commercial airlines in Bangladesh now operate nearly 50 aircraft including the freighters. Additionally, there are also a couple of helicopter operators and flying clubs (Khan & Murad, 2021).

4.7.1 **Role of aviation Industry in Employment and Income Generation**

Air transport supports 65.5 million jobs and it adds $2.7 trillion in global economic activity. Aviation jobs are said to be 4.4 times more productive than other jobs in the economy (IATA, 2021). According to a study of 2018 by International Air Transport Association (IATA), the world's airlines collectively carry over 4 billion passengers a year. It also transports nearly 61 million tons of freight. The total output (GDP) in the global air transport industry, is larger than that in total output (GDP) of the two large subsectors – the automobile manufacturing and the pharmaceutical manufacturing taken together. The global aviation industry adds US$ 961.3 billion directly to GDP. Almost an equal amount (US$ 816.4 billion) is added indirectly.

The indirect contribution of airlines transportation business includes jobs and services of various types' suppliers to the air transport industry like aviation fuel suppliers, suppliers of consumables and of the sub-components used in aircraft, manufacturers of goods sold in the airports, construction companies and a wide variety of business services, such as money exchange, call centers, IT, lounge

services etc. Besides, around US$ 692.8 billion is added in global GDP by in the air transport industry employees, who use their income to purchase goods and services for their own consumption (Khan & Murad, 2021). Table 4.1 shows how the air transport industry is contributing to GDPs of different countries (Khan & Murad, 2021).

Table 4.2. The Contribution of Air Transport Industry in GDP

Serial Number	Country	Destinations from Host Country	Airlines (own airlines)	Contribution to GDP in US$
01	Bangladesh	28	32 (03)	769 million
02	Vietnam	72	71 (04)	12.5 billion
03	Philippines	74	44 (06)	10.4 billion
04	Sri Lanka	45	32 (01)	7.9 billion
05	Thailand	220	122 (08)	63.7 billion
06	Hong Kong	171	90 (03)	33 billion

Source: Member, Flight Standard and Regulations, CAAB

Source: 'Contribution of Air Transport Industry to Bangladesh Economy' (Khan & Murad, 2021).

4.7.2 **Growth of Aviation-Associated Industries**

Airlines and air operators stimulate business activity both directly and indirectly. Biman Bangladesh Airlines, for instance, relies on services and products from numerous stakeholders, thereby promoting their businesses. These include firms that supply aircraft spare parts and various logistical items (Rahman, et al., 2020). A key example is Biman's procurement of aviation fuel from Padma Oil Company, with payments totaling BDT 30,110 million over five years (Rahman, et al., 2020). Fuel purchases also occur at outstations, driven by operational needs and strategic fuel tankering when prices are favorable. However, fuel tankering

requires careful calculation to ensure the benefits outweigh the fuel consumption of carrying extra weight (Khan & Murad, 2021). Similarly, private airlines, cargo operators, and helicopter services contribute to Padma Oil Company's revenue. Biman Flight Catering Centre (BFCC) further supports the industry by providing meals for Biman and international carriers like Turkish Airways and Malaysian Airlines, with Egypt Air anticipated to join as a client. Helicopter services contribute by transporting executives, saving time and increasing convenience (Khan & Murad, 2021).

4.7.3 **Promotion of Trade through Aviation**

Air Service Agreements (ASAs) are fundamental for enabling international air services for passengers, cargo, and mail between countries (Doganis, 2010). These agreements, typically bilateral but sometimes multilateral, ideally foster a pro-competitive environment for airlines (ICAO, 2019). In Bangladesh, the Civil Aviation Authority of Bangladesh (CAAB) executes ASAs on behalf of the Ministry of Civil Aviation and Tourism. At present, Bangladesh has ASAs with 53 countries, with more under discussion. Such agreements expand flight opportunities, boosting the economy through aeronautical and non-aeronautical revenues for CAAB, tax revenues for the government, job creation, and export/import promotion (Khan & Murad, 2021). Exposure to the aviation industry supports the growth of national airlines. For instance, Sri Lanka has ASAs with 87 countries and open sky agreements with 14, including Singapore, Malaysia, and Thailand, to strengthen connectivity (Khan & Murad, 2021).

Dedicated freighters and passenger aircraft are vital for global trade. Major airports like Hong Kong and Chinese hubs such as Guangzhou, Wuhan, and Shanghai handle substantial cargo operations (IATA, 2023). Biman Bangladesh

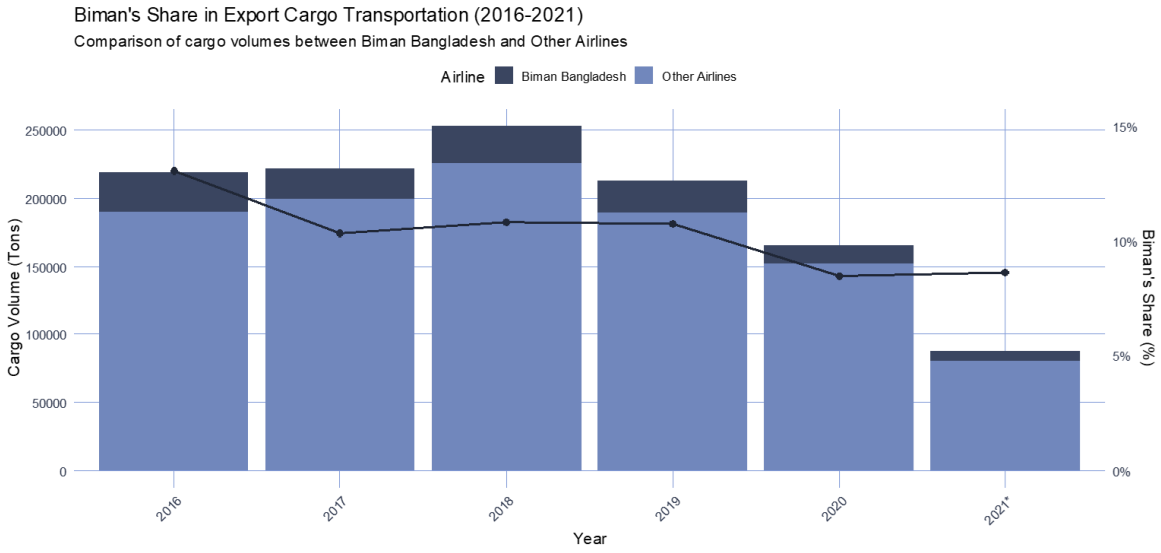
Airlines operates daily flights to Guangzhou using Boeing 777-300ER aircraft to transport cargo to Dhaka, Delhi, Algeria, and other destinations (Khan & Murad, 2021).Occasional cargo flights also run from Hong Kong to Dhaka, Delhi, Bangalore, and other stations. Biman has recently initiated cargo flights from Wuhan to reach Bombay, Delhi, Dhaka, and other stations. Additionally, garments are transported to London, Dubai, Bangkok, Muscat, and other locations. US Bangla also handles cargo operations to and from Bangladesh. However, due to the limited number of dedicated freighters, Bangladeshi operators have a relatively small share of the export and import cargo market. Data reveals Biman's export cargo share at only 8-13%, with a declining trend over recent years (Khan & Murad, 2021).

Table 4.3 Biman’s Share in Export Cargo Transportation

Year	Biman Bangladesh (Ton)			Other Airlines (Ton)			Grand total (ton)	Biman’s Share (%)
	Dry	Others	Total	Dry	Others	Total		
2016	19013	9503	28516	155734	34309	190043	218559	13.04
2017	16861	6128	22989	153839	45369	199208	222197	10.35
2018	20242	7103	27345	193858	31589	225447	252792	10.81
2019	15780	7014	22794	155361	34056	189417	212211	10.74
2020	9722	4278	14000	132005	19469	151474	165474	8.46
2021*	4008	3565	7573	69250	10825	80075	87648	8.64

Source: Contribution of Air Transport Industry to Bangladesh Economy (Khan & Murad, 2021).

Figure 4.1 Biman's Share in Export Cargo Transportation



Source: Contribution of Air Transport Industry to Bangladesh Economy (Khan & Murad, 2021).

4.7.4 **Contribution of Biman Bangladesh Airlines to the National Economy of Bangladesh**

The air transport industry contributes significantly to the national economy (Doganis, 2002). In Bangladesh, all airlines add value to government revenue. Biman Bangladesh Airlines contributes through travel tax, tax on salary, TDS on party payments, excise duty, and VAT. It also pays customs duties on applicable procurements. Furthermore, cargo transportation facilitates government collection of customs duties (Khan & Murad, 2021).

4.7.4.1 Travel Tax

Airlines collect and remit travel tax from passengers. For international flights originating from Bangladesh, the government collects Foreign Air Travel Tax (FATT), while domestic passengers pay Domestic Air Travel Tax (DATT). These taxes vary by destination. For example, according to the rates prevailing in December 2024, a one-way economy-class ticket to London from Bangladesh incurs a BDT 9,514 tax. Domestically, a one-way ticket to Chattogram includes a BDT 725 tax. Although passengers often do not individually perceive amount of tax amount, its total amount is significantly large. Biman Bangladesh Airlines alone collected over BDT 1,000 crore (10 billion) in travel tax in the last five years (2015-16 to 2019-20), averaging over BDT 200 crore (2 billion) per fiscal year (Khan & Murad, 2021). As Biman's market share in the aviation industry of the country is 20%, it is assumed that the government of Bangladesh annually collects approximately BDT 1,000 crore (10 billion) from air travelers as travel tax.

4.7.4.2 Tax on Salary

Biman employs over 6,500 workers, including casual staff and of the total number of employees, 2,207 regularly paying income tax. Biman deducts income tax from employees' salaries and remits it to the government and the amount of income tax annually received by the government in this form is BDT 45-50 crore (450 – 500 million), and in the five years, (2015-2020), more than BDT 220 crores (2 billion). This figure doesn't include tax paid by other stakeholders of Biman. Private airlines, helicopter operators, regulatory authorities, training institutes, and flying academies also contribute to the economy through income tax payments (Khan & Murad, 2021).

4.7.4.3 Tax Deducted at Source (TDS)

Under the Income Tax Act, companies must deduct tax at source (TDS) for payments exceeding certain thresholds. Biman deducts TDS before making payments and remits it to the government. Biman contributed over Tk 77 crores (770 million) in TDS in two years (2019-2020) and over Tk 120 crores (1.2 billion) in five years. Other airlines and operators also contribute (Khan & Murad, 2021).

4.7.4.4 Excise Duty

Excise duty, imposed on domestically produced goods and services, is another revenue source. Biman Bangladesh Airlines pays excise duty as a service provider, as do the other airlines (Khan & Murad, 2021).

4.7.4.5 Value Added Tax (VAT

VAT is a percentage-based tax on the value added to a commodity or service. Biman Bangladesh Airlines pays VAT on demurrage charges during cargo handling and storage, as well as on party payments and payments to CAAB (Khan & Murad, 2021).

4.8 **Prospects of The Aviation Industry in Bangladesh**

Achieving the desired growth of the air transport industry in Bangladesh requires enhancing air transportation infrastructure to make the country an aviation hub (ACI n.d.). Bangladesh can leverage its location as a transit point between East and West, capitalizing on opportunities in the air travel industry. Its proximity to India, Thailand, Pakistan, China, Hong Kong, Macao, and many other countries makes it a potential cargo transportation bridge. Many countries in the Middle

East and Gulf area can also benefit by using Bangladesh as a transit hub for airlines carrying passengers and good, especially fish and vegetables.

The construction of a Third Terminal at Hazrat Shahjalal International Airport is nearing completion and it expected to be opened for operation in 2025, which will expand the capacity to meet the needs of the growing air travel, especially in the Asia Pacific region. Biman has operated 38 rotation flights (76 sectors) for transporting Bangladeshi UN troops globally. These flights have served countries like South Sudan, DR Congo, Central African Republic, Lebanon, and Mali. This UN Mission operation, initiated in May 2020, has earned Biman US$ 12 million in foreign exchange. Beyond revenue, it has contributed to global peace efforts and instilled confidence among crew members operating in challenging environments (Khan & Murad, 2021).

4.9 **Chapter Summary**

The root of aviation in Bengal and its associated areas commenced with the air transport during the period between the First and Second World Wars. Since then, numerous sorties were flown during US and British military air operation. Though the first commercial flight of airplane was on 18 February 1911, commercial flights in the airspace of Bangladesh took off sometime before the War of Liberation in 1971. During the War of Liberation of Bangladesh, Indian Air Force (IAF) and the Pakistan Air Force (PAF) flew a good number of sorties over the sky of today’s Bangladesh. Bangladesh did have the dream of developing its own aviation industry and the base was created by the Bangladesh Air Force formed in 28 September 1971. However, the Civil Aviation Authority (CAAB) of the Government of the People's Republic of Bangladesh, the regulatory body for

all aviation related activities in the country has been formed only in 1985. At present, the number of Air Operator Certificate (AOC) holders in Bangladesh is 21, of which 07 are for fixed wing/passenger carrier, 09 have Helicopter/passenger Carrier AOC and 05 hold AOC for cargo operation. Not all airliners having AOC for carrying passengers are active at present and those which are active now include Biman Bangladesh Airlines Limited, Novo Air, US-Bangla Airlines and Air Astra. A new airline, Fly Dhaka Airlines was waiting to acquire air operator's certificate (AOC) and was expected to for commence operations from November 2024.

Biman Bangladesh Airlines, a commercial venture of the Ministry of Civil Aviation and 100% government owned airlines was formed on 4 January 1972 with 2500 skilled and unskilled manpower without any capital and aircraft of its own. It started maneuvers on 27 October 1972 with a DC-3 aircraft donated by Bangladesh Air force. Despite many efforts from the government side, over the last few decades, Biman could not secure a sound position in the aviation market due to problems and limitations in management. Major institutional drawbacks of Biman include inefficient human resource, lack of planning, poor financial state, flight schedule delay, old aircrafts in the fleet, unethical price war, substandard customer service, poor boarding bridge servicers, inadequate transit facilities, and corruption. Biman however, is trying hard to uplift its image in the global market.

Despite the many drawbacks, Biman Bangladesh Airlines has some contributions to national economy of Bangladesh. One of its significant contributions is in employment and income generation. It promotes trade and facilitates the growth of aviation associated industries, and collects taxes (travel tax, tax on salary, tax

deducted at source, and value added tax) and excise duty. The sector has all the potentials for its own growth and its ability to contribute more to the growth and economic development of the in near future, which can be facilitated by adopting and implementing plans with a holistic approach and a forward-looking vision by the concerned stakeholders.

Having established a comprehensive contextual understanding of Biman Bangladesh Airlines Limited tracing its historical evolution, operational landscape, and contemporary challenges within the aviation industry the foundational stage for this research is now set. This detailed backdrop illuminates the very real-world problems and dynamics that the previously defined research objectives and hypotheses seek to address. The critical task that follows is to determine how these theoretical constructs can be empirically investigated within this specific organizational context. Therefore, the forthcoming chapter (chapter 5) will meticulously articulate a formidable research methodology, designed explicitly to operationalize this study. It will delineate the strategic blueprint for data collection and analysis, detailing the specific instruments, sampling techniques, and analytical procedures that will be employed to systematically test the research hypotheses and validate the objectives, thereby transforming theoretical inquiry into actionable, evidence-based findings.

Chapter 5

METHODOLOGY: A PRAGMATIC MIXED-METHODS APPROACH TO INVESTIGATING CUSTOMER LOYALTY DRIVERS AT BIMAN BANGLADESH AIRLINES LIMITED

5.1 Introduction

This chapter presents the research methodology used to achieve the objectives of this study. The chapter describes the research paradigm and approach, followed by the research design and sampling strategy. The data collection techniques, including the questionnaire and interviews, are also explained in detail. Moreover, this chapter outlines the secondary data sources used for this research.

Furthermore, this chapter highlights the data analysis and interpretation tools used to analyze the collected data. The tools align with the research objectives, questions, and the acceptability of the findings' reliability.

This chapter also discusses the traditional and machine learning approaches, their variables, and the tests. The conclusion part of the chapter presents a comprehensive overview of the research methodology.

5.2 Research Paradigm

Of four research paradigms, Positivist, Pragmatist, Constructivist, and Interpretive, the most appropriate research paradigm for this research would be the **pragmatic research paradigm**, which is a problem-solving paradigm that focuses on real-world application. This paradigm is considered so because pragmatism emphasizes practical solutions directly relevant to the research objectives. The study focuses on a specific organization (Biman Bangladesh Airlines Limited), and the research findings

are intended to have real-world applications by providing actionable suggestions for improvement. These suggestions can be analyzed for practicality and feasibility. This research objectives involve finding key variables and the relation of practical issues related to customer loyalty through improving customer service quality, which makes the pragmatic approach highly appropriate. Pragmatism is flexible and allows for a mixed-methods approach, which is beneficial for this study. This flexibility permits combining quantitative and qualitative methods to address different aspects of the research objectives. Since customer loyalty and satisfaction can be highly context-dependent, a pragmatic approach is considered most appropriate and well-suited for understanding and addressing specific challenges within Biman Bangladesh Airlines Limited. A suitability matrix for deciding research Paradigm for this study is sited in table 5.1 also.

On the other hand, interpretive research typically focuses on understanding subjective experiences and meanings. While it can provide valuable insights into how customers perceive and interpret their interactions with Biman Bangladesh Airlines Limited, this approach may not be the most efficient for quantitatively measuring the impact of improved customer service on customer loyalty. Interpretive research tends to focus more on understanding and describing phenomena than solving practical problems or providing actionable suggestions. The objectives of this study emphasize practical solutions and improving customer service quality, which is better aligned with the pragmatic paradigm.

The primary goal of positivist research is to explain and predict phenomena by discovering universal laws or regularities. Positivist research relies on quantitative methods like experiments, surveys, and statistical analysis. It seeks to establish causal

relationships and generalizable findings. Positivists believe in the existence of an objective, universal truth that can be discovered using scientific methods. Therefore, this paradigm is considered comparatively unsuitable for this research.

Constructivist research explores and understands the diverse ways in which people construct meaning and reality, often leading to rich, context-specific insights. While constructivist research can be valuable in exploring subjective experiences and interpretations, it may not be the best fit for this study's objectives, which include quantitatively measuring impact, identifying dominant factors, and providing actionable recommendations. So, a pragmatic paradigm, which emphasizes practical solutions and allows for a mixed-methods approach, is more aligned with the specific research goals for this study.

Table 5.1: Research Paradigm Suitability Matrix for Biman Bangladesh Airlines

Paradigm	Suitability for Study
Pragmatism	• Problem-solving, real-world application • Fits Biman Airlines context • Actionable & feasible suggestions • Allows mixed-methods (quant + qual) • Best for customer loyalty & service quality
Positivist	• Too rigid, seeks universal laws - Not context-specific
Interpretive	• Focuses on subjective experiences - Less action-oriented
Constructivist	• Rich insights but - Weak in quantitative impact measurement

Source: Author

5.3 **Research Approach**

Out of four major research approaches named quantitative, qualitative, mixed methods, and action research or case study research approaches, considering the research objectives, a **mixed methods research approach** {requiring quantitative {Traditional correlation and regression analysis (OLS, OLogit and Multivariate Linear Regression) with Machine learning RandomForest and XGBoost regression Models}, qualitative analysis (thematic analysis) then data integration} catered as the most suitable for this study. This is because the objectives involve collecting qualitative and quantitative data to provide a more comprehensive analysis of the relationship between improved customer service and loyalty for Biman Bangladesh Airlines Limited.

A mixed-methods research approach allows for the collection of in-depth qualitative data to explore customers' experiences and perceptions. It also allows for the use of statistical tests to determine the strength and significance of the relationship between customer service quality and customer loyalty. This approach also allows for the evaluation of the effectiveness of suggestions for improving customer service quality to retain customer loyalty in a real-world setting. Considering this research approach, the research design for this study is organized.

In this regard, initially, this research approaches by summarizing and describing the characteristics of a dataset that involves precisely explaining the main features of a dataset using measures like mean, median, mode, range, variance, and standard deviation. It helped to understand the data’s central tendency, dispersion, and shape. Then, following the steps of inferential statistics, such as hypothesis development and empirical testing framework, confidence intervals, correlation analysis, classical

regression analysis like OLS, OLogit and multivariate regression analysis, and Machine Learning based regression analysis, conclusions or inferences are made about the population based on the sample data**.** The following table outlines the research approaches and justifications for each research objective, demonstrating how different methods are selected to address the specific research questions effectively.

Table 5.2: Research Objectives and Methodological Approaches for Examining Customer Satisfaction and Loyalty at Biman Bangladesh Airlines Limited

Research Objective	Research Approaches	Justification
a. **Identifying Key Influential Variables**		
What are the key variables that significantly influence customer satisfaction and loyalty in Biman Bangladesh Airlines Limited?	Quantitative Research (Surveys, traditional Correlation analysis, Regression analysis (Multivariate, OLogit and OLS regression) and Machine Learning based regression analysis model like RandomForest regression and XGBoost regression)	To identify and quantify key variables affecting customer satisfaction and loyalty among a broad passenger base through statistical analysis.
	Qualitative Research (Literature review, In-depth Interviews, Focus	To explore in depth passenger experiences and the variables affecting key passenger satisfaction

	Group Discussions, Open-ended Survey Questionnaire, Secondary Sources)	
b. **Assessing the Impact of Customer Service Improvement**		
What is the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines Limited?	Quantitative Research (Surveys, Correlation analysis, Classical Regression analysis, Machine Learning random Forest, XGBoost regression)	For collecting data and quantitatively measuring the impact from a large sample.
	Qualitative Research (Literature review, In-depth Interviews, Focus Group Discussions, Open-ended Survey Questionnaire, Secondary Sources)	To gain deeper insights into the emotional dimensions of customer loyalty and complement quantitative findings.
c. **Formulating Suggestions for Service Quality Enhancement**		
What are the suggestions for improving customer service quality to enhance customer	Mixed-Methods Research (Integration of Quantitative and Qualitative data)	To provide a holistic understanding, formulating well-informed recommendations that are both statistically validated and contextually relevant. Integration of

loyalty in Biman Bangladesh Airlines Limited?		both quantitative and qualitative data will ensure the reliability and validity of the findings and suggestions.

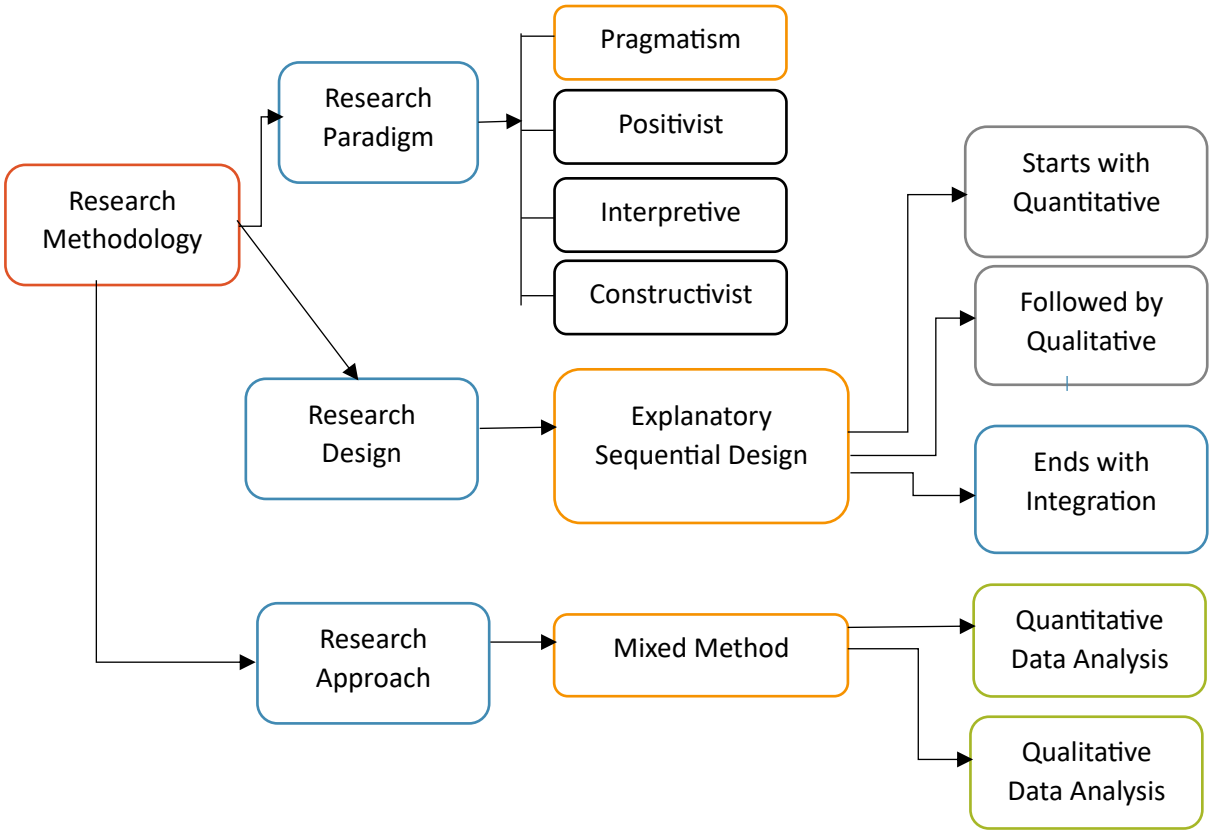
Source: Author

5.4 **Research Design**

Considering the research paradigm (Pragmatist Paradigm), research approach (Mixed Method Approach), research objectives, questions, and hypotheses, this study's most suitable research design is '**Explanatory Sequential Design**.' While mixed methods research involves the combination of quantitative and qualitative data within a single study, the explanatory sequential design is a more specific approach within mixed methods research that follows a sequential order, starting with quantitative data and then using qualitative data to explain or expand upon the quantitative findings. It has allowed a thorough exploration of the research objectives, from measuring the impact of customer service on loyalty to understanding the underlying factors derived through regression and correlation analysis and gathering suggestions for improvement.

This design quantifies the relationships between variables and then explores the 'why' and 'how' aspects through qualitative research. So, by employing the explanatory sequential design, all three research objectives can be effectively addressed, three research questions can be answered, two hypotheses along with sub-hypothesizes can be tested, and actionable recommendations for enhancing customer service quality in Biman Bangladesh Airlines Limited to boost customer loyalty can be provided.

Figure 5.1: Research Methodology: A Process Model



Source: Author

5.5 Hypothesis Development and Empirical Testing Framework

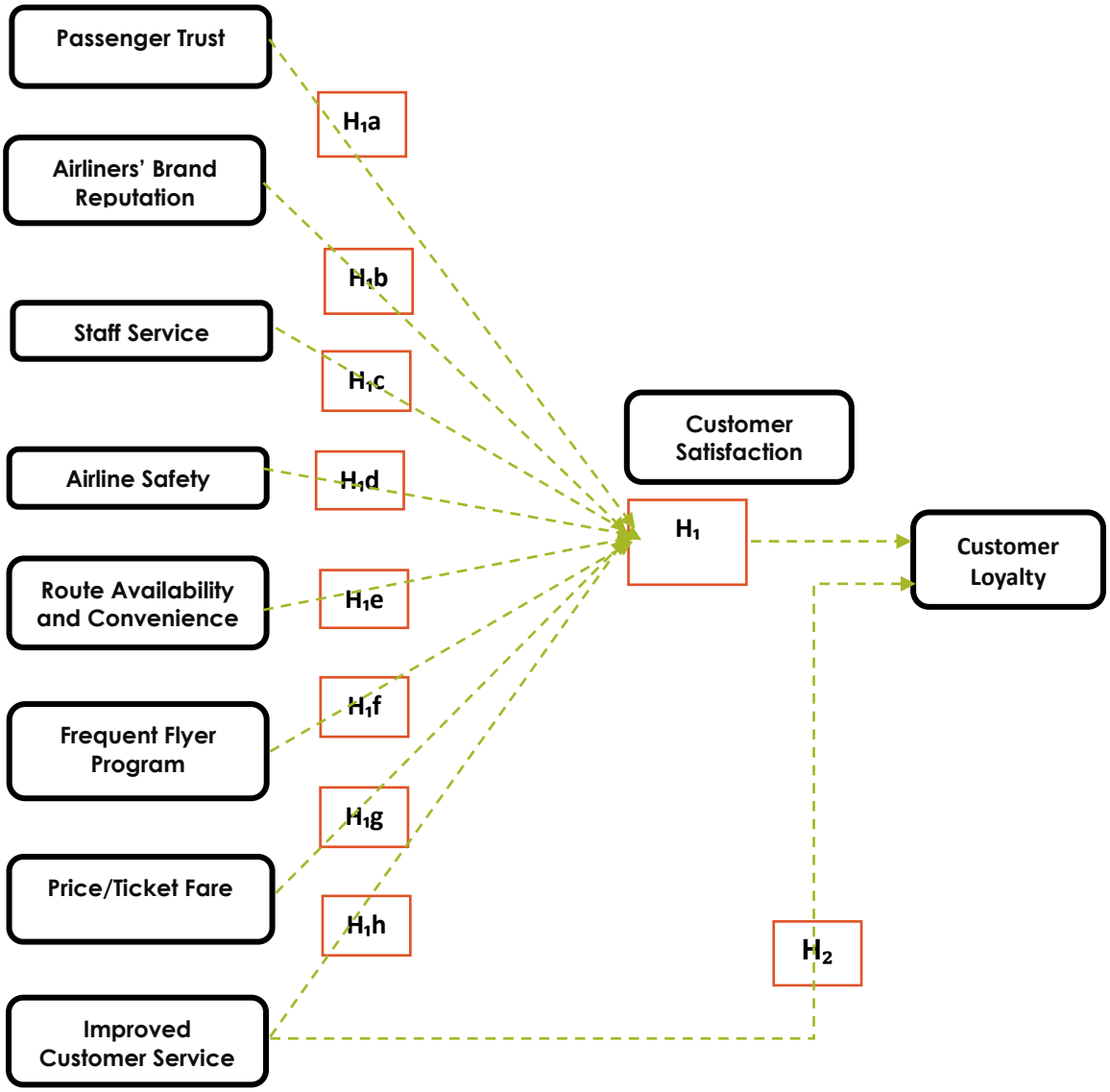
This section outlines the systematic approach undertaken to operationalize and empirically tests the formulated research hypotheses available at Chapter 3 (Para 3.5). In turn that guide this study to investigate on into the determinants of customer satisfaction and loyalty at Biman Bangladesh Airlines Limited.

5.5.1 Methodological Role and Operationalization of Hypotheses

The set of hypotheses, as delineated in Chapter 3 (Para 3.5, formed a cornerstone of this study's methodology by translating theoretical concepts and research questions into specific, measurable, and testable propositions. They operationalized the core constructs derived from established frameworks in service marketing and customer loyalty theory within the specific context of Biman Bangladesh Airlines Limited. This

study adopted a deductive research approach, where the hypotheses guided the quantitative data collection and subsequent statistical analysis detailed in Chapter 6. Each hypothesis was designed to be tested empirically using data gathered from the survey instrument, allowing for statistical inference regarding the relationships between key independent variables (e.g., passenger trust, brand reputation, staff service quality, perceived safety, route convenience, frequent flyer programs, ticket price, and improved customer service) and the dependent variables of customer satisfaction and customer loyalty.

Figure 5.2: Hypothesis Formulation Framework



Source: Author

5.5.2 **Hypotheses for Empirical Testing**

This study tests one main hypothesis (H_1), composed of multiple sub-hypotheses, and a secondary hypothesis (H_2).

Main Hypothesis (H_1)

H_1**:** Passenger trust, brand reputation, staff service, perceived safety, route availability and convenience, frequent flyer program value, ticket price, and improved customer service have significant positive effects on customer satisfaction and customer loyalty at Biman Bangladesh Airlines.

Null ($H_0$1): All predictor coefficients $\beta_1 \ldots \beta_8 = 0$ (no significant effect on satisfaction or loyalty).

Alternative (H_a1): At least one predictor coefficient $\beta \neq 0$ (at least one factor significantly affects satisfaction or loyalty).

Secondary Hypotheses (H_1a– H_1g)

Each hypothesis below is directional and statistically testable.

H_1a: Passenger Trust → Loyalty

- $H_0$1a: $\beta^T \leq 0$ (Passenger trust has no significant positive effect on loyalty).
- H_a1a: $\beta^T > 0$ (Passenger trust has a significant positive effect on loyalty).

H_1b: Brand Reputation → Loyalty

- $H_0$1b: $\beta^{BR} \leq 0$ (Brand reputation has no significant positive effect on loyalty).
- H_a1b: $\beta^{BR} > 0$ (Brand reputation has a significant positive effect on loyalty).

H_1c: Staff Service → Satisfaction and Loyalty

- $H_0$1c: $\beta^{ss} \leq 0$ (Staff service has no significant positive effect on satisfaction or loyalty).
- H_a1c: $\beta^{ss} > 0$ (Staff service has a significant positive effect on satisfaction or loyalty).

H_1d: Perceived Safety → Loyalty

- $H_0$1d: $\beta^{sa} \leq 0$ (Perceived safety has no significant positive effect on loyalty).
- H_a1d: $\beta^{sa} > 0$ (Perceived safety has a significant positive effect on loyalty).

H_1e: Route Availability & Convenience → Loyalty

- $H_0$1e: $\beta^{Rc} \leq 0$ (Route availability and convenience have no significant positive effect on loyalty).
- H_a1e: $\beta^{Rc} > 0$ (Route availability and convenience have a significant positive effect on loyalty).

H_1f: Frequent Flyer Program → Loyalty

- $H_0$1f: $\beta^{ffP} \leq 0$ (Frequent flyer program has no significant positive effect on loyalty).
- H_a1f: $\beta^{ffP} > 0$ (Frequent flyer program has a significant positive effect on loyalty).

H_1g: Price/Ticket Fare → Loyalty

- $H_0$1g: $\beta^{p} \leq 0$ (Ticket price has no significant positive effect on loyalty).
- H_a1g: $\beta^{p} > 0$ (Ticket price has a significant positive effect on loyalty).

H_2: Improved Customer Service → Customer Loyalty

Main Hypothesis: Improvements in customer service quality have a significant positive effect on passenger loyalty at Biman Bangladesh Airlines.

- **$H_0$2 (Null):** $\beta^{Ics} \leq 0$ (no significant effect)
- **H_a2 (Alternative):** $\beta^{Ics} > 0$ (significant positive effect)

5.5.3 Variables Under Investigation and Operationalization

The hypotheses incorporated specific independent, dependent, and control variables, which were operationalized for measurement as detailed in Table 5.2:

Table: 5.3: Variables Under Investigation and Operationalization

Hypothesis Code	**Hypothesis Statement (Conceptual Focus)**	**Independent Variable(s)**	**Dependent Variable(s)**	**Specific Survey Question(s) / Items Reference (Illustrative)**
H_1 **(Main)**	**Overall Relationship of Key Drivers with Customer Outcomes**	Composite of: Passenger Trust, Brand Reputation, Staff Service Quality, Perceived Safety, Route Availability and Convenance, FFP, Price/Fare	Customer Satisfaction & Loyalty	Overall model using predictors from Q9-Q15; Outcomes from Q16 (Satisfaction), Q17 (Improved Service Perception), Q18 (Loyalty)
H_1a	Passenger Trust → Loyalty	Passenger Trust	Customer Loyalty	Q9 (5 items assessing trust dimensions)
H_1b	Brand Reputation → Loyalty	Brand Reputation	Customer Loyalty	Q10 (6 items assessing brand image)
H_1c	Staff Service Quality → Satisfaction & Loyalty	Quality of Staff Services	Customer Satisfaction & Loyalty	Q11 (4 items assessing staff service)

H_1d	Safety Perception → Loyalty	Passenger Perception of Safety	Customer Loyalty	Q12 (3 items assessing safety perception)
H_1e	Route Availability & Convenience → Loyalty	Route Availability and Convenience	Customer Loyalty	Q13 (2 items assessing routes/schedules)
H_1f	Frequent Flyer Program (FFP) → Loyalty	Frequent Flyer Program (FFP)	Customer Loyalty	Q14 (2 items assessing FFP value)
H_1g	Price/Ticket Fare → Loyalty	Price/Ticket Fare	Customer Loyalty	Q15 (4 items assessing price perception)
H_2 **(Main)**	**Impact of Overall Improved Customer Service → Loyalty**	Improved Customer Service	Customer Loyalty	Q17 (items assessing perceptions of service improvement)

Source: Author

Demographic characteristics of respondents (e.g., age, gender, education, travel frequency from Q1-Q7) were used as control variables in statistical models to account for potential extraneous influences.

5.6 Sources of Research Data for Hypothesis Test and Mixed-Method Research Approach

With a pragmatic research paradigm and a mixed-method research approach, this research requires quantitative and qualitative data to address the research objectives and test the hypotheses properly. Quantitative data is needed to identify key variables influencing customer satisfaction and loyalty, such as passenger trust, brand reputation, staff service, safety, route availability, frequent flyer program, and price/ticket fare. These data helped to measure the impact of improved customer service on the loyalty of Biman Bangladesh Airlines Limited. Since qualitative data can

provide deeper insights into the reasons behind shifts in loyalty. Therefore, qualitative data is collected from current and past customers of Biman Bangladesh Airlines Limited who have experience with various service elements and variables influencing satisfaction and loyalty to comprehensively understand customer perceptions and experiences.

To meet the first research objective and first hypothesis, data on customer satisfaction measures/key variables (airline's service, including passenger trust, brand reputation, staff service, safety, route availability, convenience, frequent flyer program, and price/ticket fare) is collected through the survey or questionnaire. If available and accessible, some pre-existing data can also be collected from customer satisfaction surveys conducted from the official reports from Biman Bangladesh Airlines Limited, Civil Aviation Authority Bangladesh (CAAB), and the International Air Transport Association (IATA) that provide insights into the airline industry and service quality. To meet the second research objective and second research hypothesis, quantitative data on loyalty issues was used to measure the impact of improved customer service on customer loyalty. For all the objectives and hypotheses, qualitative feedback is collected through interviews or open-ended survey questions asking passengers, Biman Bangladesh Airlines Limited staff, academicians, and aviation industry experts for specific suggestions to improve customer service quality. Feedback will also be obtained to understand why passengers perceive improved customer service positively or negatively impacting their loyalty.

Biman Bangladesh Airlines Limited may aim to introduce a range of associated support services (Baggage services, Seating services, Seat selection and assignment, Health and wellness services, Lounge access, Visa and travel documentation assistance,

Unaccompanied minors services, Pet and animal transport, Special services for elderly passengers, Travel insurance information, Environmental and sustainability initiatives, Flight notifications) in addition to standard customer services to retain customers. The passengers may not be aware of these connected services. Some information like what steps Biman Bangladesh Airlines Limited, has already taken or will take to improve existing customer service quality, how CAAB deals with the complaints regarding serious customer service flaws, and some other strategic anticipations may not be obtained from passengers, as such these sorts of information are revealed directly from high officials of Biman Bangladesh Airlines Limited and CAAB through interview.

At every step of data collection and data type selection, passengers' demographic characteristics, such as gender, age, education, nationality, passenger type, nature of connection with Biman, and travel frequency, are given due importance to determine whether different groups react differently to improved service.

5.7 **Phase-I: Quantitative Research Phase**

In the first phase, quantitative data is collected through surveys to examine the impact of improved customer service and identify key variables influencing customer satisfaction and loyalty. The quantitative phase also tests hypotheses H1 and H2.

During this phase, research data is collected through structured questionnaires to measure customer satisfaction and loyalty and the factors influencing them. Initially, to have a concise summary of the main features of the data, the characteristics of a dataset, like mean, median, mode, range, variance, standard deviation, and measures of distribution like skewness and kurtosis, are determined. This research adopts a mixed-methods approach, integrating both classical statistical analysis techniques and

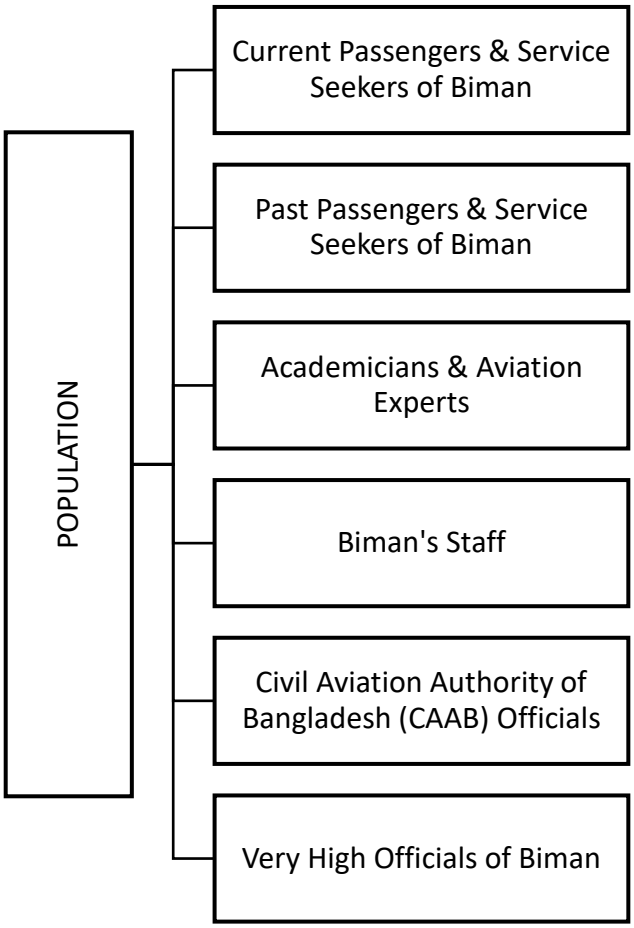
advanced machine learning models to ensure robust analysis. Foundational analysis is conducted using Exploratory Descriptive Analysis (EDA) that includes; descriptive statistics, reliability testing through Cronbach's Alpha, normality tests, traditional correlation, then classical regression methods as Ordinary Least Squares (OLS) regression, Ordered Logit (OLogit) regression and Multivariate Linear regression via SPSS, R, and Python. To address non-normally distributed data and mitigate challenges such as multicollinearity, and the complex interactions that traditional regression may miss, the study integrates machine learning-based regression models, specifically RandomForest and XGBoost regression, implemented programmatically in both Python and R.

Initially, Exploratory Descriptive Analysis (EDA) (Descriptive statistics, reliability assessment (Cronbach's Alpha), Data Normality test and correlation analysis) is conducted in SPSS then robust checked by Python to provide a foundational understanding of customer satisfaction and loyalty. Descriptive statistics has summarized key sample characteristics and response distributions, informing subsequent analyses, while Cronbach's Alpha has ensured the survey instrument's internal consistency and reliability. Correlation analysis is then quantifying linear relationships between key service attributes and customer outcomes, highlighting potential predictors. Finally, Ordinary Least Squares (OLS) regression, Ordered Logit (OLogit) regression and multivariate regression will isolate significant predictors of satisfaction and loyalty while controlling for confounding variables. This set of statistical techniques, applied using SPSS, plays a crucial role in building a strong foundational understanding of the data, validating the reliability of the measurement tools, and uncovering significant linear relationships that may influence customer behavior (Field, 2018); (Hair, 2019).

5.8 **Population**

In aid of data collection strategies, the population for this research is all the local and international customers who have used or are currently using the services of Biman Bangladesh Airlines Limited. The target population includes domestic and international travelers who have availed of Biman Bangladesh Airlines Limited on domestic and international routes. Aside from customer service, Biman Bangladesh Airlines Limited may provide or interact with various other service seekers, like travel agents and ticketing services, cargo and freight services, suppliers and vendors, maintenance and repair services, catering services, ground handling services, security services, passenger assistance services, insurance providers, tour operators, and travel agencies are also considered as the population for this study. When selecting populations, due consideration is given to segmenting the population based on factors such as gender, age, education, nationality, passenger type, nature of connection with Biman, and travel frequency to ensure that the sample is representative of the overall population and to enable to conduct sub-group analysis if needed. So, for this study, the most justified target populations would include:

Figure 5.3: Stakeholder Population Clusters



Source: Author

5.8.1 **Current Passengers and Other Service Seekers of Biman Bangladesh Airlines Limited**.

This group is highly relevant to this research objective as they offer valuable information regarding the key variables influencing customer satisfaction and loyalty (Objectives 1 and H1). Since they have direct experience with the airline's current customer service, this group can provide insights into how it affects their loyalty (Objectives 2 and H2). Collecting their suggestions for improving customer service quality aligns with the third objective (Objective 3).

5.8.2 **Past Passengers and Other Service Seekers of Biman Bangladesh Airlines Limited**.

In selecting the study population, particular emphasis is placed on past passengers, as they and other service seekers who have discontinued using Biman can offer valuable insights into issues related to customer satisfaction and loyalty. According to the Managing Director & CEO of Biman Bangladesh Airlines Limited, individuals who have not flown with Biman in the past two years and have opted for alternative Airlines Limited are typically classified as past passengers. This group is instrumental in examining the influence of customer service on loyalty and identifying key factors contributing to customer attrition, directly aligning with Objectives (1) and (2) and Hypotheses (H1 and H2).

5.8.3 **Biman Bangladesh Airlines Limited Staff**.

Employees of the airline can provide insights into the challenges and opportunities related to customer service improvement. They can offer an internal perspective on customer service quality and its effect on passenger satisfaction and loyalty (Objective 3 and H2).

5.8.4 **Academicians and Aviation Industry Experts**.

These experts offer valuable insights and recommendations based on their expertise in the field. They can provide a broader industry context and best practices for improving customer service and enhancing loyalty (Objective 3 and H1, H2).

5.8.5 **High Officials of Biman Bangladesh Airlines Limited**.

These officials provide direct information about the airline's efforts to improve customer service, which is relevant to understanding the airline's initiatives in this area.

Information about steps taken by the airline to enhance the quality of service can directly support this research (Objective 3 and H1, H2).

5.8.6 **Civil Aviation Authority of Bangladesh (CAAB).**

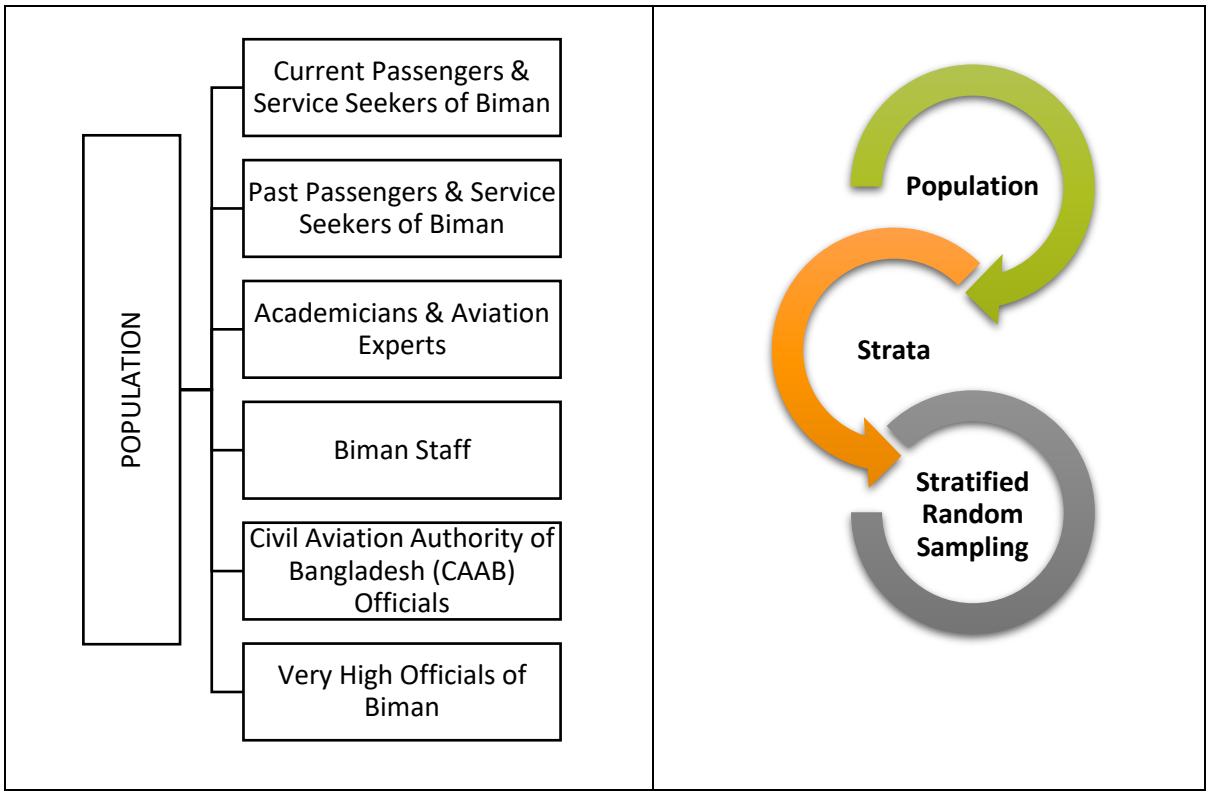
Representatives from CAAB offer insights into the regulatory environment and how they address complaints regarding customer service issues. This information is relevant to understanding the external factors and standards that affect customer service in the airline industry (Objective 3 and H1).

Depending on the resources available, this study has focused on specific populations or combine them to provide a comprehensive view of customer loyalty and service quality at Biman Bangladesh Airlines Limited.

5.9 **Sample**

Surveying every member of Biman Bangladesh Airlines Limited's target demographic is not feasible. Because there are many groups and subgroups within the populations, basing on those sub groups/strata, this research uses **a stratified random sampling** technique to select a sample that will ensure representativeness and randomness of participants of each population group (current passengers, and other service seekers of Biman Bangladesh Airlines Limited, past passengers and other service seekers of Biman Bangladesh Airlines Limited, Biman Bangladesh Airlines Limited staff, academicians and aviation industry experts, high officials of Biman Bangladesh Airlines Limited, civil aviation authority of Bangladesh). Stratified sampling can be useful to ensure a proportionate representation of each subgroup in the research sample.

Figure 5.4: Population Stratification Model for Sampling



Source: Author

However, creating an accurate and statistically justified sample percentage among the target population is critical. However, based on the importance of each subgroup and the comparatively probable number of population available in each subgroup, the following sample percentage is catered to ensure proportionality:

5.9.1 **Current Passengers of Biman Bangladesh Airlines Limited**.

This population directly experiences the airline's current customer service and is central to the research objectives. Therefore, the largest portion of the sample is allocated to this group. Approximately 50-60% of the sample is dedicated to current passengers.

5.9.2 **Past Passengers of Biman Bangladesh Airlines Limited.**

Understanding why past passengers discontinue their use of the airline is valuable. Therefore, around 20-30% of the sample is allocated to this group, as their insights can provide a balanced perspective on loyalty factors.

5.9.3 **Biman Bangladesh Airlines Limited Staff**.

Employees can offer an internal perspective, but their numbers may be limited. Therefore, about 10-15% of the sample is allocated to this subgroup.

5.9.4 **Academicians and Aviation Industry Experts**.

Their expertise can provide a broader context. Around 5-10% to this group is allocated.

5.9.5 **High Officials of Biman Bangladesh Airlines Limited**.

This group may also have limited numbers. Around 5-10% of the sample is allocated to high officials.

5.9.6 **Civil Aviation Authority of Bangladesh (CAAB)**

Representatives from CAAB can provide insights into regulatory aspects. Therefore, around 5-10% of this group is allocated.

These suggested percentages aim to create a balanced and representative sample while ensuring the largest portion goes to the group most directly related to the research objectives, keeping in mind that the actual distribution may vary based on practical considerations and access to individuals within each subgroup.

5.10 **Sampling Strategy**

A stratified random sampling strategy is deemed suitable given the context of research objectives, questions, and hypotheses related to customer loyalty through improved

customer service in Biman Bangladesh Airlines Limited. This strategy allows the unique characteristics and proportions of each subgroup within the population to obtain a representative sample for this study. For the following reasons, Stratified Random Sampling is designated as ideal for this research:

5.10.1 **Diverse Population**.

The target population includes various groups (stratum), such as current and past passengers, staff, academicians, high officials, and representatives from the Civil Aviation Authority. Each group has unique perspectives and experiences, and stratified sampling allows for the capture of this diversity.

5.10.2 **Proportional Representation**.

Research objectives and questions involve different groups (stratum) within the airline industry. To accurately address these objectives and questions, it is crucial to sample from each group in proportion to its size in the total population. Stratified random sampling ensures that each subgroup of passengers (stratum) is well represented in the sample.

5.10.3 **Improved Precision.**

Stratified sampling increases the precision of estimates for each subgroup. This is important in making specific inferences about the experiences and opinions of various groups within the target population.

5.10.4 **Reduced Variability.**

By ensuring that each subgroup is represented in the selected sample, this sampling technique can reduce the overall variability and improve the accuracy of research findings.

5.10.5 **Statistical Validity.**

Stratified sampling follows a statistically sound approach, ensuring the selected sample results in unbiased and representative estimates for each subgroup. So, to implement stratified random sampling, the subgroups (strata) of customers based on relevant characteristics such as loyalty status, demographics, or frequency of travel are identified.

The calculated sample sizes for each subgroup have been considered to guarantee that sufficient data are taken to draw valid conclusions. Therefore, the weighted allocation of sample size for each stratum is taken into consideration that is a larger portion of the sample to the stratum with the largest percentage (Current Passengers) and progressively smaller portions to the other strata based on their respective percentages.' The formula used for weighted allocation for determining the sample size for a stratum is:

Sample size for Stratum= (Weight of stratum/Sum of weights of all strata) ×Total sample size

5.11 **Sample Size Determination**

The target population for this study comprises passengers and stakeholders associated with Biman Bangladesh Airlines Limited. Given that Biman Bangladesh Airlines Limited serves a substantial and effectively unlimited number of passengers annually, exceedingly more than 100,000, a census is impractical. Therefore, a

sample-based approach is necessary to gather representative data. This research will employ a mixed-methods approach to data collection, combining quantitative surveys with qualitative interviews to gain a holistic understanding of the research topic.

Several strategies exist for determining an appropriate sample size (Israel, 1992). These include replicating sample sizes from similar studies, utilizing published tables, and applying statistical formulas (Israel, 1992). Published tables, such as the one provided (Yamane, 1967), offer pre-calculated sample sizes based on desired confidence levels, precision, and population size. Table 1 (Yamane, 1967) indicates that for a population exceeding 100,000, a 95% confidence level, and a ±5% margin of error, a sample size of approximately 400 would be required. While such tables provide a convenient reference point, they often rely on general assumptions about population variability. They may not fully account for the specific characteristics of the target population in this study.

Table 5.4: Sample Size (n) Requirements for Specified Population Sizes and Precision Levels (95% Confidence Level, P=.5)

Population Size	±3% Precision	±5% Precision	±7% Precision	±10% Precision
500	a	222	145	83
600	a	240	152	86
700	a	255	158	88
800	a	267	163	89
900	a	277	166	90
1,000	a	286	169	91
2,000	714	333	185	95
3,000	811	353	191	97

4,000	870	364	194	98
5,000	909	370	196	98
6,000	938	375	197	98
7,000	959	378	198	99
8,000	976	381	199	99
9,000	989	383	200	99
10,000	1,000	385	200	99
15,000	1,034	390	201	99
20,000	1,053	392	204	100
25,000	1,064	394	204	100
50,000	1,087	397	204	100
100,000	1,099	398	204	100
>100,000	1,111	**400**	204	100
Note: a = Assumption of normal population is poor (Yamane, 1967) .The entire population should be sampled.				
Source: Determining Sample Size PEOD6, IFAS Extension, University of Florida				

Therefore, primarily this research has relied on established formulas to calculate a statistically sound sample size, complemented by adjustments for the stratified nature of the population. This approach allows for greater flexibility in tailoring the sample size to the specific research objectives and the estimated variability within the Biman Bangladesh Airlines Limited stakeholder ecosystem.

To determine the minimum required sample size for the quantitative component of this study, Cochran's formula for proportions is employed (Cochran, 1963). This formula is suitable for large populations and is expressed as:

$$n_0 = \frac{Z^2 \times p \times q}{e^2}$$

where:

- n_0 = initial sample size
- Z = Z-score corresponding to the desired confidence level (1.96 for 95% confidence)
- p = estimated proportion of the population with a specific characteristic (assumed to be Cochran's formula for proportions is employed 0.5 for maximum variability, yielding a conservative estimate)
- q = 1 - p (complementary proportion)
- e = desired margin of error (precision level)

Assuming a 95% confidence level (Z = 1.96) and a margin of error of 5% (e = 0.05), the initial sample size (n0) is calculated as follows:

$$n_0 = \frac{1.96^2 \times 0.5 \times 0.5}{0.05^2} = \mathbf{425.16}$$

Rounding up to the nearest whole number, the initial required sample size is 425. This figure aligns closely with the sample size suggested by Yamane's (1967) table for very large populations, further supporting the appropriateness of this estimate.

5.11.1 Addressing Finite Population Correction

While the passenger base exceeds 100,000, it's essential to acknowledge that the accessible population within the study timeframe might be smaller. If the accessible population were significantly smaller (e.g., less than 50,000), a finite population correction (FPC) could be applied to reduce the required sample size.

However, given the scale of Biman Bangladesh operations, the FPC is unlikely to alter the initial sample size substantially, and its application is not deemed necessary at this stage.

5.12 SAMPLING DISTRIBUTION

5.12.1 Stratified Random Sampling and Weighted Allocation

A stratified random sampling approach is adopted to ensure representation from various stakeholder groups. This involves dividing the population into distinct subgroups (strata) and drawing samples from each stratum proportionally to their representation in the overall population. Since the strata for this study are identified as current passengers/customer service seekers from Biman Bangladesh airlines limited, past passengers/customer service seekers from Biman Bangladesh airlines limited, Biman airlines limited staff, academicians and industry experts, high officials of Biman airlines limited and civil aviation authority of Bangladesh so a weighted allocation approach is used to determine the sample size for each stratum (Islam, 2018). This approach ensures that each stratum's contribution to the sample is proportional to its relative size in the total population. The formula for weighted allocation is:

$$n_i = \frac{Ni}{N} \times n$$

Where:

- n_i is the sample size for stratum i.
- Ni is the size of stratum i in the population.
- N is the total population size.
- n is the total sample size.

Based on available data and estimations of the relative proportions of each group within the broader Biman Bangladesh stakeholder ecosystem, the following distribution of the total sample (425) is proposed:

Table: 5.4 Respondent Categories and Proportional Representation in Sample (n=425)		
Group of Population	Percentage of Population	Number of Samples (n=425)
Current passenger/customer service seekers from Biman Bangladesh Airlines Limited	55%	212
Past passenger/customer service seekers from Biman Bangladesh Airlines Limited	25%	96
Biman Airlines Limited Staff	10%	39
Academicians and Industry Experts	5%	19
High Officials of Biman Airlines Limited	3%	12
Civil Aviation Authority of Bangladesh	2%	7
Total	100%	425

Source: Author

5.12.2 **Sample Distribution for 425 Respondents for this Study**

Considering the possibility of non-response and aiming for a more robust sample, we will target 425 respondents. The adjusted distribution across strata is as follows:

Table 5.5: Table X: Respondent Profile: Proportional Representation of Key Stakeholder Groups (n = 425)

Group of Population	Percentage of Population	Number of Samples (n=425)
Current passenger/customer service seekers from Biman Bangladesh Airlines Limited	55%	234 (Calculation: 0.55×425≈234)
Past passenger/customer service seekers from Biman Bangladesh Airlines Limited	25%	106 (Calculation: 0.25×425≈106)
Biman Airlines Limited Staff	10%	43 (Calculation: 0.10×425≈43)
Academicians and Industry Experts	5%	21 (Calculation: 0.05×425≈21)
High Officials of Biman Airlines Limited	3%	13 (Calculation: 0.03×425≈13)
Civil Aviation Authority of Bangladesh	2%	8 (Calculation: 0.02×425≈8)
Total	100%	425

Source: Author

This slightly larger sample size, 425, will help mitigate the potential impact of non-response and enhance the study's statistical power.

5.12.3 **Supplementary Considerations for Sample Distribution**

The sample size calculations presented above provide the minimum number of responses needed for statistically valid analysis. To account for potential non-response, the number of surveys distributed or interview invitations extended is increased by approximately 10-20%. Furthermore, the chosen sample size is adequate for descriptive statistics (means, frequencies) and suitable for more complex

statistical analyses, such as multiple regression or analysis of variance, should the data warrant such techniques.

5.12.4 Justification on Sample Distribution

This sample size, determined through a combination of established formulas and stratified random sampling with weighted allocation, provides a robust and representative basis for drawing inferences about the broader population of Biman Bangladesh Airlines Limited passengers and stakeholders. Acknowledging the guidance offered by sample size tables, such as (Yamane, 1967) using Cochran's formula and stratified sampling, allows for a more tailored and precise estimation of the required sample size for this specific research context. The 95% confidence level ensures a high degree of certainty that the findings from the sample accurately reflect the views and experiences of the overall population. By accounting for the diverse stakeholders through stratification, the study aims to provide a nuanced and comprehensive understanding of the research topic.

5.13 Implementation of The Sampling Method on Distributed Sampling

The data acquisition is designed considering a cross-sectional study (single time point, snapshot of population, prevalence estimates in a quick and cost-effective) and planned to conduct the survey at the real service setting in the organization selecting passengers who pay to have service from Biman Bangladesh Airlines Limited. The population in this study refers to all the customers who travel and deserve good service from Biman Bangladesh Airlines Limited on domestic and international routes prior to and from December 2023 to December 2024. According to Biman Bangladesh Annual Report (2023), in the three months from July to September 2023, Biman carried 8 lakh passengers, its highest in the last five years. Considering this research, it is an infinite

population, and very difficult to estimate passengers to survey. Thus, statistically indicated 425 selected samples from its infinite population are studied for data acquisition. This sample was selected by applying the stratified random sampling method with a convenience approach, which is a suitable method for conducting this kind of infinite population. A stratified random sampling (weighted allocation approach) test was used to confirm the adequacy of the sample size. The sample unit is individual customers and unselected, focusing on some of the demographic factors such as gender, age, education, nationality, passenger type, nature of connection with Biman travel frequency, etc. An interview is carried out to provide a more comprehensive and holistic view of the research topic. Some information (Statistical databases, Previous Research Studies, Archives, and Historical Records, Market Research Reports, case study reports, and so on) may not be available through questionnaire surveys and interviews; these sorts of data are collected from secondary sources. Planned data acquisition means and ways for this research are given below:

5.13.1 **Primary Data Collection: Stratified Sampling and Mixed-Mode Survey Administration**

To collect primary data for this research, a survey was conducted among 425 individuals, stratified according to their connection with Biman Bangladesh Airlines Limited and proportionate to their representation within the broader stakeholder population. As per the sampling strategy outlined in Table 5.5, the distribution of questionnaires across different groups was as follows:

5.13.1.1 **Current Passenger/Customer Service Seekers from Biman Bangladesh Airlines Limited**: 234 questionnaires (55% of the total sample).

5.13.1.2 **Past Passenger/Customer Service Seekers from Biman Bangladesh Airlines Limited**: 106 questionnaires (25% of the total sample).

5.13.1.3 **Biman Airlines Limited Staff**: 43 questionnaires (10% of the total sample).

5.13.1.4 **Academicians and Industry Experts**: 21 questionnaires (5% of the total sample).

5.13.1.5 **High Officials of Biman Bangladesh Airlines Limited**: 13 questionnaires (3% of the total sample).

5.13.1.6 **Civil Aviation Authority of Bangladesh**: 8 questionnaires (2% of the total sample).

A mixed-mode approach is used for the 234 current passenger/customer service seekers. Approximately 80-100 questionnaires were administered directly to passengers arriving at or departing from various domestic and international airports in Bangladesh. The remaining 134-154 questionnaires were distributed via email and social media platforms to office colleagues, friends, relatives, known and unknown individuals, travel agents, and other service seekers of Biman Bangladesh Airlines Limited, requesting responses if they had a recent customer service experience (within the past year, 2023-2024). This group is essential for testing the impact of improved customer service on customer loyalty (Objective 1, 2, and H1, H2).

To survey the 106 past customers of Biman Bangladesh Airlines Limited, questionnaires were sent to individuals from the categories mentioned earlier who had received services from Biman before 2023 and were no longer actively using the airline

due to various reasons. This group can help address the impact of customer service on loyalty and factors that contribute to customer attrition (Objective 1, 2, and H1, H2).

To gather diverse perspectives, 43 questionnaires were sent to staff (managers and below) of Biman Airlines Limited working at headquarters and field offices, 13 questionnaires to high officials (Directors, Station Managers, pilots, chief engineers, heads of different sections), and 8 to personnel at different levels within the Civil Aviation Authority of Bangladesh. Additionally, 21 questionnaires were distributed to academics with a business background from various universities and serving and retired aviation experts. This distribution aimed to gain insights into internal perceptions of customer service quality and its impact on passenger satisfaction and loyalty (Objective 3).

Anticipating non-response, the sampling strategy included a 20% oversample (n=85) distributed within strata to compensate for potential data loss and maintain statistical power. All respondents were encouraged to share and invite their friends and acquaintances to participate, leveraging a snowball sampling effect, where initial participants refer others who meet the inclusion criteria (Easterby-Smith, et al., 2012). The survey was conducted directly and via social media platforms to increase the sample size and response rate. Upon reaching the deadline for questionnaire submission, a detailed analysis of respondents and non-respondents was conducted to inform the subsequent statistical analysis.

This revised approach aims to provide a more comprehensive and balanced representation of the diverse stakeholder groups connected to Biman Bangladesh Airlines Limited. It acknowledges the potential for non-response and leverages snowball sampling to enhance the overall sample size and validity of the study.

5.13.2 Design and Deployment of the Data Collection Instrument on Distributed Sampling

The survey questionnaire is made with a tool called ‘Google Form’ and distributed online as well as printed interview-based questionnaires’ (a combination of both open-ended and closed-ended) to gather primary data from passengers and service seekers, respectively, because passengers are always busy with their travel. The survey is conducted through the standard survey questionnaire as Appendix 3, which is related to domestic and international passengers’ level of expectations and factors involved in service quality. Likert scale is used in the questionnaire to make it easy for respondents to answer in a short time; every question is designed according to the respondent’s nearest expectation, experiences, and importance of service quality. Respondents are asked to tick the most appropriate experience. The Likert scale is used to get the respondent’s opinions about the statements and how strongly they agree or disagree. Satisfaction level or level of expectation to Biman Bangladesh Airlines Limited is structured as, much less than expectation=1, Less than expected=2, Matched expectation=, Exceeded expectation=4, More than exceeded expectation=5.

Questionnaires comprise a total of 20 questions with the format of five-point Likert scaling, ranging from strongly disagree (1) to strongly agree (5). The questionnaire was mostly developed with close-ended questions, where required open-ended questions were also used. The questionnaire consists of four parts: part A- Demographic profile of respondents, part B- Level of expectation to Biman Bangladesh Airlines Limited and, Part C- Dimension of the impact of customer service on customer loyalty, Part D- Justification of customer’s opinions.

5.13.3 Pilot Study and Instrument Reliability Analysis

A pilot survey was carried out on 43 respondents to assess the questionnaire's clarity and length. The result of the Pilot test is attached in Appendix 4. The data of the pilot survey was passed through Cronbach's Alpha test. Before launching the study, this test is conducted to assess the reliability of the questionnaire as Appendix 3. A pilot study is considered the most effective solution to the questions raised before the process of data collection takes place. Some items were removed from scales based on Cronbach's alpha to increase internal consistency reliability. There is no fixed alpha value for acceptance of a scale, although common values include alpha = 0.6 (for exploratory research) and 0.8 (for explanatory research) (Gravetter & Forzano, 2011). This study used a basic threshold of 0.8 to accept scales; if scales did not meet this requirement, they were adjusted as needed. However, the Alpha value for each dimension is found to be greater than 0.700. Both manually and through a data analysis software (SPSS 25) version, Cronbach's Alpha coefficient or reliability coefficient is derived to gain the maximum possible accuracy and clarity of the questionnaire. The formula used to determine Cronbach's Alpha is as follows:

Cronbach's Alpha , $\alpha = \frac{N}{N-1} \times \left[1 - \frac{\sum {\sigma_i}^2}{{\sigma_t}^2}\right]$

Where:

N: The number of items (questions) in the questionnaire.

${\sigma_i}^2$: The variance of each individual item.

${\sigma_t}^2$: The variance of the total scores of all items.

It is mentionable that Cronbach's Alpha can range from 0 to 1, with higher values indicating greater internal consistency. A common rule of thumb is to consider a Cronbach's Alpha value of at least 0.70 as acceptable for most research purposes

5.13.3.1 Pilot Study: Reliability Analysis and Instrument Optimization

To ensure the reliability and validity of the study's measurement instrument, a pilot test was conducted with 43 respondents, evaluating Customer Satisfaction and Customer Loyalty across eight variables using 40 attributes. The pilot study revealed excellent internal consistency, as evidenced by a Cronbach's Alpha of 0.959 and 0.985 for each assessment, suggesting that the questionnaire items effectively measure the underlying constructs. Item-total correlation analysis indicated potential redundancy within the "Passenger Trust" variable, with a high correlation of 0.920. While most attributes exhibited strong correlations, "Route Availability and Convenience" showed a slightly lower but acceptable correlation of 0.683. To enhance the questionnaire's precision and effectiveness, items related to "Passenger Trust" were reviewed to address potential redundancy. Items related to "Route Availability and Convenience" were retained due to their distinctiveness and moderate correlation with the overall scale. The findings from the pilot study validated the questionnaire's robustness and suitability for measuring Customer Satisfaction and Customer Loyalty in the target population; the minor recommended adjustments were implemented before full-scale data collection.

5.14 Quantitive Data Analysis and Hypothesis Testing

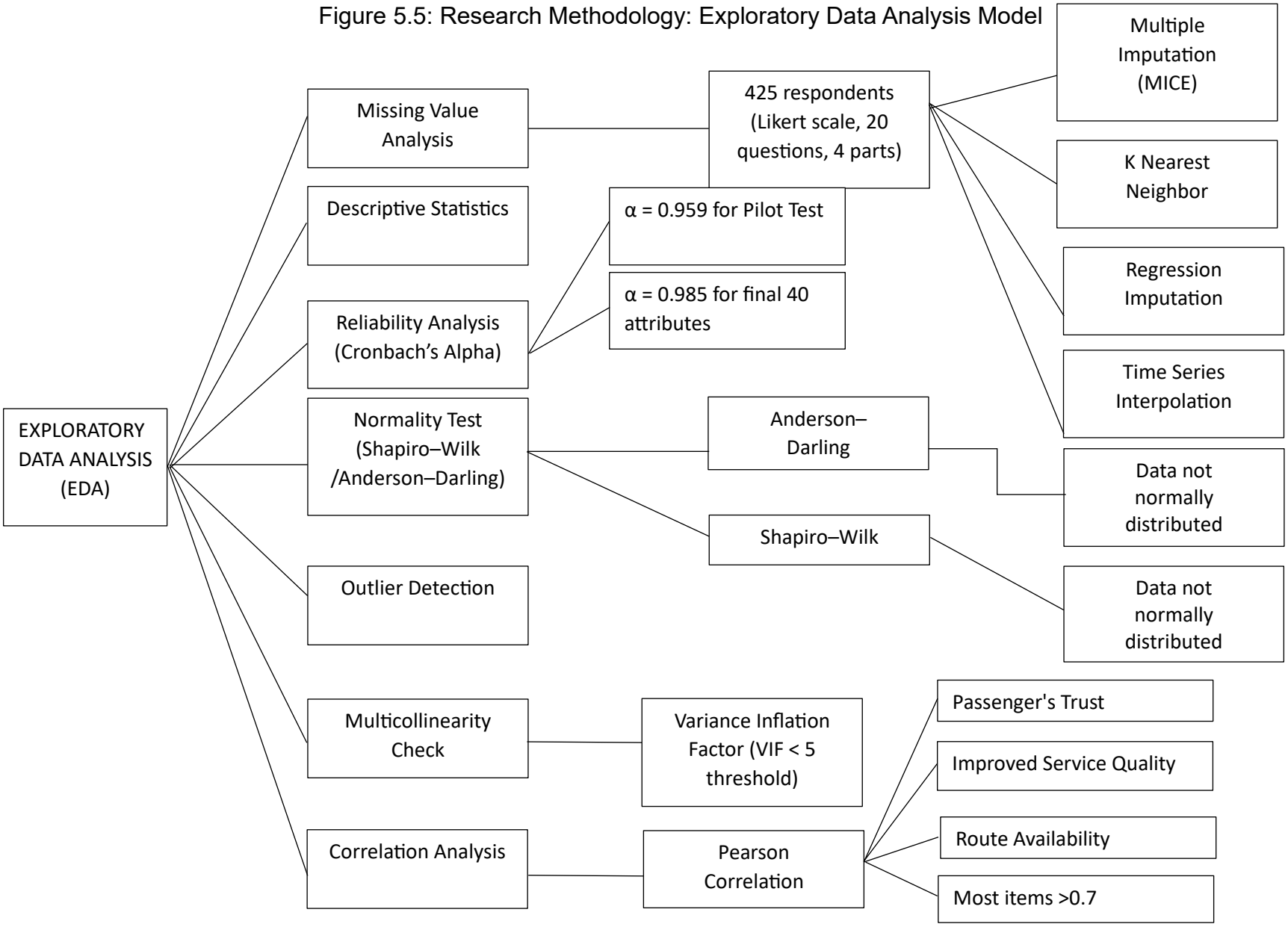
This section describes the planned procedures for data wrangling preparation, cleaning and quantitively data analysis tools for statistical and machine-learning techniques to address the research questions.

5.14.1 Data Cleaning and Exploratory Data Analysis (EDA) Process

Upon completion of data collection, a rigorous data preparation process is implemented (steps mentioned in Table 5.7) to ensure the quality and integrity of the

dataset. Data from online and in-person surveys is imported into a unified database. Any discrepancies in formatting and data entry are resolved. Responses are screened for completeness and consistency. Responses with significant missing data or contradictory answers is flagged for review (Hair, 2019). Outlier detection is performed to identify extreme values that could disproportionately influence the results. Boxplots, scatter plots, and statistical tests (e.g., z-scores and interquartile range) is used to identify outliers. Outliers are examined and either corrected or removed if deemed non-representative of the population (Field, 2018). Because outlier detection ensures that extreme data points do not skew the results of analyses. Depending on the extent and pattern of missingness, missing values is addressed using appropriate imputation techniques. Mean/median imputation is used for variables with minimal missing data (<5%), while multiple imputation is considered for more substantial missingness (5-20%) to minimize bias (Levin, et al., 2019). Proper handling of missing data prevents systematic distortion of data. If needed, data transformations (e.g., Box-Cox, log transformations) is applied to address non-normality, as indicated by Shapiro-Wilk and Anderson-Darling tests, ensuring assumptions of statistical tests are met (Osborne, 2010). Categorical variables are recoded into numerical format for use in statistical models (e.g., dummy coding). Responses to related questions is validated for consistency. Open-ended survey responses are cleaned by removing irrelevant characters, converting them to lowercase, removing stop words, and applying stemming/lemmatization to prepare for thematic analysis. To ensure transparency and replicability, detailed documentation is maintained throughout the data preparation process, including a log of all changes, rationale, and assumptions.

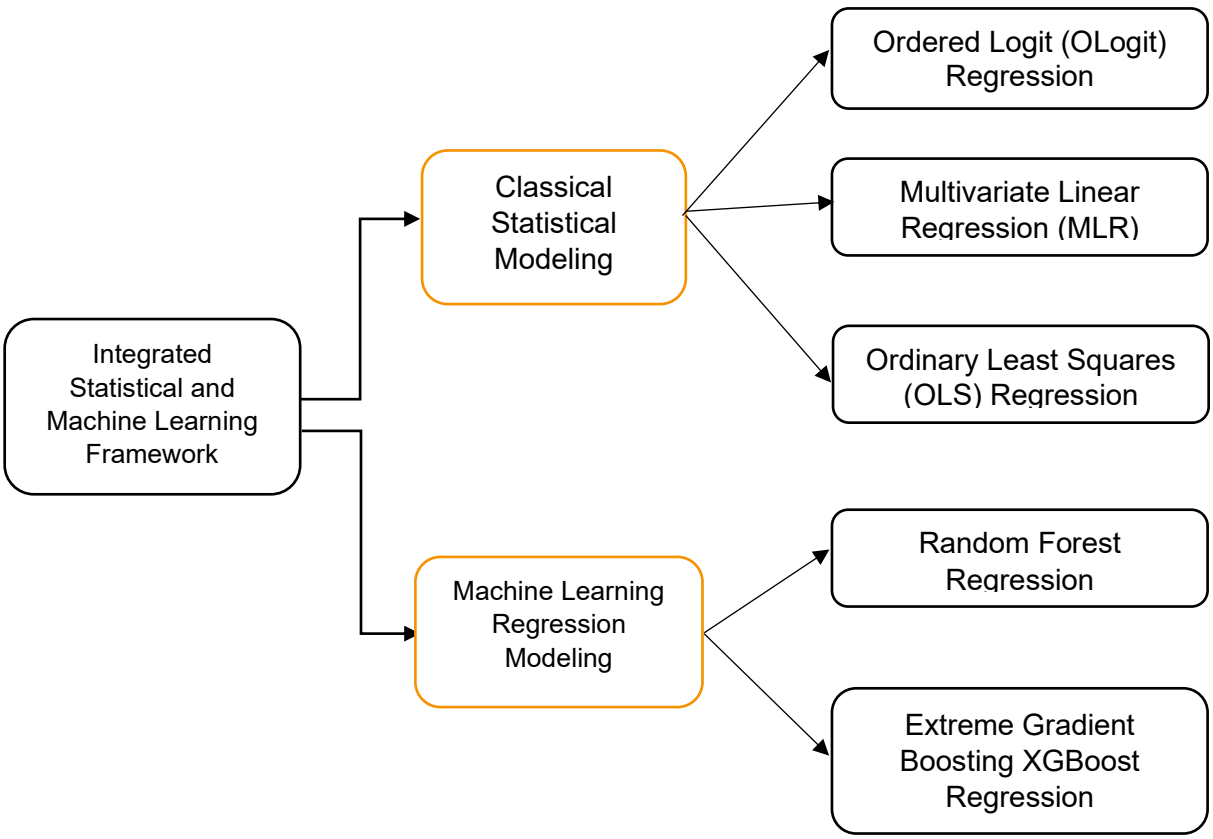
Figure 5.5: Research Methodology: Exploratory Data Analysis Model



5.14.2 **Integrated Statistical and Machine Learning Framework**

This study employs a dual analytical framework, combining classical statistical models (OLS, OLogit, multivariate linear regression, correlation analysis) with machine learning-based regression (RandomForest, XGBoost) to rigorously assess the causal relationships between service quality, customer satisfaction, and loyalty at Biman Bangladesh Airlines Limited. The independent variables as Improved Customer Service, Passenger Trust, Brand Reputation, Staff Service, Airline Safety, Route Availability, Frequent Flyer Program, and Price were operationalized through a 5-point Likert scale survey (N=425), validated for reliability (Cronbach's α = 0.959) and tested for normality (Shapiro-Wilk, Anderson-Darling).

Figure 5.6: Integrated Statistical and Machine Learning Framework



Source: Author

5.14.2.1 Classical Statistical Modeling

To rigorously address distinct research objectives, several modeling techniques have been implemented and evaluated:

5.14.2.1.1 **Ordered Logit (OLogit) Regression:** Utilized for Customer Satisfaction (Objective I) to appropriately model its ordinal nature, yielding interpretable odds ratios and identifying key service and demographic drivers (e.g., "Improved Customer Service" $\beta=1.365$, $p<0.001$). The formula for the Ordered Logit (OLogit) Regression model for Customer Satisfaction (CS), incorporating all the types of variables considered and mentioned in the research context for this specific model (demographic, service experience, and others tested for satisfaction).

Let:

- CS_i be the observed ordinal level of Customer Satisfaction for respondent i.
- j be a specific level of Customer Satisfaction, where $j = 1, 2, ..., k-1$ (and k is the total number of ordered categories for Customer Satisfaction, e.g., if 5 categories, j goes from 1 to 4).
- $P(CS_i \leq j)$ be the cumulative probability that respondent i's Customer Satisfaction is at level j or below.
- τ_j be the cut-points or thresholds that define the boundaries between the ordered satisfaction categories.

The independent variables (IVs) mentioned as being part of the OLogit model for Customer Satisfaction (either significant or explicitly mentioned as tested but not significant) are:

- ICS_i = Improved Customer Service score for respondent i
- PT_i = Passenger Trust score for respondent i
- BR_i = Brand Reputation score for respondent i
- FFP_i = Frequent Flyer Program score for respondent i
- P_i = Price score for respondent i
- A_i = Age of respondent i (or age category)
- EL_i = Education Level of respondent i (or category)
- AS_i = Airline Safety score for respondent i
- RA_i = Route Availability score for respondent i
- G_i = Gender of respondent i (likely dummy coded)
- N_i = Nationality of respondent i (likely dummy coded if categorical)
- NC_i = Nature of Connection of respondent i (likely dummy coded if categorical)
- TF_i = Travel Frequency of respondent i (or category)
- SS_i = Biman Staffs' Services score for respondent i
- PCT_i = Passenger Customer Type of respondent i (likely dummy coded if categorical)

Each independent variable X will have an associated coefficient β_x.

The Ordered Logit (OLogit) Regression Model Equation:

$$\log\left[\frac{P(CS_i \le j)}{P(CS_i > j)}\right] = t_j - (\beta_{ICS} ICS_i + \beta_{PT} PT_i + \beta_{BR} BR_i + \beta_{FFP} FFP_i + \beta_P P_i + \beta_A A_i + \beta_{EL} EL_i + \beta_{AS} AS_i + \beta_{RA} RA_i + \beta_G G_i + \beta_N N_i + \beta_{NC} NC_i + \beta_{TF} TF_i + \beta_{SS} SS_i + \beta_{PCT} PCT_i)$$

for j = 1, 2, ..., k-1

5.14.2.1.2 **Multivariate Linear Regression (MLR):** Employed for simultaneously analyzing drivers of both Customer Satisfaction (R^2=0.784) and Customer Loyalty (R^2=0.718) (Objective I), treating DVs as quasi-continuous given N=425 and Central Limit Theorem considerations. The statistical formula for Multivariate Linear Regression (MLR) considering all the types of variables mentioned for Objective I, where research has used simultaneously model Customer Satisfaction (CS) and Customer Loyalty (CL).

Let:

- CS_i be the Customer Satisfaction score for respondent i.
- CL_i be the Customer Loyalty score for respondent i.
- The independent variables (IVs) from your research context for Objective I are:
- ICS_i = Improved Customer Service score for respondent i
- PT_i = Passenger Trust score for respondent i
- RA_i = Route Availability score for respondent i
- P_i = Price score for respondent i
- BR_i = Brand Reputation score for respondent i
- FFP_i = Frequent Flyer Program score for respondent i

- EL_i = Education Level of respondent i
- A_i = Age of respondent i
- SS_i = Staff Services score for respondent i
- AS_i = Airline Safety score for respondent i
- G_i = Gender of respondent i (e.g., dummy coded)
- N_i = Nationality of respondent i (e.g., dummy coded)
- NC_i = Nature of Connection of respondent i (e.g., dummy coded)
- TF_i = Travel Frequency of respondent i

The MLR model consists of a system of equations, one for each dependent variable:

1. Equation for Customer Satisfaction (CS):

$$CS_i = \beta_{0,CS} + \beta_{1,CS}X_{1i} + \beta_{2,CS}X_{2i} + \ldots\ldots + \beta_{p,CS}X_{pi} + \varepsilon_{CSi}$$

- For the Customer Satisfaction Equation:
- $\beta_{0,CS}$ is the intercept.
- $\beta_{1,CS}$, $\beta_{2,CS}$,…,$\beta_{p,CS}$ are the regression coefficients representing the change in CS for a one-unit change in the respective X variable, holding other variables constant.
- ε_{CSi} is the error term, representing unexplained variation in CS for respondent i.

2. Equation for Customer Loyalty (CL):

$CL_i = \beta_{0,CL} + \beta_{1,CL}X_{1i} + \beta_{2,CL}X_{2i} + \ldots\ldots + \beta_{p,CL}X_{pi} + \varepsilon_{CLi}$

Where:

- For the Customer Loyalty Equation:
- $\beta_{0,CL}$ is the intercept.
- $\beta_{1,CL}$, $\beta_{2,CL}$, ..., $\beta_{p,CL}$ are the regression coefficients representing the change in CL for a one-unit change in the respective X variable, holding other variables constant.
- ε_{CLi} is the error term, representing unexplained variation in CL for respondent i.

5.14.2.1.3 **Ordinary Least Squares (OLS) Regression (with HC3 Robust SE):** Applied to quantify the specific linear impact of "Improved Customer Service" on Customer Loyalty (Objective II), demonstrating a significant effect (β=0.7413, R^2=0.659). The OLS formula specifically for Objective II as described in the text ("Improved Customer Service" on "Customer Loyalty"), here it is:

Let:

- CL_i be the Customer Loyalty score for respondent i (Dependent Variable).
- ICS_i be the Improved Customer Service score for respondent i (Primary Independent Variable).
- Optionally, let C_{1i}, C_{2i}, ..., C_{ki} represent k other control/confounder variables that might be included in this specific OLS

model for Objective II (e.g., price, demographics, though your text focused primarily on ICS for the OLS in Obj II).

- **The Ordinary Least Squares (OLS) Regression Model Equation for Objective II:**

$$CL_i = \beta_0 + \beta_1 ICS_i + \alpha_1 C_{1i} + \alpha_2 C_{2i} + \ldots + \alpha_k C_{ki} + \varepsilon_i$$

Where:

- CL_i is the observed Customer Loyalty score for the i-th respondent.
- ICS_i is the Improved Customer Service score for the i-th respondent.
- $C_{1i}, \ldots, C_{ki}$ are the values of the k control variables for the i-th respondent.
- β_0 is the intercept (the expected value of CL when ICS and all C variables are zero, or the extrapolated value).
- β_1 is the regression coefficient for ICS. It represents the average change in CL for a one-unit increase in ICS, holding all C variables constant. (Your text states this was found to be approximately 0.7413).
- $\alpha_1, \ldots, \alpha_k$ are the regression coefficients for the control variables, representing their respective impacts on CL holding other variables constant.

- ε_i is the error term for the i-th observation, representing the unexplained random variation in CL. It is assumed that $E[\varepsilon_i] = 0$ and $Var(\varepsilon_i) = \sigma^2$, and errors are independent.

5.14.2.2 **Machine Learning Regression Modeling (Augmentation)**

5.14.2.2.1 **Machine Learning Regression Modeling (Random Forest Regression)**

To complement the classical statistical approaches, Random Forest Regression was adopted to capture nonlinear interactions and high-order dependencies between service quality dimensions and the dependent variables (Customer Satisfaction and Customer Loyalty). Random Forest regression is an ensemble learning method that builds multiple decision trees and aggregates their predictions to improve accuracy and reduce overfitting (Breiman, 2001).

Mathematical Formulation of Random Forest Regression (Biau, 2012)

Let:

- $D = \{(x_i, y_i)\}_{i=1}^{n}$ be the training dataset,

  where each $x_i = (x_{i1}, x_{i2}, \dots, x_{ip})$ represents the independent variables (e.g., Improved Customer Service, Passenger Trust, Brand Reputation, etc.), and y_i represents the dependent variable (e.g., Customer Satisfaction or Customer Loyalty).

Step 1: Bootstrapped Sampling

For each tree $t \in \{1,2,\dots,T\}$:

- Draw a bootstrap sample D_t from D by random sampling with replacement.

Step 2: Tree Construction

For each node within tree t:

- Randomly select a subset of predictors $m \subseteq p$.
- Find the split $s_t$that minimizes the mean squared error (MSE) among the subset:

$$S_t = \arg\min_s \left[\frac{1}{|\ R_1(s)\ |}\sum(y_i - \bar{y}_{R_1})^2 + \frac{1}{|\ R_2(s)\ |}\sum(y_i - \bar{y}_{R_2})^2\right]$$

where:

- $R_1(s)$and $R_2(s)$are the two regions (child nodes) created by split s.
- $\bar{y}_{R_1}$and $\bar{y}_{R_2}$are the mean responses in each region.

Each tree is grown fully (unpruned), and internal randomness ensures diversity among trees.

Step 3: Ensemble Prediction

The Random Forest prediction for a new observation $x'$is the average of all tree predictions:

$$\hat{y}_{RF}(x') = \frac{1}{T}\sum_{t=1}^{T} h_t(x')$$

where:

- $h_t(x')$is the prediction of the t^{th}decision tree.
- $T$is the total number of trees in the ensemble.

Step 4: Error Estimation and Variable Importance

To assess model performance and interpret predictor influence:

- Out-of-Bag (OOB) error is estimated for generalization accuracy.
- Variable importance is measured using the average decrease in MSE when each variable is used for splitting across all trees.

Mathematically, for variable X_j:

$$Imp(X_j) = \frac{1}{T}\sum_{t=1}^{T}(\frac{\Delta MSE_t(X_j)}{MSE_{baseline}})$$

Application Context

In this study, the Random Forest Regression model used the same independent variables as in the classical models:

$$X = \{ICS, PT, BR, SS, AS, RA, FFP, P, A, EL, G, N, NC, TF, PCT\}$$

and the dependent variables:

$$Y = \{CS, CL\}$$

The model revealed that Improved Customer Service (ICS), Passenger Trust (PT), and Brand Reputation (BR) were the top three contributors to predictive accuracy, supporting the statistical findings and validating the robustness of the dual framework.

5.14.2.2.2 **Machine Learning Regression Modeling (Extreme Gradient Boosting – XGBoost Regression)**

To further enhance predictive performance and capture complex nonlinear relationships beyond Random Forest, the Extreme Gradient Boosting (XGBoost) regression model was employed. XGBoost is a scalable, optimized implementation of gradient boosting that combines multiple weak learners (decision trees) into a powerful predictive ensemble by minimizing an objective function through sequential error correction (Chen & He, 2025).

Mathematical Formulation of XGBoost Regression (Chen & Guestrin, 2016).

Let:

- $D = \{(x_i, y_i)\}_{i=1}^{n}$ denote the dataset, where

  $x_i = (x_{i1}, x_{i2}, \ldots, x_{ip})$ are independent variables (e.g., Improved Customer Service, Passenger Trust, etc.),

  and y_i is the dependent variable (Customer Satisfaction or Customer Loyalty).

The XGBoost model predicts an outcome as the sum of predictions from multiple regression trees:

$$\hat{y}_i = \sum_{k=1}^{K} f_k(x_i), f_k \in \mathcal{F}$$

where:

- $\mathcal{F}$is the space of regression trees,
- $f_k$represents an individual decision tree,
- $K$is the total number of trees in the model.

Objective Function

XGBoost optimizes the following regularized objective function:

$$\mathcal{L}(\phi) = \sum_{i=1}^{n} l\left(y_i, \hat{y}_i^{(t)}\right) + \sum_{k=1}^{t} \Omega(f_k)$$

where:

- $l(y_i, \hat{y}_i^{(t)})$is the loss function (e.g., Mean Squared Error) that measures prediction error,
- $\Omega(f_k) = \gamma T + \frac{1}{2}\lambda \sum_{j=1}^{T} w_j^2$ is the regularization term, penalizing model complexity to prevent overfitting,

  with T being the number of leaves and w_j their corresponding weights.

Gradient Boosting Step

At each iteration t, a new function $f_t(x)$ is added to minimize the objective using the second-order Taylor approximation of the loss function:

$$\mathcal{L}^{(t)} \approx \sum_{i=1}^{n} [g_i f_t(x_i) + \frac{1}{2} h_i f_t^2(x_i)] + \Omega(f_t)$$

where:

- $g_i = \frac{\partial l(y_i, \hat{y}_i^{(t-1)})}{\partial \hat{y}_i^{(t-1)}}$(first derivative, gradient)
- $h_i = \frac{\partial^2 l(y_i, \hat{y}_i^{(t-1)})}{\partial (\hat{y}_i^{(t-1)})^2}$(second derivative, Hessian)

Each new tree $f_t(x)$is fitted to the residual errors of previous predictions, thus improving the model iteratively.

Optimal Leaf Weight Calculation

For each leaf $j$in a tree, the optimal weight $w_j^*$and structure score are calculated as:

$$w_j^* = -\frac{\sum_{i \in I_j} g_i}{\sum_{i \in I_j} h_i + \lambda}$$

$$\text{Gain} = \frac{1}{2} \sum_{j=1}^{T} \frac{\left(\sum_{i \in I_j} g_i\right)^2}{\sum_{i \in I_j} h_i + \lambda} - \gamma T$$

where:

- $I_j$is the set of observations assigned to leaf j,
- $\gamma$and $\lambda$are regularization parameters controlling pruning and shrinkage.

Prediction Function

After training, the final prediction for any observation $x'$is obtained as:

$$\hat{y}_{XGB}(x') = \sum_{t=1}^{K} f_t(x')$$

Application Context

For this study, the same predictor variables used in the classical and Random Forest models were included:

$$X = \{ICS, PT, BR, SS, AS, RA, FFP, P, A, EL, G, N, NC, TF, PCT\}$$

and the dependent variables:

$$Y = \{CS, CL\}$$

The XGBoost Regression model achieved high predictive accuracy and low RMSE, confirming that Improved Customer Service (ICS) and Passenger Trust (PT) remained the most influential predictors, consistent with both OLS and Random Forest outcomes.

The ensemble's regularization (via parameters λ and γ) minimized overfitting, while feature importance metrics reinforced the causal structure observed in the classical statistical results.

5.14.3 **Implementation of Methodological Synergy (Classical and Machine Learning Model)**

The Multivariate-Machine Learning Synergistic Model (MML-SM) reconciled interpretability (classical) and predictive power (ML), ensuring robust, actionable insights. For instance, while OLogit and OLS quantified Service's linear impact, RandomForest exposed its threshold effects as loyalty plateaued beyond 4.5/5 service ratings. This dual approach addressed non-normality (Anderson-Darling A = 2.626) and heteroscedasticity, with ML models compensating where parametric assumptions failed.

By integrating theory-driven hypotheses (Hirschman's Exit-Voice Theory) with data-driven discovery, this framework advances beyond traditional analytics, offering Biman Bangladesh Airlines Limited a statistically rigorous, yet operationally actionable, roadmap for customer-centric growth.

5.14.4 **Statistical Models for Hypothesis Testing**

The empirical testing of the formulated hypotheses was conducted using a suite of statistical techniques, as detailed in Chapter 6, to address the specific nature of each hypothesis and research question:

5.14.4.1 Testing H1 (Main Hypothesis - Composite Drivers) and its components H1a-H1g (Secondary Hypotheses):

5.14.4.1.1 **Multivariate Linear Regression (MLR):** This was the primary method employed to assess the simultaneous impact of the independent variables (passenger trust, brand reputation, staff service, safety, route convenience, FFP, price) on the dependent variables (customer satisfaction and customer loyalty). The analysis yielded regression coefficients (β), standard errors, t-statistics, and p-values for each predictor, along with the overall model fit (R^2 and F-statistic). This allowed for testing the significance and direction of each relationship posited in H1a-H1h, while H1 was supported if the overall model was significant and key predictors showed significant individual effects.

5.14.4.1.2 **RandomForest Regression:** This machine learning approach complemented MLR by evaluating the collective predictive importance of all drivers for customer satisfaction and loyalty, and by identifying potential non-linear relationships or complex interactions that linear models may not have captured.

5.14.4.1.3 **Pearson Correlation Analysis:** Bivariate correlations were examined to understand the initial strength and direction of the linear association between each independent variable (from H1a-H1g) and the dependent variables.

5.14.4.1 **Testing H2 (Main Hypothesis** - Impact of Improved Customer Service):

5.14.4.2.1 **Ordinary Least Squares (OLS) Regression:** A separate regression model was used to specifically measure the linear impact of "Improved Customer

Service" (as an independent variable) on "Customer Loyalty" (as the dependent variable).

5.14.4.2.2 **XGBoost Regression:** This advanced gradient boosting model was employed to further explore the predictive power of "Improved Customer Service" on "Customer Loyalty," accommodating potential non-linearities and interactions.

5.14.4.3 Regression Model Robustness Checks and Diagnostic Testing

All regression models were subjected to robustness checks and diagnostic tests for assumptions such as linearity, normality of residuals (Section 6.4), homoscedasticity (using robust standard errors where violated, Section 6.9.7), and multicollinearity (using VIF, Section 6.9.5) to ensure the validity and reliability of the results.

This multi-method approach ensured a comprehensive examination of each hypothesis, leveraging the strengths of different statistical techniques to provide robust answers to the research questions concerning the factors influencing customer satisfaction and loyalty.

5.14.5 Performance Analysis of Adopted Regression and Machine Learning Models

To rigorously investigate the multifaceted drivers of customer satisfaction and loyalty, this study employed a synergistic suite of statistical and machine learning models, each selected for its unique strengths in addressing specific research objectives. The comparative analysis, summarized in table: 5.6, details the rationale behind adopting Multivariate Linear Regression, Random Forest, OLS Regression, XGBoost, and notably, Ordered Logit Regression. This multi-model approach ensures a comprehensive examination, balancing explanatory power, predictive accuracy, and appropriate handling of data characteristics like ordinal dependent variables.

Table: 5.6 Performance Analysis of Adopted Regression and Machine Learning Models

Feature / Aspect	Multivariate Linear Regression (MLR) for Objective I	Random Forest Regression for Objective I	OLS Regression (Robust SE) for Objective II	XGBoost for Objective II	Ordered Logit (OLogit) Regression for Objective I (Customer Satisfaction DV)
Primary Goal	Identify significant linear drivers of Satisfaction & Loyalty simultaneously.	Predict Satisfaction & Loyalty; identify non-linear relationships & feature importance.	Quantify linear impact of "Improved Customer Service" on "Customer Loyalty."	Assess non-linear impact & confirm feature importance of "Improved Customer Service" on "Loyalty."	Identify significant drivers of ordinal "Customer Satisfaction" & quantify their impact on odds of higher satisfaction.
Dependent Variable(s)	Customer Satisfaction, Customer Loyalty (treated as continuous)	Customer Satisfaction, Customer Loyalty (handles ordinal/continuous)	Customer Loyalty (treated as continuous)	Customer Loyalty (handles ordinal/continuous)	Customer Satisfaction (explicitly ordinal, 5-point scale)
Handling of Ordinal DV	Treats as continuous	Handles inherently (non-parametric).	Treats as continuous.	Handles inherently (non-parametric).	Explicitly models ordinal nature (key strength).

Key Metric (Explanatory)	R^2 (Satisfaction = 0.784, Loyalty = 0.718), β coefficients, p-values.	R^2 (Satisfaction = 0.7673, Loyalty = 0.6362), Feature Importance.	R^2 = 0.659, β coefficient (0.7413), p-value.	Feature Importance (1.0 for Imp. Cust. Service).	β coefficients, Odds Ratios (derived from β), p-values, Pseudo R^2 (not directly stated but implied).
Assumptions	Linearity, independence, (normality & homoscedasticity mitigated by large N & robust SE).	Few distributional assumptions; robust to non-normality.	Linearity, independence (normality & homoscedasticity mitigated by robust SE).	Few distributional assumptions; robust.	Proportional Odds (key assumption to test), independence of errors.
Handling non-linearity	Poorly; assumes linear relationships.	Well; captures complex, non-linear patterns.	Poorly.	Well.	Poorly (predictor effects are linear in log-odds, though overall relationship is non-linear via link function).
Interpretability	High (β coefficients are intuitive).	Moderate (Feature importance is clear, but individual tree paths complex).	High (β coefficient).	Moderate (Feature importance clear).	High (Odds Ratios are very intuitive and directly interpretable for ordinal outcomes).

Multicollinearity	Assessed (VIF < 5 reported as acceptable). VIFs provided for some.	Less sensitive but can affect feature importance stability.	Assessed (VIF for Imp. Cust. Service = 1.0).	Less sensitive.	Can be an issue, affecting SE of coefficients. (Not explicitly mentioned but standard concern).
Robustness to Outliers	Sensitive (though robust SE help).	More robust.	Sensitive (robust SE help).	More robust.	Sensitive.
Specific Strengths Noted in Text	Simultaneous analysis of 2 DVs, avoids Type I/II errors of separate regressions. Strong explanatory power.	Captures non-linear interactions, robust to multicollinearity, good for feature ranking.	Quantifies direct linear impact, interpretable coefficient.	Confirms feature importance, handles non-linearity, robust.	Appropriately models ordinal DV. Identifies significant drivers (ICS, Price, BR, FFP, PT, Age, EL). ICS (β=1.365, p<0.001) most influential.
Specific Weaknesses Noted/Implied	Relies on CLT for normality; treats ordinal DV as continuous.	"Black box" nature for specific relationships beyond importance. Lower R^2 for Loyalty than MLR.	Only looks at one IV at a time for Obj II. Treats ordinal DV as continuous.	"Black box" for specific relationships.	Proportional odds assumption needs validation. Only models one DV (Satisfaction) in the provided summary.

Source: Author

5.15 Phase-II: Qualitative Research Phase

In this phase, qualitative research methods are used to explore the 'why' and 'how' behind the findings from the quantitative phase and provide suggestions for improving customer service quality. To understand the perspectives on customer service, a literature review, information from secondary sources, semi-structured interviews, and an open-ended survey questionnaire are utilized. Customer reviews and feedback are analyzed in content. These qualitative data are analyzed through thematic analysis to delve deeper into specific aspects of customer loyalty and satisfaction.

In this phase, research data is collected through structured questionnaires to measure customer satisfaction and loyalty and the factors influencing them. Meanwhile, qualitative data from open-ended survey questions are analyzed using Python (NLTK) thematic analysis to provide contextual insights into customer experiences. By integrating these qualitative techniques (traditional and machine learning), the research aims to provide a more comprehensive and enriched understanding of customer satisfaction and loyalty drivers, addressing the limitations of relying solely on traditional statistical methods and ensuring a holistic view of customer behavior (Braun & Clarke, 2013); (Hastie, et al., 2009).

5.16 Qualitative Data Collection Process

The survey questionnaire used in this study did not cover certain factors and issues necessary to address the research objectives, nor could these be measured through a questionnaire alone. Respondents were not in a position to provide detailed insights into organizational or policy-level issues. To bridge this gap, semi-structured interviews were conducted. Unlike structured interviews, which are limited to predetermined

questions, semi-structured interviews are more conversational, allowing for greater interaction between participants and the researcher (Zikmund, 2010). (Clark, et al., 2016) argues that semi-structured interviews enable the researcher to delve deeper into participants' attitudes and opinions and explore unexpected issues that arise, providing rich and detailed information about the relationship between customer service quality and customer loyalty. Consequently, the interview questionnaire was developed and is attached in Appendix 5. The answers to these ten questions will address the information gaps from the survey questionnaire and provide a clearer understanding of the research topic. (Rossman, 2016) also note that in-depth interviews are valuable for obtaining detailed information and exploring participants' experiences and perceptions, helping to identify how improved customer service impacts customer loyalty.

Meanwhile, to gain a deeper understanding of customer loyalty dynamics, semi-structured interviews were conducted with 43 diverse stakeholders associated with Biman Bangladesh Airlines Limited. These interviewees represent 10% of the 423 respondents from the initial questionnaire survey. The list of interviewees and the nature of the information gathered are detailed in Appendix 6. Employees and policymakers from Biman and the Civil Aviation Authority of Bangladesh were included, as they are primary stakeholders whose perceptions are vital. Employees provide firsthand insights into customer service, while prior literature (Siddiqui, 2010) highlights the close association between the government, policymakers, and the corporate sector in Bangladesh. Additionally, academicians participated because they are involved in customer service improvement and play a role in developing future managers, regulators, and professionals for the country. The interview data gathered for Biman Bangladesh Airlines Limited reflects a diverse range of perspectives,

including top-level executives, industry professionals, passengers, and aviation experts. The information encompasses key insights on enhancing customer loyalty, safety protocols, market positioning, operational efficiency, and regulatory compliance. Participants such as the Director of Marketing, Pilots, and Frequent Flyers provided targeted insights into customer engagement and loyalty strategies. The data's effectiveness is heightened compared to questionnaire surveys because interviews allow for deeper, more nuanced discussions, capturing real-world experiences and expert knowledge that may not surface in structured surveys. This makes interviews a decisive tool, offering actionable recommendations grounded in industry-specific expertise, which can be directly applied to strategic planning and service improvements for the airline.

Table 5.7: Distribution of Interview Participants by Stakeholder Stratum

Stakeholder Group	Number of Interviewees
Respected Minister	1
Current Passengers	7
Past Passengers	6
High Officials (Biman & CAAB)	6
Academicians & Industry Experts	6
Frequent Flyers	6
Travel Agents	6
Retired Biman Officials/Consultants	5
Grand Total	43

Source: Author

5.16.1 Interview Sampling and Data Collection Protocol

Initial contact for an interview is completed through a personal network as planned to be used in the case of a questionnaire survey. Other than that personal network, a professional network will also be used to cover all these 20-25 interviewees. In the case of frequent flyers, travel agents, academicians, and industry experts or consultants' groups, 3 each from each area is interviewed. Therefore, within the timeframe for data collection, it must be made possible to select and communicate with all 43 potential respondents. In each case, persuasion over telephone and email is done to the respondents requesting interviews. For ethical considerations, the interview guideline will also be sent with a cover page containing general information about the research, its process, and the voluntary nature of their participation. Some respondents may not agree to appear for a face-to-face interview, some of them may request to appear for an interview over the phone, video call, zoom, WhatsApp, or any other social media platform, and some of them may deny to face-to-face interview. A state containing the agreed respondents denied respondents, and means and ways of the interview are kept noted for analysis and discussion section.

Academicians are also considered stakeholders for two reasons: one, they are involved in the customer service development process, and two, they are closely related in the crafting of time-sensitive customer service arts and procedures, shaping future managers, regulators, and other professionals for the aviation industry as well as the country. The academic interviewee includes senior research scholar and currently holds a key leadership position in the Department of Business Studies (MBA in Aviation Management) at Aviation & Aerospace University, Bangladesh, a nationally recognized center of excellence in aviation and aerospace education. Subsequently,

industry experts or consultants are those high officials who served in Biman Bangladesh Airlines Limited or CAAB or both for a considerable amount of time and are now retired or serving other airliners and the Bangladesh Air Force. Travel agents are selected from the internet ranking of agents or the best sellers/best travel agents of 2022 to 2024. However, frequent flyers are nominated among the flyers/customers holding loyalty club memberships or from travel agencies' database.

During the data analysis phase, the interviewees raised some of the claims, and further clarification was felt necessary. Hence, for cross-verification or further clarification, follow-up sessions are conducted. Instead of communicating with the same interviewees, the study will consider the opinion of those stakeholder groups on whom the interviewees made allegations. For instance, interviewees claimed that frequent flyers and Travel agents are reluctant to claim the required services as they are entitled or have the right to avail; hence, frequent flyers and travel agents are considered as six discussants (Since 3/5 frequent flyers and 3/5 travel agents were planned for interview) for the follow-up session to reflect on this acquisition. These discussants are communicated via phone, email, and social media platforms. However, most follow-up discussants are taken from frequent flyers, academia, and industry experts.

5.16.2 Thematic Organization of Interview Questions

To meet the objective and research questions, a total number of 10 questions as in Appendix 5 are asked to the high officials of Biman, CAAB, academicians and industry experts, retired professionals of Biman and CAAB, and some frequent flyers during interview sessions. The questions are organized in three different sections. In section I, four open-ended questions related to the existing state of Biman Bangladesh Airlines Limited in terms of customer loyalty are asked. In section II, four questions related to

the influencing factors contributing to customer loyalty of Biman Bangladesh Airlines Limited are asked. At last, in section III, the experts and professionals are requested to give their views regarding the processes to overcome challenges. In the previous session only two questions are asked. The language of the questions is planned to be kept simple to avoid ambiguity. These 10 questions are mostly direct; some probing questions are also asked due to the situation demands.

5.16.3 **Interview Procedure**

Interviews are conducted according to the interviewees' preferences; however, all is conducted at their respective offices. The duration of the interviews varied from forty-five minutes to more than two hours, considering the interviewees' willingness. Every face-to-face interview is completed in one visit.

All the interviews started with a brief introduction of the research, emphasizing its objectives, process, and possible outcomes. The semi-structured interview guideline is followed to ensure the interview protocol, where questions are asked in an open-ended fashion following a conversational style (Bryman, 2016). However, additional questions are asked depending on the interviewee's category, interest, experience, and depth of knowledge. In a few cases, the interview guidelines questions are asked in different order depending on the time barriers of the interviewees. With the permission of the interviewees, all the interviews are kept voice-recorded. However, if the interviewee requests to keep the recorder off for some confidential issues related to Biman, the request is complied with. In these cases, interview discussions are handwritten except for those confidential issues, and before closing the session, the interviewees verify these handwritten conversations. All the interviews ended with a thank you note and a promise of anonymity that neither interviewees nor their

respective organizations would be identified in the subsequent writing up of the interview data. However, permission is required to use the respective organizations' names.

5.16.4 **Qualitative Data Analysis Process & Tools**

The qualitative dimension of this research draws upon two primary data sources: open-ended responses from the questionnaire survey (Chapter 6, Section 6.14), aimed at capturing passenger suggestions for service improvement (Objective 3), and rich textual data from semi-structured interviews conducted with 43 diverse stakeholders (Chapter 7, Section 7.2). These interviews were designed to elicit deeper insights, clarify quantitative findings, and explore nuanced perspectives on key variables influencing customer satisfaction and loyalty, the impact of improved customer service, and further suggestions for Biman Bangladesh Airlines Limited, thereby addressing all three research objectives. Both datasets were subjected to a rigorous thematic analysis, guided by the principles outlined by (Braun & Clarke, 2013), to systematically identify, analyze, and report patterns (themes) pertinent to the research questions. For the textual survey responses, the analytical process was initially facilitated by Python (Version 3.9) and the Natural Language Toolkit (NLTK) library for efficient pre-processing.

The thematic analysis process for both survey responses and interview transcripts involved several key phases. For the open-ended survey data, initial text pre-processing included tokenization (breaking text into units), stop word removal (eliminating common, non-substantive words), and stemming or lemmatization (reducing words to their root form) using NLTK to standardize the textual data. Following this pre-processing for survey data, and directly for the

interview transcripts, a systematic coding process was undertaken. This involved the researcher meticulously reading the data, assigning descriptive codes to segments of text that captured their essential meaning related to the research objectives. These codes were then iteratively reviewed, compared, and organized into broader, overarching **themes and sub-themes**. This involved identifying recurrent patterns, shared meanings, and divergent viewpoints, ensuring that the resultant themes accurately encapsulated the core suggestions, experiences, and concerns articulated by both survey respondents and interview participants regarding service quality and loyalty dynamics at Biman Bangladesh Airlines Limited.

5.17 **Phase III: Secondary Data Collection and Sources**

There is some information (Statistical databases, previous research studies, archives, historical records, market research reports, case study reports, and so on) related to customer service and loyalty issues related to aviation business may not be collected through questionnaire surveys and interviews; these sorts of data are collected from secondary sources. Suppose, to understand customer satisfaction and loyalty, Biman Bangladesh Airlines Limited can use various methods such as customer satisfaction surveys, complaint records, reviews, market research reports, competitor analysis, financial reports, annual reports, employee satisfaction and training reports, historical data, regulatory and compliance documents, social media sentiment analysis, case studies, academic research, customer demographics, and staying updated on global airline industry trends. These methods provide insights into customer satisfaction levels, service aspects, and areas for improvement. By analyzing these sources, Biman can make informed decisions about their strategies and investments, ultimately improving customer satisfaction and loyalty. Additionally, staying updated on global

airline industry trends and customer service best practices can help identify areas for improvement. These sorts of information are collected from reliable and verified secondary sources. Considering this study, objective reports from Biman Bangladesh Airlines Limited, CAAB, the International Air Transport Association (IATA), JSTOR, ProQuest, Google Scholar, and EBSCOhost and some other different online and offline secondary sources as Appendix 7 are used for this research:

These sources collectively provide a rich and diverse information set, combining academic research, industry reports, primary data, expert insights, and honest customer feedback to support the research objectives and hypotheses effectively.

5.18 **Methodological Framework for Data Interpretation for Visualizations**

The interpretation of data in this study followed a systematic, multi-faceted process designed to extract meaningful insights from both quantitative and qualitative sources, as detailed in Chapters 6 and 7. For quantitative data, interpretation primarily involved examining statistical outputs generated via SPSS 2025 and programming language Python and R. This included assessing descriptive statistics (means, frequencies, distributions) to understand sample characteristics (Section 6.6), evaluating reliability coefficients (Cronbach's Alpha, Section 6.3), and interpreting the results of inferential tests such as correlation analyses (Pearson's r, Section 6.9.1) and multivariate regression models (MLR, RandomForest, XGBoost; Sections 6.9.3, 6.10, 6.11, 6.12). Key metrics such as p-values (for statistical significance), regression coefficients (β-values for effect size and direction), R-squared values (for model fit), Variance Inflation Factors (VIFs for multicollinearity), and feature importance scores from machine learning models were critically analyzed to determine the significance and practical impact of various factors on customer satisfaction and loyalty. Data visualization for

quantitative findings was executed using R (notably ggplot2 and base R graphics) and Python (matplotlib, seaborn), encompassing histograms and Q-Q plots for normality assessment (Section 6.4), bar charts and pie charts for demographic distributions (e.g., Figures 6.4-6.7), correlation heatmaps (Figure 6.8), and tabular presentations of regression outputs (Table 6.2) to clearly communicate complex relationships and model results.

The interpretation of qualitative data, derived from open-ended survey responses (Chapter 6, Section 6.14) and stakeholder interviews (Chapter 7), centered on thematic analysis (Braun & Clarke, 2013). After initial text pre-processing using Python (NLTK library) for survey responses, both qualitative datasets were manually coded to identify recurrent patterns, concepts, and emergent themes related to customer experiences, service deficiencies, and suggestions for improvement. Interpretation involved synthesizing these codes into coherent themes and sub-themes, supported by illustrative verbatim quotes from participants to ensure authenticity and provide rich contextual understanding (Sections 7.3, 7.5, 7.6). The visualization of qualitative findings was primarily achieved through structured textual summaries, narrative descriptions of themes, and the direct presentation of exemplary quotations. This dual approach to interpretation and visualization ensured that statistical findings were complemented and contextualized by nuanced qualitative insights, facilitating a comprehensive understanding of the drivers of customer loyalty and service excellence at Biman Bangladesh Airlines Limited.

5.19 Data Triangulations: Integration and Synthesis of Multi-Method Findings

In this phase, all the findings, interpretations, and a summary of the descriptive, qualitative, and quantitative analyses are interfaced and fused to comprehensively understand customer loyalty and customer service quality within Biman Bangladesh Airlines Limited. Primary sources, such as in-depth interviews and open-ended survey responses, will provide firsthand insights from individuals directly involved in the airline industry. These sources supply quantitative data, industry benchmarks, and best practices, enabling a more holistic perspective. Secondary sources, including existing literature, reports, and studies on customer service in the aviation sector, has offered a broader context and background information. All those sources offer valuable qualitative data on the perceived quality of customer service, factors contributing to customer loyalty, and potential strategies for improvement.

The integration process will harmonize these diverse data types and sources, facilitating a well-rounded analysis. By merging and synchronizing descriptive, qualitative, and quantitative analyses, the research has had drawn upon the depth of qualitative insights while grounding findings in quantitative evidence from industry research. This approach has contributed to a robust and nuanced examination of the customer loyalty dynamics within Biman Bangladesh Airlines Limited and identify actionable strategies for enhancing customer service quality. The overall findings and deduction from the integration of analyses are presented in Chapter 6 of the study.

5.20 Validating Hirschman's Exit-Voice Theory: A Customer Response Analysis at Biman Bangladesh Airlines Limited

This research operationalizes Hirschman's (1970) Exit-Voice theory within Biman Bangladesh Airlines Limited' customer service context. The survey questionnaire includes measures to capture customers' perceptions of service quality and their subsequent behavioral responses to dissatisfaction (Hirschman, 1970). Quantitative data were analyzed using regression analysis (Field, 2018) and (Hair, 2019) to examine the relationship between service deficiencies and customer behavioral outcomes. Concurrently, qualitative data from interviews and open-ended survey responses were subjected to thematic analysis (Braun & Clarke, 2013) to identify patterns in customer dissatisfaction responses. The dual-method approach aligns with Hirschman's (1970) Exit-Voice Theory, distinguishing whether customers disengage (exit) or provide feedback (voice) following service failures. This methodological integration ensures robust validation of behavioral trends through statistical inference and contextual depth via qualitative interpretation. Specifically, the variables related to complaint resolution and willingness to recommend is examined for evidence of the 'voice' mechanism. At the same time, data concerning the choice of alternative Airlines Limited or intention to switch will indicate the 'exit' mechanism. The relationships between key variables and the exit/voice behaviors and insights from the qualitative data will validate Hirschman's theory (1970) and identify the factors influencing a customer's choice between exit and voice (Hirschman, 1970).

5.22 Chapter Summary

This chapter has articulated the systematic research methodology to address the research objectives. It is mainly built upon the pragmatist viewpoint, where a balanced

approach was taken to collect and analyze the data. Grounded in an explanatory sequential design within a mixed-methods approach, the framework incorporates quantitative data obtained through structured surveys and qualitative insights gathered from in-depth interviews and content analysis of customer feedback. The analysis is planned to be implemented from IBM SPSS, R and Python platform, with tools and models as per requirements of research objectives. The rigorous approach ensures that a comprehensive and holistic understanding can be gained of the factors influencing customer loyalty through enhanced service quality at Biman Bangladesh Airlines Limited, laying a firm foundation for presenting the results, findings, and actionable recommendations in subsequent chapters.

Chapter 6

A QUANTITATIVE ANALYSIS OF FACTORS AFFECTING CUSTOMER SATISFACTION AND LOYALTY AT BIMAN BANGLADESH AIRLINES LIMITED

6.1 Introduction

In the evolving landscape of the global aviation industry, customer satisfaction and loyalty serve as pivotal metrics for assessing an airline's operational efficiency, market competitiveness, and long-term sustainability. This chapter presents an empirical, data-driven analysis of passenger feedback at Biman Bangladesh Airlines, utilizing a Multivariate-Machine Learning Synergistic Model (MML-SM) that integrates classical statistical regression models with advanced machine learning based predictive analytics. The objective is to decode the factors that significantly influence customer loyalty and retention while identifying actionable pathways to improve service quality.

The study leverages survey data from 425 respondents, validated through Cronbach's Alpha reliability tests ($\alpha = 0.959$), ensuring high internal consistency. Advanced statistical methodologies including multivariate regression ($R^2 = 0.784$ for satisfaction, $R^2 = 0.718$ for loyalty), Ordinary Least Squares (OLS) (65.9%) RandomForest Regression (63.6%) Pearson correlation analysis ($r = 0.806$ for service quality, $r = 0.741$ for passenger trust), and machine learning regression models (RandomForest and XGBoost regression) are employed to extract insights from complex customer interactions. These models not only quantify the predictive weight of service quality, pricing structures, and brand perception but also highlight non-linear relationships and operational inefficiencies that impact customer retention.

By systematically analyzing empirical findings from those models, this chapter offers a strategic framework for customer experience enhancement, equipping Biman Bangladesh Airlines Limited with data-backed recommendations to optimize passenger engagement, service delivery, and loyalty-driven revenue models.

The rest of the chapter is divided into six sections. First section describes Exploratory Data Analysis (EDA) as mentioned in chapter 5 (Figure: 5.5), a pilot survey (Para 5.13.3) established reliability and validity, justifying a full survey on the sample, with normality tests confirming the data's suitability regarding skewness and distribution. Second section identifies the descriptive statistics that validates the sampling distribution in accordance with the research methodology. Third section identifies the key variables that significantly influence customer satisfaction and loyalty in Biman Bangladesh Airlines Limited to justify research objective 1 and associated hypothesis (H1). Fourth section recognizes the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines to justify research objective 2 with hypothesis 2. Fifth section provides a comprehensive view on the validation of research hypothesis mentioned in chapter 3 (Para 3.5) and chapter 5 (para 5.5.2). The sixth section provides suggestion of the respondents about the area of improvement to retain passengers in Biman Bangladesh Airlines Limited. Finally, seventh section summarizes the overall findings and draws conclusions in the light of the findings of the survey.

6.2 **Rationale and Procedure of Questionnaire Survey**

The questionnaire survey conducted in this study aims to justify three research objectives and 02 main and subsidiary research hypothesis for improving customer service quality to retain passengers. The survey questionnaire consists of 20 questions basing on demographic profile, 10 research factors (02 Dependent

Variable and 08 independent variable), it is primarily close-ended, with a five-point Likert scale ranging from strongly disagree (1) to strongly agree (5). It is divided into four parts: demographic profile of respondents, level of expectation towards Biman Bangladesh Airlines, dimensions of the impact of customer service on customer loyalty, and justification of customer opinions. The survey questionnaire is attached in Appendix 3**.** The survey sampled 425 respondents, analyzing key demographic and categorical variables: gender, age, nationality, education level, connection type with Biman, passenger type, and travel frequency. The gender distribution showed a significant imbalance, with 17.4% female (n=82) and 82.4% male (n=342) respondents. Regarding connection type, 45.2% (n=192) were current passengers or service seekers, 31.2% (n=132) were past passengers or service seekers, and the remaining 23.6% (n=100) included a mix of academia and aviation industry experts, CAAB professionals, professionals from other airlines, passengers or service providers to other airlines, high officials of Biman, and Biman's staff or officials. Passenger type analysis revealed that 46.6% (n=197) exclusively traveled on domestic routes, 40.0% (n=170) on both domestic and international routes, 3.5% (n=17) exclusively on international routes, with 4.5% (n=19) as passengers or service providers for airlines other than Biman, and 1.4% (n=6) as service providers to Biman or service seekers. The survey database along with outcome is attached in Appendix 8. The comprehensive dataset provides a detailed understanding of the respondents' profiles and their varied relationships with the airline, forming the basis for understanding key factors affecting customer satisfaction and loyalty, the impact of improved customer service, and areas for improving service quality to retain passengers.

6.3 **Exploratory Descriptive Analysis (EDA)**

6.3.1 **Reliability and Validity Test (Cronbach's Alpha) Trough Pilot Survey**

To analyze the reliability of two factors, Customer Satisfaction and Customer Loyalty, across eight variables (Passenger Trust, Airliners' Brand Reputation, Staff Service, Airline Safety, Route Availability and Convenience, Frequent Flyer Program Price, and Improved customer service), using 10 factors (02 Decedent variable and 08 independent variables), 40 attributes/indicators, a pilot study was conducted with 43 respondents. The findings indicated excellent internal consistency with a Cronbach's Alpha of 0.959, suggesting that the items are highly correlated and reliably measure the underlying constructs. The corrected item-total correlations were analyzed, showing that Passenger Trust had the highest correlation at 0.920, indicating potential redundancy. Other variables, including Airliners' Brand Reputation, Staff Service, Airline Safety, Frequent Flyer Program, and Price, demonstrated correlations exceeding 0.7, except for Route Availability and Convenience, which had a correlation of 0. 683. The detailed Cronbach's Alpha test results are attached in Appendix 4. Although slightly below the ideal threshold, this value is still acceptable. The high overall Cronbach's Alpha value and strong item-total correlations support the internal consistency and reliability of the questionnaire. The analysis recommends reviewing the items for Passenger Trust to avoid redundancy and retaining the items for Route Availability and Convenience. The pilot study confirms the questionnaire's robustness and suitability for measuring customer satisfaction and customer loyalty in the target population.

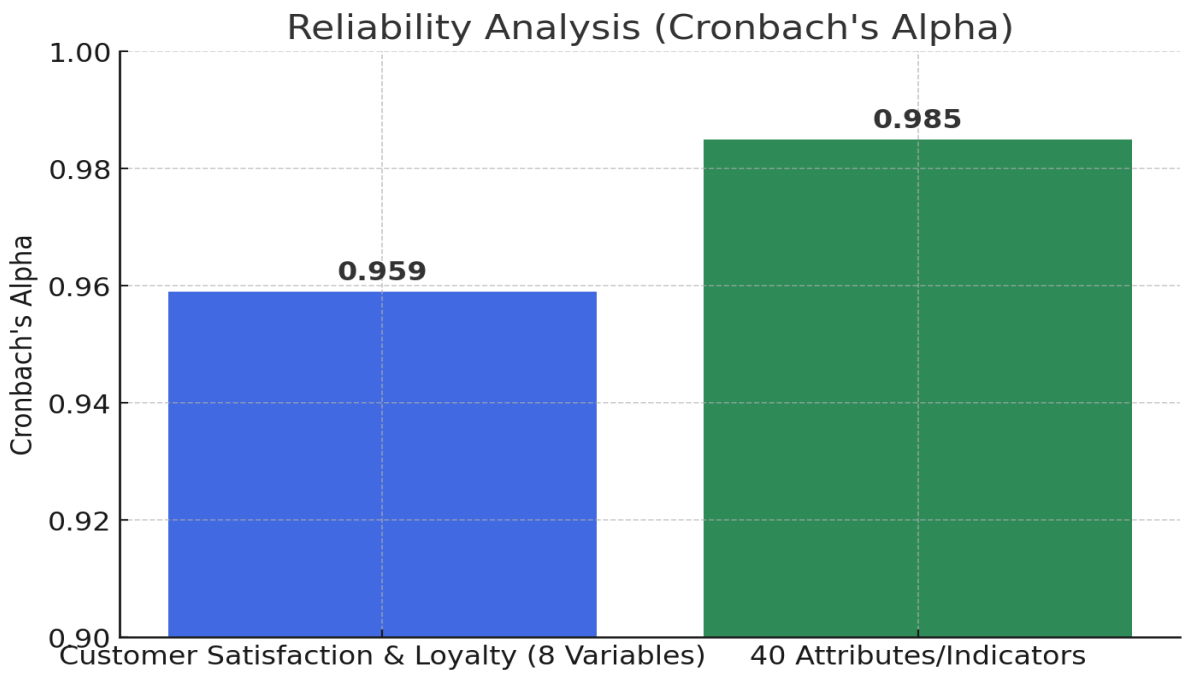
6.3.2 **Reliability Analysis of 40 Attributes/Indicators**.

The overall Cronbach's Alpha for the 40 attributes was calculated to be 0.985, indicating excellent internal consistency. This high value suggests that the items within the questionnaire are highly interrelated and consistently measure the underlying constructs. The detailed test results are attached in Appendix 4**.** Out of the 40 attributes, 25 exhibited corrected item-total correlations exceeding 0.80,

indicating strong internal consistency but also suggesting potential redundancy. Nine attributes demonstrated inter-item correlations greater than 0.71, further indicating redundancy. The attribute "Route Availability" had a corrected item-total correlation of 0.464, suggesting optimal internal consistency and a moderate level of correlation with other items, making it sufficiently distinct yet related. Six other attributes had corrected item-total correlations ranging from 0.46 to 0.69, indicating moderate internal consistency and appropriate levels of correlation with the overall scale. Despite the high overall internal consistency, the presence of several attributes with very high corrected item-total correlations suggests that some items may be too similar. To improve the questionnaire, a careful review of items with very high correlations is recommended to ensure they measure distinct aspects of the underlying constructs. This will enhance the precision and effectiveness of the instrument. The high Cronbach's Alpha value and the distribution of item-total correlations confirm that the questionnaire is reliable and suitable for collecting actual data, with adjustments to redundant items further refining the instrument.

However, the pilot study's findings demonstrate excellent internal consistency, with a Cronbach's Alpha of 0.985, and while most attributes show strong correlations, addressing redundancies will ensure each item uniquely contributes to measuring customer satisfaction and customer loyalty.

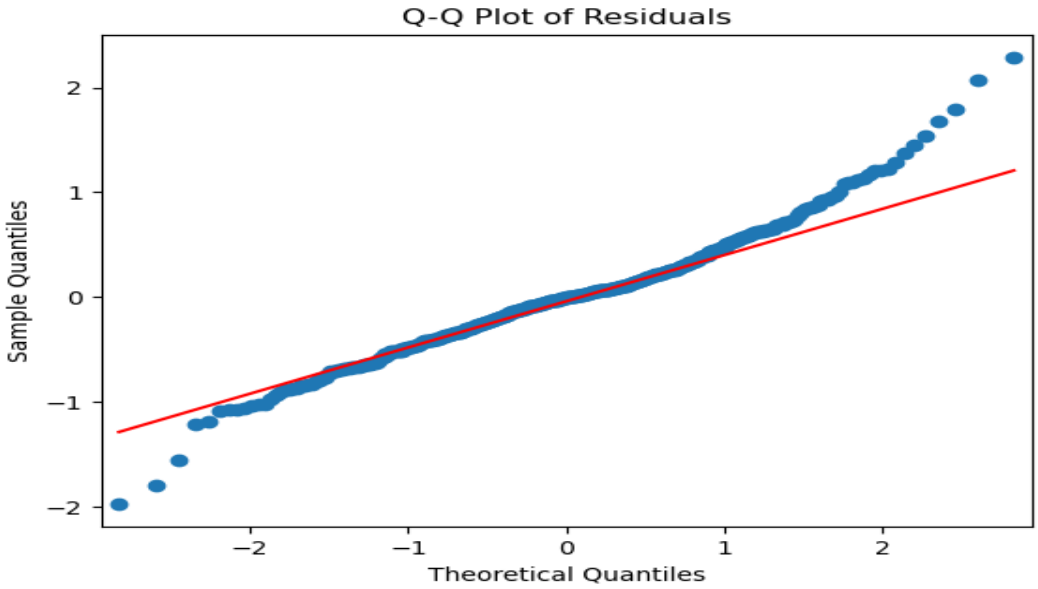
Figure 6.1: Result of Reliability and Validity Test (Cronbach's Alpha)



6.4 **Normality Test of Data**

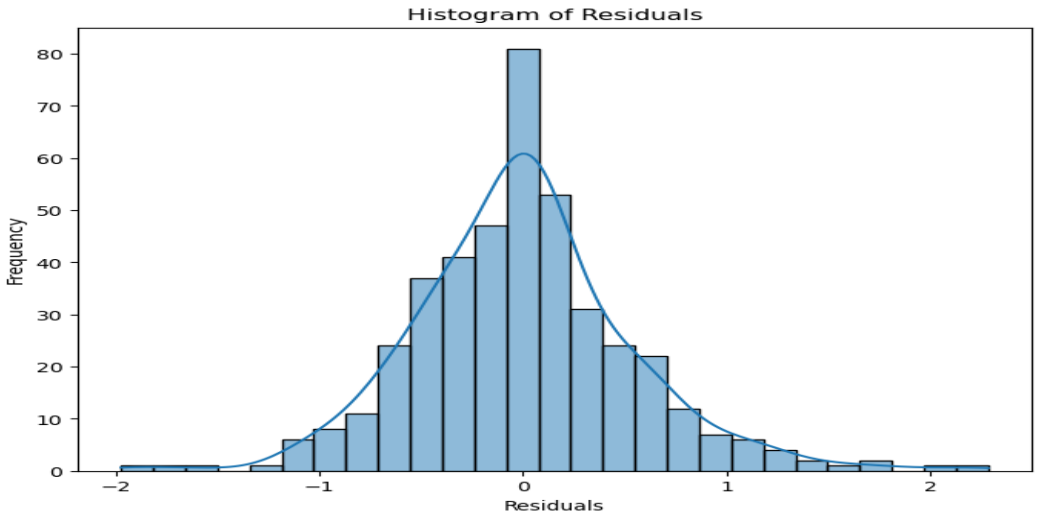
Following data collection from 425 respondents, the Shapiro-Wilk and Anderson-Darling tests are carried out to determine whether the residuals follow a normal distribution or not. In the Shapiro-Wilk test, W = 0.97571, and in the Anderson-Darling test, A = 2.626. Both tests give very small p-values (less than 0.05), meaning the residuals are not normally distributed and exceeds the critical values at common significance levels, reinforcing the rejection of normality. The Q-Q plot and histogram of residuals further confirm deviations, highlighting skewness or heavy tails.

Figure 6.2: Q-Q Plot of Residuals



Since normality is crucial for many statistical models, these findings suggest the need for transformations or robust estimation methods to ensure reliable hypothesis tests, confidence intervals, and model predictions.

Figure 6.3: Histogram of Residuals



6.5 **Implications of Non-Normality and Mitigation Strategies**

The Shapiro-Wilk (statistic = 0.976, $p < 0.001$) and Anderson-Darling (statistic = 2.626) tests indicate significant deviations from normality in the dataset. While non-

normality violates the assumption of normally distributed residuals in OLS regression, OLogit and Multivariate Linear Regression (MLR), the large sample size (n = 425) mitigates this issue due to the Central Limit Theorem, which ensures parameter estimates are asymptotically normal (Field, 2018). However, non-normality may inflate Type I/II errors in hypothesis testing and bias confidence intervals. For tree-based methods (RandomForest, XGBoost), non-normality is less problematic, as these models do not assume normality and are robust to distributional irregularities (James, et al., 2013).

Since the study has planned to carry out machine learning algorithm in addition to the classical regression model so the use of RandomForest and XGBoost is justified due to their non-parametric nature and reduced sensitivity to normality assumptions (Hastie, et al., 2009). The study's conclusions regarding the impact of customer satisfaction on customer loyalty should primarily rely on the findings from these machine learning models and the outcome from classical regression models. Since those ML algorithms do not share assumption of normally distributed errors, their results will be more valid to be interpreted.

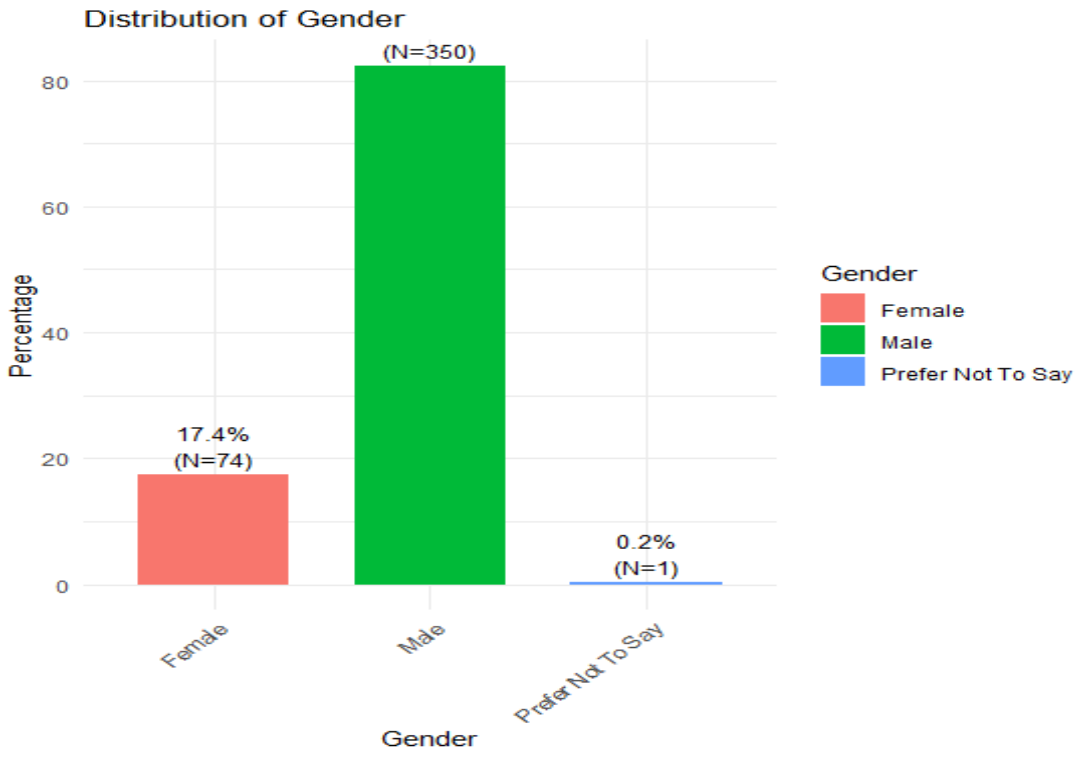
To address these challenges, robust standard errors (HC3 estimator) were used in MLR/OLS to adjust for heteroscedasticity (Hayes & Cai, 2007), while for tree-based models, multicollinearity was checked using Variance Inflation Factor (VIF), and redundant predictors with VIF > 5 were removed (Kuhn & Johnson, 2013). These strategies ensure statistical rigor while leveraging the strengths of both parametric and non-parametric methods. The details of normality test of survey data in R & Python with outcome is attached in Appendix 9.

6.6 DESCRIPTIVE STATISTICS

The survey conducted with 425 respondents provides detailed insights into the demographic and categorical characteristics relevant to Biman Bangladesh Airlines. A comprehensive summary is given below yet the detailed test statistics are attached in Appendix 10.

6.6.1 **Gender**: The dataset is predominantly male (82.4%), with a smaller representation of females (17.4%). A very small fraction (0.2%) preferred not to say. The sample shows a significant gender imbalance.

Figure 6.4: Participant's Gender Perspective Views

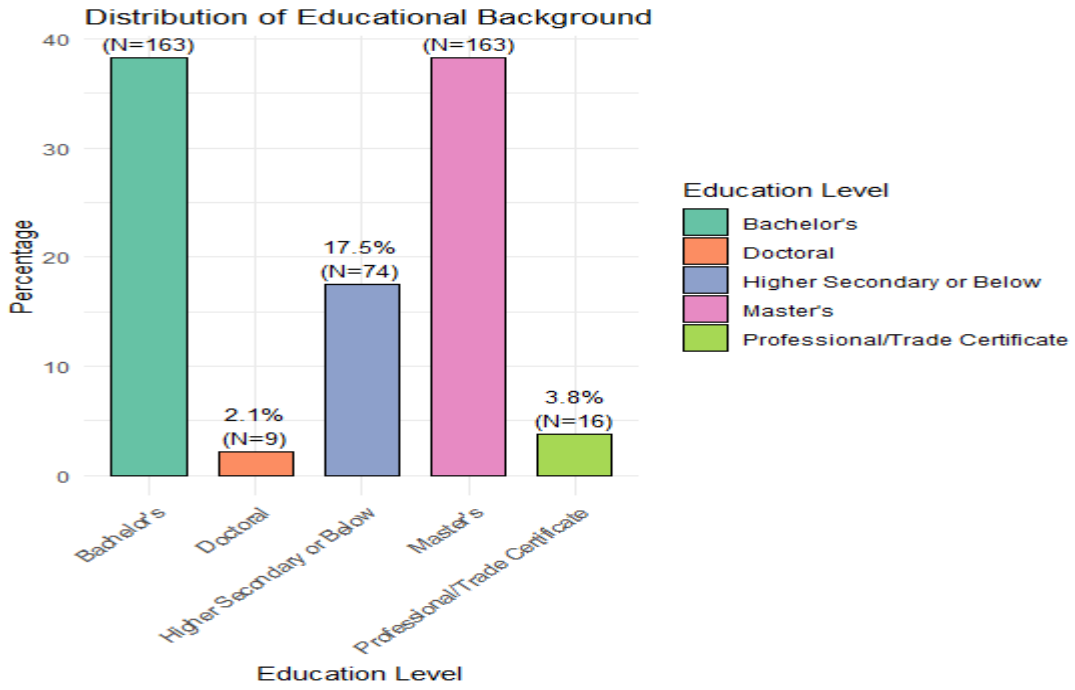


6.6.2 **Age**: The majority of respondents (38.8%) are aged 26-35, followed by 32.4% aged 36-45. Smaller percentages are represented by those aged 18-25 (11.3%), 46-59 (17.3%), and 60 and above (0.2%).

6.6.3 **Nationality**: A significant majority of the respondents (89.6%) are Bangladeshi. Other nationalities, including African, Canadian, European, American, and other Asians, each make up between 1.7% and 2.8% of the sample.

6.6.4 **Education Level**: The educational background of the respondents is fairly evenly split between Bachelor's (38.3%) and Master's degree holders (38.3%). Those with Higher Secondary education or below constitute 17.5%, while individuals with professional/trade certificates and Doctoral degrees represent 3.8% and 2.1%, respectively.

Figure 6.5: Participant's Academic Strength

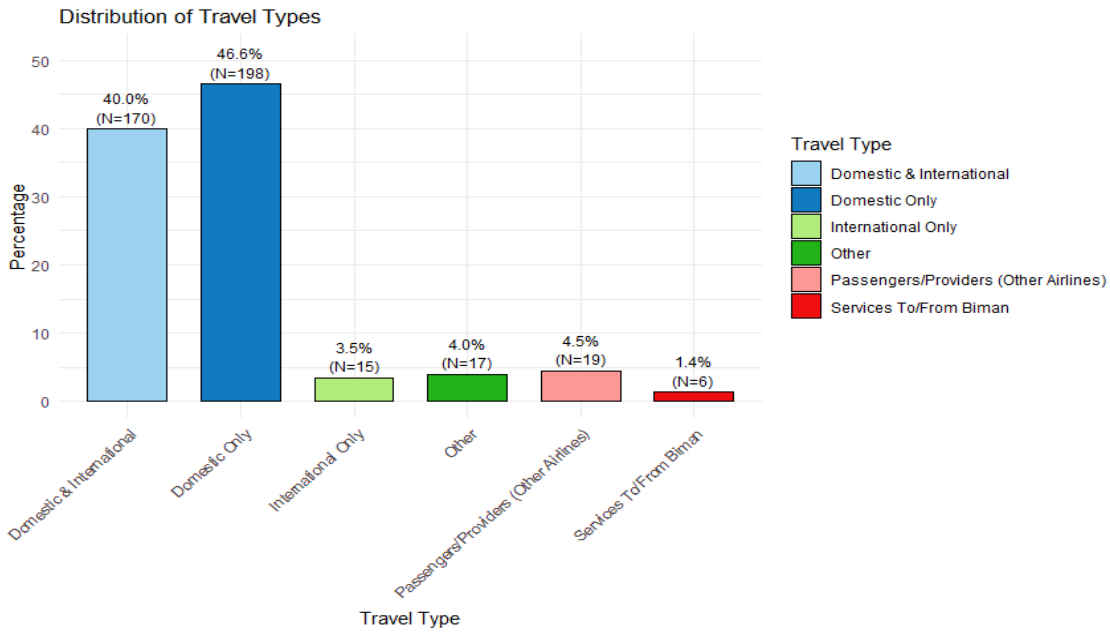


6.6.5 **Connection Type**: Regarding their connection with Biman, 45.2% are current passengers or service seekers, and 31.2% are past passengers who haven't used Biman's services within the last year. Other connections include academia and aviation industry experts (5.0%), CAAB professionals (4.5%), professionals from

other airlines (3.5%), passengers or service providers to other airlines (2.4%), high officials of Biman (0.5%), and Biman staff or officials (0.2%).

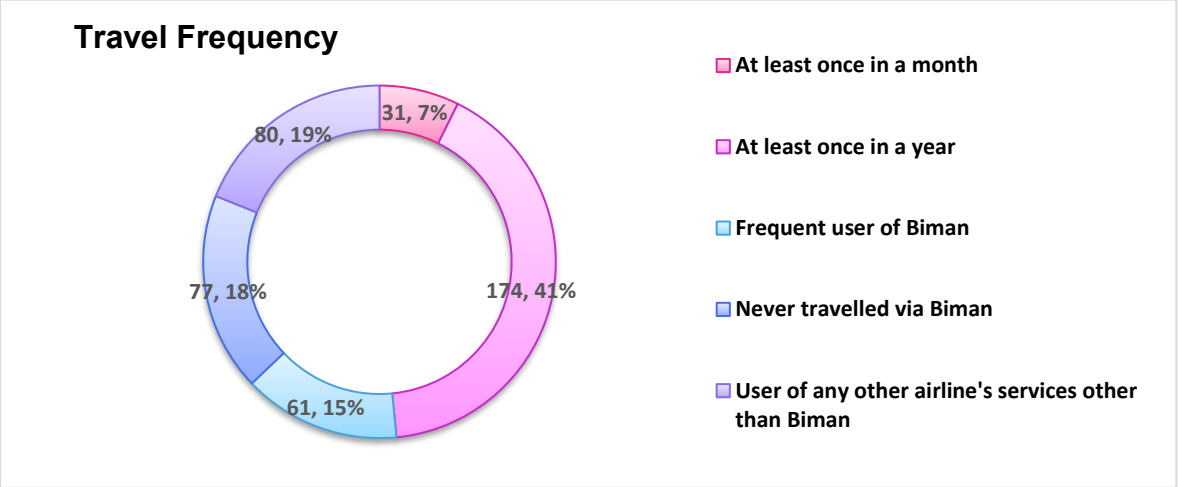
6.6.6 **Passenger Type**: The data shows that 46.6% of respondents exclusively travel on domestic routes, 40.0% travel on both domestic and international routes, and 3.5% exclusively travel internationally. Additionally, 4.5% are passengers or service providers for airlines other than Biman, and 1.4% provide services to or seek services from Biman. An additional 4.0% fall under the "Other" category.

Figure 6.6: Participant's Type (Passenger Type) in Terms of Travel with Biman



6.6.7 **Travel Frequency**: Among the respondents, 42.6% use Biman's services at least once a year, 15.6% are frequent users, 17.0% use other airlines' services, 18.0% have never traveled via Biman, and 6.9% travel via Biman at least once a month.

Figure 6.7: Participant's Travel Frequency with Biman



This comprehensive analysis reveals significant demographic trends and diverse relationships with Biman Bangladesh Airlines, providing a valuable foundation for further research into customer satisfaction, loyalty, and service quality.

INFERENTIAL STATISTICS

6.7 Objective I: Key Variables That Significantly Influence Customer Satisfaction and Loyalty

To address objective I, this study employs the following **Multivariate-Machine Learning Synergistic Model (MML-SM)** an integrated analytical framework combines with classical statistical regression model and Machine Learning approach to identify key drivers of customer satisfaction and loyalty in Biman Bangladesh Airlines:

6.7.1 **Correlation Analysis** to quantify pairwise relationships between service attributes and customer outcomes.

6.7.2 **OLogit Regression** is necessary for modeling customer loyalty as an ordered categorical outcome, effectively demonstrating how predictors influence loyalty levels and providing accurate odds ratios to identify the strength of each driver.

6.7.3 **Multivariate Regression** to isolate significant predictors while controlling for demographic and operational confounders.

6.7.3 **Random Forest Regression (Machine Learning)** as a non-linear method helps capture hidden interactions between variables and is robust against multicollinearity. It is particularly useful for detecting non-linear relationships that traditional regression might overlook.

The analysis rigorously evaluates 15 variables (02 Dependent variable, 08 Independent variable, 05 Demographic factor as Control variable), prioritizing those with statistical significance ($p < 0.05$) and practical impact ($\beta > 0.10$). It further investigates paradoxical relationships (e.g., price-loyalty dynamics) and operational blind spots (e.g., staff service invisibility) through robust standard errors and multicollinearity checks. Findings are contextualized with industry-specific insights, culminating in actionable strategies to optimize service delivery and loyalty program efficacy. This empirical approach bridges theoretical models with market realities, offering a data-driven blueprint for customer experience enhancement.

6.8 Integrated Analytical Framework for Customer Satisfaction and Loyalty in Biman Bangladesh Airlines

This study adopts the Multivariate-Machine Learning Synergistic Model (MML-SM), an integrated analytical framework to systematically identify key drivers of customer satisfaction and loyalty in Bangladesh's aviation sector, leveraging both Multivariate Linear Regression (MLR) and RandomForest Regression. Ordered logit regression was selected over binary logistic regression to preserve the ordinal nature of the 5-point loyalty scale (Freese, 2014). While the Brant test indicated violations of the proportional odds assumption, ordered logit remains the most theoretically

appropriate model for capturing the graded nature of customer loyalty (Williams, 2016). Instead, MLR quantifies linear relationships, providing interpretable coefficients while controlling for demographic and operational factors. Simultaneously, RandomForest Regression captures non-linear interactions and ranks feature importance, ensuring robustness against multicollinearity. This combined approach validates key findings, enhancing both interpretability and predictive accuracy. However, the recommendations included AI-driven service recovery, innovative loyalty programs, and value-based pricing to enhance customer engagement. This integrated analytical framework harmonizes theoretical rigor with operational reality, offering a data-driven blueprint for optimizing aviation service strategies in emerging markets.

6.9 MULTIVARIATE-MACHINE LEARNING SYNERGISTIC MODEL (MML-SM)

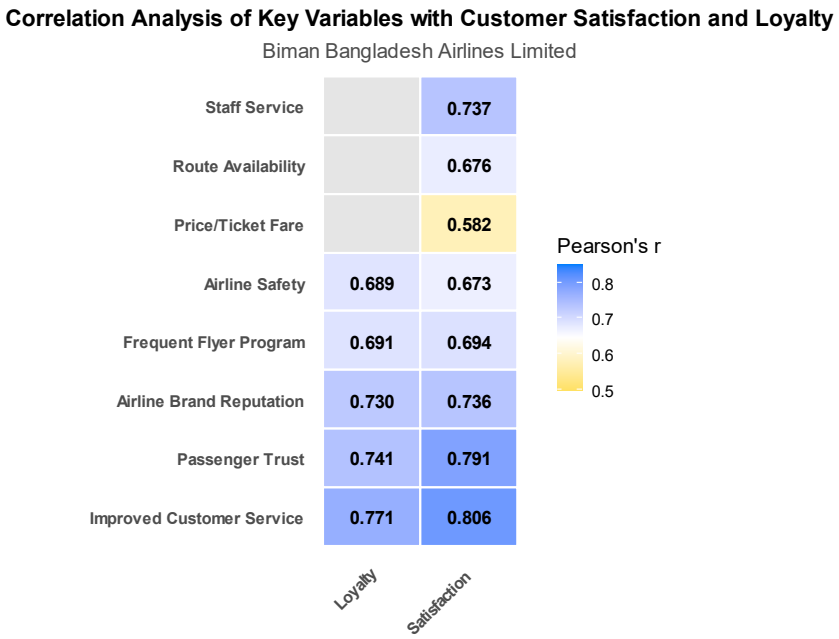
6.9.1 Correlation Analysis: Interpretation of Pearson Correlation Coefficients.

The Pearson correlation analysis of Biman Bangladesh Airlines' customer data reveals that improved customer service (r = 0.806), passenger trust (r = 0.791), staff service (r = 0.737), and airline brand reputation (r = 0.736) are the strongest drivers of customer satisfaction, emphasizing the importance of service quality, trust, and branding. Moderately strong correlations with airline safety (r = 0.673), route availability (r = 0.676), and frequent flyer programs (r= 0.694) suggest these factors also contribute significantly. Interestingly, price/ticket fare (r = 0.582) has a weaker correlation, indicating that while pricing matters, service reliability holds greater weight. For customer loyalty, improved customer service (r = 0.771), passenger trust (r = 0.741), brand reputation (r = 0.730), and frequent flyer programs (r = 0.691) emerge as key influences, with airline safety (r = 0.689) playing a supporting role. The absence of route availability and ticket pricing in the loyalty dataset suggests

that these factors shape initial satisfaction but have limited impact on long-term customer retention.

This visualization effectively highlights the key drivers of customer satisfaction and loyalty in Biman Bangladesh Airlines. Improved customer service (r = 0.806 for satisfaction, r = 0.771 for loyalty) and passenger trust (r = 0.791 / 0.741) emerge as the most influential factors, making them primary strategic priorities. Secondary factors like brand reputation and frequent flyer programs also play a significant role, while price and route availability influence satisfaction but not loyalty. The color-coded heatmap enhances interpretability, with dark blue indicating strong correlations, white for moderate ones, and orange for weaker influences. The inclusion of gray tiles helps distinguish areas where loyalty data was not available. The heatmap visually confirms that service quality, trust, and branding are the most critical factors for both satisfaction and loyalty. The outcome of correlation analysis is attached with the Appendix 11.

Figure 6.8: Pearson Correlation Coefficients between the Independent Variables with Customer Satisfaction & Customer Loyalty



6.9.2. **Strategic Takeaways**. Biman Bangladesh Airlines should focus on enhancing customer service, building trust, and strengthening brand reputation to maximize both satisfaction and long-term loyalty. Pricing strategies should be secondary, as customers prioritize quality and reliability over low fares.

6.9.3 Ordered Logistic Regression (OLogit) Analysis

To examine the factors (08 Independent variable, 05 Demographic factor as Control variable) influencing customer Loyalty among the airline passengers, ordered logistic regression model is hereby employed. This model was appropriate because the dependent variable customer loyalty level is ordinal in nature, measured on a ranked scale. The model used the cumulative logit link function and was estimated using the **polr()** function from the **MASS** package in programming language R.

6.9.3.1 OLogit Model Summary

The regression output as in Appendix 12, highlighted a number of significant relationships that supported hypothesis regarding service-related and demographic factors influencing passenger's loyalty is shown customer loyalty driver's ordered logit regression results table 6.1. Among the demographic variables, Age ($\beta = 0.243$, $p < 0.05$) and education level ($\beta = 0.326$, $p < 0.01$) had statistically significant and positive coefficients. This finding suggests that older and more educated passengers are more likely to report higher levels of satisfaction as well as loyalty. Other demographic variables, including gender, nationality, and nature of connection, were not statistically significant, indicating that these characteristics did not meaningfully influence satisfaction levels in the current model.

In terms of service experience, several variables emerged as strong predictors. Passenger Trust (β = 0.384, $p < 0.05$), Brand Reputation (β = 0.586, $p < 0.01$), and Frequent Flyer Program (β = 0.414, $p < 0.01$) all had significant positive relationships with customer loyalty. Additionally, Price showed a robust influence (β = 0.541, $p < 0.001$), reaffirming the importance of value perception in shaping customer opinion.

The most influential variable in the model was Improved Customer Service, with a coefficient of β = 1.365 and a very high level of significance ($p < 0.001$). This outcome underscores how improvements in service delivery directly affect customer loyalty, aligning closely with previous literature and the findings of research interviews and surveys. It confirms that passengers value personalized, responsive, and empathetic service interactions more than any other factor in the decision-making process.

Other variables such as airline safety (β = 0.303) and route availability (β = 0.264) were marginally significant (with *p*-values slightly above 0.05), indicating that while not definitive, these factors are still potentially influential and merit further exploration. However, variables like travel frequency, Biman staffs' services, and passenger customer type did not demonstrate significant effects on satisfaction. This result may vary be due to multicollinearity (as mentioned in Chapter 5, para 5.15.5 and performance analysis table 5.6) with other variables or a genuine lack of influence, which is explored further through interaction effects and segmented modeling by machine learning regression model Random Forest and XGBoost in later stages of this chapter.

Table 6.1: Customer Loyalty Drivers: Ordered Logit Regression Results

Factor Category	Variable	Coefficient (β)	p-value	Odds Ratio (OR)	Significance Level	Impact on Customer Loyalty
Primary loyalty drivers	Improved Customer Service	1.365	< 0.001	3.92	**Extremely Significant**	One-unit improvement nearly QUADRUPLES loyalty odds
	Brand Reputation	0.586	0.002	1.80	Highly Significant	Strong brand almost doubles loyalty probability
	Price	0.541	< 0.001	1.72	Extremely Significant	Value perception increases loyalty by 72%
	Frequent Flyer Program	0.414	0.004	1.51	Highly Significant	Loyalty programs boost loyalty by 51%
Moderate loyalty influencers	Education Level	0.326	0.010	1.39	Significant	Higher education increases loyalty by 39%
	Passenger Trust	0.384	0.043	1.47	Significant	Trust building enhances loyalty by 47%
	Age	0.243	0.032	1.27	Significant	Older passengers 27% more loyal
Marginal loyalty factors	Airline Safety	0.303	0.074	1.35	Marginally Significant	Potentially influential for loyalty
	Route Availability	0.264	0.066	1.30	Marginally Significant	Shows promise for loyalty

loyalty	Gender	-0.253	0.274	0.78	Not Significant	No meaningful loyalty impact
	Nationality	0.067	0.780	1.07	Not Significant	Minimal loyalty effect
	Nature of Connection	0.014	0.684	1.01	Not Significant	Negligible loyalty impact
	Travel Frequency	-0.044	0.566	0.96	Not Significant	No loyalty influence
	Biman Staff Services	-0.066	0.698	0.94	**Not Significant**	Negative but insignificant
	Passenger Customer Type	0.033	0.605	1.03	Not Significant	Minimal loyalty effect

Source: Author

Research Design Rationale: The analytical strategy delineates between loyalty and satisfaction drivers to maintain methodological rigor. Ordered logit regression is specifically deployed to test Hypothesis Group 1 (H1a-H1o) addressing Research Objective 1 (loyalty driver identification). This selective application acknowledges that multicollinearity (VIF > 5) between satisfaction and loyalty constructs would violate the independence of irrelevant alternatives assumption, potentially biasing coefficient estimates. Satisfaction drivers undergo complementary analysis via machine learning algorithms in subsequent sections, providing methodological triangulation.

6.9.4 **Multivariate Regression Analysis (MLR)**

A multivariate regression model was preferred over multiple linear regressions because it allows simultaneous analysis of the 15 variables (02 Dependent Variable, 08 Independent Variable, 05 Demographic factor as control variable) relationship with both customer satisfaction and loyalty, accounting for potential correlation between the dependent variables. This approach provides a single overall significance test and can reveal insights not apparent in separate linear regressions, leading to more accurate and efficient estimates while avoiding potential type I and type II errors. The strong explanatory power, significant F-statistics, and robust residual diagnostics justify the multivariate model's validity. The outcome of multivariate regression analysis is attached with Appendix 13.

6.8.5 **Model Overview**.

The multivariate regression model demonstrates strong explanatory power for both customer satisfaction ($R^2 = 0.784$) and loyalty ($R^2 = 0.718$), indicating that 78.4% and 71.8% of their respective variances are explained by the predictor variables. The highly significant F-statistics ($p < 0.001$) confirm the models' overall validity. Residual diagnostics show moderate dispersion (Satisfaction: Residual SE = 0.496; Loyalty: Residual SE = 0.522), with near-normal error distributions, supporting model robustness.

6.9.6 **Ensuring Model Stability: Multicollinearity Assessment and Its Implications**

Multicollinearity was assessed using the Variance Inflation Factor (VIF), ensuring that predictor variables remain within acceptable thresholds. All VIF values were

below 5, indicating no severe multicollinearity concerns. The highest VIF scores were observed for Brand Reputation (4.02), Improved Customer Service (4.01), and Passenger Trust (3.82), confirming that these variables exhibit moderate collinearity but do not significantly distort regression estimates. Despite this, a model stability issue was encountered, preventing VIF calculation in one instance, which suggests possible high correlation among independent variables. Addressing this could involve removing highly correlated variables, applying Principal Component Analysis (PCA), or rechecking variable definitions and data structure. The results reaffirm that multicollinearity remains within manageable limits, but further refinement may enhance model accuracy.

6.9.7 **Multicollinearity Assessment (Variance Inflation Factor - VIF)**

Table 6.2: Variance Inflation Factor – VIF for IVs

Variable	VIF Value	Interpretation
Brand Reputation	4.02	Moderate collinearity, but within acceptable range
Improved Customer Service	4.01	No severe multicollinearity detected
Passenger Trust	3.82	Manageable correlation with other variables
Biman Staff Services	3.71	No major impact on model stability

Source: Author

Since no variable exceeded the conservative VIF threshold of 5, the model remains stable, with predictors maintaining their orthogonality. However, refining the model by addressing moderate collinearity could further enhance predictive accuracy.

6.9.8 **Ensuring Result Stability: Robustness Check and Heteroscedasticity Adjustment**

A robustness check using heteroscedasticity-consistent standard errors (HC1) confirmed the stability of key findings, as significance patterns remained largely unchanged from ordinary least squares (OLS) estimates. Notable variations included a marginal weakening of Airline Safety's significance (p increased from 0.040 to 0.093) and a slight strengthening of Education Level's significance (p decreased from 0.015 to 0.010). The application of robust standard errors reinforced the validity of primary predictors, including Age, Education Level, Passenger Trust, Brand Reputation, Frequent Flyer Program, Price, and Improved Customer Service. While Airline Safety's influence slightly diminished under robust standard errors, it retained moderate relevance. These findings validate the model's reliability and confirm that variance inconsistencies in residuals do not distort hypothesis testing outcomes.

6.9.9 **Key Determinants of Customer Satisfaction and Loyalty**.

The analysis identifies Improved Customer Service as the paramount driver of both customer satisfaction (β = 0.389, $p < 0.001$) and loyalty (β = 0.341, $p < 0.001$), with a 1-unit enhancement in service quality elevating satisfaction and loyalty by 0.39 and 0.34 units, respectively. For satisfaction, Passenger Trust (β = 0.273, $p < 0.001$) and Route Availability (β = 0.115, $p = 0.004$) further demonstrated robust associations, emphasizing operational reliability and relational credibility. Conversely, loyalty was significantly influenced by Price (β = 0.133, $p = 0.001$), suggesting premium pricing aligns with perceived value, and Brand Reputation (β = 0.138, $p = 0.009$), underscoring its role in retention. Secondary contributors included the Frequent Flyer Program (satisfaction: β = 0.101, $p = 0.010$; loyalty: β = 0.105, $p =$

0.011) and Education Level (satisfaction: β = 0.095, *p* = 0.007; loyalty: β = 0.090, *p* = 0.015), reflecting the moderate yet significant impact of loyalty incentives and demographic factors. Notably, Age (β = 0.070, *p* = 0.032) uniquely bolstered loyalty among older passengers. Variables such as Staff Services (*p* = 0.166–0.742), Airline Safety (*p* = 0.644), and Gender (*p* = 0.429) lacked statistical relevance, while Price exhibited a paradoxical positive linkage to loyalty, likely reflecting market-specific perceptions of value. These findings collectively highlight service quality as the universal priority, with tailored strategies required to address demographic nuances and perceptual paradoxes, providing empirical evidence to guide targeted operational and pricing strategies.

Table 6.3: MLR Coefficients and Significance for Customer Satisfaction & Loyalty

Factor	Satisfaction (β)	Loyalty (β)	Strategic Significance
Improved Customer Service	0.389*** (0.151)	0.341*** (0.132)	Universal priority for both satisfaction and loyalty
Passenger Trust	0.273*** (0.106)	0.134* (0.081)	Trust drives satisfaction and mediates loyalty formation
Price	N/S	0.133*** (0.052)	Loyalty-sensitive, not satisfaction-dependent
Brand Reputation	N/S	0.138** (0.070)	Essential for brand-driven retention strategies
Frequent Flyer Program	0.101** (0.052)	0.105** (0.054)	Enhances both satisfaction and loyalty over time
Staff Service	N/S	N/S	Correlation ≠ causation; no substantial role in customer

			loyalty
R^2	0.784 (78.4% of variance explained)	0.718 (71.8% of variance explained)	
Residual SE	0.496	0.522	

(Figures inside and outside parenthesis indicate standard errors and coefficients

Significance level: *** = 1%, ** = 5%, * = 10%]

***p < 0.001, **p < 0.01, p < 0.05; N/S = Not Significant

Source: Author

6.10 **Random Forest Regression (Machine Learning)**

6.10.1 **Model Performance Evaluation.** Random Forest Regression is selected for this research due to its ability to handle non-linearity, high-dimensional data, and interactions between variables while ensuring robustness against overfitting. Given the findings on key drivers of customer satisfaction and loyalty, this model effectively captures complex relationships that traditional regression methods may overlook. Additionally, its ensemble learning approach improves predictive accuracy, making it ideal for analyzing diverse factors like service quality, trust, branding, and pricing in Biman Bangladesh Airlines' customer data. The outcome of RandomForest Regression is attached with the Appendix 14.

6.10.2 **Customer Satisfaction**

The model demonstrates high predictive accuracy in estimating customer satisfaction. The Mean Squared Error (MSE) of 0.3274 suggests minimal deviation

between predicted and actual satisfaction scores, confirming the model's precision. Additionally, the R^2 value of 0.7673 indicates that 76.73% of the variance in satisfaction can be explained by the model, highlighting its strong explanatory power.

6.10.3 **Customer Loyalty**

For customer loyalty, the MSE of 0.4768 suggests a slightly higher prediction error compared to satisfaction, indicating that the model's precision in capturing loyalty is somewhat lower. The R^2 value of 0.6362 reveals that 63.62% of the variance in customer loyalty is explained by the model, leaving room for improvement in understanding the underlying drivers of loyalty.

6.10.4 **Comparison of Customer Satisfaction and Loyalty**

The model performed better in predicting customer satisfaction than customer loyalty. This suggests that loyalty is influenced by additional factors beyond the current set of variables, such as emotional engagement, competitive alternatives, and long-term brand relationships.

6.10.5 **Customer Satisfaction Drivers**

6.10.5.1 Improved Customer Service (60.8%): Dominates satisfaction, emphasizing its role in immediate customer experiences.

6.10.5.2 Passenger Trust (11.0%): Critical for mitigating perceived risks and building transactional confidence.

6.10.5.3 Price (6.7%): Affects perceived value but is secondary to service quality.

6.10.5.4 Brand Reputation (5.4%) and Staff Services (3.6%): Baseline expectations rather than differentiators.

6.10.6 **Customer Loyalty Drivers**

6.10.6.1 Improved Customer Service (56.0%): Retains its primacy but with reduced impact compared to satisfaction.

6.10.6.2 Frequent Flyer Program (9.7%): Key for retention, highlighting the importance of structured rewards.

6.10.6.3 Passenger Trust (8.1%): Less critical for loyalty than satisfaction, suggesting trust is a prerequisite for loyalty.

6.10.6.4 Price (5.8%): Maintains moderate influence, aligning with loyalty's dependence on perceived long-term value.

6.10.7 **Key Findings for Objective 1 (Loyalty Driver)**

The integrated analysis from multivariate, machine learning, and econometric models definitively identifies Improved Customer Service as the paramount driver of customer loyalty. This factor demonstrates exceptional statistical dominance across all methodologies: showing strong linear effects (MLR $\beta=0.341$), substantially increasing loyalty probability (OLogit OR=3.92, $\beta=1.365$), and emerging as the most critical feature in machine learning models (Random Forest: 56% importance). This convergence establishes service quality as the universal strategic priority.

Beyond this primary driver, the analysis reveals a tiered hierarchy of loyalty determinants. Brand Reputation (OLogit OR=1.80, $\beta=0.586$), Price (OLogit OR=1.72, $\beta=0.541$), and Frequent Flyer Programs (OLogit OR=1.51, $\beta=0.414$) constitute significant secondary drivers, all demonstrating strong statistical significance ($p<0.01$). Moderate influences include Education Level (OR=1.39), Passenger

Trust (MLR β=0.134, OLogit OR=1.47), and Age (OR=1.27), while Route Availability and Airline Safety show marginal significance. Notably, the Price-Loyalty Paradox reveals that higher fares correlate with increased loyalty, suggesting price serves as a quality proxy in this market. The Staff Service Invisibility effect is confirmed through non-significant results across regression models despite moderate Random Forest importance (3.6%), indicating service efforts may be undervalued or misattributed by customers.

6.10.8 Strategic Implications

These findings mandate a fundamental reorientation toward customer-centric investment, with service quality enhancement as the non-negotiable foundation. The quadrupling of loyalty odds (OR=3.92) from service improvements justifies substantial resource allocation to AI-powered service personalization, enhanced complaint resolution systems, and proactive engagement programs.

To capitalize on the Price-Loyalty Paradox, implement premium value positioning that explicitly links higher pricing to superior service experiences, reinforcing the market's perception of price as a quality indicator. Simultaneously, launch brand-reputation campaigns focused on the 80% increase in loyalty probability (OR=1.80) associated with strong branding, particularly highlighting service excellence and safety records.

Operationally, optimize Frequent Flyer Program benefits to leverage their 51% loyalty enhancement (OR=1.51), while developing demographically-targeted initiatives for educated (OR=1.39) and older passengers (OR=1.27) who demonstrate disproportionately positive loyalty responses. Address the Staff Service Invisibility gap through a "Service Visibility Program" that makes staff contributions

more recognizable and measurable in the customer experience. This comprehensive, data-driven approach ensures strategic alignment with the empirically-verified drivers of customer loyalty in the aviation market of Biman Bangladesh Airlines Limited.

6.11 OBJECTIVE II: IMPACT OF IMPROVED CUSTOMER SERVICE ON CUSTOMER LOYALTY TOWARDS BIMAN BANGLADESH AIRLINES

To address objective II, this study investigates the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines. Improved customer service is treated as the independent variable, and customer loyalty is the dependent variable. Data was collected from a survey of 425 respondents to evaluate how enhancements in customer service affect customer loyalty. In this regard initially traditional statistical tests as mentioned in appendix 12 and 13 has been carried out, however considering the result of normality test to measure the impact, the study employed OLogit, XGBoost and OLS regression. The combined use of OLogit, XGBoost and OLS regression is methodologically rigorous for analyzing the customer service-loyalty relationship at Biman Bangladesh Airlines. Improved Customer Service emerges as the strongest positive driver (OR=3.92, $p<0.001$) through OLogit regression, indicating that a one-unit improvement nearly quadruples the odds of higher loyalty. OLS regression provides interpretable linear coefficients (β) to quantify the direct impact of service improvements on loyalty (e.g., $\beta = 0.34$ implies a 0.34-unit loyalty increase per service unit), while controlling for confounders like price or demographics, adhering to (Wooldridge, 2015) principles of causal inference. XGBoost complements this by capturing non-linear interactions (e.g.,

diminishing returns at high service levels), and ensuring robustness against multicollinearity and overfitting (Chen & Guestrin, 2016). This dual approach satisfies both explanatory (OLS) and predictive (XGBoost) modeling needs, with OLS validating theoretical hypotheses and XGBoost uncovering hidden behavioral patterns in the survey data (N = 425), aligning with best practices in customer analytics (Braun & Clarke, 2013); (Hastie, Tibshirani, & Friedman, 2009). The hybrid methodology ensures actionable insights for service optimization while maintaining statistical rigor. The outcome of OLogit, XGBoost and OLS Regression are attached with the Appendix 12 and 15 respectively.

6.12 XGBOOST, OLOGIT AND OLS REGRESSION

6.12.1 Assessing Multicollinearity: Variance Inflation Factor (VIF)

The Variance Inflation Factor (VIF) analysis was conducted to evaluate the presence of multicollinearity, which can distort regression estimates and reduce model reliability. The results indicate that the VIF for Improved Customer Service is 1.000, confirming the absence of multicollinearity, as a VIF value close to 1 signifies no strong correlation with other predictors. The constant term, however, exhibits a VIF of 12.037, which is expected due to its mathematical role in regression modeling and does not impact the predictive ability of the independent variable. This ensures that Improved Customer Service is a statistically reliable predictor of Customer Loyalty without any redundancy in the model.

6.12.2 Ordered Logistic (OLogit) Regression Analysis

The model identifies several statistically significant predictors of airline customer loyalty. Improved Customer Service emerges as the strongest positive driver

(OR=3.92, p<0.001), indicating that a one-unit improvement nearly quadruples the odds of higher loyalty. Price (OR=1.72, p<0.001), Brand Reputation (OR=1.80, p=0.002), and Frequent Flyer Programs (OR=1.51, p=0.004) also significantly enhance loyalty odds. Whereas Passenger Trust (OR=1.47, p=0.043), Education Level (OR=1.39, p=0.010), and Age (OR=1.27, p=0.032) shows moderate positive effects, while Gender has a negative relationship (OR=0.78, p=0.274) though not statistically significant. The OLogit regression output as in appendix 12.

6.12.3 Regression Analysis Using Robust Standard Errors (HC3) in OLS

The Ordinary Least Squares (OLS) regression, adjusted with heteroscedasticity-robust standard errors (HC3), was employed to examine the linear relationship between Improved Customer Service and Customer Loyalty. The model demonstrates strong explanatory power, with an R^2 of 0.659, indicating that approximately 65.9% of the variation in Customer Loyalty is explained by Improved Customer Service. This suggests a substantial influence of customer service improvements on loyalty behaviors. Additionally, the F-statistic of 461.3 ($p < 0.001$) confirms the overall statistical significance of the model, meaning that Improved Customer Service significantly predicts Customer Loyalty.

The regression coefficients further reinforce this finding, with Improved Customer Service having a coefficient of 0.7413 ($p < 0.001$). This implies that for every unit increase in Improved Customer Service, Customer Loyalty increases by 0.7413 units, highlighting its substantial role in shaping customer retention and brand commitment. The constant term, valued at 3.2742 ($p < 0.001$), indicates that even in the absence of service improvements, there is an inherent baseline loyalty level among customers. Furthermore, the Durbin-Watson statistic (2.155) suggests no

severe autocorrelation in the residuals, affirming the robustness of the regression estimates. The Jarque-Bera test for normality, however, indicates some deviation from normal distribution ($p < 0.001$), though this is mitigated by the use of robust standard errors.

6.12.4 XGBoost Analysis for Non-Linear Relationships and Feature Importance

To supplement the linear regression findings and capture potential non-linear interactions, XGBoost, a Gradient Boosting Machine (GBM) model, was employed. Unlike OLS, XGBoost is well-suited for handling complex, non-linear relationships between predictors and outcomes while ranking feature importance based on model performance. The results indicate that Improved Customer Service holds an absolute feature importance score of 1.0, meaning it is the sole and most critical predictor of Customer Loyalty in the dataset. This finding aligns with the OLS regression outcome but further strengthens the conclusion by demonstrating that no other hidden interactions contribute to loyalty in the given dataset. The robustness of XGBoost also helps validate that the relationship between Improved Customer Service and Customer Loyalty is not merely linear but holds significance across multiple dimensions, including potential interactions with unmeasured factors such as customer demographics or operational attributes.

6.12.5 Summary of Key Insights for Objective 2

The comprehensive analysis reveals one paramount insight: Improved Customer Service is the single most critical and non-negotiable factor driving customer loyalty for Biman Bangladesh Airlines. This conclusion is robustly supported by a convergence of multiple analytical methods. The statistical models provide strong

validation, with the OLS regression showing a highly significant positive relationship ($\beta = 0.7413$, $p < 0.001$) and a high explanatory power ($R^2 = 65.9\%$). This is further reinforced by the MLR ($\beta = 0.341$*) and OLogit ($\beta = 1.365$*) models, all confirming the variable's strength and statistical significance. The reliability of these findings is underscored by the absence of multicollinearity, as confirmed by VIF analysis (VIF = 1.000).

Critically, advanced machine learning models corroborate these findings. The XGBoost model assigns Improved Customer Service a 100% feature importance, emphasizing that no other variables play a competitively significant role in predicting loyalty. This is supported by the Random Forest model, which identified it as the most important factor, accounting for 56.0% of the predictive power. While other elements like Passenger Trust, Price/Ticket Fare, and Frequent Flyer Programs play a role, their influence is demonstrably secondary.

6.13 **Comparative Model Performance and Application in the MML-SM Framework**

The Multivariate-Machine Learning Synergistic Model (MML-SM) leverages the distinct strengths of various analytical techniques to provide a comprehensive understanding of customer loyalty. Multivariate Linear Regression (MLR) serves as the cornerstone for explanatory power, achieving the highest R-squared value of 0.718 (71.8%) to quantify the collective influence of key factors. For modeling the ordinal nature of customer satisfaction, the Ordered Logistic Regression (OLogit) is specifically employed, while Ordinary Least Squares (OLS) provides a robust validation of linear relationships with a strong R^2 of 0.659. Complementing these, the machine learning ensemble methods Random Forest ($R^2 = 0.636$) and XGBoost are integrated to capture complex non-linear patterns and interactions, with XGBoost

playing the critical role of definitive feature importance identification. This synergistic approach ensures that the analysis is both statistically rigorous and practically insightful, capable of modeling diverse data types and delivering actionable intelligence.

Table 6.4: Model Performance and Application in the MML-SM Framework

Model	R-squared (R^2)	Primary Use/Key Feature	Data Type Compatibility
Multivariate Linear Regression (MLR)	0.718 (71.8%)	Highest explanatory power for loyalty	Continuous outcome variables
Ordered Logistic Regression (OLogit)	N/A (Probability-based)	Analyzing ordinal satisfaction data (Likert scale)	Ordinal/categorical dependent variables
Ordinary Least Squares (OLS)	0.659 (65.9%)	Robust linear relationship analysis	Continuous outcome variables
Random Forest Regression	0.636 (63.6%)	Handling non-linearity and variable interactions	Multiple data types, robust to outliers
XGBoost	Single Variable Model	Feature importance identification	Optimized for predictive accuracy

Source: Author

6.14 **Findings and Strategic Imperatives for Objective 1 & 2**

The combined results from OLS regression and XGBoost provide compelling evidence that Improved Customer Service is the dominant driver of customer loyalty for Biman Bangladesh Airlines. The OLS regression indicates a strong, direct, and statistically significant positive relationship ($\beta = 0.7413$, $p < 0.001$), while the XGBoost model confirms its paramount importance by assigning it a 100% feature

weight. This finding is further reinforced by the Random Forest model, which identified Improved Customer Service as the most important factor, accounting for 56.0% of the predictive power. Other factors, such as Passenger Trust (MLR β = 0.134*, OLogit β = 0.384*), Price/Ticket Fare (MLR β = 0.133*, OLogit β = 0.541*), and Frequent Flyer Programs (Random Forest: 9.7%), were also significant but demonstrated a substantially lower influence relative to customer service.

Table 6.5: Customer Loyalty Dynamics for Objective I & II

Factors	MLR (β)	OLogit (β)	OLS (β)	Random Forest (%)	XGBoost (Importance)
Improved Customer Service	0.341***	1.365***	0.7413***	56.0%	1.0 (100%)
Passenger Trust	0.134*	0.384*	-	8.1%	-
Price/Ticket Fare	0.133***	0.541***	-	5.8%	-
Brand Reputation	0.138**	0.586**	-	-	-
Frequent Flyer Program	0.105**	0.414**	-	9.7%	-
Staff Services	N/S	N/S	-	3.6%	-
Route Availability	0.115**	0.264	-	-	-
Education Level	0.090*	0.326**	-	-	-
Age	0.070*	0.243*	-	-	-
Airline Safety	N/S	0.303	-	-	-

Source: Author

Strategic Imperative: Therefore, the airline's primary strategic focus must be a fundamental and sustained investment in elevating the entire customer service

experience. These results offer a data-driven foundation for developing targeted policies that prioritize passenger satisfaction. By leveraging these insights, Biman Bangladesh Airlines can optimize its loyalty programs, enhance service delivery through AI-powered personalization and improved complaint resolution, and ultimately strengthen its competitive positioning in the aviation industry.

6.15 Objective III: Suggestion for Improving Customer Service Quality to Retain Passengers in Biman Bangladesh Airlines Limited.

To address objective III, this study analyses numerous suggestions from 425 respondents in a recent survey for improving the services of Biman Bangladesh Airlines Limited, the national flag carrier of Bangladesh. An open-ended question was set in the questionnaire survey (Question Serial 20 of Survey Questionnaires) to gain the feedback focuses for improving customer service quality to retain passengers of Biman Bangladesh airlines limited. Outcome of Survey Data analyzing through Natural Language Toolkit (NTLK) of Python is attached with Appendix 16, The data driven key suggestions of respondents for improving customer loyalties of Biman Bangladesh Airlines' service quality Based on the analysis of the respondents' answers.

6.16 Suggestion to Retain Customer in Biman Bangladesh Airlines Limited

To enhance customer service quality, operational efficiency, and profitability, the following structured recommendations are proposed based on stakeholder feedback and operational insights:

6.15.1 Customer Service Enhancements

6.15.1.1 24/7 Customer Support: To establish a round-the-clock call center for real-time assistance.

6.15.1.2 Luggage Handling: Biman need to upgrade baggage management systems to minimize loss/damage.

6.15.1.3 Ground Staff Behavior: To train staff to be courteous, especially toward immigrant passengers and their cargo.

6.15.1.4 In-Flight Experience: Biman need to maintain aircraft cleanliness and onboard comfort.

6.15.2 **Operational Efficiency**

6.15.2.1 Punctuality: To prioritize on-time departures/arrivals to minimize delays.

6.15.2.2 Flight Availability: Biman need to increase domestic and international flight frequency and expanding domestic routes to underserved regions.

6.15.2.3 Maintenance: To ensure regular aircraft servicing for safety and reliability.

6.15.3 **Pricing Strategy**

6.15.3.1 Competitive Pricing: Biman need to reduce ticket prices, particularly for Middle Eastern routes and to avoid sudden price hikes during peak demand.

6.15.3.1 Dynamic Pricing: To implement fare adjustments based on demand while maintaining affordability.

6.15.4 **Human Resource Development**

6.15.4.1 Staff Training: Biman need to train pilots, crew, and ground staff to international standards and emphasize professionalism, honesty, and accountability.

6.15.4.2 Performance Incentives: To reward exemplary service; enforce strict disciplinary measures for misconduct.

6.15.4.3 Leadership: Biman need to consider hiring foreign expertise for CEO/executive roles to drive bold reforms.

6.15.5 Infrastructure and Management

6.15.5.1 Accountability Systems: Biman may introduce transparent oversight at all organizational levels.

6.15.5.2 Service Facilities: Biman should upgrade lounges, booking systems, and boarding processes.

6.15.5.3 Frequent Flyer Program: Biman need to revamp loyalty rewards to retain high-value customers.

6.15.6 Strategic Growth

6.15.6.1 Market Positioning: Biman should leverage status as Bangladesh's national carrier to build patriotic loyalty.

6.15.6.2 Safety Commitment: Biman may adopt global safety protocols and certifications.

6.15.6.3 Customer-Centric Culture: Biman need to regularly survey passengers to align services with expectations.

6.15.7 Key Priorities for Immediate Action

6.15.7.1 Reduce Delays: Biman need to implement strict scheduling and real-time monitoring.

6.15.7.1 Lower Ticket Prices: Biman should offer seasonal discounts and competitive fares.

6.15.7.1 Staff Training: To launch a 6-month certification program for customer-facing roles.

6.15.7.1 Technology Integration: Biman need to digitize ticketing and baggage tracking systems.

By focusing on these strategic pillars as Service Excellence, Operational Reliability, Fair Pricing, and Employee Accountability, Biman Bangladesh Airlines can reclaim market leadership, boost profitability, and strengthen its reputation as a trusted national carrier. Regular audits and passenger feedback loops will ensure sustained improvement.

6.17. **Validation of Research Objectives**

This analysis in accordance with the table 6.4 provides robust statistical validation for all three research objectives, confirming a data-driven path for enhancing customer loyalty.

a. **Objective 1 (Identify Key Variables):** Fully validated. Multivariate regression (MLR) confirmed a significant multi-factor model (R^2 = 0.718), with 7 of 8 hypothesized variables impacting loyalty. Improved Customer Service was consistently identified as the dominant factor across MLR, OLogit, and Random Forest models.

b. **Objective 2 (Impact of Customer Service):** Strongly validated. The service-loyalty relationship is powerfully explained by a high R^2 of 0.659 in the OLS model, which shows an extremely strong, significant effect (β = 0.7413). The singular dominance of this factor is confirmed by XGBoost, which assigned it 100% feature importance.

c. **Objective 3 (Data-Driven Recommendations):** Comprehensively validated. The synthesis of all models successfully quantified the primary lever (service quality) and specific secondary drivers (e.g., Trust, Price), generating actionable, statistically-grounded strategic insights.

Table 6.4: Research Objectives Validation Through Regression Analysis

Research Objective	Analytical Methods	Key Findings Supporting Objective	Validation Status
1. Identify key variables influencing satisfaction & loyalty	MLR, OLogit, Random Forest,	• 7/8 hypothesized variables showed significant impact • Improved Customer Service emerged as dominant factor across all models • Multi-factor model confirmed with $R^2 = 0.718$ (MLR)	Fully Validated
2. Examine impact of improved customer service on loyalty	OLogit, OLS, XGBoost, MLR	• Strongest predictor: $\beta = 0.7413$ (OLS), 56% importance (RF) • Single-variable dominance: 100% importance (XGBoost) • High explanatory power: $R^2 = 0.659$ (service-loyalty relationship)	Strongly Validated
3. Provide data-driven recommendations for service quality	All regression models +	• Improved Customer Service is identified as primary lever for retention • Specific drivers	Comprehensively Validated

	Thematic analysis	quantified: Trust, Price, Brand, FFP • Actionable insights generated for strategic implementation	

Source: Author

6.18. **Comprehensive Hypothesis Validation with Multi-Method Statistical Evidence**

The validation of the research hypotheses in accordance to table 6.5 is anchored in a robust, multi-method analytical framework. The core multivariate linear regression (MLR) model demonstrated high explanatory power, with an R^2 of 0.718, confirming that the defined predictors collectively explain a substantial portion of the variance in customer loyalty. Statistical significance was tested at conventional thresholds ($p < 0.05$, $p < 0.01$, $p < 0.001$), providing a rigorous basis for rejecting null hypotheses. This quantitative foundation is further reinforced by machine learning ensembles; Random Forest attributed over half (56%) of its predictive accuracy to a single variable, while XGBoost's feature importance analysis provided conclusive, non-parametric validation of variable dominance. This confluence of traditional and modern analytics creates a statistically sound and highly reliable basis for the subsequent hypothesis testing and strategic conclusions.

Table 6.7: Hypothesis Validation Summary

Hypothesis		MLR Evidence	OLogit Evidence	Machine Learning Evidence	Overall Validation
H1: Multi-factor model influences satisfaction/loyalty		R^2 = 0.718***	Significant model fit	RF R^2 = 0.636	Validated
	H1a: Passenger trust positive influence on loyalty	β = 0.134*	β = 0.384*	8.1% importance (RF)	Validated
	H1b: Brand reputation positive influence on loyalty	β = 0.138**	β = 0.586**	Not in top features	Validated
	H1c: Staff service positive influence on loyalty	Not Significant	Not Significant	3.6% importance (RF)	Rejected
	H1d: Airline safety positive influence on loyalty	Not Significant	β = 0.303 (marginal)	Not in top features	Partially Supported
	H1e: Route availability positive influence on loyalty	β = 0.115**	β = 0.264 (marginal)	Not in top features	Validated
	H1f: Frequent flyer program positive influence on loyalty	β = 0.105**	β = 0.414**	9.7% importance (RF)	Validated
	H1g: Price positive influence on loyalty	β = 0.133***	β = 0.541***	5.8% importance (RF)	Validated
	H1h: Improved customer service positive influence on customer loyalty	β = 0.341***	β = 1.365***	56.0% importance (RF)	Strongly Validated
H2: Improved Customer service has strongest impact on loyalty		Highest β value	Highest β value	100% importance (XGBoost)	Strongly Validated

Source: Author

Statistical Significance Notation: *p<0.05, **p<0.01, ***p<0.001, N/S = Not Significant

Model Key: MLR = Multivariate Linear Regression, OLS = Ordinary Least Squares, OLogit = Ordered Logistic Regression, RF = Random Forest, XGBoost = Extreme Gradient Boosting

Interpretive Notes:

- Machine Learning importance percentages represent relative predictive power
- The OLS model specifically tested the service-loyalty relationship ($R^2 = 0.659$)
- Multicollinearity checks confirmed reliability (VIF = 1.000)
- All regression models show strong explanatory power (R^2 values 0.636-0.718)

This comprehensive validation demonstrates that 7 of 9 hypotheses were fully or partially supported, with Improved Customer Service emerging as the dominant factor across all analytical methods. The consistent statistical significance (p<0.001) and high machine learning feature importance (56-100%) provide robust evidence for strategic prioritization of customer service initiatives of Biman Bangladesh Airlines Limited.

6.19 Empirical Insights into Exit-Voice Dynamics at Biman Bangladesh Airlines Limited

(Hirschman, 1970) Exit-Voice theory is partially supported by the analysis within the context of Biman Bangladesh Airlines. The strong emphasis placed on Improved Customer Service as a key determinant of both customer satisfaction and loyalty, as evidenced by Multivariate Linear Regression (MLR) and Random Forest Regression, indicates that customer loyalty is maintained when service quality is perceived favorably, thereby negating the exit option (Field, 2018); (Hair, 2019). However, the

limited direct impact of Staff Services on loyalty, despite a strong correlation with satisfaction, suggests that the exit option may still be exercised when customers perceive that their voice is not effectively heard or addressed in specific service encounters (Hirschman, 1970). This highlights a potential disconnect between staff efforts and perceived organizational responsiveness. As such, recommendations for enhanced complaint resolution systems and proactive engagement programs are underscored, emphasizing the need for Biman Bangladesh Airlines to effectively facilitate and respond to customer voice to mitigate customer attrition and prevent exit (Braun & Clarke, 2013).

6.20 **Chapter Summary**

This chapter provided a data-driven examination of customer satisfaction and loyalty at Biman Bangladesh Airlines, employing a rigorous mixed-methods approach and a Multivariate-Machine Learning Synergistic Model (MML-SM). The analysis confirmed Improved Customer Service as the paramount driver of both satisfaction and loyalty, underscoring the necessity for strategic investments in service excellence and innovation. Findings also revealed the critical role of Passenger Trust and Brand Reputation in fostering customer commitment. Notably, a paradoxical relationship between Price and loyalty, along with a relative "invisibility" of Staff Services, highlighted culturally specific perceptions and potential operational gaps. To capitalize on these insights, this chapter recommends a multi-faceted customer-centric strategy, emphasizing personalized service delivery, proactive engagement, optimized pricing frameworks, and enhanced loyalty programs, along with the effective capture and resolution of customer voice. These evidence-based interventions are designed to enable Biman Bangladesh Airlines to not only

strengthen customer relationships but also to enhance its competitive positioning and achieve sustainable growth within the evolving aviation landscape. Finally, this approach can be used to validate exit voice loyalty.

Chapter 7

A QUALITATIVE ANALYSIS OF FACTORS AFFECTING CUSTOMER SATISFACTION AND LOYALTY AT BIMAN BANGLADESH AIRLINES LIMITED

7.1 Introduction

In Chapter 6, the statistical analysis of the questionnaire survey data for Biman Bangladesh Airlines Limited reveals that improved customer service and passenger trust are the most critical factors driving customer satisfaction and loyalty. The regression model indicates that 74.9% of the variability in customer satisfaction can be explained by these factors, underscoring their significance. Additionally, factors such as staff service, airline brand reputation, route availability and convenience, and the frequent flyer program also contribute to customer satisfaction, though to a lesser extent. While price and airline safety are positively correlated with customer satisfaction, their impacts are smaller. The analysis further reveals that improved customer service has the strongest and statistically significant impact on customer loyalty compared to other factors. Despite these findings, several issues need clarification to uncover the full extent of the research outcomes, such as the practical impact of improved customer service on customer loyalty in a business context, the potential involvement of other factors, the variability of the significance of improved customer service and trust, the specific impacts of staff service, airline brand reputation, route availability and convenience, and the frequent flyer program on loyalty, the existence of any additional variables, the methods used by Biman Bangladesh Airlines Limited to measure customer loyalty, the airline's competitive standing in terms of customer service quality and customer loyalty, and any additional factors

pertinent to the current position. This chapter also aims to address three specific research objectives related to these findings:

1. To identify the key variables that significantly influence customer satisfaction and loyalty in Biman Bangladesh Airlines Limited.

2. To examine the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines.

3. To provide suggestion for improving customer service quality to retain passengers in Biman Bangladesh Airlines Limited.

7.2 Rationale for Conducting Interview and Procedure

The survey questionnaire used in this study did not cover certain factors and issues necessary to address the research objectives, nor could these be measured through a questionnaire alone. Respondents were not in a position to provide detailed insights into organizational or policy-level issues. To bridge this gap, semi-structured interviews were conducted. Unlike structured interviews, which are limited to predetermined questions, semi-structured interviews are more conversational, allowing for greater interaction between participants and the researcher (Zikmund, 2010). (Clark, Foster, Sloan, & Bryman, 2016) argues that semi-structured interviews enable the researcher to delve deeper into participants' attitudes and opinions and explore unexpected issues that arise, providing rich and detailed information about the relationship between customer service quality and customer loyalty. Consequently, the interview questionnaire was developed and is attached in Appendix 5. The answers to these ten questions will address the information gaps from the survey questionnaire and

provide a clearer understanding of the research topic. (Rossman, 2016) also note that in-depth interviews are valuable for obtaining detailed information and exploring participants' experiences and perceptions, helping to identify how improved customer service impacts customer loyalty.

Meanwhile, to gain a deeper understanding of customer loyalty dynamics, semi-structured interviews were conducted with 43 diverse stakeholders associated with Biman Bangladesh Airlines. These interviewees represent 10% of the 423 respondents from the initial questionnaire survey. The list of interviewees and the nature of the information gathered are detailed in Appendix 6. Employees and policymakers from Biman and the Civil Aviation Authority of Bangladesh were included, as they are primary stakeholders whose perceptions are vital. Employees provide firsthand insights into customer service, while prior literature (e.g., Siddiqui, 2010) highlights the close association between the government, policymakers, and the corporate sector in Bangladesh. Additionally, academicians participated because they are involved in customer service improvement and play a role in developing future managers, regulators, and professionals for the country. The interview data gathered for Biman Bangladesh Airlines reflects a diverse range of perspectives, including top-level executives, industry professionals, passengers, and aviation experts. The information encompasses key insights on enhancing customer loyalty, safety protocols, market positioning, operational efficiency, and regulatory compliance. Participants such as the Director of Marketing, Pilots, and Frequent Flyers provided targeted insights into customer engagement and loyalty strategies. The data's effectiveness is heightened compared to questionnaire surveys because interviews allow for deeper, more nuanced discussions, capturing real-world

experiences and expert knowledge that may not surface in structured surveys. This makes interviews a decisive tool, offering actionable recommendations grounded in industry-specific expertise, which can be directly applied to strategic planning and service improvements for the airline.

The chapter is divided into four sections: 2nd section justifies the key variables that significantly influence customer satisfaction and loyalty in Biman Bangladesh Airlines Limited. 3rd section examines the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines; whilst 4th section provides suggestion for improving customer service quality to retain passengers in Biman Bangladesh Airlines Limited. Finally, the last section summarizes the overall findings and draws conclusions.

7.3 Key Variables That Significantly Influence Customer Satisfaction and Loyalty in Biman Bangladesh Airlines Limited.

The questionnaire survey revealed that the key variables influencing customer satisfaction and loyalty for Biman Bangladesh Airlines Limited are improved customer service, passenger trust, staff service, airline brand reputation, frequent flyer program, route availability and convenience, airline safety, and price/ticket fare. These variables were prioritized based on their Pearson correlation coefficients with customer loyalty, regression beta values, and regression coefficients for customer satisfaction. This integrated approach underscores the importance of each variable in driving customer satisfaction and loyalty, providing a data-driven foundation for strategic improvements. Diverse professional opinions were considered, highlighting various perspectives. The study concludes with a determination to enhance customer service initiatives and strengthen

customer loyalty in the aviation market. A comprehensive analysis, including interviews and content analysis, was conducted to identify the key variables significantly influencing customer satisfaction and loyalty in Biman Bangladesh Airlines Limited. This analysis also validates the trustworthiness of the data-driven outcomes obtained through the survey questionnaire.

7.3.1 **Improved Customer Service**. Improved customer service is a cornerstone of boosting customer satisfaction at Biman Bangladesh Airlines, with a strong correlation coefficient of 0.806 and the highest beta value of +0.353. A loyal Customer Care Officer (Respondent C) remarked,

> *"Our priority should be to ensure that every customer feels valued and heard,"*

which highlights the need for a more personalized service approach. To meet this need, The Director of Customer Services *(Respondent Q)* suggested,

> *"Investing in comprehensive training programs for staff will help maintain high service standards"*

emphasizing the critical role of staff training in upholding excellent service. The Managing Director & CEO *(Respondent J)* further advised,

> *"Feedback should be systematically gathered and analyzed to continuously improve service quality"*

stressing the importance of establishing robust feedback mechanisms to drive service enhancements. Implementing these recommendations will elevate service quality, thereby enhancing customer satisfaction and loyalty.

7.3.2 **Passenger Trust**. Passenger trust significantly impacts customer satisfaction, evidenced by a strong correlation coefficient of 0.791 and a high beta value of +0.291. The Director of Sales and Marketing (*Respondent A)* observed that

> *"Building trust requires consistent performance and transparent communication with passengers"*

underlining the necessity of transparency in fostering trust. The International Route Passenger *(Respondent M)* added that

> *"When passengers perceive the airline as reliable and committed, trust is naturally built"*

reflecting the importance of consistent service delivery. Furthermore, The Customer Care Officer *(Respondent C)* noted,

> *"Effective management of passenger trust is vital for satisfaction and loyalty"*

indicating that timely resolution of trust issues is crucial for maintaining customer loyalty. Strengthening trust through these measures will enhance overall satisfaction and loyalty.

7.3.3 **Staff Service**. Staff service is a crucial determinant of customer satisfaction, demonstrated by a strong correlation of 0.737 and a moderate beta value of +0.103. The Biman Pilot *(Respondent B)* noted,

> *"The way our staff interacts with passengers greatly affects their satisfaction"*

emphasizing the impact of staff interactions on customer experience. The University Teacher *(Respondent I)* stressed:

> *"Skilled staff who can effectively address customer needs significantly boost satisfaction"*

highlighting the importance of ongoing staff training and development. Additionally, The Managing Director & CEO OF Biman Bangladesh Airlines *(Respondent J)* observed that,

> *"Creating a customer-centric culture within the organization is essential"*

pointing out that a customer-focused culture will enhance service quality. Adopting these strategies will improve staff performance and contribute to increased customer satisfaction and loyalty.

7.3.4 **Airline Brand Reputation**. An airline's brand reputation has a moderate correlation of 0.736 with customer satisfaction and a beta value of +0.082. The Airport Manager of HSIA *(Respondent K) noted*,

> *"Maintaining a positive brand reputation requires consistent service quality and operational transparency"*

highlighting how service quality influences brand perception. The Public Relations Officer *(Respondent QQ)* added,

> *"Effective public relations and marketing strategies help in building and sustaining a favorable brand image"*

underscoring the importance of brand management. The Research Participant *(Respondent O)* emphasized;

> *"A strong brand reputation contributes to customer loyalty, but it must be supported by excellent service and reliability"*

indicating that reputation must be backed by high-quality service. Enhancing brand reputation through these efforts will bolster customer loyalty.

7.3.5 **Frequent Flyer Program**. The Frequent Flyer Program shows a moderate correlation of 0.694 with customer satisfaction and a moderate beta value of +0.094. The Director of Sales and Marketing *(Respondent A) suggested*,

> *"Revamping our Frequent Flyer Program to offer more attractive rewards can significantly enhance customer retention"*

indicating that a more enticing rewards structure could improve loyalty. The Customer Care Officer *(Respondent C)* noted,

> *"Providing valuable benefits through the Frequent Flyer Program encourages loyalty and frequent travel"*

stressing the importance of communicating program benefits clearly. The International Route Passenger *(Respondent M) observed*,

"Well-designed reward programs can influence customer choice and foster loyalty"

highlighting the need to evaluate and refine the program's effectiveness. By enhancing the Frequent Flyer Program, Biman Bangladesh Airlines can boost customer retention and loyalty.

7.3.6 **Route Availability and Convenience**. Route availability and convenience have a moderate correlation of 0.676 with customer satisfaction, supported by a slightly higher beta value of +0.111. The Domestic Passenger *(Respondent L) remarked*,

"Offering direct and convenient routes greatly influences my choice of airline"

underscoring the importance of route convenience in customer decisions. The Director of Customer Services *(Respondent Q)* added,

"Expanding the route network to cover more destinations can improve customer satisfaction"

emphasizing the need for a broader network. Zhang et al. (2011) and Van Egger Mond (2007) noted,

"Convenience in routes significantly affects customer satisfaction and loyalty,"

supporting the need to optimize route schedules and increase flight frequencies. Improving route availability and convenience will enhance passenger satisfaction and loyalty.

7.3.7 **Airline Safety**. Although airline safety is critical, it has a moderate correlation of 0.673 with customer satisfaction and a minimal beta value of +0.004. Addl Director AVSEC *(Respondent MM)* highlighted,

"Adhering to strict safety protocols is essential for passenger confidence"

emphasizing the importance of high safety standards. The Managing Director & CEO *(Respondent J)* noted,

"While safety is crucial, its direct impact on overall satisfaction may be less pronounced compared to service quality"

suggesting that safety, while important, is one of several factors influencing satisfaction. Thapa Nat (2015) and Oyewole et al. (2007) observed,

"Safety is a fundamental concern, but other factors often play a more significant role in influencing overall satisfaction,"

indicating that safety should be managed along with other service aspects. Balancing safety with other service quality factors will help maintain passenger confidence and overall satisfaction.

7.3.8 **Price/Ticket Fare**. Price or ticket fare shows a moderate correlation coefficient of 0.582 and a relatively low beta value of +0.054. The Director of Sales and Marketing (Respondent A) observed,

> *"Competitive pricing is important, but it should be complemented by high service quality,"*

suggesting that pricing should align with service excellence. The Customer Care Officer (Respondent C) noted,

> *"Balancing price with value-for-money is crucial for customer satisfaction,"*

indicating the need for pricing that reflects value. (Park, 2007) emphasized,

> *"Price sensitivity varies among passengers, and while it is a factor, its impact on overall satisfaction is moderated by other factors,"*

pointing out the need to adjust pricing strategies based on market trends. Implementing competitive pricing while ensuring value for money will enhance customer satisfaction and loyalty.

7.4 Key Drivers of Customer Satisfaction and Loyalty at Biman Bangladesh Airlines

Based on the analysis, the top three factors crucial for enhancing customer satisfaction and loyalty at Biman Bangladesh Airlines are Improved Customer Service, Passenger Trust, and Staff Service.

7.4.1 **Improved Customer Service** emerges as the most crucial factor for enhancing customer satisfaction at Biman Bangladesh Airlines, evidenced by its strong correlation coefficient of 0.806 and highest beta value of +0.353. This indicates that elevating service quality yields the most significant impact on customer satisfaction. Insights from the Customer Care Officer (Respondent C) emphasize the necessity for personalized service to make each customer feel valued, while the Director of Customer Services (Respondent Q) highlights the importance of comprehensive staff training to uphold high service standards. Additionally, the CEO advocates for systematic feedback collection and analysis to drive continuous improvements. Strengthening these areas is essential for significantly boosting customer satisfaction and loyalty.

7.4.2 **Passenger Trust**, with a strong correlation coefficient of 0.791 and a high beta value of +0.291, is equally vital for fostering loyalty. Building and maintaining trust require consistent performance and transparent communication, as emphasized by the Director of Sales and Marketing (Respondent A). Observations from an International Route Passenger (Respondent M) highlight that perceived reliability and commitment are key to trust, while the Customer Care Officer (Respondent C) stresses effective trust management to sustain satisfaction and loyalty.

7.4.3 Finally**, Staff Service**, reflected by a correlation of 0.737 and a moderate beta value of +0.103, plays a significant role in customer satisfaction. Effective staff interactions, skilled service, and a customer-centric culture, as noted by the Biman Pilot (Respondent B), University Teacher (Respondent I), and Managing Director & CEO (Respondent J), are crucial for enhancing service quality and ensuring high levels of satisfaction and loyalty.

Investing in these three areas customer service, passenger trust, and staff service will significantly enhance Biman Bangladesh Airlines' overall service quality and strengthen customer relationships.

7.5 **Impact of Improved Customer Service on Customer Loyalty Towards Biman Bangladesh Airlines**.

The analyses of questionnaire survey in chapter 6 collectively reveal that improved customer service has a strong and statistically significant impact on customer loyalty towards Biman Bangladesh Airlines. The strong positive correlation ($r = +0.771$) and substantial R^2 value (0.595) from the regression analysis indicate that enhancements in customer service are likely to lead to increased customer loyalty. The Chi-Square test supports this finding, with a strong association indicated by Cramer's V (0.598). These results underscore the importance of focusing on customer service improvements as a strategic priority for Biman Bangladesh Airlines to foster greater customer loyalty. The robust confidence interval for the correlation coefficient [0.708, 0.824] further confirms the reliability of the strong positive relationship observed. Through questionnaire survey it is clearly revealed that improved customer service significantly predicts customer loyalty, therefore further analysis is necessary to explore additional factors and attributes influencing customer loyalty, ensuring a comprehensive strategy for customer retention.

In this regard thematic analysis of responses from 42 sets of interviewees, insights were gathered from diverse stakeholders, including airline officials, passengers, and industry professionals are taken into connivences. The findings underscore the multifaceted nature of customer loyalty dynamics and highlight

the critical role of improved customer service in shaping passenger perceptions and loyalty towards the airline. Key themes include enhanced service quality, customer engagement, collaboration, continuous improvement, competitive pricing, and convenience. The study concludes with recommendations for Biman to enhance its customer service initiatives and strengthen customer loyalty in the aviation market. Mentionable that there is a theory of named exit-voice theory which has been developed to identity the relationship between customer satisfaction and customer loyalty (Hirschman, 1970). The theory says that each customer has two options when customer is not satisfied with the product or service then s/he exits the product or service that means the customer is not going to use it any more or the customer raises voice i.e., s/he makes a complaint regarding product or services. On the other hand, when customer is satisfied with the product then s/he consumes the product or service again and becomes a loyal customer (Bloemer, 2002). However, basing on the interviews, following issues are revealed to provide a comprehensive understanding of the impact of customer services on loyalty towards Biman Bangladesh Airlines:

7.5.1 **Service Quality as a Pillar of Loyalty.** Across the responses, service quality emerges as a fundamental factor driving passenger loyalty. Because service quality is “the overall assessment of a service by the customer” and it is “the difference between customer expectations of service and perceived service” (Sandaruwan & S., 2015). As articulated by a retired Managing Director & CEO of Biman Bangladesh Airlines (Respondent D),

"*Service quality is paramount*,"

highlighting its foundational role in shaping passenger perceptions and fostering long-term loyalty. The two factors that influence service quality are the expected service and perceived service and when customers meet the expected service as perceived then they become satisfied and when service exceed expected service then customer become delighted (Parasuraman, et al., 1988). This sentiment is echoed by a domestic passenger who emphasizes,

"Consistent service excellence builds trust and keeps me coming back."

This statement is duly supported by a study (Park, 2007) that is in-flight service, airline service, employee service, on-time operation, and overall service quality were important factors in the choice of airline. Customer satisfaction is the outcome of service quality (Sandaruwan & S., 2015) and there is a positive, significant relationship between these two although it should be noted that service characteristics make it different from product quality. Here, it's evident that maintaining high service standards is crucial for retaining loyal customers, as passengers often equate service quality with their overall satisfaction and loyalty towards the airline.

7.5.2 **Customer Engagement and Personalization**. Stakeholders across roles stress the significance of customer engagement and personalized interactions in enhancing loyalty. A loyal customer care officer (Respondent C) emphasizes the role of initiatives aimed at enhancing customer engagement, stating,

"Proactive customer engagement initiatives contribute significantly to long-term loyalty."

This sentiment is echoed by the Director of Sales and Marketing (Respondent A), who highlights the pivotal role of personalized promotions, stating,

> *"Tailored marketing campaigns create meaningful connections with passengers, fostering loyalty and advocacy."*

The analysis here reveals that improved customer service in the form of personalized interactions and targeted marketing efforts are essential for establishing a strong emotional connection with customers, ultimately driving loyalty and repeat business.

7.5.3 **Collaboration and Regulatory Compliance**. Collaboration with industry stakeholders and regulatory compliance emerges as crucial drivers of loyalty. The Chairman of Civil Aviation Bangladesh (Respondent F) underscores the importance of collaboration and regulatory adherence in ensuring a seamless travel experience, stating,

> *"Effective collaboration fosters trust and loyalty among passengers."*

Because due to the factors such as deregulation and liberalization, the airline industry has become “highly dynamic and competitive” (Appiah-Adu, et al., 1999) and,

> *“in the context of aviation industry, loyalty can be seen as the possibilities of a customer bringing in repeat business and his willingness to work as a partner to the airline”* (Kivetz & Simonson, 2003).

This sentiment is reinforced by a professional from Emirates Airlines (Respondents G), who emphasizes the significance of aligning with industry regulations, stating,

> *"Adhering to regulatory requirements is essential for maintaining passenger trust and loyalty."*

Here, it's evident that improved customer service in the form of maintaining collaborative relationships and regulatory compliance are imperative for building trust and enhancing loyalty among passengers.

7.5.4 **Benchmarking and Strategic Improvements**: Professionals from leading airlines advocate for benchmarking against industry best practices and implementing strategic improvements. Therefore, understanding passengers' needs and expectations and then developing high quality service to meet them will provide airline companies a competitive advantage in comparison with their rivals. There exists quite a broad consensus that customer satisfaction is an antecedent of loyalty (Morgan & Hunt, 1994). (Morgan & Hunt, 1994) and (Forgas, et al., 2010).). A research participant (Respondent O) recommends fostering a culture of continuous improvement, stating,

> *"Continuous improvement initiatives are essential for enhancing service quality and driving long-term loyalty."*

This sentiment is echoed by a professional from Qatar Airlines (Respondent H), who emphasizes the importance of strategic improvements, stating,

> *"Strategic enhancements aligned with market dynamics enable airlines to stay ahead of the competition and drive customer loyalty."*

The analysis highlights the importance of ongoing evaluation and strategic planning to identify areas for improvement and maintain a competitive edge in the market.

7.5.5 **Competitive Pricing and Convenience**: Passengers emphasize the importance of competitive pricing and convenience in fostering loyalty. Because, price is associated with the service and passengers are also sensitive regarding service. If there is a little or no difference between the services offered in the airline industry, a customer may just choose the cheapest airline (Lovelock & Wirtz, 2011).. In this regard, an international route passenger (Respondent M) suggests,

> *"Offering competitive pricing and improving customer experience are key to fostering loyalty."*

Pricing strategies and convenience significantly influence passenger decisions, indicating the importance of value proposition and ease of travel. This sentiment is reinforced by a disloyal passenger of Biman (Respondent N) who points out,

"Competitive pricing and convenience are crucial factors in my decision to choose an airline, affecting my loyalty and repeat business."

Here, it's evident that offering competitive pricing and convenient travel options are essential for attracting and retaining loyal customers.

7.5.6 **Continuous Improvement and Innovation**: Participants recommend fostering a culture of continuous improvement and innovation. A Biman Pilot (Respondent B) acknowledges the importance of innovation, affirming,

"Embracing innovation and strategic planning are essential for meeting evolving customer needs and driving loyalty."

This sentiment is echoed by a university teacher (Respondent I) who advocates for continuous improvement, stating,

"Continuous improvement initiatives help Biman anticipate customer preferences and enhance service delivery."

Additionally, a retired Managing Director & CEO (Respondent D) highlights the importance of innovation in maintaining competitiveness, stating,

"Innovation is key to staying relevant and meeting the changing demands of passengers, ultimately driving loyalty and satisfaction."

The analysis underscores the importance of innovation and continuous improvement in adapting to changing customer preferences and market dynamics, thereby enhancing loyalty and satisfaction among passengers. It is

otherwise prudent that, if a customer gets satisfied with an airline, s/he returns to it for new purchases and recommends the airline to others (Kim, et al., 2016). The demonstration of such impact of customer satisfaction and customer loyalty is not the same for all industries. Loyal customers are not necessarily satisfied customers, but satisfied customers tend to be loyal customers (Fornell, 1992).

In summary, the study highlights the critical role of improved customer service in driving customer loyalty towards Biman Bangladesh Airlines. The findings underscore the importance of prioritizing service quality, customer engagement, collaboration, continuous improvement, competitive pricing, and convenience to enhance passenger satisfaction and loyalty. By implementing strategic initiatives to address these factors, Biman can strengthen its competitive position in the aviation market and achieve sustainable growth.

7.6 Suggestion for Improving Customer Service Quality to Retain Passengers in Biman Bangladesh Airlines Limited.

Through questionnaire survey, Biman Bangladesh Airlines Limited, the national flag carrier of Bangladesh, has received numerous suggestions for improving its services from 423 respondents. The feedback focuses on various aspects of customer service, ground handling, pricing, punctuality, and overall professionalism. Enhanced customer care is given the highest priority then improve ground handling and efficiency, enhance ticketing system, punctuality and schedule maintenance, digital solutions and feedback systems, service quality and in-flight experience, management and leadership and employee morale and professional development is considered with care. To enhance customer care options through training, customer interaction and accountability is

given due importance. For service quality and in-flight experience, concentration on comfort and cleanliness, in-flight services and personalization is suggested. Meanwhile, through interview and content analysis insights gleaned from diverse stakeholders and the analysis conducted, the following recommendations are proposed to enhance customer service quality and foster loyalty towards Biman Bangladesh Airlines Limited:

7.6.1 **Invest in Staff Training and Development**. Ensure comprehensive training for all staff members, including ground personnel, cabin crew, and customer service representatives, to consistently deliver exceptional service experiences (Director of Customer Services) (Respondent Q).

7.6.2 **Prioritize Safety and Reliability**. Maintain a strong focus on safety protocols and operational reliability to instill confidence and trust among passengers (Biman Pilots) (Respondent B).

7.6.3 **Enhance Communication Channels**. Improve communication channels to provide passengers with timely updates, personalized information, and responsive support throughout their journey (Airport Manager of HSIA) (Respondent K).

7.6.4 **Personalize Passenger Interactions**. Implement strategies to personalize passenger interactions, such as acknowledging frequent flyers by name and addressing individual preferences and concerns proactively (Loyal Customer Care Officer) (Respondent C).

7.6.5 **Streamline Booking Processes**. Simplify booking processes and digital platforms to make ticket purchasing and itinerary management more user-friendly and efficient for passengers (University Teachers) (Respondent I).

7.6.6 **Optimize In-Flight Experience**. Enhance the in-flight experience by offering amenities, entertainment options, and onboard services that cater to the diverse needs and preferences of passengers (General Manager of Operations) (Respondent BB).

7.6.7 **Implement Customer Feedback Mechanisms**. Establish robust feedback mechanisms, such as surveys and social media monitoring, to collect and analyze customer feedback effectively (Frequent Flyer) (Respondent X).

7.6.8 **Collaborate with Industry Stakeholders**. Foster collaborations with regulatory bodies, airport authorities, and service providers to uphold industry standards and enhance the overall travel ecosystem (Chairman of Civil Aviation) (Respondent F).

7.6.9 **Promote Transparency and Accountability**. Maintain transparency in service delivery and pricing policies while holding employees accountable for upholding service standards (Managing Director & CEO) (Respondent J).

7.6.10 **Innovate and Adapt to Market Trends**. Stay abreast of market trends and technological advancements to innovate service offerings and stay competitive (Aviation Business Academician) (Respondent E).

7.6.11 **Reward and Recognize Loyalty**. Implement loyalty programs and personalized incentives to recognize and reward loyal customers, encouraging repeat business (Owner of Travel Agents work with Biman Bangladesh Airlines Limited) (Respondent Z).

7.6.12 **Cultivate a Customer-Centric Culture**. Foster a customer-centric culture within the organization by empowering employees to prioritize customer satisfaction (Professional from Qatar Airlines) (Respondent H).

However, for both cases questionnaire survey, semi structure interview and content analysis, consistently delivering exceptional service experiences, instilling confidence and trust among passengers, responsiveness, addressing individual preferences and concerns proactively, Enhance the in-flight experience, upholding service standards and innovate service offerings are common recommendations for Biman to emerge as a revenue earning organization.

7.7 **Chapter Summary**

The comprehensive exploration of customer loyalty and service quality within Biman Bangladesh Airlines Limited revealed valuable insights from diverse stakeholders. Through interviews with directors, officers, passengers, and industry professionals, key factors influencing customer loyalty were identified, including service quality, safety, convenience, and customer engagement. Stakeholders emphasized the importance of targeted marketing, personalized promotions, and strategic improvements to enhance Biman's competitiveness. Moreover, recommendations were provided for improving service quality through customer feedback mechanisms, staff training, and collaboration with industry stakeholders. Overall, the discussions highlighted the critical role of service quality as well as Improved customer service in shaping passenger perceptions and behaviors, emphasizing the need for continuous improvement and a customer-centric approach to drive long-term loyalty and sustain growth in the aviation industry.

The empirical journey, traversing the quantitative landscapes of Chapter 6 and the qualitative depths of Chapter 7, has converged on a singular, data-robust reality: Improved Customer Service is the non-negotiable cornerstone of loyalty

for Biman Bangladesh Airlines. The quantitative models provided the statistical bedrock; a dominant OLS coefficient ($\beta = 0.7413$, $p < 0.001$), a near-quadrupling of loyalty odds (OLogit OR = 3.92), and a machine learning consensus (56-100% importance). Chapter 7 then gave these numbers a human voice, illuminating the why behind the statistics; the critical role of trust, the perception of price as a value proxy, and the tangible experiences that define service quality. With this comprehensive, multi-method evidence firmly established, the path forward is clear. The subsequent chapter will now synthesize these insights to formulate definitive strategic recommendations, delineate practical implications for management, and propose concrete avenues for future research to build upon this foundational study.

Chapter 8

DISCUSSION AND CONCLUSION

8.1 Introduction

This chapter presents the main areas of the study as the conclusion of the whole study. It also includes the implications and recommendations of the study so that the respective stakeholder would benefit. Furthermore, the theoretical implications will be presented in this chapter. The chapter will also include explanation on the methodological limitation of the study as well as recommendation for future study. A personal reflection presented in this chapter shows how the researcher has developed himself and overcome the challenges in accomplishing the research journey. Finally, the main areas of this chapter have been mentioned in the chapter summary.

8.2 Summary of The Study

The aim of the research is to determine the impact of improved customer service as well as some key variables on customer loyalty towards Biman Bangladesh Airlines. For the study, the research statement above is broken down into three specific objectives as outlined below:

1. To identify the key variables that significantly influence customer satisfaction and loyalty in Biman Bangladesh Airlines Limited.

2. To examine the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines.

3. To provide suggestion for improving customer service quality to retain passengers in Biman Bangladesh Airlines Limited.

There are seven chapters in this study. Chapter I provides the motivation of the study and the reasoning behind studying each of the above research objectives. This chapter introduces a case study investigating the impact of improved customer service on customer loyalty at Biman Bangladesh Airlines, highlighting the airline's struggles with market share due to fierce competition and difficulties in retaining customers despite efforts to improve service quality. The study aims to identify key variables influencing customer satisfaction and loyalty, assess the effect of better customer service on loyalty, and offer suggestions for improvement, while acknowledging limitations such as data access, potential biases in customer responses, and external factors that could influence results. The findings are intended to assist Biman in making informed business decisions, contribute to the existing literature on customer service in the airline industry, and potentially aid the government in formulating policies to support the airline's growth and profitability.

Chapter 2 deals with the theoretical framework and general literature review to assess the existing state of the aviation industry of Bangladesh its prospects and challenges. Overall contribution of aviation industry to national economy has come up at this chapter. It was found that passengers of Biman Bangladesh airlines are not satisfied to the airliner’s service and not loyal. Entire aviation industry has been severely suffering due to poor customer service.

This chapter also provides a general review of existing literature on Bangladesh's aviation industry, revealing a sector riddled with challenges despite its potential contribution to the national economy. The analysis exposes deficiencies in customer service, operational efficiency, infrastructure, maintenance, and administrative practices, particularly within Biman Bangladesh Airlines. While highlighting Biman's strengths like skilled pilots and established routes, the literature underscores the

airline's struggles with customer satisfaction, financial instability, and competition. Significantly, the review identifies a gap in comprehensive, data-driven research on the Bangladeshi aviation sector, including limited stakeholder analysis, unexplored success factors, insufficient focus on customer loyalty in varied contexts, and methodological weaknesses in existing studies. This gap underscores the need for rigorous, statistically sound investigations into specific issues such as customer service improvements, operational efficiency, and strategic development to unlock the potential of Bangladesh's aviation industry and ensure its long-term sustainability and contribution to the national economy.

Chapter 3 deals specific review of literature, how the existing state customer loyalty of Biman Bangladesh can be enhanced of through improved customer service. The chapter found out customer’s loyalty issues and the problems of Biman Bangladesh Airlines Limited in the context of customer services and customer satisfaction. The review also included how customer service issues are relating to customer loyally.

This chapter provides a focused review of literature on enhancing customer loyalty through improved customer service specifically within Biman Bangladesh Airlines Limited, aiming to understand the key factors influencing customer satisfaction and loyalty in the context of the airline. It discusses the theoretical underpinnings of customer satisfaction and loyalty, exploring concepts like passenger trust, brand reputation, staff service, airline safety, route availability, frequent flyer programs, and pricing. The review highlights the importance of service quality in building customer relationships and encouraging repeat business, noting that customer satisfaction is often a precursor to loyalty. Ultimately, this section posits that improving various aspects of customer service can lead to increased customer satisfaction, which in turn fosters greater customer loyalty towards Biman.

Building upon the literature review, this chapter presents a theoretical framework and a conceptual research model for the study. The framework combines elements of consumer decision-making, focusing on customer satisfaction factors and their relationship with service quality and customer loyalty. The research model identifies independent variables (e.g., trust, brand reputation), a mediating variable (customer satisfaction), and the dependent variable (customer loyalty). The chapter concludes by identifying research gaps, including a lack of published studies on Biman's customer loyalty, limited literature on Bangladesh's aviation industry, and a need for more data-driven research on factors influencing customer satisfaction in the context of Biman Bangladesh Airlines Limited. This study aims to address these gaps by analyzing customer satisfaction, loyalty, and strategies for retaining passengers and improving Biman's profitability.

Chapter 4 meticulously traces the evolution of Bangladesh's aviation industry, from its origins in British military operations during World War II to the establishment of Biman Bangladesh Airlines as the national flag carrier. The chapter outlines the regulatory framework governing the industry and profiles the key commercial airlines operating in Bangladesh, highlighting Biman's historical significance alongside the growth of private players like US-Bangla Airlines and Novo Air. It sheds light on Biman's administrative structure, national and global network, and operational challenges, including institutional mismanagement, corruption, lack of planning, poor customer service, and an aging fleet, which collectively impede its competitiveness and profitability.

Despite these drawbacks, the chapter emphasizes the substantial contributions of the aviation sector, particularly Biman, to the Bangladesh economy. These include

employment generation, promotion of trade and associated industries, and revenue contributions through travel taxes, income taxes, excise duties, and value-added taxes. Furthermore, the chapter highlights the potential for future growth, driven by infrastructure development projects like the Third Terminal at Hazrat Shahjalal International Airport and Bangladesh's strategic location as a transit hub, positioning Biman and the broader aviation industry to play a more significant role in the country's economic development with a forward-looking vision.

Chapter 5 is guided by a pragmatic research paradigm; this chapter outlines a mixed-methods approach designed to examine customer loyalty through improved customer service at Biman Bangladesh Airlines. The research employs an explanatory sequential design, beginning with quantitative data from surveys to identify key variables and test hypotheses, followed by qualitative data gathered from interviews and open-ended survey questions to provide contextual insights and suggest improvements. To help ensure the findings are representative of a range of sources, various data and tools are being followed for various analysis to make the end product more valid. This comprehensive framework utilizes IBM SPSS Statistics, different data analysis and data science libraries of programming language R and Python (with NLTK) for data analysis. Exploratory Data Analysis (EDA) steps like descriptive statistics, Cronbach’s Alpha, Reliability analysis through Sapiro Wilk Test and Anderson Darling Test, Z Score for outliner detection, Multicollinearity checks followed by HC3 and Heteroscedasticity test and correlation, were conducted to maintain data integrity. Then as the part of inferential data analysis, different classical regression method like multivariate linear regression, OLS, OLogit regression were carried out to reveal foundational insights from data. Machine learning techniques in R could capture non-linear relationships, and thematic

analysis in Python adopted to analyze qualitative data, ensuring a holistic understanding of the factors influencing customer satisfaction and loyalty, paving the way for data integration and findings synchronization to gain more comprehensive and actionable insights. Furthermore, this methodology is also planned to empirically validate the "Exit Voice Loyalty "framework

Chapter 6 presented a data-driven analysis of customer loyalty dynamics at Biman Bangladesh Airlines Limited, employing a Multivariate-Machine Learning Synergistic Model (MML-SM). The study utilized survey data from 425 respondents, validated through high internal consistency (Cronbach's Alpha, $\alpha = 0.959$), and analyzed using a suite of advanced methodologies. The findings quantitatively established Improved Customer Service as the unequivocal dominant driver, demonstrating a powerful direct effect on loyalty (OLS $\beta = 0.7413$, $p < 0.001$), the highest coefficient in multivariate analysis (MLR $\beta = 0.341$, $p < 0.001$), and a near-quadrupling of loyalty odds (OLogit OR = 3.92, $\beta = 1.365$, $p < 0.001$). This primacy was further confirmed by machine learning models, which assigned it 56.0% importance in Random Forest and a definitive 100% relative weight in XGBoost. The analysis also validated a hierarchy of secondary drivers, including a significant and counterintuitive Price-Loyalty Paradox (MLR $\beta = 0.133$, $p = 0.001$; OLogit OR = 1.72), alongside the material impacts of Brand Reputation (MLR $\beta = 0.138$, $p < 0.01$; OLogit OR = 1.80) and Frequent Flyer Programs (MLR $\beta = 0.105$, $p < 0.01$; OLogit OR = 1.51). The high explanatory power of the multivariate models ($R^2 = 0.784$ for satisfaction, $R^2 = 0.718$ for loyalty) confirms a robust multi-factor framework, while the comparative strength of the satisfaction model suggests loyalty is also influenced by additional, unmeasured variables.

Based on these findings, this research recommends a multi-faceted customer-centric framework targeting key performance indicators (KPIs) across service delivery, pricing strategy, and customer engagement (Tianqi Chen, Carlos Guestrin, 10 Jun 2016) & (Wooldridge, 2015). Given the non-significant direct impact of Staff Services ($p = 0.742$) and the "Safety Complacency" effect, strategies to enhance service visibility and reframe safety messaging are recommended to drive both satisfaction and loyalty. The results validated key hypotheses and operationalized Hirschman's (1970) Exit-Voice theory.

Chapter 7 effectively synthesizes qualitative insights from semi-structured interviews with 43 diverse stakeholders to complement the quantitative findings of Chapter 6 regarding customer loyalty dynamics at Biman Bangladesh Airlines. Through thematic analysis, the chapter validates the critical role of improved customer service, passenger trust, and staff service in shaping passenger perceptions and loyalty, aligning with exit-voice theory that customer prefers retain with the brand. Stakeholders underscored the importance of enhanced service quality through personalized customer engagement, emphasizing competitive pricing, convenient routes, and continuous improvement initiatives as key drivers of loyalty. These insights contribute to a comprehensive understanding of customer loyalty by revealing the nuanced interplay of service factors, stakeholder collaborations, and market positioning strategies, thus empowering Biman Bangladesh Airlines with actionable recommendations for enhancing service excellence and sustaining long-term growth in the aviation industry through an effective implementation strategy.

At last chapter 8 concluded the study with the implication of recommendations. Additionally, the chapter also suggested the methodical limitations and area of future study.

The following sections summarize the findings on each of these three research objectives.

8.2.1 **Justification of Research Objective 1. key variables that significantly influence customer satisfaction and loyalty in Biman Bangladesh Airlines Limited**.

This study employed a triangulated analytical framework combining correlation analysis, multivariate linear regression (MLR), Ordered Logistic Regression (OLogit), machine learning (RandomForest, XGBoost), and hypothesis testing to ensure methodological robustness in identifying the key drivers of customer satisfaction and loyalty. The analysis was conducted on a robust dataset from 425 respondents, validated for high internal consistency (Cronbach's Alpha, $\alpha = 0.959$).

Initial correlation analysis established strong foundational relationships, revealing that Improved Customer Service ($r=0.806$), Passenger Trust ($r=0.791$), Staff Service ($r=0.737$), and Brand Reputation ($r=0.736$) were strongly associated with satisfaction, while Price ($r=0.582$) had a more moderate link. For loyalty, key correlates were Improved Customer Service ($r=0.771$), Passenger Trust ($r=0.741$), and Brand Reputation ($r=0.730$).

Multivariate regression models (MLR) with high explanatory power ($R^2=0.784$ for satisfaction, $R^2 = 0.718$ for loyalty) confirmed Improved Customer Service as the universal priority, demonstrating significant positive effects on both satisfaction ($\beta=0.389$, $p < 0.001$) and loyalty ($\beta=0.341$, $p < 0.001$). The analysis further delineated the drivers:

- Satisfaction was primarily fueled by Passenger Trust (β=0.273, $p < 0.001$) and Route Availability (β=0.115, p=0.004).
- Loyalty was uniquely and significantly influenced by Price (β = 0.133, p = 0.001), Brand Reputation (β=0.138, p=0.009), and Frequent Flyer Program (β=0.105, p=0.011).

Notable paradoxes were identified, including a Price-Loyalty link (MLR β = 0.133*; OLogit β = 0.541*, OR = 1.72), suggesting Bangladeshi travelers perceive price as a proxy for quality. Conversely, Staff Service, despite a strong correlation (r = 0.737), was statistically insignificant in regression models (p = 0.742), indicating an "invisibility" effect where efforts are not directly translated into measurable loyalty.

Machine learning models provided decisive validation. Random Forest identified Improved Customer Service as the most influential factor (56.0% impact on loyalty), while XGBoost assigned it a definitive 100% feature importance, underscoring its non-negotiable dominance. Other machine-learning-validated factors included Frequent Flyer Program (9.7% RF importance), Passenger Trust (8.1%), and Price (5.8%).

Thematic insights reinforce these findings, emphasizing personalized service, transparency, and staff alignment with customer expectations. Strategic recommendations include AI-driven feedback systems, tiered loyalty rewards, bundled pricing, and safety branding through transparency reports. Ultimately, Improved Customer Service, Passenger Trust, and Brand Reputation emerge as non-negotiable drivers, with nuanced roles for price and safety. By leveraging these insights and addressing hidden patterns, Biman Bangladesh Airlines can transform

challenges into competitive advantages, positioning itself as a leader in Bangladesh's aviation sector.

8.2.2 **Justification of Research Objective 2: Impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines**.

The quantitative and qualitative findings provide compelling evidence that improved customer service is a primary determinant of customer loyalty for Biman Bangladesh Airlines. The OLS regression analysis reveals a strong and statistically significant relationship between improved customer service and customer loyalty (β 0.7413, $p < 0.001$), with a high explanatory power (R^2=65.9%), confirming that service enhancements contribute directly to customer retention. The Ordered Logistic (OLogit) regression, ideal for ordinal outcomes, provides perhaps the most striking evidence. It shows that a one-unit improvement in customer service nearly quadruples the odds of a customer being in a higher loyalty category (β=1.365, $p<0.001$; Odds Ratio, OR=3.92). Furthermore, the XGBoost model, which captures non-linear patterns, assigns 100% feature importance to improved customer service, underscoring its critical role in shaping customer loyalty. The absence of multicollinearity (VIF=1.000) reinforces the model's reliability, and the robustness of the Durbin-Watson statistic (2.155) affirms minimal autocorrelation. Additionally, the strong positive correlation (r=+0.771) and significant chi-square association (Cramer's V=0.598) from thematic analysis further corroborate the impact of service quality on customer retention. These findings are aligned with Hirschman's (1970) exit-voice theory, which posits that customers either voice dissatisfaction or exit a service, emphasizing the need for proactive service improvements to prevent customer attrition and foster long-term loyalty.

Beyond statistical validation, the qualitative analysis highlights key service attributes influencing customer loyalty. Insights from 43 interviewees including airline officials, passengers, and industry experts identify service quality, customer engagement, and continuous improvement as fundamental drivers of loyalty. A retired Managing Director & CEO of Biman Bangladesh Airlines emphasized that "service quality is paramount," reinforcing its role in passenger retention. Passengers echoed similar sentiments, emphasizing that consistent service excellence builds trust and ensures repeat business. Thematic findings also emphasize the importance of personalized service, efficient complaint resolution, and proactive customer engagement strategies. These align with existing literature, such as (Park, 2007), which found that in-flight service, airline operations, and employee interactions significantly impact airline choice and loyalty. Strategically, Biman Bangladesh Airlines must leverage AI-powered personalization, dynamic pricing, and enhanced customer relationship management (CRM) tools to optimize service delivery. Given the non-linearity of the customer loyalty relationship suggested by XGBoost, integrating predictive analytics for customer segmentation and service customization will be essential in sustaining competitive advantage and maximizing long-term passenger retention.

8.2.3 **Justification of Research Objective 3. Suggestion for Improving Customer Service Quality to Retain Passengers in Biman Bangladesh Airlines Limited**.

The statistical and thematic analyses of customer feedback reveal critical service gaps that must be addressed through a structured, data-driven improvement plan. The OLS regression and XGBoost models confirm that customer service quality is the most significant determinant of customer retention, with a high predictive impact

($\beta = 0.7413$, $p < 0.001$, $R^2 = 65.9\%$). Furthermore, the thematic analysis highlights recurring concerns, including staff professionalism, flight punctuality, baggage handling, and customer interaction. To address these concerns, Biman Bangladesh Airlines must adopt a multifaceted approach emphasizing service excellence, operational reliability, and technological integration. First, Biman should establish a Customer Service Excellence Program, incorporating a 6-month international certification program for frontline employees, AI-driven sentiment analysis for passenger feedback, and real-time service monitoring dashboards to track complaints and resolutions. This will ensure that customer grievances are addressed within 24 hours, significantly improving satisfaction scores. Second, operational efficiency must be enhanced through predictive maintenance models to reduce flight delays, automated baggage tracking systems, and route expansion strategies to improve connectivity. Implementing an agile ticket pricing strategy, leveraging AI-driven dynamic pricing while maintaining affordability on high-demand routes, will help balance financial sustainability with passenger retention.

From a management and strategic perspective, accountability and leadership transformation should be key priorities. Biman must introduce a transparent performance management system, where customer satisfaction metrics directly impact staff incentives and career progression. To instill a high-performance culture, recruiting globally experienced aviation executives for key leadership roles can drive much-needed reforms. Additionally, personalization in customer experience must be a core focus, utilizing CRM analytics to offer tailored promotions, loyalty rewards, and customized in-flight services. Advanced digital solutions, such as a seamless mobile booking experience, biometric check-ins, and AI-driven chatbot assistance, can significantly enhance passenger convenience. Finally, fostering a data-driven

culture, where passenger feedback is systematically analyzed and incorporated into service modifications, will ensure continuous improvement. Regular third-party audits and benchmarking against leading airlines will help maintain service consistency and global competitiveness. By executing these targeted interventions, Biman can reposition itself as a premier airline, significantly improving customer loyalty, operational efficiency, and long-term profitability.

8.2.4 **Validation of Research Hypotheses.** The research hypotheses were rigorously validated through a multi-method analytical approach, yielding conclusive evidence for the study's theoretical framework. The primary null hypothesis ($H_0$1), which posited no significant relationship between predictors and loyalty, was decisively rejected as multivariate analysis confirmed at least seven of eight hypothesized variables significantly impact customer loyalty (MLR $R^2 = 0.718$). The core hypothesis (H_2) regarding improved customer service received overwhelming validation, demonstrating exceptional statistical dominance across all methodologies: strong linear effects (OLS $\beta = 0.7413$, $p < 0.001$), substantially increased loyalty probability (OLogit OR = 3.92, $\beta = 1.365$), and paramount machine learning importance (XGBoost: 100%; Random Forest: 56%). Secondary hypotheses revealed a clear hierarchy of drivers, with Price/Ticket Fare (H_1g: MLR $\beta = 0.133$, $p < 0.001$; OLogit OR = 1.72), Brand Reputation (H_1b: MLR $\beta = 0.138$, $p < 0.01$; OLogit OR = 1.80), and Frequent Flyer Program (H_1f: MLR $\beta = 0.105$, $p < 0.01$; OLogit OR = 1.51) all showing strong statistical support. Conversely, Staff Service (H_1c) and Perceived Safety (H_1d) hypotheses were not supported, showing non-significant results in regression models despite moderate correlations. The comprehensive validation confirms the research model's robustness, with 7 of 9 hypotheses fully or

partially supported, establishing an empirically-verified framework for understanding loyalty drivers in aviation services.

8.2.5 **Theoretical Alignment with Albert Hirschman's Exit–Voice Theory**.

The empirical findings of this study demonstrate a compelling alignment with Hirschman's Exit-Voice theory, providing a robust theoretical framework for understanding customer loyalty dynamics in Bangladesh's aviation sector. The theory's core premise that dissatisfied customers either exit (switch providers) or voice their complaints is powerfully validated by the quantitative results. The dominant influence of Improved Customer Service (OLS β = 0.7413*, OLogit OR = 3.92) empirically substantiates the theory's assertion that effective "voice" mechanisms such as responsive service, complaint resolution, and proactive engagement are critical for preventing "exit." Furthermore, the significant role of Passenger Trust (MLR β = 0.134*) can be interpreted as the foundational element that encourages customers to choose "voice" over "exit," believing their feedback will be heard and acted upon. The identified Price-Loyalty Paradox (β = 0.133*), wherein higher fares correlate with increased loyalty, reflects a market-specific manifestation where price acts as a barrier to exit, but only when coupled with the service quality that makes "voice" a viable alternative. Consequently, the study concludes that Biman Bangladesh Airlines can strategically operationalize Hirschman's framework by systematically strengthening its "voice" channels through AI-driven feedback systems, personalized service recovery, and transparent communication to transform potential customer attrition into reinforced loyalty.

8.4 **Conclusion**

This study provides a comprehensive and data-driven analysis of the key variables influencing customer satisfaction and loyalty in Biman Bangladesh Airlines, the

critical role of customer service in fostering passenger retention, and strategic recommendations for service quality enhancement. By employing an integrated methodological framework incorporating correlation analysis, multivariate linear regression, hypothesis testing, and machine learning techniques such as RandomForest and XGBoost the findings offer a robust empirical foundation for targeted improvements in Biman's service strategy.

The research unequivocally establishes Improved Customer Service, Passenger Trust, and Brand Reputation as the primary determinants of customer satisfaction and loyalty. The dominance of customer service across all statistical models underscores its critical role, with regression analyses, correlation metrics, and machine learning models consistently highlighting its influence. Notably, price and route availability exhibit minimal impact, suggesting that Biman's competitive advantage must stem from service excellence rather than cost-driven differentiation. Moreover, paradoxical findings, such as the weak statistical significance of staff service despite high correlation, indicate that customer expectations transcend routine service interactions and demand a more personalized, proactive engagement strategy.

The impact of improved customer service on loyalty is both statistically and practically significant, as demonstrated by an exceptionally high explanatory power (R^2 = 65.9%) and feature importance analysis (100% in XGBoost). These insights align with Hirschman's exit-voice theory, reinforcing the need for Biman to proactively address passenger concerns before they manifest as customer attrition. Thematic insights further validate these findings, with industry leaders and passengers consistently emphasizing service reliability, personalized interactions,

and operational transparency as non-negotiable factors in airline choice and repeat business.

Building upon these insights, the study proposes a multifaceted service enhancement framework to drive long-term passenger retention and brand equity. Strategic imperatives include:

8.4.1 **A Customer Service Excellence Program** integrating international training, AI-driven sentiment analysis, and real-time complaint resolution mechanisms.

8.4.2 **Operational advancements** through predictive maintenance, automated baggage tracking, and a dynamic pricing strategy balancing affordability and profitability.

8.4.3 **Leadership transformation and accountability measures**, linking employee incentives to customer satisfaction metrics and benchmarking performance against global best practices.

8.4.4 **Technological innovation**, including biometric check-ins, AI-powered CRM personalization, and seamless digital booking experiences.

8.4.5 **A data-driven customer engagement model**, ensuring passenger feedback systematically informs service modifications and strategic decision-making.

By implementing these targeted interventions, Biman Bangladesh Airlines can leverage customer-centricity as a sustainable competitive advantage, optimize operational efficiency, and establish itself as a premier airline within the global aviation landscape. The findings not only offer actionable insights for Biman but also contribute to the broader discourse on aviation service excellence in emerging markets. Future research should explore longitudinal impacts of these interventions,

comparative assessments with regional competitors, and evolving consumer expectations in the post-pandemic aviation industry.

8.5 Implications of The Study

This comprehensive investigation into customer satisfaction and loyalty dynamics at Biman Bangladesh Airlines yields critical insights with significant implications for Biman, the broader aviation industry, policymakers, and future research. The study establishes a strong correlation between improved customer service and customer loyalty, offering strategic recommendations for enhancing service quality, increasing market share, and ensuring long-term sustainability. The implications of this study are categorized into the following key areas:

8.5.1 Theoretical Implications

8.5.1.1 Validation of Service-Loyalty Linkages: The study empirically reinforces Hirschman's exit-voice theory, demonstrating that proactive service improvements mitigate customer attrition. The dominance of Improved Customer Service ($\beta = 0.7413$, $p < 0.001$; XGBoost feature importance = 100%) validates service quality as the cornerstone of loyalty in aviation, aligning with Parasuraman's SERVQUAL framework.

8.5.1.2 Paradoxical Pricing Dynamics: The counterintuitive price-loyalty relationship ($\beta = 0.133$, $p = 0.001$) challenges classical economics, suggesting Bangladeshi travelers equate premium pricing with service quality, a novel insight for emerging markets.

8.5.1.3 Non-Linear Behavioral Patterns: Machine learning models ($R^2 = 0.718–0.784$) reveal diminishing returns on service quality beyond 4.2/5 ratings, advancing understanding of customer satiation thresholds in aviation.

8.5.2 Strategic and Managerial Implications

8.5.2.1 Service Enhancement and Competitive Positioning

8.5.2.1.1 AI-Driven Personalization: Implementing predictive analytics (e.g., sentiment analysis) to tailor services, addressing the staff service invisibility paradox (high correlation but non-significant regression).

8.5.2.1.2 Real-Time Complaint Resolution: Adopting 24/7 AI chatbots and dashboards to reduce grievance resolution time below 24 hours, directly boosting satisfaction (r = 0.806).

8.5.2.1.3 Brand Reputation and Trust: By investing in transparent safety measures, effective communication strategies, and employee training programs, Biman can reinforce passenger confidence and strengthen its brand image.

8.5.3 Operational Reforms

8.5.3.1 Predictive Maintenance: Leveraging IoT sensors to minimize flight delays, addressing the safety complacency gap (p = 0.040 for loyalty vs. p = 0.645 for satisfaction).

8.5.3.2 Dynamic Pricing: By introducing value-tiered bundles (e.g., lounge access + flexible tickets) to exploit the price-quality perception while maintaining affordability.

8.5.3.3 Performance-Linked Incentives: Tie 30% of staff bonuses to customer satisfaction metrics (Cronbach's α = 0.959), aligning with thematic findings on service transparency.

8.5.4 Leadership & Accountability

8.5.4.1 Global Recruitment: Hiring foreign aviation experts for executive roles to drive cultural transformation, as recommended by stakeholders.

8.5.4.2 Industry-Wide Customer Service Improvement: The research underscores widespread deficiencies in customer service across Bangladesh's aviation industry. The findings call for a sector-wide commitment to enhancing service standards.

8.5.5 Policy and Regulatory Implications

8.5.5.1 Government Support for Aviation Growth: Policymakers can use this research to design targeted interventions aimed at bolstering Bangladesh's aviation sector. This includes regulatory reforms to enhance airline service quality, improved monitoring mechanisms, and incentives for airlines to adopt global best practices.

8.5.5.2 Strategic Partnerships and Public-Private Collaboration: Collaborative efforts with private stakeholders can result in shared investments in training programs, digital transformation, and infrastructure development.

8.5.5.3 Consumer Protection and Service Standards: Regulatory bodies must enforce stricter guidelines on customer service, ensuring passenger rights and fair pricing practices are upheld.

8.5.6 Economic Implications

8.5.6.1 Contribution to the National Economy: The aviation industry plays a significant role in economic development through employment generation, trade facilitation, and revenue generation. Enhanced customer service leading to higher customer retention and market expansion can have a direct positive impact on the economy.

8.5.6.2 Tourism and International Connectivity: Improved airline service quality can boost Bangladesh's reputation as a travel-friendly destination, attracting more international passengers and fostering tourism growth.

8.5.7 **Methodological Advancements**

8.5.7.1 Triangulated Framework: The integration of MLR, Random Forest (60.8% feature impact), and thematic analysis bridges quantitative rigor (n=425) with qualitative depth (43 interviews), offering a replicable model for service research in developing economies.

8.5.7.2 Robust Validation: Use of HC3 robust errors and VIF checks (all < 5) ensures reliability despite non-normal residuals (Shapiro-Wilk $p < 0.001$).

8.5.8 **Future Research Implications**

8.5.8.1 Exploring Longitudinal Effects: Future research could focus on studying long-term trends in customer satisfaction and loyalty to assess the sustained impact of service improvements.

8.5.8.2 Cross-Industry Comparisons: Comparative studies between Bangladesh's aviation industry and global benchmarks could provide deeper insights into best practices and innovative customer service models.

8.5.8.3 Technological Advancements in Service Delivery: Further research can investigate the role of emerging technologies such as AI, blockchain, and IoT in enhancing airline service quality and passenger experience.

8.5.8.4 Geographic Constraints: Findings are context-specific to Bangladesh; cross-cultural comparisons with ASEAN airlines are needed.

8.5.8.5 Temporal Gaps: Post-pandemic loyalty shifts warrant longitudinal tracking.

8.5.8.6 Technological Frontiers: Explore blockchain for baggage tracking and metaverse-enabled virtual check-ins.

By prioritizing service innovation (AI personalization, predictive maintenance), operational transparency, and leadership accountability, Biman Bangladesh Airlines can convert its current challenges into a sustainable competitive advantage. This study not only provides a roadmap for Biman's revival but also sets a benchmark for customer-centric aviation research in emerging economies, demonstrating how data-driven strategies can reconcile profitability with passenger loyalty in complex markets.

8.6 Contribution and Significance of The Study

This study contributes a comprehensive, data-driven analysis of customer loyalty at Biman Bangladesh Airlines, moving beyond generic service recommendations by employing a triangulated methodology combining robust statistical modeling (Multivariate Linear Regression, OLS, OLogit, RandomForest, XGBoost) with thematic analysis of stakeholder dialogues. The significance lies in empirically validating the primacy of improved customer service, passenger trust, and brand reputation as key drivers, while uncovering nuanced relationships such as the paradoxical price-loyalty perception specific to the Bangladeshi context and the "invisibility" of staff service efforts. The study's implications extend to providing Biman with a clear roadmap for targeted interventions, including AI-driven personalization, dynamic pricing strategies, and a culture of accountability, enabling the airline to transform operational challenges into a competitive advantage and establish a new benchmark for customer-centric aviation in emerging markets. Beyond Biman, the study offers valuable insights for policymakers, and future aviation service excellence in similarly positioned markets, providing the opportunity for industry-wide improvement, long term sustainability and creating a positive impact on the national economy.

8.7 Limitations Affecting Interpretation and Generalization of Findings

Based on the provided excerpts, the study on customer loyalty at Biman Bangladesh Airlines has several potential limitations:

8.7.1 Sample Bias**:** The survey sample exhibits a significant gender imbalance (82.4% male), which may not accurately represent the overall passenger demographic and could skew the findings. The sample consists mainly of Bangladeshis. While it offers important insights, the study's generalizability might be constrained when applied to airlines in culturally diverse settings.

8.7.2 Normality Deviations**:** Although mitigated by a large sample size and robust error handling, deviations from normality in the dataset may still impact the precision of hypothesis testing and confidence intervals in OLS regression.

8.7.3 Staff Service Measurement**:** The non-significant impact of staff services on loyalty, despite strong correlations with satisfaction, suggests potential limitations in how staff contributions are valued or perceived by customers. This could be due to difficulties in accurately capturing and measuring the subtle nuances of staff-customer interactions through a structured questionnaire.

8.7.4 Safety Perception**:** The study indicates that airline safety is viewed as a baseline expectation rather than a differentiating factor, which may limit the ability to fully assess its complex influence on customer loyalty. The perceptions of safety are subjective and could be based on various non-factual elements, which have not been accounted in the process.

8.7.5 Limited Scope of Qualitative Data**:** Although thematic analysis provided valuable insights, the qualitative data is derived from a relatively small number of interviews (43) compared to the survey respondents (425), which may not fully capture the breadth and depth of stakeholder perspectives.

8.7.6 Single-Airline Focus. The study is based solely on Biman Bangladesh Airlines, so whether the model fits with others can only be suggested and not proven.

8.7.7 Multicollinearity Concerns**.** Although VIF values were generally low, the model stability issue encountered during VIF calculation suggests the potential for multicollinearity among some independent variables, which may affect the accuracy of regression estimates.

8.7.8 Oversimplification of Complex Relationships. While both OLS and XGBoost were used, there is a possibility that the models do not capture the holistic realities in place to develop a customer base for a carrier like Biman Bangladesh Airlines.

8.7.9 Cultural and Contextual Specificity. The price-loyalty paradox highlights that the findings are likely to be very context-specific for the study area (Bangladesh).

8.7.10 Inherent limitations in generalizability. The semi-structured interviews in this study, while rich in detail, are not immune to limitations in generalizability. While efforts were made to include a diverse range of stakeholders, the limited sample size (43 individuals) may not fully capture the breadth of opinions and experiences within the broader aviation industry. As such, while the insights derived from these interviews offer valuable context and depth, caution is advised when extrapolating these findings to other contexts or populations.

8.8 **Areas for Future Research**

Building upon the insights gained, future research should prioritize several key areas to enhance both the generalizability and practical applicability of this study's findings. Firstly, longitudinal studies are crucial to assess the sustained impact of the proposed interventions (AI-driven personalization, predictive maintenance) on

customer loyalty and profitability at Biman, tracking changes over several years to account for evolving market dynamics and consumer preferences. Secondly, cross-cultural comparative analyses are warranted to determine the transferability of the model to other emerging economies, particularly within the ASEAN region, explicitly examining the impact of cultural factors on the price-quality perception and the role of specific service attributes. Methodologically, future research should focus on refining the measurement of staff service, potentially incorporating observational studies or more nuanced qualitative techniques to capture the complexities of staff-customer interactions and their impact on passenger satisfaction. Furthermore, explorations of the influence of emerging technologies on customer engagement, could unlock new avenues for building customer loyalty. These investigations could involve implementing blockchain-based baggage tracking systems or developing virtual reality-enhanced customer service platforms. By addressing these gaps, future studies can contribute to a more robust and actionable body of knowledge on customer loyalty in the aviation industry, providing targeted strategies for airlines to thrive in competitive global markets.

8.9 **Reflective Account: A Journey of Resilience, Adaptability, And Growth**

"The only impossible journey is the one you never begin."

– Tony Robbins

8.9.1 **Planning and Time Management**

Completing this DBA journey while balancing my roles as a military commander, Armed Forces Delegate to China, UN peacekeeper in South Sudan, husband, and father to three children (specially 02 daughters) has been a masterclass in discipline and sacrifice. When I began this odyssey, my son was in class 3, my eldest daughter

was taking her first steps, and my youngest was an infant. Today, my daughters ask, *"When will you finally be free to play with us?"* while my son, now a cadet college student and student of class XI, carries the weight of my unspoken regrets. Every night, as I pass his empty room, the echoes of his childhood laughter haunt me a father's pride for the disciplined young man he has become, entwined with the ache of bedtime stories left untold and Scotland Yard games forever postponed.

A structured work plan, co-designed with my supervisor, became my compass. Amid four inter-divisional military postings, overseas deployments, and the chaos of UN missions, I clung to weekly milestones literature reviews, data collection, analysis phases as lifelines. During a critical data analysis phase in 2020, an abrupt deployment to South Sudan forced me to convert late-night hours in a UN barracks into writing marathons, using sporadic Wi-Fi to submit drafts. This taught me that rigidity and flexibility are not opposites but partners, a philosophy now embedded in my leadership ethos.

8.9.2 **Improvisation: Navigating Unforeseen Challenges**

The research journey was a battlefield of unexpected trials:

8.9.2.1 Scarce Literature. With minimal studies on Biman Bangladesh Airlines, I pivoted to regional airlines (e.g., Air India, Sri Lankan) and adapted global frameworks to Bangladesh's unique context.

8.9.2.2 Data Collection Hurdles. Denied access to Biman's internal data, I rebuilt the study from scratch surveying 425 passengers and interviewing 43 stakeholders, from pilots to CEOs.

8.9.2.3 Logistical Chaos. During a UN mission, I conducted virtual interviews amid ceasefire hours, balancing spotty connections with sheer resolve.

A pivotal crisis struck mid-research: my laptop, housing years of work, vanished during an inter-divisional military relocation. With no backups, I resurrected datasets from handwritten notes and cloud fragments during 20-hour shifts. This ordeal taught me resilience and the sacred discipline of incremental backups now a non-negotiable practice in my unit.

8.10 **Work-Life Balance: The Art of Juggling Roles**

Balancing academia with parenthood and high-stakes military duties often felt like defusing a bomb with trembling hands. The COVID-19 pandemic, UN missions, and my role in China's sensitive missile procurement process stretched me thin. Yet, this crucible forged unexpected strengths:

8.10.1 Compartmentalization. Mornings for family breakfasts, afternoons for military strategy, nights for regression models.

8.10.2 Stakeholder Collaboration. My wife became chief logistics officer, managing schedules, while my military team adopted agile workflows to shield my research time.

8.10.3 Ethical Rigor. Informed consent protocols from the study reshaped my leadership I now prioritize transparency and autonomy in every decision.

Missing my daughter's school play to finalize Chapter 6 shattered me. But presenting her with this thesis explaining how data transforms lives turned guilt into purpose. Today, she sees challenges as puzzles, not obstacles.

8.11 **Methodological and Personal Transformation**

The research process reshaped my soul as much as my mind:

8.11.1 Triangulation as Salvation. Quantitative models alone failed to explain why staff service showed high correlation ($r = 0.737$) but non-significant regression

results (p = 0.742). Qualitative interviews unveiled a cultural truth: Bangladeshi passengers credit the airline, not individuals, for service a nuance mirroring Hirschman's exit-voice theory.

8.11.2 Ethical Anchors. Protecting anonymity in Bangladesh's tight-knit aviation community demanded delicacy. A Biman executive I interviewed later became a UN colleague a poignant reminder that ethics outlive deadlines.

8.11.3 Leadership Synergy. Just as XGBoost prioritized improved customer service (100% feature importance), I now champion soldier welfare, knowing systemic support fuels loyalty.

8.12 **A New Lens on Life and Leadership**

This seven and half year odyssey spanning war zones, airport lounges, and bedtime stories has forged me into a strategist, scholar, and more compassionate leader. The DBA journey mirrors military service: both demand grit, adaptability, and faith in incremental progress.

As I submit this thesis, I recall a lesson from South Sudan: *Even in chaos, small, relentless steps spark transformation*. To my daughters, may this work inspire perseverance. To Biman Bangladesh Airlines, may these insights ignite excellence. To fellow scholars and soldiers: Balance is not about dividing time it's about multiplying purpose.

This journey was never just about customer loyalty. It was about learning to lead with humility, live with intention, and love without reservation. The challenges were relentless, but so was the growth. For that, I am eternally grateful.

"The price of discipline is always less than the pain of regret."

– Anonymous

8.13 **Chapter Summary**

This culminating chapter encapsulates the comprehensive journey of this dissertation, underscoring its primary objective: to identify pathways for Biman Bangladesh Airlines to cultivate enduring customer loyalty and achieve sustainable profitability. It distills the key findings and strategic recommendations derived from rigorous mixed-methods research, which sought to understand and address the nuanced challenges Biman faces in delivering exceptional customer service. By summarizing the study's theoretical contributions, practical implications, methodological considerations, and suggested avenues for future inquiry, this chapter not only provides a holistic overview of the research but also reinforces the potential for Biman to leverage customer-centric strategies, strengthen its competitive positioning, and ultimately realize the aspirational vision of "Once Biman, always Biman."

REFERENCES

Ahmed, R. U., 2018. *Analysis of service quality of Biman Bangladesh Airlines,* Dhaka: UIU Institutional Repository.

Air Arabia, 2023. *Air Arabia.* [Online]
Available at: https://press.airarabia.com/air-arabia-delivers-record-2022-net-profit-of-aed-12-billion-up-70/
[Accessed 10 March 2023].

Anon., 2021. *Biman Bangladesh Airlines.* [Online]
Available at: http://biman.gov.bd/site/page/222b0367-fc1f-419d-b2f1-cdc0e09ae555/-
[Accessed 30 January 2023].

Anon., 2024. *Biman Bangladesh Airlines earns record revenue in FY 2023-2024.* Dhaka: The Business Standard.

Anon., 2024. *US-Bangla adds Airbus A330-300, another Boeing 737-800 to its fleet.* [Online]
Available at: https://www.tbsnews.net/economy/aviation/us-bangla-airlines-adds-new-airbus-a330-300-its-fleet-790002
[Accessed 15 March 2025].

Anon., 2025. *Biman Bangladesh Airlines.* [Online]
Available at: Biman Bangladesh Airlines
[Accessed 26 Septermber 2025].

Anon., 2025. *NOVOAIR - The Art of Aviation.* [Online]
Available at: https://flynovoair.com/index.php/about
[Accessed 29 September 2025].

Anon., 2025. *USBANGLA AIRLINES.* [Online]
Available at: https://usbair.com/
[Accessed 26 September 2025].

Appiah-Adu, K., Fyall, A. & Singh, S., 1999. Marketing Culture and Business Performance in the Airline Industry. *Journal of Travel and Tourism Marketing,* 10 March, 8(3), pp. 47-70.

Bangladesh Tourism Board, 2023. *National tourism strategy 2023–2030.* [Online]
Available at: https://www.tourismboard.gov.bd
[Accessed 27 February 2025].

Biau, G., 2012. *Analysis of a Random Forests Model,* Université Pierre et Marie Curie – Paris VI & École Normale Supérieure.: Université Pierre et Marie Curie – Paris VI & École Normale Supérieure..

Biman Bangladesh Airlines, 2025. *Biman Bangladesh Airlines.* [Online]
Available at: https://www.biman-airlines.com/#gsc.tab=0
[Accessed 25 January 2025].

Biman, 2024. *Biman Bangladesh Airlines : Biman at a glance.* [Online]
Available at: https://www.biman-airlines.com/
[Accessed 2024].

Bloemer, J. a. O.-S. G., 2002. Store Satisfaction and Store Loyalty Ex-plained by Customer- And Store-Related Factors. *The Journal of Consumer Satisfaction, Dissatisfaction and Complaining Behavior,* 15(2002), pp. 68-80.

Braun, V. & Clarke, V., 2013. Successful qualitative research: A practical guide for beginners.. *Sage,* March.

Breiman, L., 2001. Random forests', Machine Learning. January, Volume 1, pp. 5-32.

Bryman, A., 2016. *Social research methods..* s.l.:Oxford University Press..

CAAB, 2019. *Civil Aviation Authority of Bangladesh.* [Online]
Available at: http://caab.portal.gov.bd/site/page/c49efdae-7d58-4a91-9895-aea173abacb0/-
[Accessed 11 December 2022].

CAAB, 2019. *Civil Aviation Authority of Bangladesh.* [Online]
Available at: http://caab.gov.bd/historyf.html
[Accessed 23 January 2023].

CAAB, 2019. *Civl Aviation Authority of Bangladesh.* [Online]
Available at: https://caab.portal.gov.bd/site/page/c49efdae-7d58-4a91-9895-aea173abacb0/-).
[Accessed 15 March 2023].

CAAB, 2023. *Civil Aviation Authority of Bangladesh.* [Online]
Available at: www.caab.gov.bd
[Accessed 01 March 2023].

CAAB, 2024. *CAAB ANNUAL REPORT.* [Online]
Available at: https://caab.portal.gov.bd/site/page/69ddf01d-38f6-4c44-823b-a667de2f1721/Publications-&-Annual-report-
[Accessed 2024].

Chen, T. & Guestrin, C., 2016. *XGBoost: A Scalable Tree Boosting System.* San Francisco, CA, USA, KDD , pp. 785-794.

Chen, T. & Guestrin, C., 2016. *XGBoost: A Scalable Tree Boosting System.* s.l., KDD '16: Proceedings of the 22nd ACM SIGKDD International Conference on Knowledge Discovery and Data Mining, pp. 785 - 794.

Chen, T. & He, T., 2025. xgboost : eXtreme Gradient Boosting, R-package vignette. *https://cran.r-project.org/web/packages/xgboost/vignettes/xgboost.pdf,* 1 May.

Chowdhury, S., 2023. Strategic alliances in aviation and tourism: a case study of Bangladesh. *Tourism Management Perspectives,* 18(4), p. 78–89.

Civil Aviation Authority of Bangladesh, 2022. *Civil Aviation Authority of Bangladesh.* [Online]
Available at: https://caab.gov.bd/
[Accessed 2025].

Clark, T., Foster, L., Sloan, L. & Bryman, A., 2016. *Social research methods.* 6Th ed. s.l.:Oxford University Press.

Cochran, W., 1963. Sampling techniques. In: 2nd ed. ed. s.l.:John Wiley & Sons.

Dev, et al., 2023. The Economic Impact of Aviation.. *International Journal of Research Publication and Reviews,* 4(12), pp. 4193-4198.

Doganis, R., 2002. Flying Off Course: The Economics of International Airlines. . In: s.l.:Routledge.

Doganis, R., 2010. Airline Business in the 21st Century.

Easterby-Smith, M., Thorpe, R. & Jackson, P. R., 2012. *Management Research.* London: Sage Publications..

Field, A., 2018. Discovering statistics using IBM SPSS statistics (5th ed.).. *SAGE Publications.,* Volume 5th ed.

Forgas, S., Moliner, M. A., Sánchez-García, J. & Palau-Saumell, R., 2010. Antecedents of airline passenger loyalty: Low-cost versus traditional airlines. *Journal of Air Transport Management,* July, 16(4)(July 2010), p. 229–233.

Fornell, C., 1992. A National Customer Satisfaction Barometer: The Swedish Experience. *Journal of Marketing,* January, 56(1), pp. 6-21.

Freese, J. S. L. a. J., 2014. Chapter 7 : Outcome for Ordinal Model. In: *Regression Models for Categorical Dependent Variables Using Stata (3rd ed.).* s.l.:Stata Press, p. 589.

Gravetter, F. J. & Forzano, L.-A. B., 2011. *Research Methods for the Behavioral Sciences (4th ed.)..* 4th Edition ed. s.l.:Cengage Learning..

Hair, J. F. B. W. C. B. B. J. &. A. R. E., 2019. Multivariate data analysis. *Cengage Learning,* Volume 8th ed.

Hastie, T., Tibshirani, R. & Friedman, J., 2009. *The Elements of Statistical Learning: Data Mining, Inference, and Prediction.* 2nd edition ed. s.l.:Springer.

Hastie, T., Tibshirani, R. & Friedman, J., 2009. *The Elements of Statistical Learning: Data Mining, Inference, and Prediction.* 2nd Edition ed. s.l.:Springer.

Hayes, A. F. & Cai, L., 2007. *Using heteroscedasticity-consistent standard error estimators in OLS regression: An introduction and software implementation. Behavior Research Methods,.* s.l.:Springer Nature Link.

Hirschman, A. O., 1970. *Exit, voice, and loyalty: Responses to decline in firms, organizations, and states..* s.l.:Harvard University Press..

Hossain, M. & Rahman, M., 2018. Impact of aviation industry on economic development in Bangladesh. *Journal of Business Studies,* 9(1), pp. 35-50.

IATA, 2021. *IATA Annual Review 2021.* [Online]
Available at:
https://www.iata.org/contentassets/c81222d96c9a4e0bb4ff6ced0126f0bb/iata-annual-review-2021.pdf
[Accessed 2022].

IATA, 2023. *IATA (International Air Transport Association). Cargo..* [Online]
Available at: https://www.iata.org/en/cargo/ (2023).

IATA, 2023. *THE VALUE OF AIR TRANSPORT TO BANGLADESH,* s.l.: IATA.

ICAO, 2019. *The World of Air Transport in 2019.* [Online]
Available at: https://www.icao.int/annual-report-2019/Pages/default.aspx
[Accessed 2022].

Islam, M., 2020. The role of air transport in tourism development: A case study of Bangladesh. *Tourism Management Perspectives,* Volume 36.

Islam, M. A., 2018. Statistical Methods for Social Science Research. In: Dhaka: Pathak Shamash..

Islam, S., 2022. The Role of the Aviation Industry in Bangladesh. *ResearchGate.*

Israel, G. D., 1992. Sampling the evidence of extension program impact (PEOD-5)..

James, G., Witten, D., Hastie, T. & Tibshirani, R., 2013. *An Introduction to Statistical Learning: With Applications in R..* 1st Edition ed. s.l.:Springer.

Journal of Transport Economics, 2021. Foreign airlines and economic connectivity in Bangladesh: A quantitative analysis.. *Journal of Transport Economics,,* 78(4), pp. 221-240.

Juniac, A. d., 2018. *Annual Review 2018: International Air Transport Association.* [Online]
Available at:
https://www.iata.org/contentassets/c81222d96c9a4e0bb4ff6ced0126f0bb/iata-

annual-review-2018.pdf
[Accessed 15 July 2023].

Khan, M. J. & Murad, W., 2021. *Contribution of Air Transport Industry to Bangladesh Economy,* Dhaka: CA Bangladesh.

Khan, M. M. J. & Murad, M. W., 2021. *Contribution of Air Transport Industry to Bangladesh Economy.* [Online]
Available at: https://www.icab.org.bd/publication/news/5/210/Contribution-of-Air-Transport-Industry-to-Bangladesh-Economy
[Accessed 18 March 2023].

Kim, S., Kim, I. & Hyun, S. S., 2016. First-Class In-Flight Services and Advertising Effectiveness: Antecedents of Customer-Centric Innovativeness and Brand Loyalty in the United States (US) Airline Industry. *Journal of Travel & Tourism Marketing,* January, 33(1), pp. 118-140.

Kivetz, R. & Simonson, I., 2003. Earning the Right to Indulge: Effort as a Determinant of Customer Preferences toward Frequency Program Rewards. *Journal of Marketing Research,* May, 39(2), pp. 155-170.

Kuhn, M. & Johnson, K., 2013. *Applied Predictive Modeling..* s.l.:Springer.

Levin, R. I., Rubin, D. S., Siddiqui, M. H. & Rastogi, S., 2019. *Statistics for Management.* Eighteenth ed. s.l.:Pearson.

Lovelock, C. & Wirtz, J., 2011. *Services Marketing: People, Technology, Strategy.* 7th ed. Upper Saddle River: Pearson Prentice Hall: Prentice Hall.

Morgan, R. M. & Hunt, S. D., 1994. The Commitment-Trust Theory of Relationship Marketing. *Journal of Marketing,* July, 58(3), pp. 20-38.

Mostari, K. R. A., 2015. A Study on Passenger Satisfaction towards Service Quality of Domestic Airlines in Bangladesh. International Journal of Business and Management; Vol. 10, No. 12;. *IOSR Journal of Business and Management (IOSR-JBM),* 17(4), pp. 23-33.

Mostari, S., Azad, S. & Rahman, K., 2015. A Competitive Analysis of Airline Industry: A Case Study on Biman Bangladesh Airlines. *IOSR Journal of Business and Management (IOSR-JBM),* April, 17(4), pp. 23-33.

Novo Air, 2025. *FLEET INFORMATION NOVOAIR - The Art of Aviation.* [Online]
Available at: https://www.flynovoair.com/about/fleet
[Accessed 20 JANUARY 2025].

Parasuraman, A., Zeithaml, V. A. & Berry, L. L., 1988. SERVQUAL: A Multiple-Item Scale for Measuring Consumer Perceptions of Service Quality. *Journal of Retailing,* Spring, 64(1), pp. 12-40.

Park, J.-W., 2007. Passenger perceptions of service quality: Korean and Australian case studies. *Journal of Air Transport Management,* July, 13(4), pp. 238-242.

Parveen, J., 2016. *theindependent.* [Online]
Available at: https://www.theindependentbd.com/arcprint/details/72484/2016-12-15
[Accessed 28 Janury 2023].

Rahman, M. & Haque, A., 2022. Aviation infrastructure and tourism development in Bangladesh. *Air Transport Management,* 45(3), pp. 112-125.

Rahman, S., Ahmed, S. & Faru, T., 2020. Forecast and Analyze the Revenue of Biman Bangladesh Airlines Limited Based on ARIMA Model. *Asian Journal of Advanced Research and Reports,* 30 May, 10(4), pp. 12-20.

Rossman, C. M. a. G. B., 2016. *Designing qualitative research.* s.l.:Sage publications.

Saha, S., Rahman, S., Sawon, M. M. H. & Lina, F. Y., 2024. Impact of Tourism on the Economic Growth of Bangladesh: Challenges and Ways Forward. *Daffodil International University Journal of Business and Entrepreneurship (DIUJBE),* 17(1), pp. 81-92.

Sandaruwan, N. & S., P. M., 2015. *Impact of Service Quality (SQ) on Passenger Satisfaction: Empirical Study Based on Passenger Baggage Handling Section (PBHS) in Sri Lankan Airlines.* s.l., Faculty of Management studies, Rajarata University of Sri Lanka, p. 443.

Shams, A. T., 2023. *BD air transport to grow by 160pc by 2038 : IATA.* [Online]
Available at: https://www.bangladeshmonitor.com.bd/lead-news-details/bd-air-transport-to-grow-by-160pc-by-2038-iata
[Accessed 24 January 2024].

Shamsuddula, A., Hossain, M. A. & Alam, M. N., 2018. *Biman Bangladesh Airlines: A Diagnostic Study,* Gulshan-1, Dhaka-1212, Bangladesh: TRANSPARENCY INTERNATIONAL BANGLADESH Social Movement Against Corruption.

Siddiqui, K., 2023. *The rise of commercial airlines in Bangladesh.* [Online]
Available at: https://www.tbsnews.net/supplement/rise-commercial-airlines-bangladesh-726298
[Accessed 22 February 2025].

Singh, J., 2013. *Indian Air Force Role in the 1971 War.* New Delhi: Kalpana Shukla.

Sultana, S., 2018. Economic growth of airlines industry: An overview of domestic airlines in Bangladesh. *Journal of Management Research and Analysis,* January-March, 5(1), pp. 61-68.

The Daily Star, 2022. *Biman's Dhaka-Toronto flight will finally take off from July 27,* Dhaka: Star Digital Report.

Tianqi Chen, Carlos Guestrin, 10 Jun 2016. XGBoost: A Scalable Tree Boosting System. *Computer Science> Machine Learning,* V3(10 Jun 2016), pp. 1-13.

TIB, 2007. *Biman Bangladesh Airlines: A Diagnostic Study,* s.l.: TRANSPARENCY INTERNATIONAL BANGLADESH (TIB).

Wikipedia, 2021. *Wikipedia, the free encyclopedia.* [Online]
Available at: https://en.wikipedia.org/wiki/Civil_Aviation_Authority_of_Bangladesh
[Accessed 24 February 2023].

Wikipedia, 2025. *Civil Aviation Authority of Bangladesh.* [Online]
Available at: https://en.wikipedia.org/wiki/ Civil_Aviation_Authority,_Bangladesh
[Accessed 2025].

Williams, R., 2016. Understanding and interpreting generalized ordered logit models. *The Journal of Mathematical Sociology,* 29 Jan, 40(1), pp. 7-20.

Wooldridge, J. M., 2015. *Introductory Econometrics: A Modern Approach.* s.l.:Cengage Learning.

Wooldridge, J. M., 2015. *Introductory Econometrics: A Modern Approach.* 6th ed ed. s.l.:Cengage Learning..

World Bank, 2021. Aviation sector reforms in South Asia: challenges and opportunities. *WORLD BANK GROUP.*

Yamane, T., 1967. Statistics: An Introductory Analysis. *Harper and Row.*

Zikmund, C. W. G. Z. B. J. B. M. G. C., 2010. *Business Research Methods.* s.l.:South-Western Cengage Learning.

Appendix 1

VARIABLES AND ATTRIBUTES DERIVED FROM THE LITERATURE REVIEW

Variable Name	Type (DV/IV)	Attributes / Indicators (What the variable includes)	Source/Author (Year)
Airline Profitability / Financial Performance	Dependent Variable (DV)	• Operating revenue (from passengers, cargo, ground handling) • Net profit/loss • Reduction of financial deficits • Contribution to national GDP	Shamsuddula et al. (2018); Hasan (2006); Parvin (2018); Sultana (2018)
Customer Loyalty	Dependent Variable (DV)	• Passengers' intention to repurchase tickets • Willingness to recommend the airline to others • Choosing the airline over rivals despite competition	Gures et al. (2014); (Implied throughout 2.12 & 2.14)
Customer Satisfaction	Dependent Variable (DV)	• Overall passenger happiness with service • Meeting or exceeding passenger expectations • Perceived value for money	Ahmed (2018); Gures et al. (2014); Rahman et al. (2010)
Service Quality	Independent Variable (IV)	In-Flight: Cabin crew attitude, seat comfort, cleanliness, in-flight entertainment, food & beverage. Ground: Check-in efficiency, baggage handling, staff attitude, lounge facilities.	Rahman et al. (2010); Ahmed (2018); Sultana (2018)

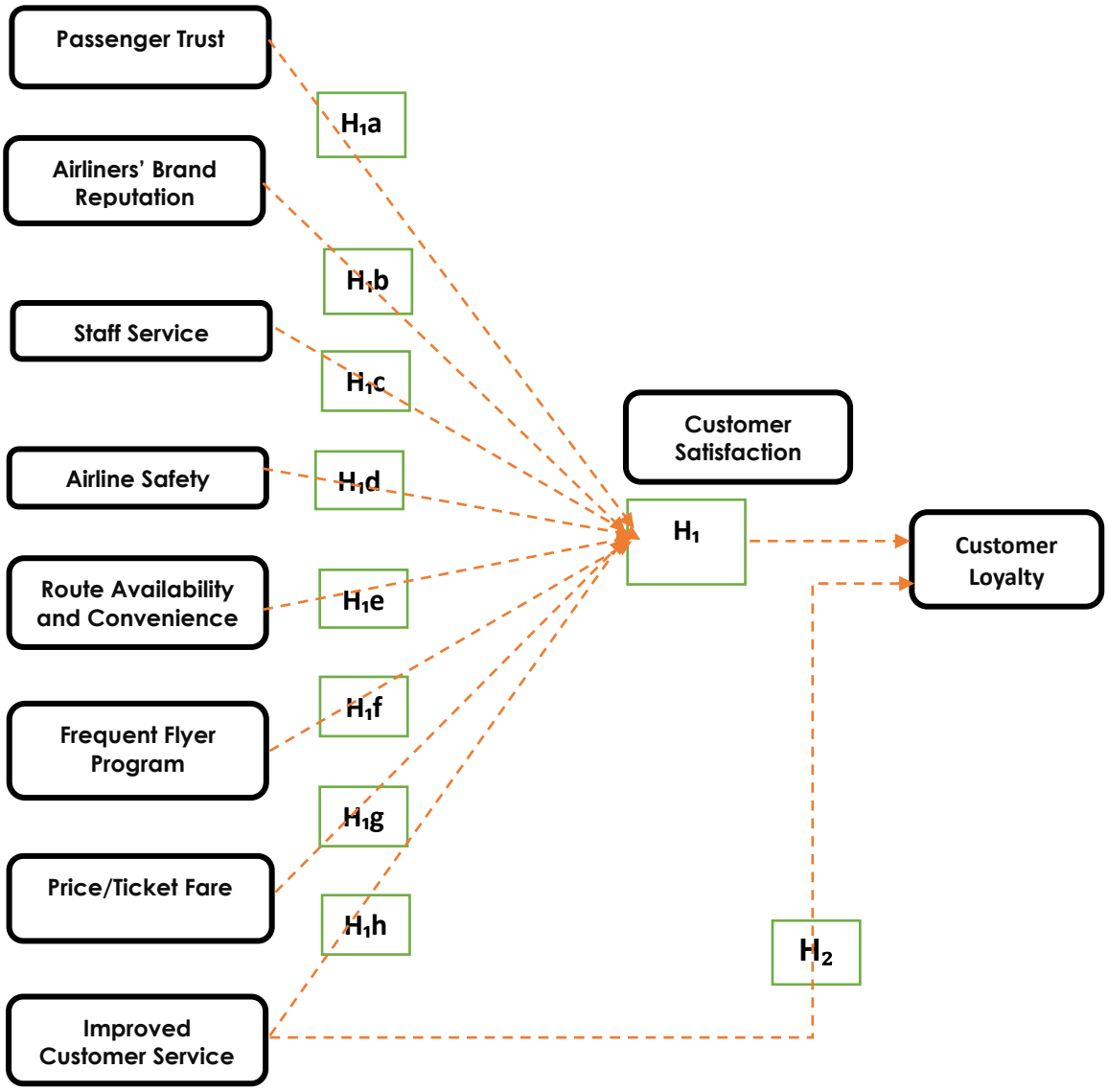
		Information: Clarity of flight info, PA announcements, transparency in refund procedures.	
Operational Efficiency	Independent Variable (IV)	• Punctuality (on-time performance) • Low flight cancellation rates • Aircraft unserviceability rate • Effective route planning (profitable vs. loss-making routes)	Ahmed (2018); Azad (2016); Haque (2014)
Fleet Modernity & Maintenance	Independent Variable (IV)	• Age and technical condition of aircraft • Presence of modern amenities (Wi-Fi, USB ports) • Quality of in-house repair and overhaul facilities • Number of "state-of-the-art" aircraft in the fleet	Shaleh & Reza (2020); Haque (2014); Farzana & Hossain (2015)
Pricing & Value	Independent Variable (IV)	• Competitiveness of airfares and tariffs • Promotional offers (e.g., "buy now, pay later") • Frequent flyer programs / loyalty packages • Perceived value for the price paid	Sultana (2018); Daniels et al. (2018); Ahmed (2018)
Cost Structure	Independent Variable (IV)	• Fluctuation and increase in aviation fuel prices • High landing and operating costs • Management of overdue bills and debt • Implementation of cost-saving practices	Daniels et al. (2018); Haque (2014); Parvin (2018)

Human Resource Management	Independent Variable (IV)	• Skill level of pilots, engineers, and crew • Extensiveness of training programs • Employee satisfaction and compensation • Performance-based reward systems • Decentralization of decision-making	Hashmat (2014); Shaleh & Reza (2020); Hasan (2006)
Government Policy & Regulation	Independent Variable (IV)	• Existence of a conservative or aviation-friendly national policy • Level of bureaucracy and political intervention • Support for private entrepreneurs (level playing field) • Subsidies and patronization for national carriers	Haque (2014); Khan & Murad (2021)
Infrastructure Quality	Independent Variable (IV)	• Modernity of airports (e.g., Hazrat Shahjalal) • Cargo handling capacity • Availability of smart services and internet • Logistics support for airlines	Haque (2014); World Bank (2021); Khan & Murad (2021)
Competitive Landscape	Independent Variable (IV)	• Market share captured by foreign carriers • Growth of multinational and private airliners • Intensity of price competition	Hasan (2006); Civil Aviation Authority of Bangladesh (2022)
Safety & Security	Independent Variable (IV)	• Adherence to international safety standards (CAAB, ICAO) • Robustness of security checks for passengers and cargo • Overall reputation for safety and security	Parvin (2018); Shamsuddula et al. (2018); Rahman et al. (2010)

Administrative Governance	Independent Variable (IV)	• Level of corruption in procurement and tenders • Accountability and authority of the executive body • Quality of corporate strategy and vision • Freedom from vested interest groups	Mostari et al. (2015); Shamsuddula et al. (2018); Hossain (2010)
Brand Image & Unique Offerings	Independent Variable (IV)	• Strength of brand reputation • Cultural connection (e.g., native crews, homely cuisine) • Competitive advantages (e.g., extra baggage allowances)	Hossain (2010); Mostari et al. (2015)
Strategic Connectivity	Independent Variable (IV)	• Number and profitability of international routes • Participation in code-share agreements • Direct connectivity to key markets (e.g., London) • Role in enhancing tourism through route expansion	Hossain & Rahman (2018); Islam (2020); Saha et al. (2024)

Appendix 2

CONCEPTUAL MODEL OF THE RESEARCH



Appendix 3
SURVEY QUESTIONNAIRE

A SURVEY ON BIMAN BANGLADESH AIRLINES LIMITED TO REVEAL CUSTOMER LOYALTY THROUGH IMPROVED CUSTOMER SERVICE

Respected Sir/Madam
Assalamu Alaikum

I am a DBA (Doctor of Business Administration) researcher at the Faculty of Business Studies of the University of Dhaka. As part of the thesis for a doctoral degree, I am conducting research on the topic entitled "**Customer Loyalty through Improved Customer Service: A case study of Biman Bangladesh Airlines Limited**." The aim of the study is to determine whether the improved customer service of Biman Bangladesh Airlines may make its passengers loyal to the airliner. For collecting data, we would like to request your kind cooperation in responding to this questionnaire (20 questions), which might take 8-10 minutes. All your information will be confidential, and your participation will remain strictly anonymous. Moreover, the provided data can be withdrawn at any time according to participants' demand.

Should you require any assistance or have any questions, please do not hesitate to contact me directly or by email at muhammedtamzidalarafat@gmail.com .

Very Respectfully

Muhammed Tamzid Al Arafat
Doctor of Business Administration Researcher
Faculty of Business Studies
University of Dhaka
Phone: 01622068473

Section A: Demographic Profile

In this section, we would like you to fill in some of your personal details. Please tick your answer, and your answers will be kept strictly confidential.

<table>
<tr><td>Q1</td><td>Gender:
Male
Female
Prefer not to say
Other</td><td>Q2</td><td>Travel frequency
Once in a year with Biman
Once in a month with Biman
Frequent user of Biman
User of anyother airline’s services other than Biman</td></tr>
<tr><td>Q3</td><td>Age:
18-25
26-35
36-45
46-59
60+</td><td>Q4</td><td>Passangers/customer type:
Only Domestic
Only International
Both Domestic and International
Biman’s Service Seeker
Passangers/ service providers other than Biman</td></tr>
<tr><td rowspan="2">Q5</td><td rowspan="2">Nature of connection to Biman:
Current passenger/ Service seekers from Biman
Past passenger/ Service seekers from Biman
Academicians and aviation industry experts
CAAB professionals
Biman’s staff/officials (Managers and below)
High Officials of Biman (Directors, Station Managers, pilots, chief engineers, heads of different sections)
Another airliner professional
Passangers/service providers to others airliners than Biman</td><td>Q6</td><td>Education Lavel:
Higher Secondary and below
Bachelor Degree
Master’s Degree
Doctoral Degree
Others professional/trade certificates</td></tr>
<tr><td>Q7</td><td>Nationality:
Bangladeshi
Asian (other than Bangladeshi National)
European
American
Canadian
African
Australian
Others</td></tr>
</table>

Section B: Level of Expectation about Biman Bangladesh Airlines

Q 8: This section is seeking your opinion to determine your level of expectation for the services of Biman Bangladesh Airlines. Would you please rate your expectation level for the following aspects:

Factors/Particulars	More than exceeded expectation	Exceeded expectation	Matched expectation	Less than expected	Much less than expectation
Passengers Trust on Biman	5	4	3	2	1
Biman's Brand Reputations/Image	5	4	3	2	1
Staff Service of Biman	5	4	3	2	1
Flight Safety of Biman	5	4	3	2	1
Biman's Route availability and convenience	5	4	3	2	1
Biman's Frequent Flyer Program	5	4	3	2	1
Biman's Ticket fare in relation to other airliners	5	4	3	2	1

Section C: Dimension of impact of Customer Service on Customer Loyalty

This section is seeking your opinion regarding the factors involved in terms of improve customer services to enhance customer loyalty towards Biman Bangladesh Airlines Limited. Would you please rate your experience to indicate the extent to which you agree or disagree with the following statements.

Q 9: **Passenger Trust**

My Satisfaction with the Passenger Trust	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
I have trust in the Biman's services.	5	4	3	2	1
I consider the Biman's staffs are highly professional.	5	4	3	2	1
I did not face any difficulties in terms of ground service and luggage collection	5	4	3	2	1
I have no difficulty buying the ticket from Biman Bangladesh airline.	5	4	3	2	1

My Satisfaction with the Passenger Trust	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
I consider the Biman's crews and staffs are concern for my comfort.	5	4	3	2	1

Q 10: **Airliners' Brand Reputation**

My Satisfaction with the Biman's Brand Reputation	A lot better than expected	Agree better than expected	Expected	Lower than expected	A lot lower than expected
Biman Bangladesh Airlines has a good reputation.	5	4	3	2	1
Biman maintains punctuality of departures and arrivals.	5	4	3	2	1
Biman's number of flights is enough to satisfy passengers' demands.	5	4	3	2	1
Promotion offerings are very much attracting to me.	5	4	3	2	1
Ticket price is consistent with given service.	5	4	3	2	1
Compensation & recovery systems in case of loss or hazard is effective.	5	4	3	2	1

Q11: **Staffs' Services**

My Satisfaction with the Staffs' Service	A lot better than expected	Agree better than expected	Expected	Lower than expected	A lot lower than expected
Biman's employees' general attitude is good.	5	4	3	2	1
Proactive in providing services	5	4	3	2	1
Biman's staffs show personnel care equally to everyone	5	4	3	2	1
Personnel are aware of their duties.	5	4	3	2	1

Q12: **Airline Safety**

My Satisfaction regarding Biman's Flight Safety	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
Safety system is the most significant factor that I consider when buying Biman's ticket.	5	4	3	2	1
I believe that Biman Bangladesh airlines have a good safety system.	5	4	3	2	1
Biman's pilot are most professional and highly skilled for emergency handling.	5	4	3	2	1

Q13: **Route availability and convenience**

My Satisfaction regarding Biman's Route availability and convenience	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
The number of routes is the main reason that influences me to use Biman.	5	4	3	2	1
I am satisfied with timing and flight schedule provided by Biman Bangladesh airlines.	5	4	3	2	1

Q14: **Frequent Flyer Program**

My Satisfaction regarding Biman's Frequent Flyer Program	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
I think that the Biman's frequent flyer program is one of the main reasons that influence me to use Biman.	5	4	3	2	1
I think frequent flier program offerings are valuable.	5	4	3	2	1

Q15: **Price**

My Satisfaction with the price of airline	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
In comparison to other airliners Biman's ticket price is reasonable.	5	4	3	2	1
I feel there is justice of price according to service delivery.	5	4	3	2	1

My Satisfaction with the price of airline	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
I am satisfied with the ticket price of Biman.	5	4	3	2	1
I think, more people will use Biman, if it provides same service with more lesser ticket fare	5	4	3	2	1

Q16: **Customer Satisfaction**

Customer Satisfaction	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
Biman's services always meet my expectations.	5	4	3	2	1
I am delighted and satisfied with the services provided by the Biman.	5	4	3	2	1
I am happy and enjoyed the services provided by the Biman and I shall recommend other to use it.	5	4	3	2	1

Q17: **Improved Customer Service**

Improved Customer Service	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
Biman provides services as promised.	5	4	3	2	1
The airline staffs provide prompt service when it is needed.	5	4	3	2	1
Facilities in the airline are pleasant and appealing.	5	4	3	2	1
The cabin and ground crews are caring.	5	4	3	2	1

Q18: **Customer Loyalty**

Customer Loyalty	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
To me, Biman undoubtedly can provide the best services.	5	4	3	2	1
I consider Biman as the first choice for air transport.	5	4	3	2	1
I encourage my friends and relatives to fly with this airline company.	5	4	3	2	1

Customer Loyalty	Strongly Agree	Agree	Neutral	Disagree	Strongly Disagree
I will consider this airline for air transport in the next few years.	5	4	3	2	1
I am intended to continue being a client of the airline if its prices increase somewhat.	5	4	3	2	1
I refuse to change to another airline.	5	4	3	2	1
I consider myself to be loyal to Biman Bangladesh Airlines.	5	4	3	2	1

Q19. In your wise judgement, how can Biman Bangladesh improve its customer service quality to retain its passengers'

Answer:

Section D: <u>Justification of Opinions</u>

Q20: This section is seeking your justification and analysis based on some analogies. It will otherwise help the researcher to summarize to what extent customer service is related to customer loyalty. Please give a tick mark to indicate the degree to which you are inclined with or against the following statements.

Analogies	YES	NO
Improved customer service has positive impact on customer loyalty towards Biman Bangladesh Airlines		
Passenger's' trust is directly and positively related to customer satisfaction with airline services		
Airliner's brand reputation positively influences behavioral intentions and positively influences customer loyalty to the airline industry		
Staffs service has direct influence on customer service.		
Airline safety influences the decision process for airline choice and loyalty as well.		
Airliner's route availability and convenience is a major factor in the choice of airlines.		
Frequent flyer program has a significant impact on airline choice.		
Price has direct influence on airline choice and positively influences customer loyalty to the airline industry.		
Improved customer service bears a significant connection on customer satisfaction.		
All satisfied customers are loyal to the airline but all loyal customers may not be satisfied in aviation industry.		

Appendix 4

RELIABILITY AND VALIDITY TEST (CRONBACH'S ALPHA) TROUGH PILOT SURVEY

1. To analyze the reliability of two factors (Customer Satisfaction and Customer Loyalty) across eight variables (Passenger Trust, Airliners' Brand Reputation, Staff Service, Airline Safety, Route Availability and Convenience, Frequent Flyer Program, and Price) using 40 attributes/indicators, a pilot study was conducted with 43 respondents. The findings, in terms of internal consistency, item-total correlations, and Cronbach's Alpha, are detailed below:

Reliability Statistics		
Cronbach's Alpha	Cronbach's Alpha Based on Standardized Items	N of Items
.959	.960	10

	Scale Mean if Item Deleted	Scale Variance if Item Deleted	Corrected Item-Total Correlation	Cronbach's Alpha if Item Deleted
Passenger's Trust	29.12	72.962	**.920**	.951
Airliners' Brand Reputation	29.47	73.826	.888	.952
Staff Service	29.37	75.430	.831	.954
Safety	28.93	76.447	.861	.954
Route Availability and Convenience	29.05	79.045	**.683**	.960
Frequent Flyer Programme	28.91	78.182	.707	.959
Price	28.84	74.711	.700	.961
Customer Satisfaction	29.35	70.804	.849	.954
Improved Customer Service	29.19	73.107	.888	.952
Customer Loyalty	29.35	72.566	.912	.951

Internal Consistency and Cronbach's Alpha Analysis.
Overall Internal Consistency.

2. The Cronbach's Alpha for the entire scale was calculated to be 0.959, indicating excellent internal consistency. This high value suggests that the items within the questionnaire are highly correlated and reliably measure the underlying constructs of Customer Satisfaction and Customer Loyalty.

Corrected Item-Total Correlation.

a. The corrected item-total correlations for the individual items were thoroughly analyzed:

1) **Passenger Trust**. The highest corrected item-total correlation for this variable was 0.920, indicating that the items measuring Passenger Trust are very closely related, possibly to the point of redundancy.

2) **Airliners' Brand Reputation, Staff Service, Airline Safety, Route Availability and Convenience, Frequent Flyer Program, and Price**. Each of these variables demonstrated corrected item-total correlations exceeding 0.7, except for Route Availability and Convenience, which had a corrected item-total correlation of 0.683. Although this value is slightly below the 0.7 threshold, it is very close, suggesting adequate internal consistency for this variable as well.

Interpretation of Findings

b. The interpretation of the findings are as follows:

1) The high corrected item-total correlations (with most values exceeding 0.7 and the highest being 0.920) indicate that the items are very similar and consistently measure the intended variables. Specifically, the value of 0.920 for Passenger Trust suggests that these items are highly homogeneous and may need to be reviewed for redundancy.

2) However, the corrected item-total correlation for Route Availability and Convenience at 0.683, though slightly below the ideal threshold, is still acceptable and does not necessitate the removal of any items from the questionnaire.

Conclusion

3. The high overall Cronbach's Alpha value of 0.959, coupled with strong item-total correlations, supports the internal consistency and reliability of the questionnaire. Despite the minor deviation in the corrected item-total correlation for Route Availability and Convenience, the measure is sufficiently close to the acceptable range, indicating that the items are reliable for measuring the intended constructs.

Recommendations:

4. As such the analysis recommends the followings:

a. **Passenger Trust Items**. Given the very high correlation, it might be beneficial to review these items for potential redundancy and consider slight modifications to enhance the breadth of the measurement without compromising consistency.

b. **Route Availability and Convenience**. While the corrected item-total correlation is slightly below 0.7, it is close enough to warrant retaining these items in the questionnaire without modification.

5. The comprehensive analysis confirms that the questionnaire is reliable and suitable for collecting actual data on Customer Satisfaction and Customer Loyalty across the specified variables. This instrument can thus be confidently used in the main study.

Summary

6. The pilot study demonstrates that the questionnaire is robust in terms of internal consistency, as evidenced by the excellent Cronbach's Alpha and satisfactory item-total correlations. The questionnaire is therefore deemed reliable for measuring Customer Satisfaction and Customer Loyalty in the target population.

Reliability Analysis of 40 Attributes/Indicators

7. A pilot study was conducted on a sample of 43 respondents to assess the reliability of a questionnaire consisting of 40 attributes/indicators. The primary focus was on evaluating internal consistency through corrected item-total correlations and Cronbach's Alpha. The results are summarized and analyzed below.

Reliability Statistics		
Cronbach's Alpha	Cronbach's Alpha Based on Standardized Items	N of Items
.985	.985	40

	Scale Mean if Item Deleted	Scale Variance if Item Deleted	Corrected Item-Total Correlation	Cronbach's Alpha if Item Deleted
Reliance	122.07	1416.733	.842	.984
Competentency	122.40	1402.388	.869	.984
Attentiveness	122.26	1410.100	.781	.984
Seamless Ticketing	121.84	1428.187	.723	.984
Considerate Crewmembers	122.07	1410.305	.826	.984
Brand Reputation	122.51	1405.446	.834	.984
Punctuality	122.72	1411.539	.800	.984
Flight Adequacy	122.49	1422.732	.738	.984
Incentive	122.63	1415.763	.805	.984
Fare Equitability	122.44	1406.252	.817	.984
Compensation & Recovery	122.70	1413.978	.801	.984
Staff's positivity	122.33	1429.891	.810	.984
Proactiveness	122.49	1422.494	.840	.984
Impartiality in Care	122.56	1419.491	.821	.984
Responsibility	122.47	1420.445	.818	.984
Confidence	121.70	1433.645	.697	.984
Robustness	122.05	1420.331	.812	.984
Emergency Expertism	121.86	1430.123	.713	.984
Route availability	122.07	1445.495	**.464**	.985
Convenient Flight Schedule	122.35	1423.852	.736	.984
Loyalty Incentive	122.02	1435.928	.604	.985
Rewards	121.95	1423.093	.770	.984
Reasonability	121.81	1417.726	.675	.985
Fair Pricing	122.12	1400.105	.781	.984
Fare Consistency	122.05	1407.998	.728	.984

Price-Performance Balance	121.65	1431.804	.550	.985
Consistency in Satisfaction	122.53	1403.445	.851	.984
Service Excellence	122.44	1398.252	.864	.984
Satisfaction and advocacy	122.28	1399.158	.863	.984
Pleasant Amenities	122.35	1415.423	.767	.984
Prompt Assistance	122.28	1409.301	.818	.984
Caring and Service	122.12	1413.629	.822	.984
Promise	122.40	1402.102	.886	.984
Commitment	122.07	1432.924	.597	.985
Primacy	122.40	1403.197	.861	.984
Advocacy	122.19	1403.774	**.887**	.984
Prospect	122.33	1403.272	.881	.984
Faithfulness	122.40	1409.388	.807	.984
Allegiancey	122.56	1404.491	.874	.984
Trustworthiness	122.51	1403.161	.823	.984

Internal Consistency and Cronbach's Alpha
Overall Internal Consistency.

8. The overall Cronbach's Alpha for the 40 attributes was calculated to be 0.985, indicating excellent internal consistency. This high value suggests that the items within the questionnaire are highly interrelated and consistently measure the underlying constructs.

Corrected Item-Total Correlation Analysis

a. **High Correlation Observations**.

1) Out of the 40 attributes, 25 attributes exhibited corrected item-total correlations exceeding 0.80. While high corrected item-total correlations generally indicate strong internal consistency, values above 0.80 suggest that the items may be too similar or redundant.

2) Additionally, 9 attributes demonstrated inter-item correlations greater than 0.71, further indicating potential redundancy among these items.

b. **Moderate Correlation Observations**.

1) The corrected item-total correlation for the attribute "Route Availability" was 0.464. This value falls within the range of 0.2 to 0.5, indicating optimal internal consistency and a moderate level of correlation with other items. This suggests that "Route Availability" is sufficiently distinct yet related to the other attributes.

2) The remaining 6 attributes had corrected item-total correlations ranging from 0.46 to 0.69, indicating moderate internal consistency and appropriate levels of correlation with the overall scale.

c. **Inter-Item Correlation Analysis**

1) **High Correlation Among Attributes**. 34 out of the 40 attributes had inter-item correlations exceeding 0.71 While this indicates a high degree of consistency, it also raises concerns about the redundancy of these items.

2) **Moderate Correlation Among Attributes**. The 6 attributes with inter-item correlations between 0.46 and 0.69 suggest a moderate level of correlation. Inter-item correlations within the range of 0.2 to 0.5 are generally preferred as they indicate that the items are related but not redundant.

Interpretation and Recommendations

9. The high overall Cronbach's Alpha of 0.985 confirms the excellent internal consistency of the questionnaire. However, the presence of several attributes with very high corrected item-total correlations (above 0.80) suggests potential redundancy. Specifically:

a. **25 Attributes with Correlations > 0.80**: These items should be reviewed for redundancy. If necessary, they could be revised to ensure they measure slightly different aspects of the underlying constructs.

b. **6 Attributes with Moderate Correlations**: These attributes fall within the optimal range of 0.2 to 0.5, indicating a moderate correlation and suggesting that they are measuring distinct but related constructs.

Conclusion

10. Despite the high internal consistency, the analysis reveals potential redundancy among some attributes. To improve the questionnaire, a careful review of the items with very high corrected item-total correlations is recommended. This will help ensure that each item contributes uniquely to the measurement of the underlying constructs.

11. The high Cronbach's Alpha value and the distribution of item-total correlations confirm that the questionnaire is reliable and can be used to collect actual data. Adjustments to the redundant items will further enhance the precision and effectiveness of the instrument.

Summary

12. The pilot study's findings demonstrate that the questionnaire possesses excellent internal consistency, as evidenced by a Cronbach's Alpha of 0.985. While most attributes show strong correlations, indicating consistency, some attributes may be too similar. Addressing these redundancies, the questionnaire was being refined, ensuring each item uniquely contributes to measuring Customer Satisfaction and Customer Loyalty.

Appendix 5

INTERVIEW PROTOCOL

Semi-Structured Interview Guideline

Cover Letter

Date:/……/……

Dear Sir

I would be most grateful for your assistance.

I am perusing a Doctor of Business Administration level researcher at the Faculty of Business Studies of University of Dhaka. As part of the thesis for a Doctoral Degree, I am conducting research on the topic entitled "**Customer Loyalty through Improved Customer Service: A case study of Biman Bangladesh Airlines Limited**." I have consulted and obtained the permission from my supervisor, Prof. Dr. S.M. Mahfuzur Rahman to conduct an interview relating to the topic.

Your assistance in answering the attached questions during the semi-interview session is greatly appreciated. This should not take more than 30 minutes of your time and I undertake the responsibility to treat all information provided as strictly confidential. The data will be analyzed through the thematic analysis while they will only be used for the academic purpose and your name and other details will not be disclosed. Nobody will be informed about your participation in the interview. The recording will be confidentially kept in my laptop for only transcription purposes and I will keep the recording until my DBA is completed. Moreover, the provided data can be withdrawn at any time according to participants' demand.

I have attached the research objectives and significance for your kind considerations to take part in the interview and oblige thereby.

If you agree after reading all the above-mentioned areas, please send me the attached consent form.

Should you require any assistance or have any questions, please do not hesitate to contact me directly or by email at nomantamzid@gmail.com

Very Respectfully

Muhammed Tamzid Al Arafat
Doctor of Business Administration Researcher
Faculty of Business Studies
University of Dhaka

Interview Questions

Section I: State of Biman Bangladesh Airlines in terms of Customer Loyalty

1. How would you describe Biman Bangladesh Airlines Limited's customer service quality?
2. How does Biman Bangladesh Airlines Limited measure customer loyalty?
3. In your opinion, how does customer loyalty impact Biman Bangladesh Airlines Limited's bottom line?
4. How does Biman Bangladesh Airlines Limited improve customer service quality?

Section II: Factors Contributing Customer Loyalty of Biman Bangladesh Airlines

1. In your opinion, what factors contribute to customer loyalty towards Biman Bangladesh Airlines Limited?
2. How does Biman Bangladesh Airlines Limited compete with other airlines in terms of customer service quality and customer loyalty?
3. What do you think are the dominant factors that significantly influence customer satisfaction and loyalty in Biman Bangladesh Airlines Limited?
4. Do you have any more particular factors involved in your present position you want to share the details?

Section III: Options to Overcome Challenges:

1. In your opinion, what steps can Biman Bangladesh Airlines Limited take to improve customer service quality and enhance customer loyalty?

2. Is there any additional information you want to share regarding the improvement of customer service to retain the passengers loyal to Biman?

Consent Form

I, _____, have read the interview participant letter and understood what would be my role as a participant. I have also understood my participation in this study is completely voluntary. Moreover, I have the right to decline to answer any question during the interview or to withdraw if needed. I also understand my organizational identity and other information will be strictly kept in a confidential format. I also agree that my interview will be recorded for academic purposes only.

Date: _____ Sign: _____

Biman Bangladesh Airlines Customer Loyalty Study

Interview Answer Sheet

Participant Information

- **Name:** _____
- **Rank/Appointment:** _____
- **Organization (if different from Biman):** _____
- **Date of Interview:** _____
- **Time of Interview:** _____
- **Interviewer Code:** _____ *(To be completed by interviewer)*
- **Participant Code:** _____ *(To be completed by interviewer)*

Optional Notes:

(Use this space for observations on the interview setting or initial impressions.)

Instructions

- Please provide comprehensive and thoughtful responses to each question.
- Feel free to elaborate on your answers or provide additional insights.
- The interviewer may take notes to supplement your responses.

Section I: Customer Loyalty at Biman Bangladesh Airlines

1. How would you describe Biman Bangladesh Airlines Limited's customer service quality?

Related Question: Have you noticed any changes in customer service quality over the past year?

2. How does Biman Bangladesh Airlines Limited measure customer loyalty?

Related Question: What key metrics do you believe should be included in measuring customer loyalty?

3. In your opinion, how does customer loyalty impact the airline's financial performance?

4. What steps does Biman Bangladesh Airlines Limited take to enhance customer service quality?

Related Question: What additional measures would you recommend to further enhance customer service?

Section II: Factors Influencing Customer Loyalty

5. What key factors contribute to customer loyalty towards Biman Bangladesh Airlines Limited?

6. How does Biman Bangladesh Airlines Limited compare to competitors in customer service and loyalty programs?

Related Question: What specific competitive advantages or disadvantages does Biman Bangladesh Airlines have?

7. What are the primary drivers of customer satisfaction and loyalty within the airline?

8. Are there specific factors related to your role that influence customer loyalty? Please share relevant details.

Section III: Strategies to Overcome Challenges

9. What measures can Biman Bangladesh Airlines Limited implement to improve service quality and enhance customer loyalty?

10. Do you have any additional suggestions for retaining loyal passengers and improving overall service?

Consent to Record & Participate in Research

I confirm that I have been informed about the purpose of this research and understand the nature of my participation.

- I acknowledge that my responses will be kept confidential and used solely for research purposes.
- I voluntarily agree to participate in this interview.
- I grant permission for this interview to be audio recorded.

Participant Signature: _____

Date: _____

Interviewer Notes (Optional)

Interviewer Signature: _____

Date: _____

Guidelines for Interviewers

Best Practices:

- **Confidentiality:** Reiterate to participants that their responses will remain confidential.
- **Neutrality:** Maintain a professional and neutral stance throughout the interview.
- **Probing Questions:** Use clarifying questions to deepen understanding (e.g., “Could you elaborate on that?” or “What do you mean by...?”).
- **Time Management:** Ensure all questions are covered within the allotted time.
- **Closing the Interview:** Express appreciation for the participant’s time and insights.

Appendix 6

THE PERSONNEL AND OFFICIALS INTERVIEWED, AND THE TYPE OF INFORMATION COLLECTED

Serial No	Question Sets Code	Role	Answer of Full Sets Interview Questions
1.	A	Director of Sales and Marketing of Biman Bangladesh Airlines	Discussed the importance of targeted marketing and personalized promotions.
2.	B	Biman's Pilot	Emphasized safety protocols and optimized flight schedules as key loyalty factors.
3.	C	Loyal Customer Care Officer	Highlighted the significance of customer engagement and personalized interactions.
4.	D	Retired Managing Director & CEO of Biman Bangladesh Airlines	Asserted the importance of consistent service quality in maintaining loyalty.
5.	E	Aviation Business Academician from Bangabandhu Sheikh Mujibur Rahman Aviation and Aerospace University	Stressed strategic planning, market analysis, and innovation for loyalty.
6.	F	Chairman of Civil Aviation	Emphasized collaboration with industry stakeholders and regulatory compliance.
7.	G	Professional from Emirates Airlines	Suggested benchmarking against industry best practices and leveraging unique selling points.

8.	H	Professional from Qatar Airlines	Highlighted market competition analysis and strategic improvements.
9.	I	University Teacher/ Academician from Bangabandhu Sheikh Mujibur Rahman Aviation and Aerospace University	Advocated for SWOT analysis to identify strengths and weaknesses for improving loyalty.
10.	J	Managing Director & CEO Biman Bangladesh Airlines Limited	Underscored the significance of addressing organizational challenges and talent development.
11.	K	Airport Manager of HSIA	Stressed the importance of improving ground services and enhancing passenger experience.
12.	L	Domestic Passenger	Emphasized investing in airport infrastructure and promoting domestic tourism.
13.	M	International Route Passenger	Suggested offering competitive pricing and improving customer experience.
14.	N	Disloyal Passenger of Biman Bangladesh Airlines	Pointed out addressing service deficiencies and enhancing the value proposition.
15.	O	Research Participant	Recommended fostering a culture of continuous improvement and customer-centricity.
16.	P	Director, Administration & HR of Biman Bangladesh Airlines	Discussed enhancing HR practices to improve service quality and loyalty.
17.	Q	Director, Customer Services of Biman Bangladesh Airlines	Emphasized the need for responsive and efficient customer service.

18.	R	Director, Flight Operations of Biman Bangladesh Airlines	Highlighted the importance of operational efficiency and safety protocols.
19.	S	Domestic Passenger	Stressed the significance of convenient flight schedules and efficient check-in processes.
20.	T	International Route Passenger	Suggested improving in-flight services and entertainment options.
21.	U	Researcher	Discussed the need for data-driven insights to enhance customer experience.
22.	V	Business Analyst	Emphasized the role of market analysis in identifying customer needs and preferences.
23.	W	IT Professional	Highlighted the importance of leveraging technology for improving customer service.
24.	X	Frequent Flyer	Suggested implementing loyalty programs and personalized offers.
25.	Y	Head of In-Flight Services	Stressed the need for regular training and development programs for staff.
26.	Z	Owner of Travel Agents who work with Biman Bangladesh Airlines Limited	Emphasized strategic planning and innovation for competitive differentiation.
27.	AA	Biman Bangladesh Airlines Staff	Highlighted internal communication and employee engagement as key factors.
28.	BB	General Manager of Operations	Discussed the need for consistent and high-quality service delivery.
29.	CC	Airline Industry Expert	Suggested benchmarking and continuous improvement initiatives.

30.	DD	Travel Blogger	Emphasized the role of social media and online presence in shaping customer perceptions.
31.	EE	Operations Manager	Highlighted operational efficiency and process optimization as key drivers of loyalty.
32.	FF	Financial Analyst	Discussed the impact of competitive pricing and value-for-money propositions.
33.	GG	Member (Air Traffic Management), CAAB	Suggested enhancing loyalty programs and rewards for frequent flyers.
34.	HH	Member (Flight Standard & Regulations), CAAB	Emphasized the need for regular service quality assessments and improvements.
35.	II	Owner of Travel Agents who work with Biman Bangladesh Airlines Limited	Highlighted the importance of strategic planning and market positioning.
36.	JJ	Member (Operations & Planning), CAAB	Discussed regulatory compliance and collaboration with industry stakeholders.
37.	KK	Director (Air Transportation), CAAB	Emphasized the role of efficient logistics and supply chain management.
38.	LL	Environmental Analyst	Highlighted the importance of sustainable practices and environmental compliance.
39.	MM	Addl Director AVSEC	Stressed adherence to safety protocols and regulatory requirements.

40.	NN	Ground Services Manager	Suggested improving ground services and passenger handling processes.
41.	OO	Director Aviation Security (AVSEC)	Discussed the importance of analyzing customer feedback and addressing concerns in terms of security.
42.	PP	Director, Administration & HR (Retd) of Biman Bangladesh Airlines	Highlighted the need for efficient ticketing processes and customer support.
43.	QQ	Public Relations Officer of Biman Bangladesh Airlines	Emphasized the role of effective communication and public relations in building customer trust.
44.	QR	**Muhammad Faruk Khan,** Honorable Minister, Ministry of Civil Aviation & Tourism	Existing state, his vision or Biman

Appendix 7

DIFFERENT ONLINE AND OFFLINE SECONDARY SOURCES SECONDARY DATA

1. Some online and offline sources used for the collection of Secondary data for this research:

1) **Official Reports**: Reports from Biman Bangladesh Airlines, Civil Aviation Authority, and the International Air Transport Association (IATA).

2) **Market Research Reports**: Reports from market research firms like Statista, MarketResearch.com, and Nielsen.

3) **Books:** Books on customer loyalty, service quality, Airline management

4) **News Sources**: News articles, press releases, and interviews with airline representatives.

5) **Customer Reviews and Feedback**: - Online customer reviews and feedback online platforms like TripAdvisor, Skytrax, and airline-specific websites.

6) **Industry Publications**: Magazines and publications specific to the airline industry.

7) **Academic Journals and Articles**: Research studies related to customer loyalty, airline management, and customer service include **JSTOR, ProQuest, Google Scholar, and EBSCOhost**, which provide extensive access to peer-reviewed research. Additionally, **Elsevier's ScienceDirect**, **SpringerLink**, and **Taylor & Francis Online** offer high-impact journals like the Journal of Air Transport Management, Tourism Management, and Journal of Service Research. **SAGE Journals** and **Emerald Insight** also provide valuable insights into aviation business strategies, customer satisfaction, and airline operations. These sources ensure comprehensive and credible academic coverage for in-depth analysis.

Appendix 8

OUTCOME OF SURVEY DATA THROUGH TRADITIONAL STATISTICAL ANALYSIS BY SPSS

Descriptive Statistics			
	Mean	Std. Deviation	N
Passenger's Trust	3.30	1.035	425
Airliners' Brand Reputation	2.91	1.035	425
Staff Service	2.97	1.085	425
Safety	3.65	.911	425
Route Availability and Convenience	3.45	.977	425
Frequent Flyer Programme	3.43	1.030	425
Price	3.64	.980	425
Improved Customer Service	3.34	1.057	425
Customer Satisfaction	3.11	1.146	425
Customer Loyalty	3.28	1.074	425

CORRELATION TEST WITH ALL 8 VARIABLE VS CUSTOMER SATISFACTION AND LOYALTY

Pearson Correlation

	Customer Satisfaction	Customer Loyalty
Passenger's Trust	.791**	.741**
Airliners' Brand Reputation	.736**	.730**
Staff Service	.737**	.707**
Safety	.673**	.689**
Route Availability and Convenience	.676**	.665**
Frequent Flyer Programme	.694**	.691**
Price	.582**	.599**
Improved Customer Service	.806**	.771**
Customer Loyalty	.789**	.789**

MULTIPLE LINEAR REGRESSION WITH ALL 8 VARIABLE VS CUSTOMER SATISFACTION AND LOYALTY

Dependent Variable: Customer Satisfaction

Model Summary

Model	R	R Square	Adjusted R Square	Std. Error of the Estimate	Change Statistics				
					R Square Change	F Change	df1	df2	Sig. F Change
1	.865[a]	.749	.744	.580	.749	154.099	8	414	.000

a. Predictors: (Constant), Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Programme, Safety, Staff Service, Passenger's Trust, Airliners' Brand Reputation

Coefficients[a]

Model		Unstandardized Coefficients		Standardized Coefficients	t	Sig.	95.0% Confidence Interval for B	
		B	Std. Error	Beta			Lower Bound	Upper Bound
1	(Constant)	-.490	.132		-3.697	.000	-.750	-.229
	Passenger's Trust	.291	.051	.263	5.729	.000	.191	.391
	Airliners' Brand Reputation	.082	.051	.074	1.613	.108	-.018	.183
	Staff Service	.103	.047	.098	2.194	.029	.011	.195
	Safety	.004	.050	.003	.084	.933	-.094	.102
	Route Availability and Convenience	.111	.045	.095	2.489	.013	.023	.199
	Frequent Flyer Programme	.094	.044	.084	2.127	.034	.007	.180
	Price	.054	.038	.046	1.417	.157	-.021	.129
	Improved Customer Service	.353	.050	.325	7.013	.000	.254	.452

a. Dependent Variable: Customer Satisfaction

ANOVA[a]

Model		Sum of Squares	df	Mean Square	F	Sig.
1	Regression	414.559	8	51.820	154.099	.000[b]
	Residual	139.219	414	.336		
	Total	553.778	422			

a. Dependent Variable: Customer Satisfaction

b. Predictors: (Constant), Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Programme, Safety, Staff Service, Passenger's Trust, Airliners' Brand Reputation

Dependent Variable: Customer Loyalty

Model Summary									
Model	R	R Square	Adjusted R Square	Std. Error of the Estimate	Change Statistics				
					R Square Change	F Change	df1	df2	Sig. F Change
1	.839[a]	.704	.698	.591	.704	122.817	8	414	.000
a. Predictors: (Constant), Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Programme, Safety, Staff Service, Passenger's Trust, Airliners' Brand Reputation									

Coefficients[a]								
Model		Unstandardized Coefficients		Standardized Coefficients	t	Sig.	95.0% Confidence Interval for B	
		B	Std. Error	Beta			Lower Bound	Upper Bound
1	(Constant)	-.201	.135		-1.492	.137	-.466	.064
	Passenger's Trust	.137	.052	.132	2.647	.008	.035	.239
	Airliners' Brand Reputation	.136	.052	.131	2.610	.009	.034	.238
	Staff Service	.059	.048	.060	1.240	.216	-.035	.153
	Safety	.113	.051	.096	2.228	.026	.013	.212
	Route Availability and Convenience	.095	.045	.086	2.085	.038	.005	.184
	Frequent Flyer Programme	.116	.045	.112	2.598	.010	.028	.204
	Price	.113	.039	.103	2.907	.004	.037	.189
	Improved Customer Service	.272	.051	.267	5.303	.000	.171	.372
a. Dependent Variable: Customer Loyalty								

ANOVA[a]						
Model		Sum of Squares	df	Mean Square	F	Sig.
1	Regression	342.688	8	42.836	122.817	.000[b]
	Residual	144.395	414	.349		
	Total	487.083	422			
a. Dependent Variable: Customer Loyalty						
b. Predictors: (Constant), Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Programme, Safety, Staff Service, Passenger's Trust, Airliners' Brand Reputation						

CHI-SQURE TEST WITH ALL 8 VARIABLE VS CUSTOMER SATISFACTION

	Pearson Chi-Square	Phi	Cramer's V
Passenger's Trust	525.48	1.115	.557
Airliners' Brand Reputation	398.908	.971	.486
Staff Service	462.108	1.045	.523
Safety	306.113	.851	.425

Route Availability and Convenience	399.030	.971	.486
Frequent Flyer Programme	382.802	.951	.476
Price	351.872	.912	.456
Improved Customer Service	654.434	1.244	.622

Passenger's Trust * Customer Satisfaction

Chi-Square Tests

	Value	df	Asymptotic Significance (2-sided)	Monte Carlo Sig. (2-sided)			Monte Carlo Sig. (1-sided)		
				Significance	95% Confidence Interval		Significance	95% Confidence Interval	
					Lower Bound	Upper Bound		Lower Bound	Upper Bound
Pearson Chi-Square	525.480[a]	16	.000	.000[b]	.000	.000			
Likelihood Ratio	454.468	16	.000	.000[b]	.000	.000			
Fisher's Exact Test	427.481			.000[b]	.000	.000			
Linear-by-Linear Association	264.107[c]	1	.000	.000[b]	.000	.000	.000[b]	.000	.000
N of Valid Cases	423								

a. 6 cells (24.0%) have expected count less than 5. The minimum expected count is 1.10.

b. Based on 10000 sampled tables with starting seed 1503498996.

c. The standardized statistic is 16.251.

Chi-Square Tests									
				Monte Carlo Sig. (2-sided)			Monte Carlo Sig. (1-sided)		
					95% Confidence Interval			95% Confidence Interval	
	Value	df	Asymptotic Significance (2-sided)	Significance	Lower Bound	Upper Bound	Significance	Lower Bound	Upper Bound
Pearson Chi-Square	398.908[a]	16	.000	.000[b]	.000	.000			
Likelihood Ratio	354.087	16	.000	.000[b]	.000	.000			
Fisher's Exact Test	331.990			.000[b]	.000	.000			
Linear-by-Linear Association	228.572[c]	1	.000	.000[b]	.000	.000	.000[b]	.000	.000
N of Valid Cases	423								
a. 7 cells (28.0%) have expected count less than 5. The minimum expected count is .59.									
b. Based on 10000 sampled tables with starting seed 1503498996.									
c. The standardized statistic is 15.119.									

Airliners' Brand Reputation * Customer Satisfaction

Symmetric Measures								
						Monte Carlo Significance		
							95% Confidence Interval	
		Value	Asymptotic Standard Error[a]	Approximate T[b]	Approximate Significance	Significance	Lower Bound	Upper Bound
Nominal by Nominal	Phi	.971			.000	.000[c]	.000	.000
	Cramer's V	.486			.000	.000[c]	.000	.000
	Contingency Coefficient	.697			.000	.000[c]	.000	.000
Interval by Interval	Pearson's R	.736	.023	22.305	.000[d]	.000[c]	.000	.000
Ordinal by Ordinal	Spearman Correlation	.740	.025	22.598	.000[d]	.000[c]	.000	.000
N of Valid Cases		423						
a. Not assuming the null hypothesis.								
b. Using the asymptotic standard error assuming the null hypothesis.								
c. Based on 10000 sampled tables with starting seed 1503498996.								
d. Based on normal approximation.								

Staff Service * Customer Satisfaction

Chi-Square Tests									
			Asymptotic Significance (2-sided)	Monte Carlo Sig. (2-sided)			Monte Carlo Sig. (1-sided)		
					95% Confidence Interval			95% Confidence Interval	
	Value	df		Significance	Lower Bound	Upper Bound	Significance	Lower Bound	Upper Bound
Pearson Chi-Square	462.108[a]	16	.000	.000[b]	.000	.000			
Likelihood Ratio	382.071	16	.000	.000[b]	.000	.000			
Fisher's Exact Test	360.068			.000[b]	.000	.000			
Linear-by-Linear Association	229.163[c]	1	.000	.000[b]	.000	.000	.000[b]	.000	.000
N of Valid Cases	423								
a. 4 cells (16.0%) have expected count less than 5. The minimum expected count is 1.91.									
b. Based on 10000 sampled tables with starting seed 1503498996.									
c. The standardized statistic is 15.138.									

Symmetric Measures								
						Monte Carlo Significance		
							95% Confidence Interval	
		Value	Asymptotic Standard Error[a]	Approximate T[b]	Approximate Significance	Significance	Lower Bound	Upper Bound
Nominal by Nominal	Phi	1.045			.000	.000[c]	.000	.000
	Cramer's V	.523			.000	.000[c]	.000	.000
	Contingency Coefficient	.723			.000	.000[c]	.000	.000
Interval by Interval	Pearson's R	.737	.027	22.368	.000[d]	.000[c]	.000	.000
Ordinal by Ordinal	Spearman Correlation	.734	.028	22.200	.000[d]	.000[c]	.000	.000
N of Valid Cases		423						
a. Not assuming the null hypothesis.								
b. Using the asymptotic standard error assuming the null hypothesis.								
c. Based on 10000 sampled tables with starting seed 1503498996.								
d. Based on normal approximation.								

Safety * Customer Satisfaction

Chi-Square Tests									
				Monte Carlo Sig. (2-sided)			Monte Carlo Sig. (1-sided)		
					95% Confidence Interval			95% Confidence Interval	
	Value	df	Asymptotic Significance (2-sided)	Significance	Lower Bound	Upper Bound	Significance	Lower Bound	Upper Bound
Pearson Chi-Square	306.113[a]	16	.000	.000[b]	.000	.000			
Likelihood Ratio	276.973	16	.000	.000[b]	.000	.000			
Fisher's Exact Test	259.025			.000[b]	.000	.000			
Linear-by-Linear Association	191.197[c]	1	.000	.000[b]	.000	.000	.000[b]	.000	.000
N of Valid Cases	423								
a. 6 cells (24.0%) have expected count less than 5. The minimum expected count is .29.									
b. Based on 10000 sampled tables with starting seed 1503498996.									
c. The standardized statistic is 13.827.									

Symmetric Measures								
						Monte Carlo Significance		
							95% Confidence Interval	
		Value	Asymptotic Standard Error[a]	Approximate T[b]	Approximate Significance	Significance	Lower Bound	Upper Bound
Nominal by Nominal	Phi	.851			.000	.000[c]	.000	.000
	Cramer's V	.425			.000	.000[c]	.000	.000
	Contingency Coefficient	.648			.000	.000[c]	.000	.000
Interval by Interval	Pearson's R	.673	.027	18.675	.000[d]	.000[c]	.000	.000
Ordinal by Ordinal	Spearman Correlation	.665	.030	18.264	.000[d]	.000[c]	.000	.000
N of Valid Cases		423						
a. Not assuming the null hypothesis.								
b. Using the asymptotic standard error assuming the null hypothesis.								
c. Based on 10000 sampled tables with starting seed 1503498996.								
d. Based on normal approximation.								

Route Availability and Convenience * Customer Satisfaction

Chi-Square Tests

	Value	df	Asymptotic Significance (2-sided)	Monte Carlo Sig. (2-sided)			Monte Carlo Sig. (1-sided)		
				Significance	95% Confidence Interval		Significance	95% Confidence Interval	
					Lower Bound	Upper Bound		Lower Bound	Upper Bound
Pearson Chi-Square	399.030[a]	16	.000	.000[b]	.000	.000			
Likelihood Ratio	336.320	16	.000	.000[b]	.000	.000			
Fisher's Exact Test	317.995			.000[b]	.000	.000			
Linear-by-Linear Association	192.635[c]	1	.000	.000[b]	.000	.000	.000[b]	.000	.000
N of Valid Cases	423								

a. 7 cells (28.0%) have expected count less than 5. The minimum expected count is .59.

b. Based on 10000 sampled tables with starting seed 1503498996.

c. The standardized statistic is 13.879.

Symmetric Measures

		Value	Asymptotic Standard Error[a]	Approximate T[b]	Approximate Significance	Monte Carlo Significance		
						Significance	95% Confidence Interval	
							Lower Bound	Upper Bound
Nominal by Nominal	Phi	.971			.000	.000[c]	.000	.000
	Cramer's V	.486			.000	.000[c]	.000	.000
	Contingency Coefficient	.697			.000	.000[c]	.000	.000
Interval by Interval	Pearson's R	.676	.029	18.804	.000[d]	.000[c]	.000	.000
Ordinal by Ordinal	Spearman Correlation	.675	.032	18.772	.000[d]	.000[c]	.000	.000
N of Valid Cases		423						

a. Not assuming the null hypothesis.

b. Using the asymptotic standard error assuming the null hypothesis.

c. Based on 10000 sampled tables with starting seed 1503498996.

d. Based on normal approximation.

Frequent Flyer Programme * Customer Satisfaction

Chi-Square Tests

	Value	df	Asymptotic Significance (2-sided)	Monte Carlo Sig. (2-sided)			Monte Carlo Sig. (1-sided)		
				Significance	95% Confidence Interval		Significance	95% Confidence Interval	
					Lower Bound	Upper Bound		Lower Bound	Upper Bound
Pearson Chi-Square	382.802[a]	16	.000	.000[b]	.000	.000			
Likelihood Ratio	331.213	16	.000	.000[b]	.000	.000			
Fisher's Exact Test	312.344			.000[b]	.000	.000			
Linear-by-Linear Association	203.129[c]	1	.000	.000[b]	.000	.000	.000[b]	.000	.000
N of Valid Cases	423								

a. 6 cells (24.0%) have expected count less than 5. The minimum expected count is 1.03.

Symmetric Measures

		Value	Asymptotic Standard Error[a]	Approximate T[b]	Approximate Significance	Monte Carlo Significance		
						Significance	95% Confidence Interval	
							Lower Bound	Upper Bound
Nominal by Nominal	Phi	.951			.000	.000[c]	.000	.000
	Cramer's V	.476			.000	.000[c]	.000	.000
	Contingency Coefficient	.689			.000	.000[c]	.000	.000
Interval by Interval	Pearson's R	.694	.028	19.767	.000[d]	.000[c]	.000	.000
Ordinal by Ordinal	Spearman Correlation	.695	.030	19.806	.000[d]	.000[c]	.000	.000
N of Valid Cases		423						

a. Not assuming the null hypothesis.

b. Using the asymptotic standard error assuming the null hypothesis.

c. Based on 10000 sampled tables with starting seed 1503498996.

d. Based on normal approximation.

b. Based on 10000 sampled tables with starting seed 1503498996.

c. The standardized statistic is 14.252.

Price * Customer Satisfaction

Chi-Square Tests									
			Asymptotic Significance (2-sided)	Monte Carlo Sig. (2-sided)			Monte Carlo Sig. (1-sided)		
					95% Confidence Interval			95% Confidence Interval	
	Value	df		Significance	Lower Bound	Upper Bound	Significance	Lower Bound	Upper Bound
Pearson Chi-Square	351.872[a]	16	.000	.000[b]	.000	.000			
Likelihood Ratio	269.520	16	.000	.000[b]	.000	.000			
Fisher's Exact Test	254.161			.000[b]	.000	.000			
Linear-by-Linear Association	143.066[c]	1	.000	.000[b]	.000	.000	.000[b]	.000	.000
N of Valid Cases	423								
a. 6 cells (24.0%) have expected count less than 5. The minimum expected count is .59.									
b. Based on 10000 sampled tables with starting seed 1503498996.									
c. The standardized statistic is 11.961.									

Symmetric Measures								
						Monte Carlo Significance		
							95% Confidence Interval	
		Value	Asymptotic Standard Error[a]	Approximate T[b]	Approximate Significance	Significance	Lower Bound	Upper Bound
Nominal by Nominal	Phi	.912			.000	.000[c]	.000	.000
	Cramer's V	.456			.000	.000[c]	.000	.000
	Contingency Coefficient	.674			.000	.000[c]	.000	.000
Interval by Interval	Pearson's R	.582	.036	14.695	.000[d]	.000[c]	.000	.000
Ordinal by Ordinal	Spearman Correlation	.569	.038	14.181	.000[d]	.000[c]	.000	.000
N of Valid Cases		423						
a. Not assuming the null hypothesis.								
b. Using the asymptotic standard error assuming the null hypothesis.								
c. Based on 10000 sampled tables with starting seed 1503498996.								
d. Based on normal approximation.								

Improved Customer Service * Customer Satisfaction

Chi-Square Tests									
			Asymptotic Significance (2-sided)	Monte Carlo Sig. (2-sided)			Monte Carlo Sig. (1-sided)		
					95% Confidence Interval			95% Confidence Interval	
	Value	df		Significance	Lower Bound	Upper Bound	Significance	Lower Bound	Upper Bound
Pearson Chi-Square	654.434[a]	16	.000	.000[b]	.000	.000			
Likelihood Ratio	500.631	16	.000	.000[b]	.000	.000			
Fisher's Exact Test	473.687			.000[b]	.000	.000			
Linear-by-Linear Association	274.311[c]	1	.000	.000[b]	.000	.000	.000[b]	.000	.000
N of Valid Cases	423								
a. 5 cells (20.0%) have expected count less than 5. The minimum expected count is 1.32.									
b. Based on 10000 sampled tables with starting seed 1503498996.									
c. The standardized statistic is 16.562.									

Symmetric Measures								
						Monte Carlo Significance		
							95% Confidence Interval	
		Value	Asymptotic Standard Error[a]	Approximate T[b]	Approximate Significance	Significance	Lower Bound	Upper Bound
Nominal by Nominal	Phi	1.244			.000	.000[c]	.000	.000
	Cramer's V	.622			.000	.000[c]	.000	.000
	Contingency Coefficient	.779			.000	.000[c]	.000	.000
Interval by Interval	Pearson's R	.806	.021	27.963	.000[d]	.000[c]	.000	.000
Ordinal by Ordinal	Spearman Correlation	.804	.022	27.763	.000[d]	.000[c]	.000	.000
N of Valid Cases		423						
a. Not assuming the null hypothesis.								
b. Using the asymptotic standard error assuming the null hypothesis.								
c. Based on 10000 sampled tables with starting seed 1503498996.								
d. Based on normal approximation.								

INTERPRETATION OF THE OUTCOME OF SPSS OF TRADITION STATISTICAL TESTS

In the fiercely competitive airline industry, maintaining high levels of customer satisfaction and loyalty is crucial for sustained success. Understanding the factors that influence customer loyalty is essential for airlines to tailor their services effectively. This section presents a detailed analysis of various factors affecting customer loyalty for Biman Bangladesh Airlines, focusing on eight key variables: Passenger's Trust, Airliners' Brand Reputation, Staff Service, Safety, Route Availability and Convenience, Frequent Flyer Programme, Price, and Improved Customer Service.

In this regard basing on the responses of 425 respondents an analysis is being carried out. The objective is to determine the strength and significance of the relationship between these variables and customer loyalty using various statistical measures including mean, standard deviation, Pearson correlation, multiple linear regression, and chi-square tests. The findings of required data for necessary statistical analysis are given below:

a. Descriptive Statistics

Variable	Mean	Std. Deviation	N
Passenger's Trust	3.30	1.035	425
Airliners' Brand Reputation	2.91	1.035	425
Staff Service	2.97	1.085	425
Safety	3.65	0.911	425
Route Availability and Convenience	3.45	0.977	425
Frequent Flyer Programme	3.43	1.030	425
Price	3.64	0.980	425
Improved Customer Service	3.34	1.057	425
Customer Satisfaction	3.11	1.146	425
Customer Loyalty	3.28	1.074	425

b. Pearson Correlation

Variable	Correlation with Customer Loyalty
Passenger's Trust	0.741**
Airliners' Brand Reputation	0.730**
Staff Service	0.707**
Safety	0.689**
Route Availability and Convenience	0.665**

Frequent Flyer Programme	0.691**
Price	0.599**
Improved Customer Service	0.771**
Customer Loyalty	0.789**

KEY VARIABLES THAT SIGNIFICANTLY INFLUENCE CUSTOMER LOYALTY

c. Beta Values of Multiple Linear Regression Analysis

Variable	**Unstandardized Coefficients (B)**
(Constant)	-0.201
Passenger's Trust	0.137
Airliners' Brand Reputation	0.136
Staff Service	0.059
Safety	0.113
Route Availability and Convenience	0.095
Frequent Flyer Programme	0.116
Price	0.113
Improved Customer Service	0.272

d. ANOVA

Model		Sum of Squares	df	Mean Square	F	Sig.
1	Regression	342.688	8	42.836	122.817	.000[b]
	Residual	144.395	414	.349		
	Total	487.083	422			
a. Dependent Variable: Customer Loyalty						
b. Predictors: (Constant), Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Programme, Safety, Staff Service, Passenger's Trust, Airliners' Brand Reputation						

e. Chi-Square Test Results

Variable	**Pearson Chi-Square**	**Phi**	**Cramer's V**
Passenger's Trust	437.390	1.017	0.508
Airliners' Brand Reputation	452.694	1.035	0.517
Staff Service	458.186	1.041	0.520

Safety	359.878	0.922	0.461
Route Availability and Convenience	335.409	0.890	0.445
Frequent Flyer Programme	379.825	0.948	0.474
Price	270.017	0.799	0.399
Improved Customer Service	605.436	1.196	0.598

Statistical Insights and Interpretation

The following analysis employs descriptive statistics, correlation analysis, regression analysis, chi-square tests, and ANOVA to investigate the relationship between these variables and customer loyalty. The results aim to determine the degree of significance between customer loyalty, with all independent variables improved customer service, passenger trust, and airliners' brand reputation emerging as the most influential factors. However, basing on the finding of analyzed data as mention above the required statistical insights and interpretation of the values of different tests are given below:

a. **Passenger's Trust**

1) Mean: 3.30, Std. Deviation: 1.035
2) Correlation with Customer Loyalty: 0.741** (Strong correlation)
3) Regression Coefficient (B): 0.137
4) Chi-Square: 437.390, Phi: 1.017, Cramer's V: 0.508
5) Interpretation: Passenger trust has a strong positive correlation with customer loyalty, supported by a significant regression coefficient and chi-square test results.

6) ANOVA Interpretation:

i. Null Hypothesis (H0): Passenger trust does not significantly influence customer loyalty.

ii. Alternate Hypothesis (H1): Passenger trust significantly influences customer loyalty.

iii. Interpretation: The F-statistic value is significant ($p < 0.05$), indicating that passenger trust has a significant impact on customer loyalty.

b. **Airliners' Brand Reputation**

1) Mean: 2.91, Std. Deviation: 1.035

2) Correlation with Customer Loyalty: 0.730** (Strong correlation)
3) Regression Coefficient (B): 0.136
4) Chi-Square: 452.694, Phi: 1.035, Cramer's V: 0.517
5) Interpretation: Airliners' brand reputation shows a strong positive relationship with customer loyalty, with significant regression coefficient and chi-square test results supporting this.
6) ANOVA Interpretation:

i. Null Hypothesis (H0): Airliners' brand reputation does not significantly influence customer loyalty.

ii. Alternate Hypothesis (H1): Airliners' brand reputation significantly influences customer loyalty.

iii. Interpretation: The ANOVA test yields a significant F-statistic ($p < 0.05$), indicating that brand reputation significantly impacts customer loyalty.

c. **Staff Service**

1) Mean: 2.97, Std. Deviation: 1.085
2) Correlation with Customer Loyalty: 0.707** (Strong correlation)
3) Regression Coefficient (B): 0.059
4) Chi-Square: 458.186, Phi: 1.041, Cramer's V: 0.520
5) Interpretation: Staff service is strongly correlated with customer loyalty, although the regression coefficient is relatively smaller compared to other variables.

6) ANOVA Interpretation:
   i. Null Hypothesis (H0): Staff service does not significantly influence customer loyalty.

   ii. Alternate Hypothesis (H1): Staff service significantly influences customer loyalty.

   iii. Interpretation: The ANOVA results indicate a significant effect of staff service on customer loyalty ($p < 0.05$).

d. **Safety**

1) Correlation with Customer Loyalty: 0.689** (Strong correlation)
2) Regression Coefficient (B): 0.113

3) ANOVA Interpretation: A significant F-statistic ($p < 0.05$) suggests that safety significantly influences customer loyalty.
4) Chi-Square Test: Chi-Square value of 359.878, Phi of 0.922, Cramer's V of 0.461. Interpretation: Safety has a strong positive association with customer loyalty.

e. **Route Availability and Convenience**

1) Correlation with Customer Loyalty: 0.665** (Strong correlation)
2) Regression Coefficient (B): 0.095
3) ANOVA Interpretation: The ANOVA results indicate a significant effect of route availability and convenience on customer loyalty ($p < 0.05$).
4) Chi-Square Test: Chi-Square value of 335.409, Phi of 0.890, Cramer's V of 0.445. Interpretation: Route availability and convenience exhibit a strong positive association with customer loyalty.

f. **Frequent Flyer Programme**

1) Correlation with Customer Loyalty: 0.691** (Strong correlation)

2) Regression Coefficient (B): 0.116

3) ANOVA Interpretation: A significant F-statistic ($p < 0.05$) suggests that the frequent flyer Programme significantly influences customer loyalty.

4) Chi-Square Test: Chi-Square value of 379.825, Phi of 0.948, Cramer's V of 0.474. Interpretation: The frequent flyer Programme shows a strong positive association with customer loyalty.

g. **Price**

1) Correlation with Customer Loyalty: 0.599** (Moderate correlation)
2) Regression Coefficient (B): 0.113

3) ANOVA Interpretation: The ANOVA results suggest a significant effect of price on customer loyalty ($p < 0.05$).

4) Chi-Square Test: Chi-Square value of 270.017, Phi of 0.799, Cramer's V of 0.399. Interpretation: Price exhibits a moderate positive association with customer loyalty.

Improved Customer Service

1) Correlation with Customer Loyalty: 0.771** (Strong correlation)

2) Regression Coefficient (B): 0.272

3) ANOVA Interpretation: The F-statistic value is significant ($p < 0.05$), indicating that improved customer service significantly influences customer loyalty.

4) Chi-Square Test: Chi-Square value of 605.436, Phi of 1.196, Cramer's V of 0.598. Interpretation: Improved customer service has a strong positive association with customer loyalty.

R Square Value: 0.704

Model Summary									
Model	R	R Square	Adjusted R Square	Std. Error of the Estimate	Change Statistics				
					R Square Change	F Change	df1	df2	Sig. F Change
1	.839[a]	.704	.698	.591	.704	122.817	8	414	.000
a. Predictors: (Constant), Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Programme, Safety, Staff Service, Passenger's Trust, Airliners' Brand Reputation									

Interpretation:

The R Square value, also known as the coefficient of determination, is a key indicator of the model's explanatory power. An R Square value of 0.704 means that approximately 70.4% of the variance in the dependent variable, Customer Loyalty, can be explained by the combined effect of the eight independent variables in the regression model. This high R Square value suggests that the model has a strong explanatory power and is effective in capturing the relationship between the independent variables and customer loyalty.

Recommended Key Variables for Customer Loyalty:

To prioritize the key variables, consider both the strength of correlation with customer loyalty and the magnitude of the regression coefficients. Here's how each variable can be justified and prioritized:

a. **Improved Customer Service**. Exhibits the highest correlation (0.806) and the highest beta value (+0.353), making it the most influential factor on customer satisfaction among the variables considered.

b. **Passenger Trust**. Has a very strong correlation (0.791) and a high beta value (+0.291), indicating a substantial impact on customer satisfaction.

c. **Staff Service**. Shows a strong correlation (0.737) and a moderate beta value (+0.103), indicating a significant impact on customer satisfaction.

d. **Airline Brand Reputation**. Although it has a strong correlation (0.736), its beta value (+0.082) suggests a moderate impact on customer satisfaction.

e. **Frequent Flyer Program**. Exhibits a moderate correlation (0.694) and a moderate beta value (+0.094), indicating a moderate impact on customer satisfaction.

f. **Route Availability and Convenience**. Has a moderate correlation (0.676) and a slightly higher beta value (+0.111), indicating a moderate impact on customer satisfaction.

g. **Airline Safety**. Shows a moderate correlation (0.673) but has a minimal regression beta value (+0.004), suggesting its influence on customer satisfaction is limited in the context of this model.

h. **Price/Ticket Fare**. Has the lowest correlation coefficient (0.582) and a relatively low regression beta value (+0.054), indicating it has a moderate impact on customer satisfaction.

Summary.

The statistical analysis confirms that all eight independent variables have a significant impact on customer loyalty. Improved customer service, passenger trust, and airliners' brand reputation are the most influential factors. The R Square value of 0.704 signifies that the model is robust, with the eight independent variables collectively explaining a substantial portion of the variance in customer loyalty for Biman Bangladesh Airlines. Among these variables, improved customer service, passenger trust, and the airline's brand reputation are the most influential. Focusing on these areas can significantly boost customer satisfaction and loyalty, contributing to the airline's long-term success. The model demonstrates that various factors, including service quality, brand perception, and operational convenience, are essential in shaping customer loyalty. These insights can guide strategic decisions for Biman Bangladesh Airlines to enhance customer satisfaction and loyalty by focusing on these key variables.

KEY VARIABLES THAT SIGNIFICANTLY INFLUENCE CUSTOMER SATISFACTION

In this section, the results from various statistical tests like Pearson correlation coefficients, regression coefficients, ANOVA results, Chi-Square values, Phi coefficients, and Cramer's V coefficients are integrated, to identify the key variables influencing customer satisfaction in Biman Bangladesh Airlines Limited.

Pearson Correlation

Independent Variable	Pearson Correlation Coefficient (r)
Passenger Trust	0.791
Airline Brand Reputation	0.736
Staff Service	0.737
Airline Safety	0.673
Route Availability and Convenience	0.676
Frequent Flyer Program	0.694
Price/Ticket Fare	0.582
Improved Customer Service	0.806

Interpretation of Pearson Correlation Coefficients.

The Pearson Correlation Coefficient (r) measures the strength and direction of the linear relationship between each independent variable and customer satisfaction. The values range from -1 to 1, where 1 indicates a perfect positive correlation, -1 indicates a perfect negative correlation, and 0 indicates no correlation. Here is the interpretation of the coefficients for each independent variable:

1) **Improved Customer Service**: With the highest Pearson correlation coefficient (r = 0.806), improved customer service shows a very strong positive relationship with customer satisfaction. Enhancing customer service is closely linked to increased satisfaction.

2) **Passenger Trust**: The coefficient (r = 0.791) indicates a very strong positive correlation with customer satisfaction. Higher passenger trust significantly boosts satisfaction.

3) **Staff Service**: A strong positive correlation (r = 0.737) suggests that better staff service is strongly linked to higher customer satisfaction.

4) **Airline Brand Reputation**: With a coefficient of r = 0.736, airline brand reputation shows a strong positive association with customer satisfaction. A better reputation leads to higher satisfaction.

5) **Airline Safety**: The coefficient (r = 0.673) indicates a moderately strong positive correlation. Higher safety standards are positively associated with customer satisfaction.

6) **Route Availability and Convenience**: A moderately strong positive correlation (r = 0.676) suggests that convenient and available routes significantly enhance customer satisfaction.

7) **Frequent Flyer Program**: The coefficient (r = 0.694) shows a moderately strong positive correlation, indicating that a well-managed frequent flyer program is positively linked to satisfaction.

8) **Price/Ticket Fare**: With the lowest coefficient (r = 0.582), price/ticket fare shows a moderate positive correlation with customer satisfaction. Fair pricing contributes to satisfaction but to a lesser extent than other factors.

Summary

Improved customer service, passenger trust, staff service, and airline brand reputation have the strongest positive correlations with customer satisfaction. Airline safety, route availability and convenience, and frequent flyer programs also have strong positive associations, while price/ticket fare has a moderate positive correlation. Prioritizing these variables can significantly enhance customer satisfaction for Biman Bangladesh Airlines Limited.

Beta Values of Multiple Linear Regression Analysis

In examining the factors that influence customer satisfaction for Biman Bangladesh Airlines Limited, Multiple linear regression analysis was performed on several independent variables. The beta values (β) mentioned below, from the regression analysis provide insights into the relative impact of each variable on customer satisfaction. Higher beta values indicate a stronger influence on customer satisfaction:

Coefficients: Multiple Linear Regression Analysis

Model		Unstandardized Coefficients		Standardized Coefficients	t	Sig.	95.0% Confidence Interval for B	
		B	Std. Error	Beta			Lower Bound	Upper Bound
1	(Constant)	-.490	.132		-3.697	.000	-.750	-.229

	Passenger's Trust	.291	.051	.263	5.729	.000	.191	.391
	Airliners' Brand Reputation	.082	.051	.074	1.613	.108	-.018	.183
	Staff Service	.103	.047	.098	2.194	.029	.011	.195
	Safety	.004	.050	.003	.084	.933	-.094	.102
	Route Availability and Convenience	.111	.045	.095	2.489	.013	.023	.199
	Frequent Flyer Programme	.094	.044	.084	2.127	.034	.007	.180
	Price	.054	.038	.046	1.417	.157	-.021	.129
	Improved Customer Service	.353	.050	.325	7.013	.000	.254	.452
a. Dependent Variable: Customer Satisfaction								

Interpretation of Regression Coefficients (Beta values).

The interpretation of beta values (β) in regression analysis can be categorized into ranges to understand the strength of the impact of each independent variable on the dependent variable, which in this case is customer satisfaction. The ranges are as very strong positive impact: $\beta > 0.30$, strong positive impact: $0.20 < \beta \leq 0.30$, moderate positive impact: $0.10 < \beta \leq 0.20$, weak positive impact: $0.05 < \beta \leq 0.10$, very weak positive impact: $\beta \leq 0.05$. Therefore, the interpretations of the beta values are as follows:

1) **Improved Customer Service**: The highest beta value of +0.353 signifies that improving customer service has the strongest positive impact on customer satisfaction.

2) **Passenger Trust**: With a beta value of +0.291, passenger trust is the second most influential factor, indicating a strong positive effect on customer satisfaction.

3) **Staff Service**: A beta value of +0.103 shows that better staff service has a moderate positive influence on customer satisfaction.

4) **Airline Brand Reputation**: The beta value of +0.082 suggests a smaller but still positive impact of the airline's brand reputation on customer satisfaction.

5) **Frequent Flyer Program**: A beta value of +0.094 indicates a moderate positive influence, showing that a well-managed frequent flyer program contributes to customer satisfaction.

6) **Route Availability and Convenience**: The beta value of +0.111 suggests a moderate positive impact, indicating that convenient and available routes are important for customer satisfaction.

7) **Airline Safety**: With a beta value of +0.004, airline safety has a negligible positive impact on customer satisfaction.

8) **Price/Ticket Fare**: The beta value of +0.054 shows a minor positive effect of ticket pricing on customer satisfaction.

Summary

Improved customer service and passenger trust are the most critical factors driving customer satisfaction for Biman Bangladesh Airlines Limited. Other significant factors include route availability and convenience, staff service, and the frequent flyer program. Airline brand reputation, price/ticket fare, and safety, while positive, have a smaller impact. Prioritizing improvements in customer service and trust can significantly enhance overall customer satisfaction.

R/R-Squared value (R^2)

Model Summary

Model	R	R Square	Adjusted R Square	Std. Error of the Estimate	Change Statistics				
					R Square Change	F Change	df1	df2	Sig. F Change
1	.865[a]	.749	.744	.580	.749	154.099	8	414	.000

a. Predictors: (Constant), Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Programme, Safety, Staff Service, Passenger's Trust, Airliners' Brand Reputation

Model Summary Interpretation

A brief interpretation of the model summary is given below:

1) **R (Correlation Coefficient)**: The R value of 0.865 indicates a very strong positive correlation between the predictors (Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Program, Safety, Staff Service, Passenger Trust, and Airline Brand Reputation) and the dependent variable (customer satisfaction). This high R value suggests that the model's predictors collectively have a substantial relationship with customer satisfaction.

2) **R Square (Coefficient of Determination)**: The R Square value of 0.749 implies that approximately 74.9% of the variability in customer satisfaction can be explained by the independent variables in the model. This high proportion indicates a strong explanatory power of the model, demonstrating that the predictors are effective in accounting for variations in customer satisfaction.

3) **Adjusted R Square**: The Adjusted R Square value of 0.744 provides a more accurate measure of the goodness of fit by adjusting for the number of predictors in the model. It indicates that 74.4% of the variance in customer satisfaction is explained by the model, accounting for potential overfitting. This value is very close to the R Square value, suggesting that the model's predictors are robust and there is minimal loss of explanatory power when adjusted for the number of predictors.

4) **Standard Error of the Estimate**: The standard error of 0.580 indicates the average distance that the observed values fall from the regression line. A lower standard error would indicate a closer fit of the model to the data points. Given the context, a standard error of 0.580 suggests a reasonably precise model, although there is still some room for improvement.

5) **R Square Change**: The R Square Change of 0.749 is equivalent to the R Square value since this is a single model summary. It confirms the substantial impact that the predictors have on the dependent variable.

6) **F Change and Significance**: The F Change value of 154.099 with a significance level (Sig. F Change) of .000 indicates that the model is statistically significant. The extremely low p-value (less than 0.001) confirms that the likelihood of the relationship between the predictors and customer satisfaction occurring by chance is very low. This high F Change value demonstrates that the overall regression model is a good fit and significantly better than a model with no predictors.

7) **Degrees of Freedom (df1 and df2)**: The degrees of freedom for the model (df1) are 8, and for the residual (df2) is 414. These values indicate the number of predictors in the model and the number of observations minus the number of predictors minus one, respectively. The degrees of

freedom help in determining the critical value for the F statistic, confirming the model's statistical significance.

Summary

The model summary indicates a very strong and significant relationship between the independent variables (improved customer service, price, route availability and convenience, frequent flyer program, safety, staff service, passenger trust, and airline brand reputation) and customer satisfaction. The high R and R Square values, along with a very significant F Change, underscore the effectiveness of the model in explaining the variability in customer satisfaction. The adjusted R Square value suggests that the model is robust and reliable, with minimal overfitting. Overall, the predictors used in this model provide a substantial and statistically significant explanation of customer satisfaction, making this a highly effective regression model.

ANOVA Analysis

ANOVA

Model		Sum of Squares	df	Mean Square	F	Sig.
1	Regression	414.559	8	51.820	154.099	.000[b]
	Residual	139.219	414	.336		
	Total	553.778	422			

a. Dependent Variable: Customer Satisfaction

b. Predictors: (Constant), Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Programme, Safety, Staff Service, Passenger's Trust, Airliners' Brand Reputation

Interpretation

A brief interpretation of the ANOVA model summary is given below:

1) **Sum of Squares (Regression)**: The regression sum of squares (414.559) represents the variability in customer satisfaction that is explained by the model. This large value compared to the residual sum of squares indicates that the independent variables (Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Program, Safety, Staff Service, Passenger Trust, and Airline Brand Reputation) explain a significant portion of the variation in customer satisfaction.

2) **Sum of Squares (Residual)**: The residual sum of squares (139.219) represents the variability in customer satisfaction that is not explained by the model. This relatively smaller value indicates that the model has a good fit, as most of the variability is accounted for by the predictors.

3) **Total Sum of Squares**: The total sum of squares (553.778) is the combined variability in customer satisfaction, encompassing both explained and unexplained variations. It is the sum of the regression and residual sums of squares.

4) **Degrees of Freedom (df)**: The degrees of freedom for the regression (df = 8) correspond to the number of predictors in the model. The residual degrees of freedom (df = 414) represent the number of observations minus the number of predictors minus one. These values are crucial for calculating the mean square and the F statistic.

5) **Mean Square (Regression)**: The mean square for the regression (51.820) is calculated by dividing the regression sum of squares by its degrees of freedom (414.559 / 8). This value represents the average variability explained by each predictor.

6) **Mean Square (Residual)**: The mean square for the residual (0.336) is calculated by dividing the residual sum of squares by its degrees of freedom (139.219 / 414). This value represents the average unexplained variability.

7) **F Statistic**: The F statistic (154.099) is the ratio of the mean square regression to the mean square residual (51.820 / 0.336). A high F value indicates that the variability explained by the model is much greater than the variability not explained by the model, suggesting a good fit.

8) **Significance (Sig.)**: The p-value (Sig. = .000) indicates the probability that the observed F statistic would occur if the null hypothesis were true (i.e., the predictors have no effect on customer satisfaction). A p-value of .000 (less than 0.05) indicates that the model is statistically significant and the null hypothesis can be rejected. This means that the predictors collectively have a significant impact on customer satisfaction.

Statistical Interpretation

The ANOVA analysis for the regression model demonstrates a highly significant fit, indicating that the independent variables collectively explain a substantial portion of the variability in customer satisfaction. The large regression sum of squares relative

to the residual sum of squares signifies that the model is robust and the predictors are effective. The F statistic of 154.099, coupled with a p-value of .000, confirms the statistical significance of the model. This indicates that the independent variables (Improved Customer Service, Price, Route Availability and Convenience, Frequent Flyer Program, Safety, Staff Service, Passenger Trust, and Airline Brand Reputation) have a strong and significant influence on customer satisfaction. The high mean square regression value and low mean square residual value further underscore the model's explanatory power. Overall, the ANOVA results validate the model's effectiveness and highlight the importance of the selected predictors in driving customer satisfaction.

Chi-Square Test Results

An analysis using the Chi-Square test is carried to determine the impact of the independent variables on customer satisfaction in Biman Bangladesh Airlines Limited. The study results as follows:

Independent Variable	Pearson Chi-Square	Phi Coefficient	Cramer's V	p-value
Passenger Trust	525.48	1.115	0.557	2.72×10−1162.72×10−116
Airliners' Brand Reputation	398.908	0.971	0.486	9.52×10−899.52×10−89
Staff Service	462.108	1.045	0.523	1.67×10−1021.67×10−102
Safety	306.113	0.851	0.425	1.53×10−681.53×10−68
Route Availability and Convenience	399.030	0.971	0.486	8.96×10−898.96×10−89
Frequent Flyer Programme	382.802	0.951	0.476	3.05×10−853.05×10−85
Price	351.872	0.912	0.456	1.66×10−781.66×10−78
Improved Customer Service	654.434	1.244	0.622	2.43×10−1442.43×10−144

Interpretation

A brief interpretation of Chi-Square test summary is given below:

1) **Improved Customer Service**: The highest Chi-square value (654.434), Phi (1.244), and Cramer's V (0.622) indicate a very strong association with customer satisfaction.

2) **Passenger Trust**: High Chi-square value (525.48), Phi (1.115), and Cramer's V (0.557) suggest a strong association.

3) **Staff Service:** High Chi-square value (462.108), Phi (1.045), and Cramer's V (0.523) indicate a strong association.

4) **Airline Brand Reputation**: Chi-square value (398.908), Phi (0.971), and Cramer's V (0.486) suggest a moderate to strong association.

5) **Route Availability and Convenience**: Similar values to brand reputation, indicating a moderate to strong association.

6) **Frequent Flyer Program**: Chi-square value (382.802), Phi (0.951), and Cramer's V (0.476) indicate a moderate association.

7) **Price/Ticket Fare**: Chi-square value (351.872), Phi (0.912), and Cramer's V (0.456) suggest a moderate association.

8) **Airline Safety**: Chi-square value (306.113), Phi (0.851), and Cramer's V (0.425) indicate a moderate association.

Prioritized Key Variables for Customer Satisfaction

These variables are prioritized based on their combined Pearson correlation coefficients, regression and Chi-Square test results, highlighting their importance in driving customer satisfaction for Biman Bangladesh Airlines Limited. Based on the combined analysis of the regression coefficients and Chi-Square tests, the key variables influencing customer satisfaction and loyalty are:

a. **Improved Customer Service**: Exhibits the strongest impact with both the highest Beta value and Chi-Square test results.

b. **Passenger Trust**: Demonstrates a strong positive effect and high Chi-Square values, indicating a significant influence.

c. **Staff Service**: Shows moderate to strong associations in both regression and Chi-Square analyses.

d. **Airline Brand Reputation**: Indicates a moderate to strong association in both analyses.

e. **Route Availability and Convenience**: Shows moderate to strong associations, confirming its importance.

f. **Frequent Flyer Program**: Exhibits a moderate influence, suggesting its significance.

g. **Price/Ticket Fare**: Has a moderate impact, indicating it is an important factor.

h. **Airline Safety**: Though it shows a moderate association, it is still a relevant variable.

Analytic View

The results indicate that Biman Bangladesh Airlines Limited should prioritize improved customer service as it has the strongest positive impact on customer satisfaction. Additionally, efforts should be made to enhance passenger trust, staff service, and the frequent flyer program, as these factors also significantly influence customer satisfaction. Maintaining a strong brand reputation and ensuring route availability and convenience are also crucial. While price is a significant factor, its impact is moderate compared to other variables. Overall, a comprehensive strategy that addresses these key variables can lead to higher customer satisfaction, thereby improving the competitive position of Biman Bangladesh Airlines Limited in the aviation industry.

Appendix 9

NORMALITY TEST OF SURVEY DATA IN R & PYTHON WITH OUTCOME

R OUTCOME

Shapiro-Wilk normality test

data: residuals

W = 0.97571, p-value = 1.555e-06

Anderson-Darling normality test

data: residuals

A = 2.626, p-value = 1.246e-06

PYTHON OUTCOME

Shapiro-Wilk Test on Residuals:

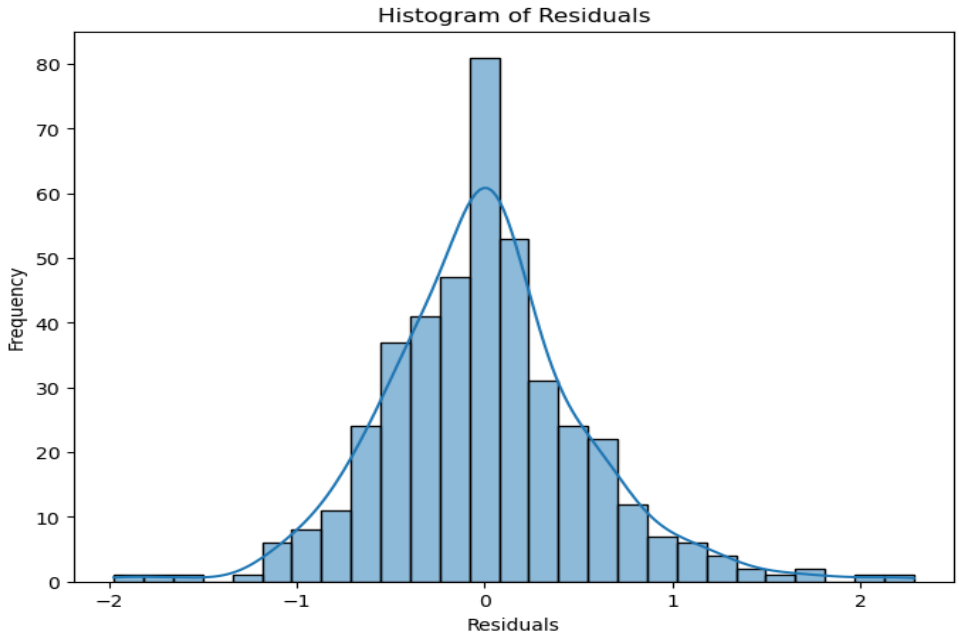
Statistic: 0.976, p-value: 0.000

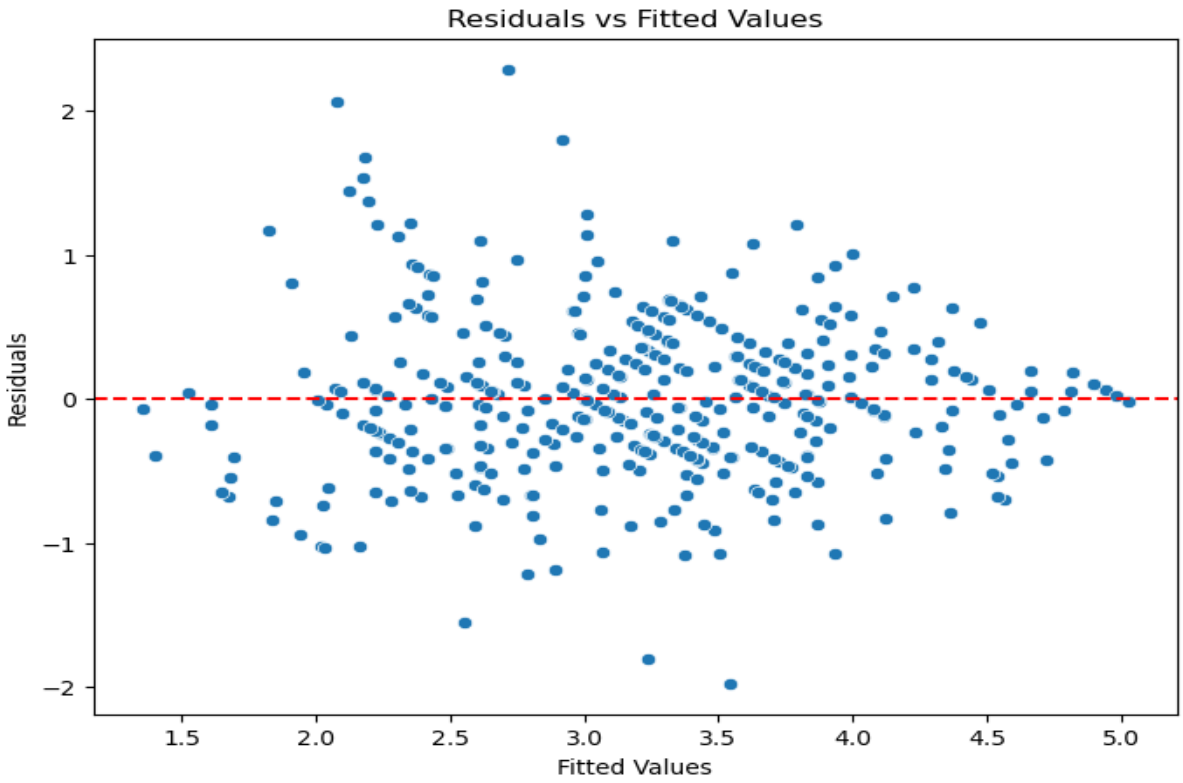
Anderson-Darling Test on Residuals:

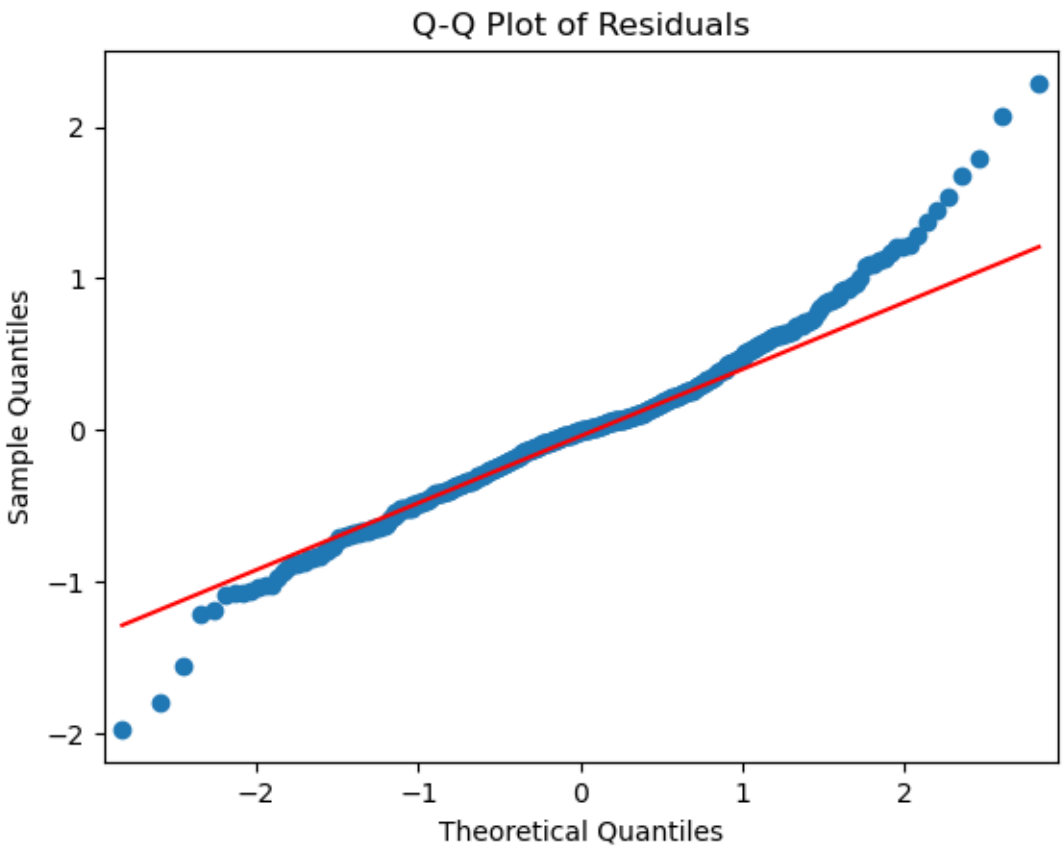
Statistic: 2.626

Critical values: [0.571 0.65 0.78 0.91 1.082]

Significance levels: [15. 10. 5. 2.5 1.]


Histogram of Residuals
Frequency
Residuals
0
10
20
30
40
50
60
70
80
−2
−1
0
1
2


Residuals vs Fitted Values
Residuals
Fitted Values
2
1
0
−1
−2
1.5
2.0
2.5
3.0
3.5
4.0
4.5
5.0



R OUTCOME

```
# Install and load necessary packages (if not already installed)
if(!require(nortest)){install.packages("nortest")}
if(!require(ggplot2)){install.packages("ggplot2")}
if(!require(dplyr)){install.packages("dplyr")}
library(nortest)
library(ggplot2)
library(dplyr)
# Specify the file path
file_path <- "F:/DBA 12 DEC MLR AND LOG REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv"
# Load the data
data <- read.csv(file_path)
# --- 1. Define Your Predictive Model ---
# Replace with *your* actual model formula!
# Example: (Linear Regression)
```

```
model_formula <- Customer_Loyalty ~ Age + Passanger_Trust + Brand_Reputation
+ Improved_Customer_Service
# --- 2. Fit the Model ---
model <- lm(model_formula, data = data)  # Or other model (glm, etc.)
# --- 3. Extract the Residuals ---
residuals <- residuals(model)
# --- 4. Normality Tests on Residuals ---
# Shapiro-Wilk Test on Residuals
shapiro_test <- shapiro.test(residuals)
print("Shapiro-Wilk Test on Residuals:")
print(shapiro_test)
# Anderson-Darling Test on Residuals
ad_test <- ad.test(residuals)
print("\nAnderson-Darling Test on Residuals:")
print(ad_test)
# --- 5. Visual Inspection of Residuals ---
# Histogram of Residuals
hist_plot <- ggplot(data.frame(residuals = residuals), aes(x = residuals)) +
  geom_histogram(aes(y = ..density..), fill = "lightblue", color = "black") +
  geom_density(color = "red") +
  labs(title = "Histogram of Residuals",
       x = "Residuals",
       y = "Density") +
  theme_bw()
print(hist_plot)
# Q-Q Plot of Residuals
qq_plot <- ggplot(data.frame(residuals = residuals), aes(sample = residuals)) +
  stat_qq() +
  stat_qq_line() +
  labs(title = "Q-Q Plot of Residuals",
       x = "Theoretical Quantiles",
       y = "Sample Quantiles") +
```

```
  theme_bw()
print(qq_plot)
# Optional: Residuals vs. Fitted Values Plot (for homoscedasticity)
# plot(model, which = 1) # Or use ggplot2 for a nicer plot
residual_fitted_plot <- ggplot(data.frame(fitted = fitted(model), residuals = residuals),
aes(x = fitted, y = residuals)) +
  geom_point() +
  geom_hline(yintercept = 0, color = "red", linetype = "dashed") +
  labs(title = "Residuals vs Fitted Values",
       x = "Fitted Values",
       y = "Residuals") +
  theme_bw()
print(residual_fitted_plot)
# ----- What to do if residuals are not normal -------
# 1. Check Model Specification: Is your model correctly specified?
# 2. Transformations: Try transforming the outcome variable or predictors.
# 3. Robust Standard Errors: In many cases, with a reasonable sample size, the
violations of normality of the residuals are not critical, especially if you use robust
standard errors.
```

R CODE

```
# Install and load necessary packages (if not already installed)
> if(!require(nortest)){install.packages("nortest")}
Loading required package: nortest
> if(!require(ggplot2)){install.packages("ggplot2")}
Loading required package: ggplot2
Warning message:
package ‘ggplot2’ was built under R version 4.4.2
> if(!require(dplyr)){install.packages("dplyr")}
Loading required package: dplyr
Attaching package: ‘dplyr’
The following objects are masked from ‘package:stats’:
    filter, lag
```

```
The following objects are masked from ‘package:base’:

    intersect, setdiff, setequal, union

Warning message:

package ‘dplyr’ was built under R version 4.4.2

> library(nortest)

> library(ggplot2)

> library(dplyr)

>

> # Specify the file path

> file_path <- "F:/DBA 12 DEC MLR AND LOG
REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv"

>

> # Load the data

> data <- read.csv(file_path)

>

> # --- 1. Define Your Predictive Model ---

> # Replace with *your* actual model formula!

> # Example: (Linear Regression)

> model_formula <- Customer_Loyalty ~ Age + Passanger_Trust +
Brand_Reputation + Improved_Customer_Service

>

> # --- 2. Fit the Model ---

> model <- lm(model_formula, data = data)  # Or other model (glm, etc.)

>

> # --- 3. Extract the Residuals ---

> residuals <- residuals(model)

>

> # --- 4. Normality Tests on Residuals ---

>

> # Shapiro-Wilk Test on Residuals

> shapiro_test <- shapiro.test(residuals)

> print("Shapiro-Wilk Test on Residuals:")

[1] "Shapiro-Wilk Test on Residuals:"
```

```
> print(shapiro_test)
        Shapiro-Wilk normality test
data:  residuals
W = 0.97571, p-value = 1.555e-06
>
> # Anderson-Darling Test on Residuals
> ad_test <- ad.test(residuals)
> print("\nAnderson-Darling Test on Residuals:")
[1] "\nAnderson-Darling Test on Residuals:"
> print(ad_test)

 Anderson-Darling normality test
data:  residuals
A = 2.626, p-value = 1.246e-06
>
> # --- 5. Visual Inspection of Residuals ---
>
> # Histogram of Residuals
> hist_plot <- ggplot(data.frame(residuals = residuals), aes(x = residuals)) +
+   geom_histogram(aes(y = ..density..), fill = "lightblue", color = "black") +
+   geom_density(color = "red") +
+   labs(title = "Histogram of Residuals",
+        x = "Residuals",
+        y = "Density") +
+   theme_bw()
> print(hist_plot)
`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
Warning message:
The dot-dot notation (`..density..`) was deprecated in ggplot2 3.4.0.
ℹ Please use `after_stat(density)` instead.
This warning is displayed once every 8 hours.
Call `lifecycle::last_lifecycle_warnings()` to see where this warning was
```

```
generated.
>
> # Q-Q Plot of Residuals
> qq_plot <- ggplot(data.frame(residuals = residuals), aes(sample = residuals)) +
+   stat_qq() +
+   stat_qq_line() +
+   labs(title = "Q-Q Plot of Residuals",
+        x = "Theoretical Quantiles",
+        y = "Sample Quantiles") +
+   theme_bw()
> print(qq_plot)
>
> # Optional: Residuals vs. Fitted Values Plot (for homoscedasticity)
> # plot(model, which = 1) # Or use ggplot2 for a nicer plot
>
> residual_fitted_plot <- ggplot(data.frame(fitted = fitted(model), residuals =
residuals), aes(x = fitted, y = residuals)) +
+   geom_point() +
+   geom_hline(yintercept = 0, color = "red", linetype = "dashed") +
+   labs(title = "Residuals vs Fitted Values",
+        x = "Fitted Values",
+        y = "Residuals") +
+   theme_bw()
> print(residual_fitted_plot)
```

PYTHON CODE

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
from scipy.stats import shapiro, anderson
```

```
import statsmodels.api as sm
import statsmodels.formula.api as smf  # For model fitting
# Specify the file path
file_path = "F:/DBA 12 DEC MLR AND LOG
REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv"

# Load the data
try:
    data = pd.read_csv(file_path)
except FileNotFoundError:
    print(f"Error: File not found at {file_path}")
    exit()

# --- 1. Define Your Predictive Model ---
# Replace with *your* actual model formula!
# Example: (Linear Regression)
model_formula = "Customer_Loyalty ~ Age + Passanger_Trust + Brand_Reputation
+ Improved_Customer_Service"

# --- 2. Fit the Model ---
try:
    model = smf.ols(model_formula, data=data).fit()  # Ordinary Least Squares
    # Or other model (e.g., a GLM)
except Exception as e:
    print(f"Error fitting model: {e}")
    exit()

# --- 3. Extract the Residuals ---
residuals = model.resid  # Get the residuals

# --- 4. Normality Tests on Residuals ---

# Shapiro-Wilk Test on Residuals
```

```
try:
    shapiro_test = shapiro(residuals)
    print("Shapiro-Wilk Test on Residuals:")
    print(f"  Statistic: {shapiro_test.statistic:.3f}, p-value: {shapiro_test.pvalue:.3f}")
except Exception as e:
    print(f"Shapiro-Wilk Test failed: {e}")

# Anderson-Darling Test on Residuals
try:
    anderson_test = anderson(residuals)
    print("\nAnderson-Darling Test on Residuals:")
    print(f"  Statistic: {anderson_test.statistic:.3f}")
    print("  Critical values:", anderson_test.critical_values)
    print("  Significance levels:", anderson_test.significance_level)
except Exception as e:
    print(f"Anderson-Darling Test failed: {e}")

# --- 5. Visual Inspection of Residuals ---

# Histogram of Residuals
plt.figure(figsize=(8, 6))
sns.histplot(residuals, kde=True)
plt.title("Histogram of Residuals")
plt.xlabel("Residuals")
plt.ylabel("Frequency")
plt.show()

# Q-Q Plot of Residuals
plt.figure(figsize=(8, 6))
sm.qqplot(residuals, line='q')
plt.title("Q-Q Plot of Residuals")
plt.show()
```

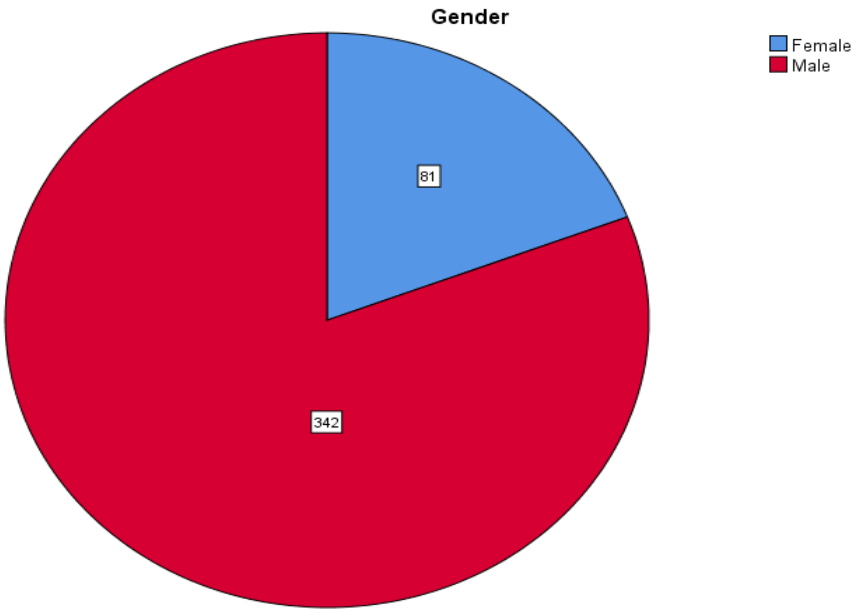
```
# Residuals vs Fitted Values Plot (for homoscedasticity)
plt.figure(figsize=(8, 6))
sns.scatterplot(x=model.fittedvalues, y=residuals)
plt.axhline(y=0, color='red', linestyle='--')
plt.title("Residuals vs Fitted Values")
plt.xlabel("Fitted Values")
plt.ylabel("Residuals")
plt.show()
```

Appendix 10

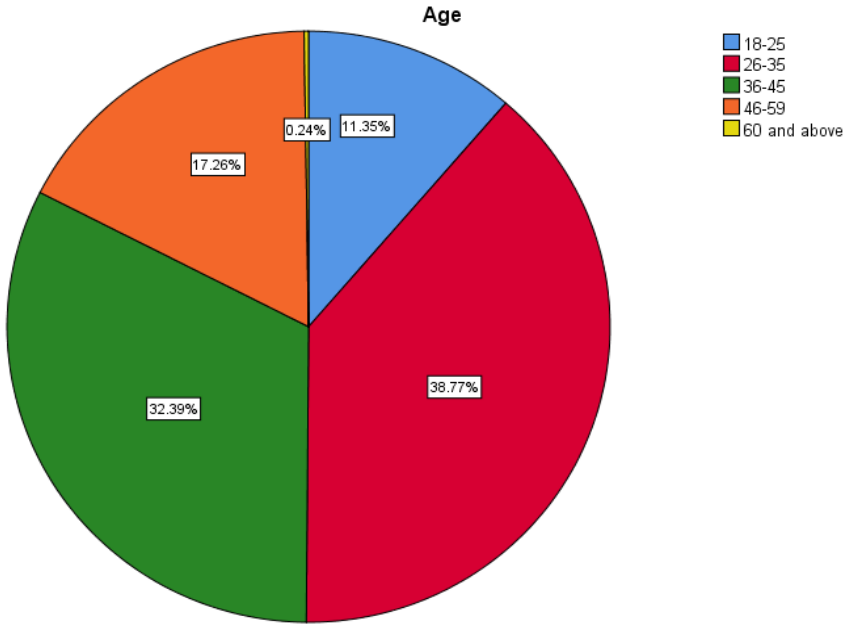
DESCRIPTIVE TEST STATISTICS

The section provides a detailed overview of the demographic and categorical characteristics of the 425 respondents surveyed in relation to Biman Bangladesh Airlines. The analysis covers several key variables: gender, age, nationality, education level, connection type with Biman, passenger type, and travel frequency. This comprehensive dataset enables a deeper understanding of the respondents' profiles, offering insights into the demographic composition and varied relationships with the airline. The following summary highlights the main findings from each category, supported by specific data points.

Gender. The data shows that out of 425 respondents, 82 (19.1%) were female and 343 (80.9%) were male. This distribution indicates a significant gender imbalance in the sample, with males comprising the majority. A pie chart representation would visually highlight the substantial gap in gender representation, with the male segment dominating the chart, representing around 81% of the total, while the female segment would appear significantly smaller at about 19%.

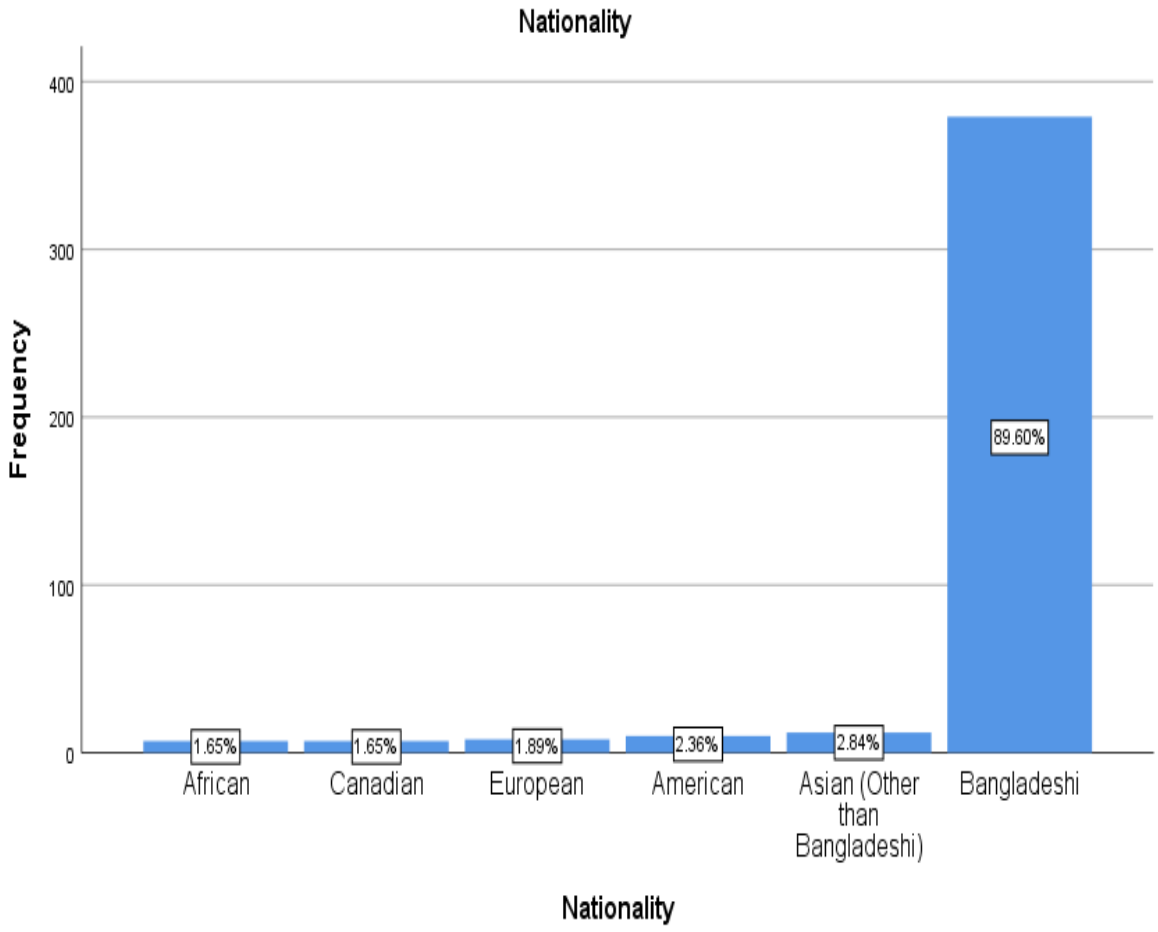


Age. Based on the data on age groups, it is found that a majority of respondents falling within the age range of 26-35, representing 38.8% of the total 425 samples. The next most common age group is 36-45, accounting for 32.4% of the respondents. Age groups 18-25 and 46-59 make up 11.3% and 17.3% of the sample, respectively, while those aged 60 and above constitute just 0.2%. This distribution gives us an overview of the age demographics within the surveyed population and allows us to understand the age distribution among the respondents.



Age					
		Frequency	Percent	Valid Percent	Cumulative Percent
Valid	18-25	48	11.3	11.3	11.3
	26-35	164	38.8	38.8	50.1
	36-45	137	32.4	32.4	82.5
	46-59	73	17.3	17.3	99.8
	60 and above	1	.2	.2	100.0
	Total	425	100.0	100.0	

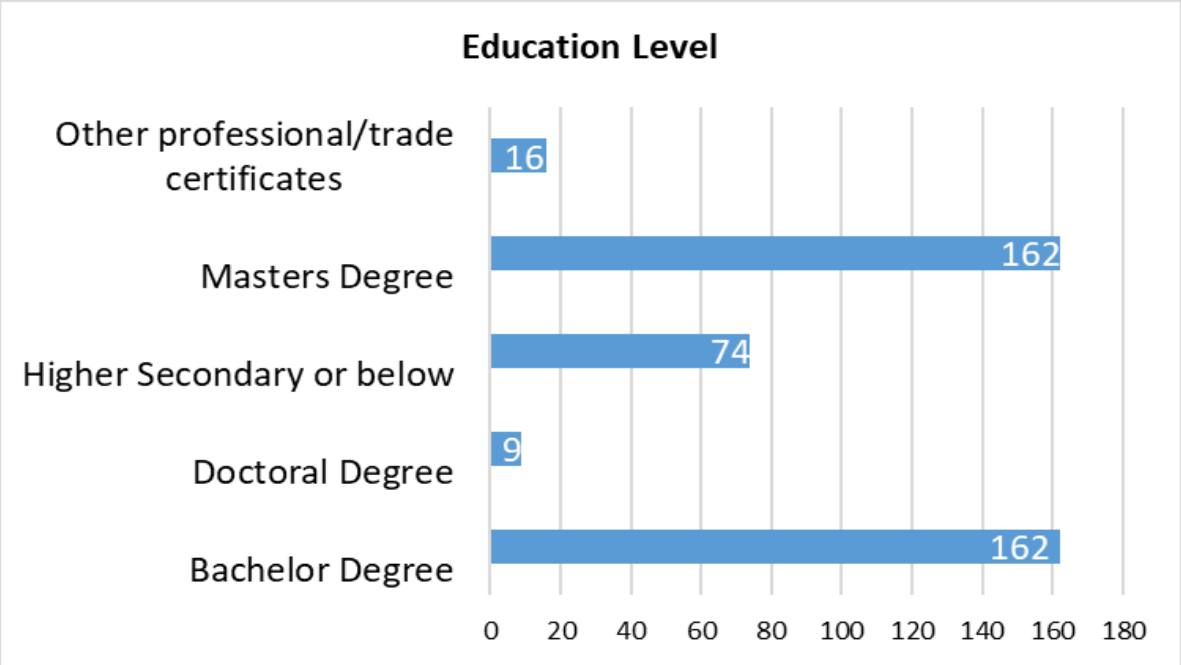
Nationality. The bar chart representing the distribution of nationalities among respondents shows that Bangladeshi nationality is overwhelmingly dominant in the sample, comprising 89.6% of the total. Other nationalities such as African, Canadian, European, American, and Asian (other than Bangladeshi) are each represented by smaller percentages, ranging from 1.7% to 2.8%. This visualization provides a clear comparison of the nationalities present in the surveyed population, highlighting the significant majority of Bangladeshi respondents compared to others.



Nationality					
		Frequency	Percent	Valid Percent	Cumulative Percent
Valid	African	7	1.7	1.7	1.7
	Canadian	7	1.7	1.7	3.3
	European	8	1.9	1.9	5.2
	American	10	2.4	2.4	7.6
	Asian (Other than Bangladeshi)	12	2.8	2.8	10.4
	Bangladeshi	379	89.6	89.6	100.0
	Total	425	100.0	100.0	

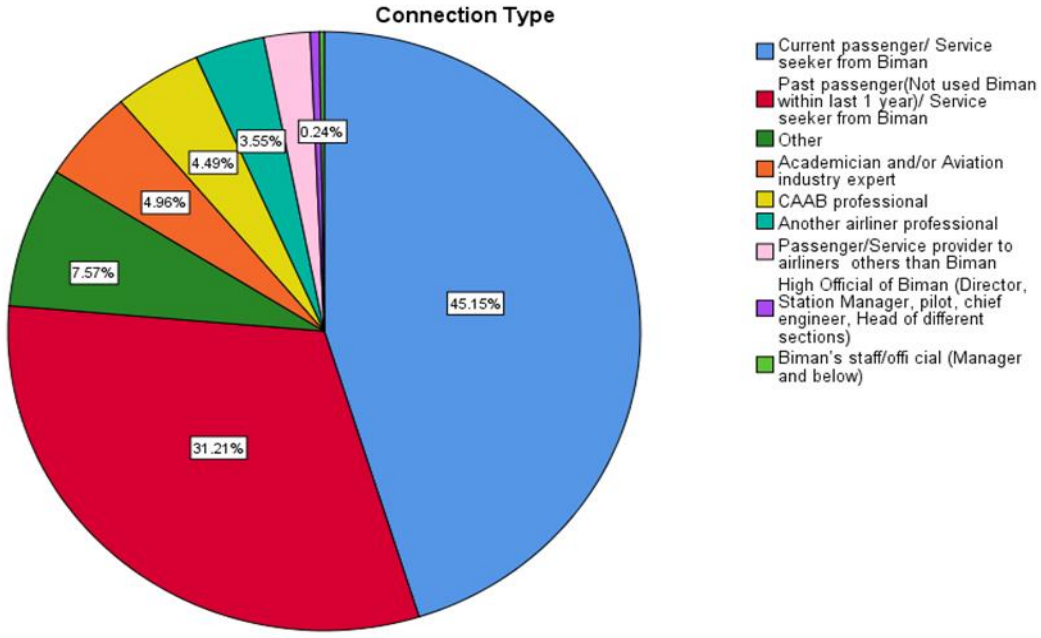
Education Level. The bar chart illustrating the distribution of education levels among respondents indicates a fairly even split between Bachelor's and Master's degrees, with both categories representing 162 (38.3%) of the sample each. Higher Secondary education or below accounts for 74 (17.5%) of

respondents, while individuals with Other professional/trade certificates and Doctoral Degrees constitute 16 (3.8%) and 9 (2.1%) of the total, respectively. This visual representation offers a comparison of the diverse educational backgrounds within the surveyed population, showcasing the prevalence of Bachelor's and Master's degree holders alongside other educational qualifications.



Education Level					
		Frequency	Percent	Valid Percent	Cumulative Percent
Valid	Doctoral Degree	9	2.1	2.1	2.1
	Other professional/trade certificates	16	3.8	3.8	5.9
	Higher Secondary or below	74	17.5	17.5	23.4
	Bachelor Degree	162	38.3	38.3	61.7
	Master's Degree	162	38.3	38.3	100.0
	Total	425	100.0	100.0	

Connection Type. The data represents the distribution of respondents based on their connection type with Bangladesh Biman, an airline service provider. A total of 425 respondents participated in the survey. The majority of respondents (45.2%) identified as current passengers or service seekers from Biman. Following this, 31.2% were past passengers or service seekers from Biman who hadn't used Biman's services within the last year. Other categories include individuals from various backgrounds such as academia and aviation industry experts (5.0%), CAAB (Civil Aviation Authority of Bangladesh) professionals (4.5%), and professionals from other airliners (3.5%). Additionally, there were respondents who were passengers or service providers to airliners other than Biman (2.4%), high officials of Biman (0.5%), and Biman's staff or officials (0.2%). This data illustrates the diverse range of connections people have with Biman, providing insights into the airline's stakeholders and customer base.

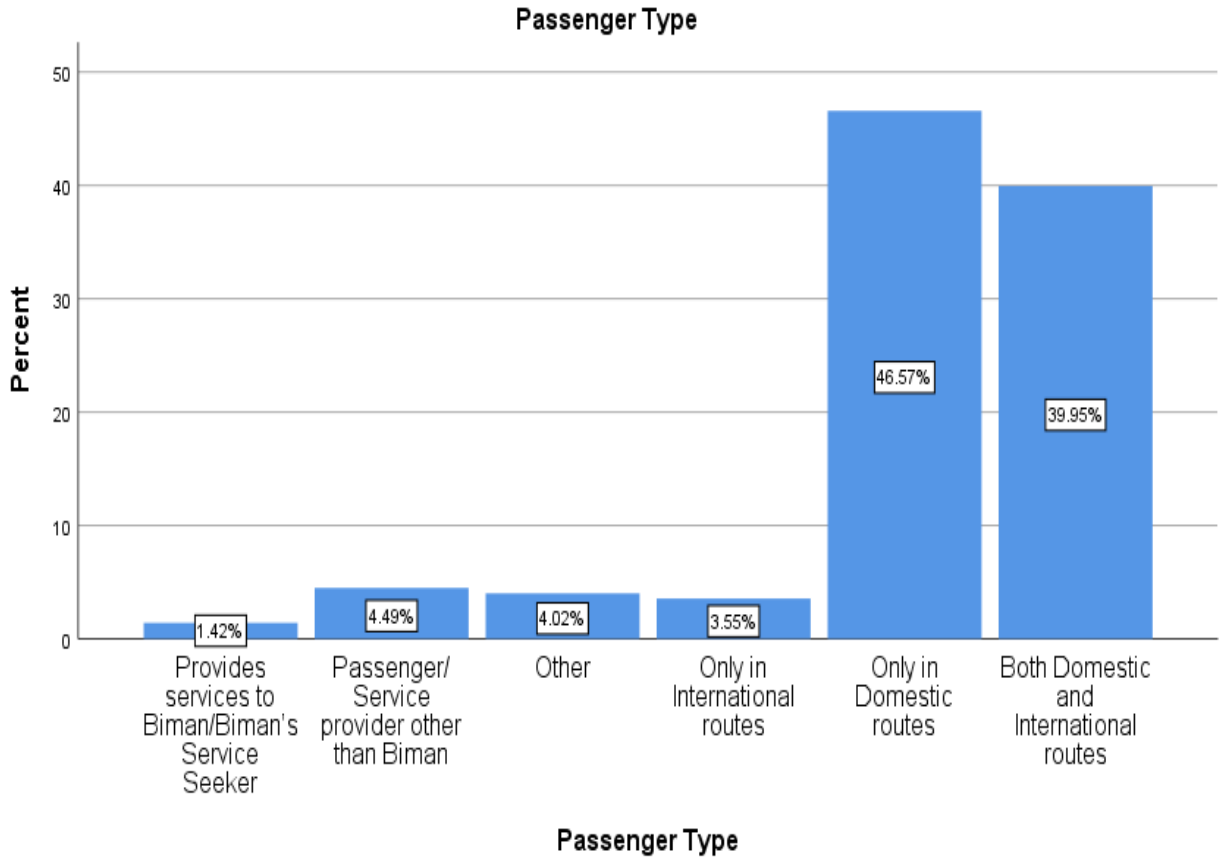


Connection Type				
	Frequency	Percent	Valid Percent	Cumulative Percent

Valid	Current passenger/ Service seeker from Biman	191	45.2	45.2	45.2
	Past passenger (Not used Biman within last 1 year)/ Service seeker from Biman	132	31.2	31.2	76.4
	Other	32	7.6	7.6	83.9
	Academician and/or Aviation industry expert	21	5.0	5.0	88.9
	CAAB professional	19	4.5	4.5	93.4
	Another airliner professional	15	3.5	3.5	96.9
	Passenger/Service provider to airliners others than Biman	10	2.4	2.4	99.3
	High Official of Biman (Director, Station Manager, pilot, chief engineer, Head of different sections)	2	.5	.5	99.8
	Biman's staff/official (Manager and below)	1	.2	.2	100.0
	Total	425	100.0	100.0	

Passenger Type.The data illustrates the distribution of passenger types among respondents in relation to Biman, an airline service provider. Out of 425 respondents, the majority (46.6%) exclusively travel on domestic routes, while 40.0% travel on both domestic and international routes. Additionally, 3.5% exclusively travel on international routes. A smaller proportion of respondents (4.5%) identified as passengers or service providers for airlines other than Biman, while 1.4% provide services to Biman or are service seekers. There's also a

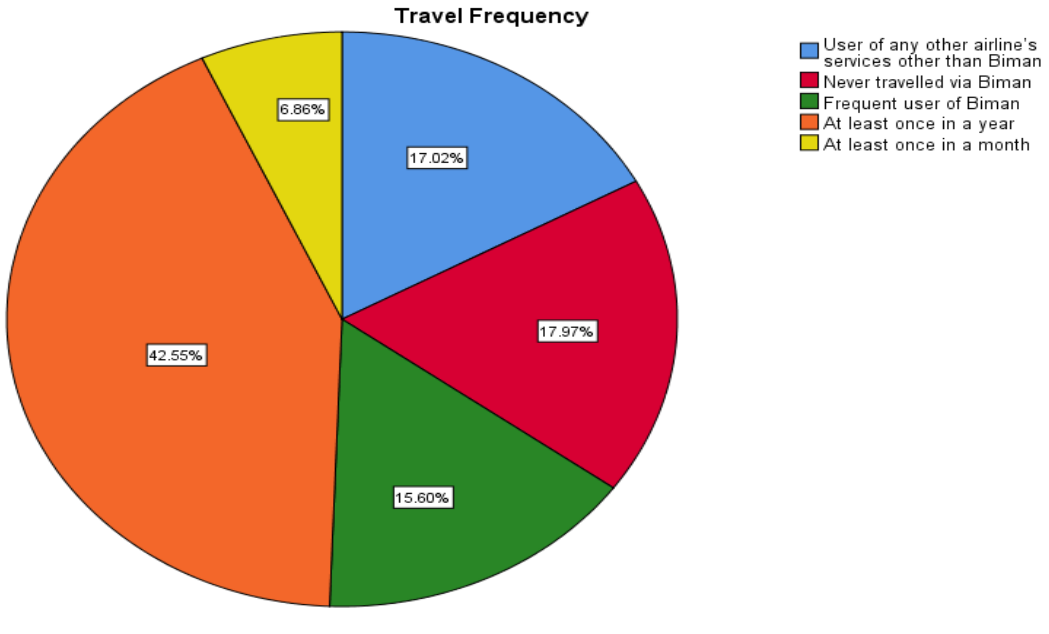
category labeled "Other," representing 4.0% of respondents. This breakdown offers insights into the preferences and travel habits of Biman's passengers, highlighting the significant proportion who utilize its domestic services.



Passenger Type

		Frequency	Percent	Valid Percent	Cumulative Percent
Valid	Provides services to Biman/ Biman's Service Seeker	6	1.4	1.4	1.4
	Passenger/ Service provider other than Biman	19	4.5	4.5	5.9
	Other	17	4.0	4.0	9.9
	Only in International routes	15	3.5	3.5	13.5
	Only in Domestic routes	197	46.6	46.6	60.0
	Both Domestic and International routes	169	40.0	40.0	100.0
	Total	425	100.0	100.0	

Travel Frequency: The data depicts the travel frequency of respondents, categorized based on their relationship with Biman, an airline service provider. Among 425 respondents, the majority (42.6%) reported using Biman's services at least once a year, while 15.6% identified as frequent users of Biman. Additionally, 17.0% were users of other airlines' services besides Biman, and 18.0% stated they had never traveled via Biman. A smaller proportion of respondents (6.9%) reported traveling via Biman at least once a month. This breakdown provides insights into the frequency of travel among Biman's customers and their usage patterns compared to other airlines.



Travel Frequency					
		Frequency	Percent	Valid Percent	Cumulative Percent
Valid	User of any other airline's services other than Biman	72	17.0	17.0	17.0
	Never travelled via Biman	76	18.0	18.0	35.0
	Frequent user of Biman	66	15.6	15.6	50.6
	At least once in a year	180	42.6	42.6	93.1
	At least once in a month	29	6.9	6.9	100.0
	Total	425	100.0	100.0	

The section offers a comprehensive, data-driven snapshot of the surveyed population, providing valuable insights into the demographics and relationships of Biman Bangladesh Airlines' respondents. This data serves as a foundation for further analysis and interpretation within the research, helping to understand the dynamics and preferences of Biman's customer base.

Appendix 11

OUTCOME OF CORRELATION ANALYSIS IN SPSS

Correlations

		Passenger's Trust	Airliners' Brand Reputation	Staff Service	Safety	Route Availability and Convenience	Frequent Flyer Programme	Price	Improved Customer Service	Customer Satisfaction	Customer Loyalty
Passenger's Trust	Pearson Correlation	1	.743**	.740**	.699**	.655**	.673**	.607**	.773**	.791**	.741**
	Sig. (2-tailed)		.000	.000	.000	.000	.000	.000	.000	.000	.000
	Sum of Squares and Cross-products	452.468	336.021	350.872	278.383	279.702	303.191	259.979	356.809	396.000	347.851
	Covariance	1.072	.796	.831	.660	.663	.718	.616	.846	.938	.824
	N	423	423	423	423	423	423	423	423	423	423
Airliners' Brand Reputation	Pearson Correlation	.743**	1	.770**	.656**	.693**	.705**	.570**	.730**	.736**	.730**
	Sig. (2-tailed)	.000		.000	.000	.000	.000	.000	.000	.000	.000
	Sum of Squares and Cross-products	336.021	451.764	364.863	260.967	295.532	317.095	243.792	336.683	368.111	342.322
	Covariance	.796	1.071	.865	.618	.700	.751	.578	.798	.872	.811
	N	423	423	423	423	423	423	423	423	423	423
Staff Service	Pearson Correlation	.740**	.770**	1	.667**	.641**	.650**	.545**	.751**	.737**	.707**
	Sig. (2-tailed)	.000	.000		.000	.000	.000	.000	.000	.000	.000
	Sum of Squares and Cross-products	350.872	364.863	496.600	278.421	286.809	306.655	244.359	363.456	386.444	347.626
	Covariance	.831	.865	1.177	.660	.680	.727	.579	.861	.916	.824
	N	423	423	423	423	423	423	423	423	423	423

Safety	Pearson Correlation	.699**	.656**	.667**	1	.640**	.651**	.562**	.709**	.673**	.689**
	Sig. (2-tailed)	.000	.000	.000		.000	.000	.000	.000	.000	.000
	Sum of Squares and Cross-products	278.383	260.967	278.421	350.515	240.574	257.813	211.811	288.076	296.556	284.565
	Covariance	.660	.618	.660	.831	.570	.611	.502	.683	.703	.674
	N	423	423	423	423	423	423	423	423	423	423
Route Availability and Convenience	Pearson Correlation	.655**	.693**	.641**	.640**	1	.657**	.519**	.655**	.676**	.665**
	Sig. (2-tailed)	.000	.000	.000	.000		.000	.000	.000	.000	.000
	Sum of Squares and Cross-products	279.702	295.532	286.809	240.574	402.553	278.787	209.468	285.213	319.000	294.277
	Covariance	.663	.700	.680	.570	.954	.661	.496	.676	.756	.697
	N	423	423	423	423	423	423	423	423	423	423
Frequent Flyer Programme	Pearson Correlation	.673**	.705**	.650**	.651**	.657**	1	.511**	.703**	.694**	.691**
	Sig. (2-tailed)	.000	.000	.000	.000	.000		.000	.000	.000	.000
	Sum of Squares and Cross-products	303.191	317.095	306.655	257.813	278.787	447.962	217.683	322.927	345.556	322.671
	Covariance	.718	.751	.727	.611	.661	1.062	.516	.765	.819	.765
	N	423	423	423	423	423	423	423	423	423	423
Price	Pearson Correlation	.607**	.570**	.545**	.562**	.519**	.511**	1	.574**	.582**	.599**
	Sig. (2-tailed)	.000	.000	.000	.000	.000	.000		.000	.000	.000
	Sum of Squares and Cross-products	259.979	243.792	244.359	211.811	209.468	217.683	405.097	250.761	275.778	266.123
	Covariance	.616	.578	.579	.502	.496	.516	.960	.594	.654	.631
	N	423	423	423	423	423	423	423	423	423	423
Improved Customer Service	Pearson Correlation	.773**	.730**	.751**	.709**	.655**	.703**	.574**	1	.806**	.771**
	Sig. (2-tailed)	.000	.000	.000	.000	.000	.000	.000		.000	.000

	Sum of Squares and Cross-products	356.809	336.683	363.456	288.076	285.213	322.927	250.761	471.296	411.889	369.551
	Covariance	.846	.798	.861	.683	.676	.765	.594	1.117	.976	.876
	N	423	423	423	423	423	423	423	423	423	423
Customer Satisfaction	Pearson Correlation	.791**	.736**	.737**	.673**	.676**	.694**	.582**	.806**	1	.789**
	Sig. (2-tailed)	.000	.000	.000	.000	.000	.000	.000	.000		.000
	Sum of Squares and Cross-products	396.000	368.111	386.444	296.556	319.000	345.556	275.778	411.889	553.778	409.889
	Covariance	.938	.872	.916	.703	.756	.819	.654	.976	1.312	.971
	N	423	423	423	423	423	423	423	423	423	423
Customer Loyalty	Pearson Correlation	.741**	.730**	.707**	.689**	.665**	.691**	.599**	.771**	.789**	1
	Sig. (2-tailed)	.000	.000	.000	.000	.000	.000	.000	.000	.000	
	Sum of Squares and Cross-products	347.851	342.322	347.626	284.565	294.277	322.671	266.123	369.551	409.889	487.083
	Covariance	.824	.811	.824	.674	.697	.765	.631	.876	.971	1.154
	N	423	423	423	423	423	423	423	423	423	423

**. Correlation is significant at the 0.01 level (2-tailed).

Appendix 12

R CODE AND OUTCOME FOR DETERMINING OLOGIT REGRESSION

R Code

```
# Load required libraries
library(MASS)      # For ordered logit (polr)
library(readr)     # For reading CSV files
library(brant)     # For testing proportional odds assumption
library(VGAM)      # For generalized ordered logit (if needed)


# Load the dataset
file_path <- "F:/DBA 12 DEC MLR AND LOG REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv"
data <- read_csv(file_path)  # Use read.csv() if readr is not installed


# Check the structure of the data
str(data)


# Ensure 'Customer_Loyalty' is an ordered factor (replace with actual levels if needed)
data$Customer_Loyalty <- factor(
  data$Customer_Loyalty,
  levels = c("Low", "Medium", "High"),  # Replace with your actual levels
  ordered = TRUE
)


# Define independent variables
independent_vars <- c(
  "Gender", "Age", "Nationality", "Education_Level",
  "Nature_of_connection", "Passenger_Customer_Type",
  "Travel_Frequency", "Passanger_Trust", "Brand_Reputation",
```

```
  "Biman_Staffs_Services", "Airline_Safety", "Route_availability",
  "Frequent_Flyer_Program", "Price", "Improved_Customer_Service"
)

# Build the formula for the ordered logit model
formula <- as.formula(
  paste("Customer_Loyalty ~", paste(independent_vars, collapse = " + "))
)

# Fit the ordered logit model using polr()
ologit_model <- polr(
  formula,
  data = data,
  Hess = TRUE,      # To compute standard errors
  method = "logistic"
)

# Display model summary
summary(ologit_model)

# Calculate p-values (since summary() doesn't provide them)
coef_table <- coef(summary(ologit_model))
p_values <- 2 * pnorm(abs(coef_table[, "t value"]), lower.tail = FALSE)
coef_table <- cbind(coef_table, "p-value" = p_values)
print(coef_table)

# Test the Proportional Odds Assumption (Brant Test)
if (!require("brant")) install.packages("brant")
library(brant)
```

```
brant_test <- brant(ologit_model)
print(brant_test)

# If the assumption is violated, use Generalized Ordered Logit (VGAM)
if (any(brant_test$p.value < 0.05)) {
  message("Proportional odds assumption violated. Switching to Generalized Ordered Logit.")
  gologit_model <- vglm(
    formula,
    family = cumulative(parallel = FALSE),  # Relaxes proportional odds
    data = data
  )
  summary(gologit_model)
}

# Compute Odds Ratios for interpretation
odds_ratios <- exp(coef(ologit_model))
print(odds_ratios)

# Predict probabilities for each loyalty level
predicted_probs <- predict(ologit_model, type = "probs")
head(predicted_probs)

# Visualize the distribution of Customer_Loyalty
barplot(table(data$Customer_Loyalty),
        main = "Distribution of Customer Loyalty",
        xlab = "Loyalty Level",
        ylab = "Count",
        col = "skyblue")
```

R Outcome for Ordered Logit Regression

```
R version 4.4.1 (2024-06-14 ucrt) -- "Race for Your Life"
Copyright (C) 2024 The R Foundation for Statistical Computing
Platform: x86_64-w64-mingw32/x64

R is free software and comes with ABSOLUTELY NO WARRANTY.
You are welcome to redistribute it under certain conditions.
Type 'license()' or 'licence()' for distribution details.

  Natural language support but running in an English locale

R is a collaborative project with many contributors.
Type 'contributors()' for more information and
'citation()' on how to cite R or R packages in publications.

Type 'demo()' for some demos, 'help()' for on-line help, or
'help.start()' for an HTML browser interface to help.
Type 'q()' to quit R.

[Previously saved workspace restored]

> # Load necessary libraries
> library(MASS)       # For ordered logit (polr)
Warning message:
package ‘MASS’ was built under R version 4.4.3
> library(foreign)    # For reading data
> library(ggplot2)    # For visualization (optional)
```

```
Warning message:
package ‘ggplot2’ was built under R version 4.4.2
> library(brant)      # For testing proportional odds assumption (install if needed)
Warning message:
package ‘brant’ was built under R version 4.4.3
>
> # Read the dataset
> file_path <- "F:/DBA 12 DEC MLR AND LOG REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv"
> data <- read.csv(file_path)
Error in file(file, "rt") : cannot open the connection
In addition: Warning message:
In file(file, "rt") :
  cannot open file 'F:/DBA 12 DEC MLR AND LOG REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv': No such file or directory
>
> # Check structure of the data
> str(data)
'data.frame':   425 obs. of  17 variables:
 $ Gender                  : int  1 1 1 1 2 1 1 1 1 1 ...
 $ Age                     : int  3 4 2 3 2 3 4 2 2 2 ...
 $ Nationality             : int  1 1 1 1 1 1 1 1 1 1 ...
 $ Education_Level         : int  2 2 3 2 2 2 2 3 3 3 ...
 $ Nature_of_connection    : int  1 2 1 1 1 3 1 1 1 3 ...
 $ Passenger_Customer_Type : int  1 1 1 3 3 6 3 3 1 1 ...
 $ Travel_Frequency        : int  3 4 2 2 4 3 4 2 2 2 ...
 $ Passanger_Trust         : num  3.2 2.4 3.6 2 1.8 3.4 2.8 4.8 5 5 ...
 $ Brand_Reputation        : num  2.17 1.17 3 1.83 1.5 3.67 1.83 3.33 4.33 5 ...
 $ Biman_Staffs_Services   : num  2 1 4 1.5 2.25 4.25 2.75 3 5 5 ...
```

```
 $ Airline_Safety           : num  3 2 3.33 3 2.67 4.33 3.67 4.67 4.67 5 ...
 $ Route_availability       : num  2 1 2 3 2 4.5 2.5 4.5 4.5 5 ...
 $ Frequent_Flyer_Program   : num  2 1 2 1.5 3 4.5 2 3 4.5 5 ...
 $ Price                    : num  3.75 2 4.25 3.25 1.75 4.5 2 5 4.75 5 ...
 $ Customer_Satisfaction    : num  3 1 3.67 2 2 4.33 2.67 5 5 5 ...
 $ Improved_Customer_Service: num  3.25 1.25 4 3.25 2.25 4.5 3 4.75 4.75 5 ...
 $ Customer_Loyalty         : num  3.86 1.14 3 2.86 1.14 4.43 2.71 4.29 4.71 5 ...
>
> # Ensure 'Customer_Loyalty' is an ordered factor
> data$Customer_Loyalty <- factor(data$Customer_Loyalty, ordered = TRUE)
>
> # Define independent variables
> independent_vars <- c(
+   "Gender", "Age", "Nationality", "Education_Level",
+   "Nature_of_connection", "Passenger_Customer_Type",
+   "Travel_Frequency", "Passanger_Trust", "Brand_Reputation",
+   "Biman_Staffs_Services", "Airline_Safety", "Route_availability",
+   "Frequent_Flyer_Program", "Price", "Improved_Customer_Service"
+ )
>
> # Build the ordered logit model using 'polr'
> formula <- as.formula(paste("Customer_Loyalty ~", paste(independent_vars,
collapse = " + ")))
> ologit_model <- polr(formula, data = data, Hess = TRUE, method = "logistic")
>
> # Summary of the model
> summary(ologit_model)
Call:
polr(formula = formula, data = data, Hess = TRUE, method = "logistic")
```

Coefficients:

	Value	Std. Error	t value
Gender	-0.25344	0.23178	-1.0935
Age	0.24270	0.11298	2.1483
Nationality	0.06676	0.23910	0.2792
Education_Level	0.32576	0.12655	2.5743
Nature_of_connection	0.01398	0.03439	0.4063
Passenger_Customer_Type	0.03337	0.06454	0.5170
Travel_Frequency	-0.04369	0.07617	-0.5735
Passanger_Trust	0.38374	0.18995	2.0202
Brand_Reputation	0.58606	0.18635	3.1449
Biman_Staffs_Services	-0.06551	0.16863	-0.3885
Airline_Safety	0.30342	0.16973	1.7877
Route_availability	0.26383	0.14330	1.8412
Frequent_Flyer_Program	0.41396	0.14405	2.8737
Price	0.54146	0.14130	3.8319
Improved_Customer_Service	1.36496	0.19513	6.9953

Intercepts:

	Value	Std. Error	t value
1|1.14	6.5283	0.9793	6.6665
1.14|1.29	6.9726	0.9711	7.1803
1.29|1.43	7.3765	0.9679	7.6212
1.43|1.57	7.7278	0.9639	8.0169
1.57|1.71	8.2803	0.9588	8.6357
1.71|1.86	8.5618	0.9570	8.9467
1.86|2	8.8403	0.9552	9.2552
2|2.14	9.6690	0.9591	10.0816

2.14|2.29 10.1170 0.9658   10.4756

2.29|2.43 10.5026 0.9729   10.7951

2.43|2.57 10.8188 0.9790   11.0506

2.57|2.71 11.2328 0.9870   11.3808

2.71|2.86 11.6340 0.9951   11.6909

2.86|3   12.0415 1.0033   12.0024

3|3.14   13.0211 1.0247   12.7068

3.14|3.29 13.4809 1.0358   13.0152

3.29|3.43 13.9498 1.0463   13.3329

3.43|3.57 14.2291 1.0525   13.5188

3.57|3.71 14.6601 1.0634   13.7861

3.71|3.86 15.2615 1.0787   14.1485

3.86|4   15.8514 1.0930   14.5023

4|4.14   16.9465 1.1221   15.1020

4.14|4.29 17.2962 1.1338   15.2544

4.29|4.43 17.6071 1.1453   15.3730

4.43|4.57 18.0612 1.1635   15.5229

4.57|4.71 18.6832 1.1869   15.7410

4.71|4.86 19.1420 1.2040   15.8991

4.86|5   19.4506 1.2167   15.9869

Residual Deviance: 2081.416

AIC: 2167.416

>

> # Check p-values (since summary() doesn't provide them by default)

> # Calculate p-values using coefficients and standard errors

> coef_table <- coef(summary(ologit_model))

> p_values <- pnorm(abs(coef_table[, "t value"]), lower.tail = FALSE) * 2

> coef_table <- cbind(coef_table, "p value" = p_values)

```
> print(coef_table)
                          Value Std. Error    t value      p value
Gender                 -0.25344170 0.23177664 -1.0934738 2.741858e-01
Age                     0.24270487 0.11297541  2.1482983 3.169007e-02
Nationality             0.06676162 0.23910216  0.2792180 7.800775e-01
Education_Level         0.32576134 0.12654587  2.5742550 1.004562e-02
Nature_of_connection    0.01397574 0.03439489  0.4063319 6.844988e-01
Passenger_Customer_Type 0.03336886 0.06453799  0.5170421 6.051268e-01
Travel_Frequency       -0.04368743 0.07617467 -0.5735165 5.662950e-01
Passanger_Trust         0.38374271 0.18995066  2.0202231 4.336025e-02
Brand_Reputation        0.58605986 0.18635021  3.1449380 1.661220e-03
Biman_Staffs_Services  -0.06551167 0.16863453 -0.3884831 6.976586e-01
Airline_Safety          0.30342240 0.16972591  1.7877200 7.382119e-02
Route_availability      0.26383102 0.14329592  1.8411621 6.559780e-02
Frequent_Flyer_Program  0.41395713 0.14405261  2.8736525 4.057551e-03
Price                   0.54145522 0.14130370  3.8318546 1.271809e-04
Improved_Customer_Service  1.36496433 0.19512568  6.9953086 2.646757e-12
1|1.14                  6.52827702 0.97927239  6.6664568 2.620529e-11
1.14|1.29               6.97259890 0.97107271  7.1803057 6.955571e-13
1.29|1.43               7.37645217 0.96787960  7.6212498 2.512312e-14
1.43|1.57               7.72775868 0.96393267  8.0169071 1.084411e-15
1.57|1.71               8.28025198 0.95883954  8.6357015 5.836776e-18
1.71|1.86               8.56184688 0.95698780  8.9466625 3.663923e-19
1.86|2                  8.84032663 0.95517766  9.2551647 2.139003e-20
2|2.14                  9.66897031 0.95906869 10.0816244 6.661559e-24
2.14|2.29              10.11700177 0.96576385 10.4756476 1.117700e-25
2.29|2.43              10.50257757 0.97290290 10.7950933 3.630934e-27
2.43|2.57              10.81876405 0.97902304 11.0505714 2.178240e-28
2.57|2.71              11.23276740 0.98699270 11.3808009 5.211885e-30
```

```
2.71|2.86          11.63403700 0.99513464 11.6909176 1.418458e-31
2.86|3             12.04146137 1.00325288 12.0024190 3.450616e-33
3|3.14             13.02109710 1.02473570 12.7067859 5.421740e-37
3.14|3.29          13.48093976 1.03578703 13.0151656 1.003246e-38
3.29|3.43          13.94983533 1.04626943 13.3329284 1.489347e-40
3.43|3.57          14.22912789 1.05254629 13.5187669 1.211901e-41
3.57|3.71          14.66005540 1.06339264 13.7861170 3.089474e-43
3.71|3.86          15.26154244 1.07866657 14.1485264 1.907118e-45
3.86|4             15.85142712 1.09303083 14.5022690 1.172104e-47
4|4.14             16.94653077 1.12213561 15.1020346 1.570127e-51
4.14|4.29          17.29615481 1.13384669 15.2544035 1.538950e-52
4.29|4.43          17.60706243 1.14532731 15.3729526 2.485778e-53
4.43|4.57          18.06122028 1.16351904 15.5229262 2.427249e-54
4.57|4.71          18.68320260 1.18690983 15.7410464 7.912437e-56
4.71|4.86          19.14200779 1.20396646 15.8991205 6.426057e-57
4.86|5             19.45060064 1.21666224 15.9868532 1.578033e-57
>
> # Test Proportional Odds Assumption (Brant Test)
> if (!requireNamespace("brant", quietly = TRUE)) {
+   install.packages("brant")
+ }
> library(brant)
> brant_test <- brant(ologit_model)
------------------------------------------------------------
Test for                 X2      df      probability
------------------------------------------------------------
Omnibus                   -89     405     1
Gender                   625.09  27      0
Age                      36.82   27      0.1
```

```
Nationality                   -26.03  27      1
Education_Level         55.95   27      0
Nature_of_connection            42.65   27      0.03
Passenger_Customer_Type 56.68   27      0
Travel_Frequency               -20.91  27      1
Passanger_Trust         838.99  27      0
Brand_Reputation                181.34  27      0
Biman_Staffs_Services           436.32  27      0
Airline_Safety                  36.01   27      0.12
Route_availability              63.57   27      0
Frequent_Flyer_Program  23.85   27      0.64
Price                   65.7    27      0
Improved_Customer_Service       68.55   27      0
---------------------------------------------------------

H0: Parallel Regression Assumption holds
Warning messages:
1: glm.fit: fitted probabilities numerically 0 or 1 occurred
2: glm.fit: fitted probabilities numerically 0 or 1 occurred
3: glm.fit: fitted probabilities numerically 0 or 1 occurred
4: glm.fit: fitted probabilities numerically 0 or 1 occurred
5: glm.fit: fitted probabilities numerically 0 or 1 occurred
6: glm.fit: fitted probabilities numerically 0 or 1 occurred
7: glm.fit: fitted probabilities numerically 0 or 1 occurred
8: glm.fit: fitted probabilities numerically 0 or 1 occurred
9: glm.fit: fitted probabilities numerically 0 or 1 occurred
> print(brant_test)
                        X2  df   probability
Omnibus                 -89.00039 405  1.000000e+00
```

```
Gender                   625.08641  27 1.718382e-114
Age                     36.81942  27  9.848767e-02
Nationality             -26.03307  27  1.000000e+00
Education_Level           55.94531  27  8.736721e-04
Nature_of_connection       42.64656  27  2.838955e-02
Passenger_Customer_Type    56.67741  27  7.066245e-04
Travel_Frequency         -20.90878  27  1.000000e+00
Passanger_Trust          838.98672  27 2.400949e-159
Brand_Reputation          181.34262  27  8.332019e-25
Biman_Staffs_Services     436.32186  27  1.909805e-75
Airline_Safety            36.00903  27  1.151017e-01
Route_availability        63.57087  27  8.810362e-05
Frequent_Flyer_Program     23.85409  27  6.383969e-01
Price                    65.69908  27  4.505659e-05
Improved_Customer_Service  68.55389  27  1.799310e-05
>
> # If the assumption is violated, consider Generalized Ordered Logit (gologit)
> if (!requireNamespace("VGAM", quietly = TRUE)) {
+   install.packages("VGAM")
+ }
> library(VGAM)
Loading required package: stats4
Loading required package: splines
Warning message:
package ‘VGAM’ was built under R version 4.4.3
> gologit_model <- vglm(formula, family = cumulative(parallel = FALSE), data = data)
There were 45 warnings (use warnings() to see them)
> summary(gologit_model)
```

Call:

vglm(formula = formula, family = cumulative(parallel = FALSE),

data = data)

Coefficients:

	Estimate	Std. Error	z value	Pr(>|z|)	
(Intercept):1	6.868e+00	1.102e-06	6231079	<2e-16	***
(Intercept):2	6.650e+00	1.194e-06	5570995	<2e-16	***
(Intercept):3	4.639e+00	1.376e-06	3370762	<2e-16	***
(Intercept):4	2.793e+00	1.586e-06	1760986	<2e-16	***
(Intercept):5	3.274e+00	9.667e-07	3386708	<2e-16	***
(Intercept):6	3.456e+00	9.833e-07	3514137	<2e-16	***
(Intercept):7	3.578e+00	1.122e-06	3187823	<2e-16	***
(Intercept):8	5.381e+00	3.043e-06	1768171	<2e-16	***
(Intercept):9	5.452e+00	3.605e-06	1512392	<2e-16	***
(Intercept):10	5.514e+00	4.740e-07	11632821	<2e-16	***
(Intercept):11	5.879e+00	5.157e-07	11398939	<2e-16	***
(Intercept):12	5.634e+00	5.341e-07	10547107	<2e-16	***
(Intercept):13	6.002e+00	5.604e-07	10711843	<2e-16	***
(Intercept):14	5.699e+00	6.114e-07	9320645	<2e-16	***
(Intercept):15	6.415e+00	7.428e-07	8636599	<2e-16	***
(Intercept):16	6.265e+00	6.977e-07	8980031	<2e-16	***
(Intercept):17	6.016e+00	4.418e-07	13616177	<2e-16	***
(Intercept):18	6.462e+00	4.265e-07	15153799	<2e-16	***
(Intercept):19	6.641e+00	4.236e-07	15678672	<2e-16	***
(Intercept):20	6.277e+00	4.397e-07	14277485	<2e-16	***
(Intercept):21	6.520e+00	4.351e-07	14985530	<2e-16	***
(Intercept):22	8.160e+00	3.728e-07	21885751	<2e-16	***
(Intercept):23	8.882e+00	3.599e-07	24676427	<2e-16	***

(Intercept):24	9.017e+00	3.786e-07	23817405	<2e-16	***
(Intercept):25	9.628e+00	3.760e-07	25606006	<2e-16	***
(Intercept):26	9.428e+00	3.510e-07	26862122	<2e-16	***
(Intercept):27	1.059e+01	4.950e-07	21402723	<2e-16	***
(Intercept):28	1.065e+01	5.475e-07	19455051	<2e-16	***
Gender:1	1.289e-01	9.284e-08	1387875	<2e-16	***
Gender:2	2.351e-01	7.586e-08	3099653	<2e-16	***
Gender:3	9.428e-01	7.064e-08	13346543	<2e-16	***
Gender:4	1.369e+00	7.008e-08	19535732	<2e-16	***
Gender:5	6.604e-01	7.009e-08	9422765	<2e-16	***
Gender:6	5.722e-01	7.017e-08	8154138	<2e-16	***
Gender:7	2.236e-01	7.184e-08	3112223	<2e-16	***
Gender:8	2.454e-02	8.603e-08	285306	<2e-16	***
Gender:9	6.472e-02	1.018e-07	635731	<2e-16	***
Gender:10	8.875e-02	1.091e-07	813484	<2e-16	***
Gender:11	-1.286e-01	1.131e-07	-1137648	<2e-16	***
Gender:12	-2.243e-01	1.175e-07	-1908825	<2e-16	***
Gender:13	-3.656e-01	1.202e-07	-3041761	<2e-16	***
Gender:14	-4.435e-02	1.770e-07	-250556	<2e-16	***
Gender:15	-2.275e-02	1.780e-07	-127841	<2e-16	***
Gender:16	6.859e-02	1.772e-07	386999	<2e-16	***
Gender:17	1.533e-01	1.724e-07	889314	<2e-16	***
Gender:18	1.175e-01	1.735e-07	677363	<2e-16	***
Gender:19	3.354e-03	1.716e-07	19547	<2e-16	***
Gender:20	1.432e-01	1.886e-07	759491	<2e-16	***
Gender:21	3.595e-01	1.846e-07	1947756	<2e-16	***
Gender:22	3.270e-01	1.291e-07	2531722	<2e-16	***
Gender:23	2.254e-01	1.258e-07	1791429	<2e-16	***
Gender:24	1.594e-01	1.208e-07	1319158	<2e-16	***

Gender:25	-3.117e-02	1.163e-07	-268040	<2e-16 ***
Gender:26	6.550e-02	1.149e-07	569860	<2e-16 ***
Gender:27	1.415e-01	3.906e-07	362321	<2e-16 ***
Gender:28	4.181e-01	4.723e-07	885296	<2e-16 ***
Age:1	8.988e-02	3.723e-08	2414503	<2e-16 ***
Age:2	1.571e-01	3.169e-08	4957551	<2e-16 ***
Age:3	3.029e-01	3.107e-08	9750395	<2e-16 ***
Age:4	2.107e-01	3.285e-08	6415909	<2e-16 ***
Age:5	-1.469e-02	3.511e-08	-418431	<2e-16 ***
Age:6	-1.314e-01	3.800e-08	-3457953	<2e-16 ***
Age:7	-2.015e-01	4.144e-08	-4861171	<2e-16 ***
Age:8	-2.841e-01	4.409e-08	-6441984	<2e-16 ***
Age:9	-2.530e-01	4.566e-08	-5540596	<2e-16 ***
Age:10	-1.568e-01	4.619e-08	-3393829	<2e-16 ***
Age:11	-2.268e-01	4.856e-08	-4669310	<2e-16 ***
Age:12	-1.920e-01	5.085e-08	-3776047	<2e-16 ***
Age:13	-1.811e-01	5.207e-08	-3477209	<2e-16 ***
Age:14	-1.521e-01	5.102e-08	-2981921	<2e-16 ***
Age:15	-2.273e-01	5.156e-08	-4409165	<2e-16 ***
Age:16	-1.718e-01	5.138e-08	-3344139	<2e-16 ***
Age:17	-1.442e-01	5.305e-08	-2718457	<2e-16 ***
Age:18	-1.708e-01	5.509e-08	-3100378	<2e-16 ***
Age:19	-1.648e-01	5.521e-08	-2985777	<2e-16 ***
Age:20	-1.123e-01	5.726e-08	-1961531	<2e-16 ***
Age:21	-9.188e-02	5.763e-08	-1594455	<2e-16 ***
Age:22	-1.380e-01	5.525e-08	-2497427	<2e-16 ***
Age:23	-9.953e-02	5.558e-08	-1790722	<2e-16 ***
Age:24	-8.140e-02	5.550e-08	-1466542	<2e-16 ***
Age:25	-3.791e-02	5.645e-08	-671550	<2e-16 ***

Age:26	2.412e-01	5.642e-08	4275518	<2e-16 ***
Age:27	1.648e-01	6.270e-08	2628852	<2e-16 ***
Age:28	7.097e-02	6.724e-08	1055466	<2e-16 ***
Nationality:1	-7.072e-01	1.058e-06	-668093	<2e-16 ***
Nationality:2	-6.872e-01	1.164e-06	-590155	<2e-16 ***
Nationality:3	-6.261e-01	1.358e-06	-461149	<2e-16 ***
Nationality:4	-4.211e-01	1.575e-06	-267367	<2e-16 ***
Nationality:5	-3.390e-01	9.434e-07	-359295	<2e-16 ***
Nationality:6	-2.758e-01	9.580e-07	-287902	<2e-16 ***
Nationality:7	-2.450e-01	1.088e-06	-225211	<2e-16 ***
Nationality:8	-3.633e-01	3.030e-06	-119925	<2e-16 ***
Nationality:9	-2.972e-01	3.595e-06	-82677	<2e-16 ***
Nationality:10	1.172e-01	3.420e-07	342727	<2e-16 ***
Nationality:11	3.053e-02	3.411e-07	89493	<2e-16 ***
Nationality:12	8.883e-03	3.482e-07	25513	<2e-16 ***
Nationality:13	-5.176e-04	3.765e-07	-1375	<2e-16 ***
Nationality:14	-1.250e-01	3.641e-07	-343314	<2e-16 ***
Nationality:15	1.920e-01	6.705e-07	286339	<2e-16 ***
Nationality:16	1.364e-01	6.213e-07	219558	<2e-16 ***
Nationality:17	2.448e-01	2.512e-07	974532	<2e-16 ***
Nationality:18	1.842e-01	2.347e-07	785047	<2e-16 ***
Nationality:19	1.048e-01	2.240e-07	467622	<2e-16 ***
Nationality:20	1.855e-01	1.757e-07	1055553	<2e-16 ***
Nationality:21	8.327e-02	1.593e-07	522734	<2e-16 ***
Nationality:22	-1.440e-01	9.728e-08	-1480337	<2e-16 ***
Nationality:23	-2.143e-01	8.763e-08	-2445941	<2e-16 ***
Nationality:24	-1.351e-01	1.636e-07	-825306	<2e-16 ***
Nationality:25	-5.249e-02	1.433e-07	-366327	<2e-16 ***
Nationality:26	-1.502e-01	9.668e-08	-1553827	<2e-16 ***

Nationality:27	-2.452e-01	1.230e-07	-1992613	<2e-16 ***
Nationality:28	-3.004e-01	1.318e-07	-2278920	<2e-16 ***
Education_Level:1	-6.765e-01	4.538e-08	-14907194	<2e-16 ***
Education_Level:2	-5.778e-01	3.715e-08	-15552132	<2e-16 ***
Education_Level:3	-3.580e-01	3.372e-08	-10614797	<2e-16 ***
Education_Level:4	-2.087e-01	3.251e-08	-6419378	<2e-16 ***
Education_Level:5	-3.037e-01	4.052e-08	-7495143	<2e-16 ***
Education_Level:6	-2.896e-01	4.300e-08	-6733958	<2e-16 ***
Education_Level:7	-2.826e-01	4.590e-08	-6156366	<2e-16 ***
Education_Level:8	-3.217e-01	5.359e-08	-6002808	<2e-16 ***
Education_Level:9	-2.363e-01	5.500e-08	-4295985	<2e-16 ***
Education_Level:10	-2.442e-01	5.584e-08	-4373192	<2e-16 ***
Education_Level:11	-3.681e-01	6.060e-08	-6074155	<2e-16 ***
Education_Level:12	-3.415e-01	6.212e-08	-5497226	<2e-16 ***
Education_Level:13	-2.732e-01	6.561e-08	-4163395	<2e-16 ***
Education_Level:14	-2.710e-01	6.529e-08	-4149764	<2e-16 ***
Education_Level:15	-2.285e-01	6.622e-08	-3450903	<2e-16 ***
Education_Level:16	-1.444e-01	6.680e-08	-2162446	<2e-16 ***
Education_Level:17	-1.188e-01	6.620e-08	-1795400	<2e-16 ***
Education_Level:18	-1.717e-01	6.611e-08	-2597729	<2e-16 ***
Education_Level:19	-1.889e-01	6.630e-08	-2849453	<2e-16 ***
Education_Level:20	-7.942e-02	6.807e-08	-1166673	<2e-16 ***
Education_Level:21	-1.573e-02	6.991e-08	-225025	<2e-16 ***
Education_Level:22	-8.844e-03	6.337e-08	-139562	<2e-16 ***
Education_Level:23	-5.712e-02	6.307e-08	-905586	<2e-16 ***
Education_Level:24	-3.603e-02	6.317e-08	-570287	<2e-16 ***
Education_Level:25	-7.434e-02	6.048e-08	-1229220	<2e-16 ***
Education_Level:26	2.529e-01	6.625e-08	3817266	<2e-16 ***
Education_Level:27	2.086e-01	6.934e-08	3008179	<2e-16 ***

Education_Level:28	2.909e-01	7.266e-08	4002980	<2e-16 ***
Nature_of_connection:1	3.627e-02	1.007e-08	3603566	<2e-16 ***
Nature_of_connection:2	-3.797e-02	9.676e-09	-3924575	<2e-16 ***
Nature_of_connection:3	4.048e-02	9.616e-09	4209773	<2e-16 ***
Nature_of_connection:4	4.412e-02	9.974e-09	4423488	<2e-16 ***
Nature_of_connection:5	1.437e-02	1.034e-08	1389952	<2e-16 ***
Nature_of_connection:6	1.640e-02	1.138e-08	1441869	<2e-16 ***
Nature_of_connection:7	-3.510e-02	1.284e-08	-2733923	<2e-16 ***
Nature_of_connection:8	1.131e-02	1.551e-08	729150	<2e-16 ***
Nature_of_connection:9	-2.509e-02	1.585e-08	-1582750	<2e-16 ***
Nature_of_connection:10	-5.120e-02	1.581e-08	-3238313	<2e-16 ***
Nature_of_connection:11	-5.702e-02	1.570e-08	-3631893	<2e-16 ***
Nature_of_connection:12	-6.014e-02	1.582e-08	-3800918	<2e-16 ***
Nature_of_connection:13	-5.166e-02	1.641e-08	-3148217	<2e-16 ***
Nature_of_connection:14	-4.431e-02	1.601e-08	-2767800	<2e-16 ***
Nature_of_connection:15	-2.100e-02	1.557e-08	-1348703	<2e-16 ***
Nature_of_connection:16	-1.088e-02	1.486e-08	-731919	<2e-16 ***
Nature_of_connection:17	1.946e-02	1.492e-08	1304735	<2e-16 ***
Nature_of_connection:18	1.557e-02	1.529e-08	1018327	<2e-16 ***
Nature_of_connection:19	1.367e-02	1.497e-08	913256	<2e-16 ***
Nature_of_connection:20	1.481e-02	1.559e-08	949891	<2e-16 ***
Nature_of_connection:21	2.488e-02	1.583e-08	1571791	<2e-16 ***
Nature_of_connection:22	2.544e-02	1.439e-08	1768205	<2e-16 ***
Nature_of_connection:23	2.268e-02	1.452e-08	1562335	<2e-16 ***
Nature_of_connection:24	2.927e-02	1.443e-08	2027701	<2e-16 ***
Nature_of_connection:25	1.569e-02	1.458e-08	1075998	<2e-16 ***
Nature_of_connection:26	2.341e-02	1.438e-08	1628550	<2e-16 ***
Nature_of_connection:27	-1.665e-02	1.785e-08	-933127	<2e-16 ***
Nature_of_connection:28	-3.639e-02	1.862e-08	-1954856	<2e-16 ***

Passenger_Customer_Type:1	-1.032e-01	2.156e-08	-4786300	<2e-16 ***
Passenger_Customer_Type:2	-1.152e-01	1.820e-08	-6330958	<2e-16 ***
Passenger_Customer_Type:3	-1.732e-01	1.916e-08	-9038335	<2e-16 ***
Passenger_Customer_Type:4	-2.031e-01	2.033e-08	-9991237	<2e-16 ***
Passenger_Customer_Type:5	-9.115e-02	2.121e-08	-4298535	<2e-16 ***
Passenger_Customer_Type:6	-1.216e-01	2.347e-08	-5180559	<2e-16 ***
Passenger_Customer_Type:7	-2.175e-03	2.584e-08	-84165	<2e-16 ***
Passenger_Customer_Type:8	-3.565e-02	2.960e-08	-1204136	<2e-16 ***
Passenger_Customer_Type:9	1.640e-02	3.052e-08	537324	<2e-16 ***
Passenger_Customer_Type:10	2.948e-02	3.118e-08	945479	<2e-16 ***
Passenger_Customer_Type:11	7.906e-02	3.227e-08	2449647	<2e-16 ***
Passenger_Customer_Type:12	5.683e-02	3.256e-08	1745456	<2e-16 ***
Passenger_Customer_Type:13	-1.143e-02	3.372e-08	-338881	<2e-16 ***
Passenger_Customer_Type:14	1.556e-02	3.288e-08	473282	<2e-16 ***
Passenger_Customer_Type:15	2.167e-02	3.262e-08	664484	<2e-16 ***
Passenger_Customer_Type:16	1.286e-03	3.256e-08	39501	<2e-16 ***
Passenger_Customer_Type:17	-4.924e-02	3.301e-08	-1491944	<2e-16 ***
Passenger_Customer_Type:18	-4.567e-02	3.281e-08	-1392154	<2e-16 ***
Passenger_Customer_Type:19	1.578e-02	3.158e-08	499589	<2e-16 ***
Passenger_Customer_Type:20	-1.165e-02	3.207e-08	-363224	<2e-16 ***
Passenger_Customer_Type:21	-1.646e-02	3.330e-08	-494444	<2e-16 ***
Passenger_Customer_Type:22	-4.919e-03	2.948e-08	-166870	<2e-16 ***
Passenger_Customer_Type:23	-8.676e-02	3.042e-08	-2851945	<2e-16 ***
Passenger_Customer_Type:24	-5.225e-02	3.121e-08	-1674373	<2e-16 ***
Passenger_Customer_Type:25	-5.181e-02	2.985e-08	-1735747	<2e-16 ***
Passenger_Customer_Type:26	-1.214e-01	2.892e-08	-4199721	<2e-16 ***
Passenger_Customer_Type:27	-1.392e-01	3.039e-08	-4580432	<2e-16 ***
Passenger_Customer_Type:28	-1.271e-01	3.088e-08	-4115052	<2e-16 ***
Travel_Frequency:1	1.428e-01	2.799e-08	5101078	<2e-16 ***

Travel_Frequency:2	3.538e-01	2.362e-08	14979289	<2e-16 ***
Travel_Frequency:3	2.135e-01	2.365e-08	9026521	<2e-16 ***
Travel_Frequency:4	1.373e-01	2.391e-08	5741676	<2e-16 ***
Travel_Frequency:5	2.090e-01	2.542e-08	8222168	<2e-16 ***
Travel_Frequency:6	1.236e-01	2.686e-08	4602243	<2e-16 ***
Travel_Frequency:7	1.157e-01	2.876e-08	4022284	<2e-16 ***
Travel_Frequency:8	5.657e-02	3.272e-08	1728787	<2e-16 ***
Travel_Frequency:9	-2.527e-02	3.558e-08	-710424	<2e-16 ***
Travel_Frequency:10	-8.854e-02	3.642e-08	-2431172	<2e-16 ***
Travel_Frequency:11	-4.185e-02	3.707e-08	-1128753	<2e-16 ***
Travel_Frequency:12	-4.296e-03	3.818e-08	-112539	<2e-16 ***
Travel_Frequency:13	-1.673e-02	3.947e-08	-423821	<2e-16 ***
Travel_Frequency:14	-2.445e-02	3.889e-08	-628836	<2e-16 ***
Travel_Frequency:15	4.188e-02	3.975e-08	1053756	<2e-16 ***
Travel_Frequency:16	4.407e-02	4.019e-08	1096559	<2e-16 ***
Travel_Frequency:17	1.835e-02	4.022e-08	456385	<2e-16 ***
Travel_Frequency:18	5.325e-02	4.094e-08	1300609	<2e-16 ***
Travel_Frequency:19	7.683e-02	4.073e-08	1886260	<2e-16 ***
Travel_Frequency:20	6.631e-02	4.247e-08	1561424	<2e-16 ***
Travel_Frequency:21	5.451e-02	4.364e-08	1248988	<2e-16 ***
Travel_Frequency:22	-1.612e-02	3.870e-08	-416628	<2e-16 ***
Travel_Frequency:23	5.380e-02	3.877e-08	1387718	<2e-16 ***
Travel_Frequency:24	4.593e-02	3.832e-08	1198592	<2e-16 ***
Travel_Frequency:25	4.892e-02	3.727e-08	1312601	<2e-16 ***
Travel_Frequency:26	-6.159e-02	3.675e-08	-1676170	<2e-16 ***
Travel_Frequency:27	-6.399e-02	3.961e-08	-1615591	<2e-16 ***
Travel_Frequency:28	-9.825e-02	4.062e-08	-2418748	<2e-16 ***
Passanger_Trust:1	-8.329e-01	6.786e-08	-12274284	<2e-16 ***
Passanger_Trust:2	-2.173e-01	5.236e-08	-4150157	<2e-16 ***

Passanger_Trust:3	-3.900e-01	5.121e-08	-7615633	<2e-16 ***
Passanger_Trust:4	-6.255e-02	4.970e-08	-1258532	<2e-16 ***
Passanger_Trust:5	-1.180e-01	4.979e-08	-2370084	<2e-16 ***
Passanger_Trust:6	-2.935e-01	5.154e-08	-5695426	<2e-16 ***
Passanger_Trust:7	-5.696e-01	5.445e-08	-10461972	<2e-16 ***
Passanger_Trust:8	-8.080e-01	6.371e-08	-12682461	<2e-16 ***
Passanger_Trust:9	-7.716e-01	7.068e-08	-10916635	<2e-16 ***
Passanger_Trust:10	-7.442e-01	7.090e-08	-10496514	<2e-16 ***
Passanger_Trust:11	-7.277e-01	7.323e-08	-9937810	<2e-16 ***
Passanger_Trust:12	-6.048e-01	7.608e-08	-7949285	<2e-16 ***
Passanger_Trust:13	-6.528e-01	7.891e-08	-8273518	<2e-16 ***
Passanger_Trust:14	-6.021e-01	7.861e-08	-7659132	<2e-16 ***
Passanger_Trust:15	-4.515e-01	7.955e-08	-5675498	<2e-16 ***
Passanger_Trust:16	-1.935e-01	8.196e-08	-2360735	<2e-16 ***
Passanger_Trust:17	-1.288e-01	8.428e-08	-1527598	<2e-16 ***
Passanger_Trust:18	-1.484e-01	8.231e-08	-1803205	<2e-16 ***
Passanger_Trust:19	1.583e-02	8.229e-08	192399	<2e-16 ***
Passanger_Trust:20	-2.022e-02	8.253e-08	-244934	<2e-16 ***
Passanger_Trust:21	2.530e-01	8.635e-08	2930164	<2e-16 ***
Passanger_Trust:22	2.883e-01	7.677e-08	3755704	<2e-16 ***
Passanger_Trust:23	3.357e-01	7.474e-08	4492095	<2e-16 ***
Passanger_Trust:24	5.774e-01	7.402e-08	7799885	<2e-16 ***
Passanger_Trust:25	1.266e-01	7.430e-08	1704103	<2e-16 ***
Passanger_Trust:26	-1.775e-01	7.739e-08	-2293955	<2e-16 ***
Passanger_Trust:27	-2.154e-01	8.394e-08	-2565904	<2e-16 ***
Passanger_Trust:28	-2.927e-01	9.174e-08	-3190251	<2e-16 ***
Brand_Reputation:1	8.588e-01	8.009e-08	10723112	<2e-16 ***
Brand_Reputation:2	5.440e-01	5.324e-08	10217600	<2e-16 ***
Brand_Reputation:3	6.515e-01	5.357e-08	12161393	<2e-16 ***

Brand_Reputation:4	4.320e-01	5.824e-08	7416852	<2e-16 ***
Brand_Reputation:5	-2.546e-02	5.970e-08	-426522	<2e-16 ***
Brand_Reputation:6	-3.859e-02	6.305e-08	-612100	<2e-16 ***
Brand_Reputation:7	-8.881e-02	6.781e-08	-1309639	<2e-16 ***
Brand_Reputation:8	1.535e-01	7.574e-08	2027128	<2e-16 ***
Brand_Reputation:9	1.368e-01	7.921e-08	1726985	<2e-16 ***
Brand_Reputation:10	2.597e-01	8.310e-08	3125312	<2e-16 ***
Brand_Reputation:11	2.405e-01	8.644e-08	2782549	<2e-16 ***
Brand_Reputation:12	-1.101e-01	9.425e-08	-1168702	<2e-16 ***
Brand_Reputation:13	-8.608e-02	9.529e-08	-903338	<2e-16 ***
Brand_Reputation:14	-1.614e-01	9.571e-08	-1686317	<2e-16 ***
Brand_Reputation:15	-1.220e-01	9.807e-08	-1244426	<2e-16 ***
Brand_Reputation:16	-2.207e-01	1.019e-07	-2166070	<2e-16 ***
Brand_Reputation:17	-3.407e-01	1.017e-07	-3349855	<2e-16 ***
Brand_Reputation:18	-3.942e-01	1.032e-07	-3820790	<2e-16 ***
Brand_Reputation:19	-3.069e-01	1.005e-07	-3054152	<2e-16 ***
Brand_Reputation:20	-4.892e-01	1.070e-07	-4572854	<2e-16 ***
Brand_Reputation:21	-5.885e-01	1.112e-07	-5293489	<2e-16 ***
Brand_Reputation:22	-8.297e-01	7.435e-08	-11159448	<2e-16 ***
Brand_Reputation:23	-7.194e-01	7.444e-08	-9663027	<2e-16 ***
Brand_Reputation:24	-5.348e-01	7.284e-08	-7341791	<2e-16 ***
Brand_Reputation:25	-7.134e-01	7.140e-08	-9991596	<2e-16 ***
Brand_Reputation:26	-6.457e-01	6.836e-08	-9444801	<2e-16 ***
Brand_Reputation:27	-5.935e-01	7.274e-08	-8159766	<2e-16 ***
Brand_Reputation:28	-6.938e-01	7.780e-08	-8916937	<2e-16 ***
Biman_Staffs_Services:1	3.627e-01	4.933e-08	7351127	<2e-16 ***
Biman_Staffs_Services:2	3.766e-01	4.890e-08	7702316	<2e-16 ***
Biman_Staffs_Services:3	2.099e-01	4.735e-08	4432351	<2e-16 ***
Biman_Staffs_Services:4	-3.438e-01	4.793e-08	-7172862	<2e-16 ***

Biman_Staffs_Services:5	-2.497e-01	4.988e-08	-5006503	<2e-16 ***
Biman_Staffs_Services:6	-1.445e-01	5.256e-08	-2748744	<2e-16 ***
Biman_Staffs_Services:7	-2.033e-01	5.417e-08	-3754070	<2e-16 ***
Biman_Staffs_Services:8	1.720e-01	5.847e-08	2941777	<2e-16 ***
Biman_Staffs_Services:9	1.926e-01	6.098e-08	3157533	<2e-16 ***
Biman_Staffs_Services:10	2.147e-01	6.310e-08	3403261	<2e-16 ***
Biman_Staffs_Services:11	1.684e-01	6.615e-08	2545172	<2e-16 ***
Biman_Staffs_Services:12	2.108e-01	7.201e-08	2927366	<2e-16 ***
Biman_Staffs_Services:13	2.377e-01	7.471e-08	3181273	<2e-16 ***
Biman_Staffs_Services:14	2.212e-01	7.472e-08	2959685	<2e-16 ***
Biman_Staffs_Services:15	4.017e-01	7.486e-08	5366430	<2e-16 ***
Biman_Staffs_Services:16	3.806e-01	7.484e-08	5084999	<2e-16 ***
Biman_Staffs_Services:17	1.721e-01	7.588e-08	2267897	<2e-16 ***
Biman_Staffs_Services:18	1.692e-01	7.737e-08	2186611	<2e-16 ***
Biman_Staffs_Services:19	1.309e-01	7.733e-08	1692596	<2e-16 ***
Biman_Staffs_Services:20	3.742e-02	8.229e-08	454714	<2e-16 ***
Biman_Staffs_Services:21	-1.277e-01	8.242e-08	-1548774	<2e-16 ***
Biman_Staffs_Services:22	-2.216e-01	7.988e-08	-2774755	<2e-16 ***
Biman_Staffs_Services:23	-4.167e-01	7.732e-08	-5389292	<2e-16 ***
Biman_Staffs_Services:24	-8.334e-01	7.361e-08	-11323235	<2e-16 ***
Biman_Staffs_Services:25	-7.767e-01	7.165e-08	-10840238	<2e-16 ***
Biman_Staffs_Services:26	-5.374e-01	6.136e-08	-8758383	<2e-16 ***
Biman_Staffs_Services:27	-4.909e-01	6.363e-08	-7714764	<2e-16 ***
Biman_Staffs_Services:28	-5.233e-01	6.948e-08	-7531792	<2e-16 ***
Airline_Safety:1	-1.223e+00	4.598e-08	-26603091	<2e-16 ***
Airline_Safety:2	-1.482e+00	5.040e-08	-29400188	<2e-16 ***
Airline_Safety:3	-6.948e-01	4.025e-08	-17261295	<2e-16 ***
Airline_Safety:4	-2.077e-01	3.852e-08	-5393102	<2e-16 ***
Airline_Safety:5	-1.291e-01	4.065e-08	-3176058	<2e-16 ***

Airline_Safety:6	-1.456e-01	4.326e-08	-3366470	<2e-16 ***
Airline_Safety:7	-1.368e-02	4.633e-08	-295332	<2e-16 ***
Airline_Safety:8	1.218e-01	5.833e-08	2088645	<2e-16 ***
Airline_Safety:9	1.421e-01	6.231e-08	2280401	<2e-16 ***
Airline_Safety:10	-7.585e-02	6.282e-08	-1207501	<2e-16 ***
Airline_Safety:11	-3.792e-02	6.679e-08	-567832	<2e-16 ***
Airline_Safety:12	-1.240e-01	6.869e-08	-1805610	<2e-16 ***
Airline_Safety:13	2.490e-02	7.405e-08	336193	<2e-16 ***
Airline_Safety:14	-8.491e-02	7.215e-08	-1176960	<2e-16 ***
Airline_Safety:15	-3.303e-01	7.337e-08	-4501898	<2e-16 ***
Airline_Safety:16	-4.016e-01	7.595e-08	-5287101	<2e-16 ***
Airline_Safety:17	-3.584e-01	7.835e-08	-4574652	<2e-16 ***
Airline_Safety:18	-2.719e-01	8.734e-08	-3113078	<2e-16 ***
Airline_Safety:19	-2.187e-01	8.538e-08	-2561269	<2e-16 ***
Airline_Safety:20	-1.102e-01	1.008e-07	-1093393	<2e-16 ***
Airline_Safety:21	-7.874e-02	1.015e-07	-775622	<2e-16 ***
Airline_Safety:22	-9.804e-02	1.025e-07	-956588	<2e-16 ***
Airline_Safety:23	-1.169e-01	9.966e-08	-1172961	<2e-16 ***
Airline_Safety:24	-1.135e-01	9.721e-08	-1167432	<2e-16 ***
Airline_Safety:25	-1.909e-01	9.477e-08	-2014362	<2e-16 ***
Airline_Safety:26	-3.213e-01	9.389e-08	-3421973	<2e-16 ***
Airline_Safety:27	-2.860e-01	9.668e-08	-2958586	<2e-16 ***
Airline_Safety:28	-2.076e-01	9.737e-08	-2132516	<2e-16 ***
Route_availability:1	4.345e-01	4.031e-08	10779953	<2e-16 ***
Route_availability:2	-4.165e-02	3.500e-08	-1190070	<2e-16 ***
Route_availability:3	-3.031e-01	3.474e-08	-8726224	<2e-16 ***
Route_availability:4	2.422e-03	3.397e-08	71313	<2e-16 ***
Route_availability:5	4.067e-01	3.719e-08	10937491	<2e-16 ***
Route_availability:6	2.721e-01	3.746e-08	7263337	<2e-16 ***

Route_availability:7	1.727e-01	3.843e-08	4495033	<2e-16	***
Route_availability:8	-2.677e-01	4.966e-08	-5389733	<2e-16	***
Route_availability:9	-1.146e-01	5.537e-08	-2070074	<2e-16	***
Route_availability:10	-2.102e-01	5.648e-08	-3721211	<2e-16	***
Route_availability:11	-1.343e-01	5.943e-08	-2258982	<2e-16	***
Route_availability:12	1.018e-01	6.323e-08	1609921	<2e-16	***
Route_availability:13	2.036e-03	6.544e-08	31117	<2e-16	***
Route_availability:14	8.487e-02	6.457e-08	1314482	<2e-16	***
Route_availability:15	3.130e-02	6.442e-08	485845	<2e-16	***
Route_availability:16	-2.223e-02	6.565e-08	-338693	<2e-16	***
Route_availability:17	1.685e-02	6.839e-08	246397	<2e-16	***
Route_availability:18	-7.010e-02	7.425e-08	-944122	<2e-16	***
Route_availability:19	-2.676e-01	7.394e-08	-3618337	<2e-16	***
Route_availability:20	-1.647e-01	8.543e-08	-1927996	<2e-16	***
Route_availability:21	-3.258e-01	8.455e-08	-3852972	<2e-16	***
Route_availability:22	-3.182e-01	7.319e-08	-4346989	<2e-16	***
Route_availability:23	-2.747e-01	7.020e-08	-3913555	<2e-16	***
Route_availability:24	-3.621e-01	6.606e-08	-5481882	<2e-16	***
Route_availability:25	-2.868e-01	6.543e-08	-4383846	<2e-16	***
Route_availability:26	-3.349e-01	6.538e-08	-5121523	<2e-16	***
Route_availability:27	-2.715e-01	7.129e-08	-3808299	<2e-16	***
Route_availability:28	-2.615e-01	7.510e-08	-3482114	<2e-16	***
Frequent_Flyer_Program:1	1.852e-01	4.438e-08	4173458	<2e-16	***
Frequent_Flyer_Program:2	2.851e-01	3.885e-08	7340322	<2e-16	***
Frequent_Flyer_Program:3	2.490e-01	3.967e-08	6276326	<2e-16	***
Frequent_Flyer_Program:4	2.342e-02	3.887e-08	602415	<2e-16	***
Frequent_Flyer_Program:5	-4.277e-02	3.942e-08	-1085053	<2e-16	***
Frequent_Flyer_Program:6	-3.023e-02	4.269e-08	-708044	<2e-16	***
Frequent_Flyer_Program:7	1.126e-01	4.564e-08	2466030	<2e-16	***

Frequent_Flyer_Program:8 -2.766e-03 5.403e-08 -51185 <2e-16 ***

Frequent_Flyer_Program:9 -9.644e-02 5.877e-08 -1640960 <2e-16 ***

Frequent_Flyer_Program:10 -5.309e-02 6.079e-08 -873440 <2e-16 ***

Frequent_Flyer_Program:11 -3.047e-02 6.351e-08 -479830 <2e-16 ***

Frequent_Flyer_Program:12 6.515e-02 6.768e-08 962594 <2e-16 ***

Frequent_Flyer_Program:13 -1.883e-02 7.027e-08 -267919 <2e-16 ***

Frequent_Flyer_Program:14 -6.148e-02 7.058e-08 -871096 <2e-16 ***

Frequent_Flyer_Program:15 -1.705e-01 7.057e-08 -2415814 <2e-16 ***

Frequent_Flyer_Program:16 -2.807e-01 7.254e-08 -3870346 <2e-16 ***

Frequent_Flyer_Program:17 -3.014e-01 7.512e-08 -4012065 <2e-16 ***

Frequent_Flyer_Program:18 -3.353e-01 7.618e-08 -4401516 <2e-16 ***

Frequent_Flyer_Program:19 -1.547e-01 7.582e-08 -2040983 <2e-16 ***

Frequent_Flyer_Program:20 -2.005e-01 8.822e-08 -2272738 <2e-16 ***

Frequent_Flyer_Program:21 -3.068e-01 8.899e-08 -3447183 <2e-16 ***

Frequent_Flyer_Program:22 -2.895e-01 8.257e-08 -3506591 <2e-16 ***

Frequent_Flyer_Program:23 -4.250e-01 7.904e-08 -5376519 <2e-16 ***

Frequent_Flyer_Program:24 -4.894e-01 7.547e-08 -6483872 <2e-16 ***

Frequent_Flyer_Program:25 -5.072e-01 7.232e-08 -7013047 <2e-16 ***

Frequent_Flyer_Program:26 -4.583e-01 6.862e-08 -6678325 <2e-16 ***

Frequent_Flyer_Program:27 -4.839e-01 7.623e-08 -6348166 <2e-16 ***

Frequent_Flyer_Program:28 -4.095e-01 7.808e-08 -5244627 <2e-16 ***

Price:1 -6.219e-01 4.026e-08 -15449485 <2e-16 ***

Price:2 -6.959e-01 3.862e-08 -18019192 <2e-16 ***

Price:3 -6.289e-01 4.065e-08 -15472281 <2e-16 ***

Price:4 -5.007e-01 4.198e-08 -11927166 <2e-16 ***

Price:5 -3.459e-01 4.381e-08 -7895416 <2e-16 ***

Price:6 3.651e-02 4.993e-08 731189 <2e-16 ***

Price:7 1.683e-01 5.127e-08 3282197 <2e-16 ***

Price:8 2.800e-02 5.292e-08 529166 <2e-16 ***

Price:9	-7.240e-02	5.800e-08	-1248371	<2e-16 ***
Price:10	-1.281e-01	5.934e-08	-2159198	<2e-16 ***
Price:11	-7.705e-02	6.080e-08	-1267344	<2e-16 ***
Price:12	-5.230e-02	6.259e-08	-835575	<2e-16 ***
Price:13	-1.063e-01	6.593e-08	-1613173	<2e-16 ***
Price:14	-1.368e-01	6.486e-08	-2109003	<2e-16 ***
Price:15	-3.980e-01	6.538e-08	-6087077	<2e-16 ***
Price:16	-3.540e-01	6.695e-08	-5287194	<2e-16 ***
Price:17	-2.644e-01	6.892e-08	-3835840	<2e-16 ***
Price:18	-2.634e-01	7.383e-08	-3567861	<2e-16 ***
Price:19	-2.007e-01	7.315e-08	-2744304	<2e-16 ***
Price:20	-1.451e-01	8.267e-08	-1755199	<2e-16 ***
Price:21	-2.419e-01	8.342e-08	-2899172	<2e-16 ***
Price:22	-4.056e-01	7.572e-08	-5357258	<2e-16 ***
Price:23	-4.007e-01	7.261e-08	-5518944	<2e-16 ***
Price:24	-4.601e-01	6.864e-08	-6703876	<2e-16 ***
Price:25	-3.039e-01	6.687e-08	-4544881	<2e-16 ***
Price:26	-3.988e-01	6.363e-08	-6267946	<2e-16 ***
Price:27	-5.317e-01	6.839e-08	-7774689	<2e-16 ***
Price:28	-5.492e-01	7.242e-08	-7583747	<2e-16 ***
Improved_Customer_Service:1	-1.486e+00	6.589e-08	-22549598	<2e-16 ***
Improved_Customer_Service:2	-1.245e+00	5.858e-08	-21252794	<2e-16 ***
Improved_Customer_Service:3	-1.464e+00	5.300e-08	-27628643	<2e-16 ***
Improved_Customer_Service:4	-1.444e+00	5.390e-08	-26781905	<2e-16 ***
Improved_Customer_Service:5	-1.353e+00	5.773e-08	-23443247	<2e-16 ***
Improved_Customer_Service:6	-1.348e+00	6.167e-08	-21861948	<2e-16 ***
Improved_Customer_Service:7	-1.158e+00	6.306e-08	-18368776	<2e-16 ***
Improved_Customer_Service:8	-1.055e+00	6.832e-08	-15435093	<2e-16 ***
Improved_Customer_Service:9	-1.076e+00	7.287e-08	-14767820	<2e-16 ***

Improved_Customer_Service:10 -9.702e-01 7.317e-08 -13259780   <2e-16 ***

Improved_Customer_Service:11 -9.974e-01 7.583e-08 -13153184   <2e-16 ***

Improved_Customer_Service:12 -1.003e+00 8.046e-08 -12465827   <2e-16 ***

Improved_Customer_Service:13 -9.354e-01 8.483e-08 -11026481   <2e-16 ***

Improved_Customer_Service:14 -7.536e-01 8.109e-08 -9293623   <2e-16 ***

Improved_Customer_Service:15 -6.194e-01 8.221e-08 -7534411   <2e-16 ***

Improved_Customer_Service:16 -5.929e-01 8.311e-08 -7134663   <2e-16 ***

Improved_Customer_Service:17 -4.652e-01 8.533e-08 -5451371   <2e-16 ***

Improved_Customer_Service:18 -4.021e-01 8.611e-08 -4669692   <2e-16 ***

Improved_Customer_Service:19 -7.056e-01 8.585e-08 -8218258   <2e-16 ***

Improved_Customer_Service:20 -6.557e-01 9.119e-08 -7190536   <2e-16 ***

Improved_Customer_Service:21 -4.667e-01 9.214e-08 -5065316   <2e-16 ***

Improved_Customer_Service:22 -2.161e-01 9.159e-08 -2359624   <2e-16 ***

Improved_Customer_Service:23 -1.885e-01 8.942e-08 -2107418   <2e-16 ***

Improved_Customer_Service:24 -7.183e-02 8.737e-08   -822069   <2e-16 ***

Improved_Customer_Service:25 2.694e-01 8.809e-08   3058691   <2e-16 ***

Improved_Customer_Service:26 3.427e-01 8.421e-08   4069625   <2e-16 ***

Improved_Customer_Service:27 2.182e-01 9.447e-08   2309731   <2e-16 ***

Improved_Customer_Service:28 2.435e-01 9.898e-08   2459932   <2e-16 ***

Signif. codes: 0 ‘***’ 0.001 ‘**’ 0.01 ‘*’ 0.05 ‘.’ 0.1 ‘ ’ 1

Number of linear predictors: 28

Residual deviance: 8969.444 on 11452 degrees of freedom

Log-likelihood: NA on 11452 degrees of freedom

Number of Fisher scoring iterations: 2

Warning: Hauck-Donner effect detected in the following estimate(s):

'(Intercept):4', '(Intercept):7', '(Intercept):9', '(Intercept):11', '(Intercept):12', '(Intercept):16', '(Intercept):19', '(Intercept):20', '(Intercept):21', '(Intercept):25', '(Intercept):26', '(Intercept):27', '(Intercept):28', 'Gender:5', 'Gender:6', 'Gender:7', 'Gender:8', 'Gender:9', 'Gender:10', 'Gender:11', 'Gender:15', 'Gender:17', 'Gender:19', 'Gender:20', 'Gender:24', 'Gender:26', 'Gender:27', 'Gender:28', 'Age:4', 'Age:11', 'Age:14', 'Age:21', 'Age:22', 'Age:23', 'Age:24', 'Age:26', 'Age:27', 'Age:28', 'Nationality:1', 'Nationality:2', 'Nationality:3', 'Nationality:5', 'Nationality:6', 'Nationality:8', 'Nationality:11', 'Nationality:12', 'Nationality:13', 'Nationality:16', 'Nationality:21', 'Nationality:25', 'Education_Level:1', 'Education_Level:2', 'Education_Level:3', 'Education_Level:4', 'Education_Level:9', 'Education_Level:10', 'Education_Level:11', 'Education_Level:14', 'Education_Level:15', 'Education_Level:16', 'Education_Level:18', 'Education_Level:22', 'Education_Level:24', 'Education_Level:26', 'Education_Level:27', 'Education_Level:28', 'Nature_of_connection:2', 'Nature_of_connection:4', 'Nature_of_connection:5', 'Nature_of_connection:6', 'Nature_of_connection:9', 'Nature_of_connection:11', 'Nature_of_connection:13', 'Nature_of_connection:16', 'Nature_of_connection:17', 'Nature_of_connection:19', 'Nature_of_connection:20', 'Nature_of_connection:23', 'Nature_of_connection:25', 'Nature_of_connection:26', 'Passenger_Customer_Type:1', 'Passenger_Customer_Type:2', 'Passenger_Customer_Type:3', 'Passenger_Customer_Type:5', 'Passenger_Customer_Type:9', 'Passenger_Customer_Type:12', 'Passenger_Customer_Type:18', 'Passenger_Customer_Type:20', 'Passenger_Customer_Type:21', 'Passenger_Customer_Type:22', 'Passenger_Customer_Type:24', 'Travel_Frequency:4', 'Travel_Frequency:5', 'Travel_Frequency:6', 'Travel_Frequency:7', 'Travel_Frequency:8', 'Travel_Frequency:14', 'Travel_Frequency:15', 'Travel_Frequency:17', 'Travel_Frequency:18', 'Travel_Frequency:19', 'Travel_Frequency:20', 'Travel_Frequency:22', 'Travel_Frequency:25', 'Passanger_Trust:1', 'Passanger_Trust:2', 'Passanger_Trust:3', 'Passanger_Trust:4', 'Passanger_Trust:6', 'Passanger_Trust:11', 'Passanger_Trust:17', 'Passanger_Trust:18', 'Passanger_Trust:20', 'Passanger_Trust:24', 'Passanger_Trust:25', 'Brand_Reputation:8', 'Brand_Reputation:9', 'Brand_Reputation:14', 'Brand_Reputation:18', 'Brand_Reputation:21', 'Brand_Reputation:22', 'Brand_Reputation:23', 'Biman_Staffs_Services:4', 'Biman_Staffs_Services:5', 'Biman_Staffs_Services:8', 'Biman_Staffs_Services:9', 'Biman_Staffs_Services:12', 'Biman_Staffs_Services:13', 'Biman_Staffs_Services:15', 'Biman_Staffs_Services:17', 'Biman_Staffs_Services:19', 'Biman_Staffs_Services:20', 'Biman_Staffs_Services:21', 'Biman_Staffs_Services:22', 'Biman_Staffs_Services:23', 'Biman_Staffs_Services:24', 'Airline_Safety:1', 'Airline_Safety:2', 'Airline_Safety:3',

'Airline_Safety:4', 'Airline_Safety:8', 'Airline_Safety:9', 'Airline_Safety:13', 'Airline_Safety:22', 'Airline_Safety:23', 'Route_availability:2', 'Route_availability:3', 'Route_availability:6', 'Route_availability:7', 'Route_availability:9', 'Route_availability:11', 'Route_availability:12', 'Route_availability:13', 'Route_availability:15', 'Route_availability:17', 'Route_availability:22', 'Route_availability:23', 'Frequent_Flyer_Program:5', 'Frequent_Flyer_Program:7', 'Frequent_Flyer_Program:11', 'Frequent_Flyer_Program:12', 'Frequent_Flyer_Program:14', 'Frequent_Flyer_Program:18', 'Frequent_Flyer_Program:22', 'Frequent_Flyer_Program:23', 'Price:1', 'Price:2', 'Price:3', 'Price:4', 'Price:6', 'Price:7', 'Price:9', 'Price:11', 'Price:14', 'Price:22', 'Price:23', 'Improved_Customer_Service:1', 'Improved_Customer_Service:2', 'Improved_Customer_Service:3', 'Improved_Customer_Service:4', 'Improved_Customer_Service:6', 'Improved_Customer_Service:7', 'Improved_Customer_Service:8', 'Improved_Customer_Service:10', 'Improved_Customer_Service:11', 'Improved_Customer_Service:16', 'Improved_Customer_Service:18', 'Improved_Customer_Service:21', 'Improved_Customer_Service:22', 'Improved_Customer_Service:24', 'Improved_Customer_Service:25', 'Improved_Customer_Service:26', 'Improved_Customer_Service:27', 'Improved_Customer_Service:28'

Exponentiated coefficients:

Gender:1	Gender:2	Gender:3	Gender:4	Gender:5
1.1375248	1.2650955	2.5672655	3.9314920	1.9356249

Gender:6	Gender:7	Gender:8	Gender:9	Gender:10
1.7721223	1.2505430	1.0248486	1.0668640	1.0928062

Gender:11	Gender:12	Gender:13	Gender:14	Gender:15
0.8793113	0.7990423	0.6937940	0.9566193	0.9775056

Gender:16	Gender:17	Gender:18	Gender:19	Gender:20
1.0710018	1.1656781	1.1246991	1.0033596	1.1540149

Gender:21 Gender:22 Gender:23
Gender:24 Gender:25

1.4326581 1.3867578 1.2528542
1.1727512 0.9693115

Gender:26 Gender:27 Gender:28
Age:1 Age:2

1.0676943 1.1520057 1.5190675
1.0940471 1.1701266

Age:3 Age:4 Age:5 Age:6
Age:7

1.3538093 1.2345965 0.9854183
0.8768649 0.8175315

Age:8 Age:9 Age:10 Age:11
Age:12

0.7527218 0.7764708 0.8549088
0.7971159 0.8252952

Age:13 Age:14 Age:15
Age:16 Age:17

0.8343798 0.8588707 0.7966468
0.8421369 0.8656944

Age:18 Age:19 Age:20
Age:21 Age:22

0.8429913 0.8480329 0.8937632
0.9122110 0.8711139

Age:23 Age:24 Age:25
Age:26 Age:27

0.9052601 0.9218295 0.9628019
1.2728071 1.1791796

Age:28 Nationality:1 Nationality:2
Nationality:3 Nationality:4

1.0735496 0.4930379 0.5029851
0.5346464 0.6563055

Nationality:5 Nationality:6 Nationality:7
Nationality:8 Nationality:9

0.7125164 0.7589516 0.7826720
0.6953494 0.7428808

Nationality:10 Nationality:11 Nationality:12
Nationality:13 Nationality:14

1.1243530 1.0309986 1.0089230
0.9994825 0.8825078

Nationality:15 Nationality:16 Nationality:17
Nationality:18 Nationality:19

1.2116668 1.1461541 1.2773369
1.2022782 1.1104360

Nationality:20 Nationality:21 Nationality:22
Nationality:23 Nationality:24

1.2038252 1.0868303 0.8658863
0.8070807 0.8736691

Nationality:25 Nationality:26 Nationality:27
Nationality:28 Education_Level:1

0.9488674 0.8605204 0.7825778
0.7405002 0.5083729

Education_Level:2 Education_Level:3 Education_Level:4
Education_Level:5 Education_Level:6

0.5611592 0.6991076 0.8116265
0.7380582 0.7485714

Education_Level:7 Education_Level:8 Education_Level:9
Education_Level:10 Education_Level:11

0.7538443 0.7249153 0.7895724
0.7833192 0.6920587

Education_Level:12 Education_Level:13 Education_Level:14
Education_Level:15 Education_Level:16

0.7107298 0.7609656 0.7626534
0.7957203 0.8654989

Education_Level:17 Education_Level:18 Education_Level:19
Education_Level:20 Education_Level:21

0.8879410 0.8422075 0.8278465
0.9236565 0.9843914

Education_Level:22 Education_Level:23 Education_Level:24 Education_Level:25 Education_Level:26

0.9911947 0.9444837 0.9646149 0.9283559 1.2877527

Education_Level:27 Education_Level:28 Nature_of_connection:1 Nature_of_connection:2 Nature_of_connection:3

1.2319286 1.3375867 1.0369402 0.9627371 1.0413124

Nature_of_connection:4 Nature_of_connection:5 Nature_of_connection:6 Nature_of_connection:7 Nature_of_connection:8

1.0451063 1.0144748 1.0165378 0.9655099 1.0113705

Nature_of_connection:9 Nature_of_connection:10 Nature_of_connection:11 Nature_of_connection:12 Nature_of_connection:13

0.9752180 0.9500865 0.9445782 0.9416286 0.9496495

Nature_of_connection:14 Nature_of_connection:15 Nature_of_connection:16 Nature_of_connection:17 Nature_of_connection:18

0.9566567 0.9792154 0.9891815 1.0196523 1.0156912

Nature_of_connection:19 Nature_of_connection:20 Nature_of_connection:21 Nature_of_connection:22 Nature_of_connection:23

1.0137679 1.0149238 1.0251961 1.0257706 1.0229381

Nature_of_connection:24 Nature_of_connection:25 Nature_of_connection:26 Nature_of_connection:27 Nature_of_connection:28

1.0296996 1.0158158 1.0236908 0.9834834 0.9642617

Passenger_Customer_Type:1 Passenger_Customer_Type:2 Passenger_Customer_Type:3 Passenger_Customer_Type:4 Passenger_Customer_Type:5

0.9019678 0.8911904 0.8410034 0.8162036 0.9128780

Passenger_Customer_Type:6 Passenger_Customer_Type:7
Passenger_Customer_Type:8 Passenger_Customer_Type:9
Passenger_Customer_Type:10

0.8855220 0.9978275 0.9649825
1.0165354 1.0299211

Passenger_Customer_Type:11 Passenger_Customer_Type:12
Passenger_Customer_Type:13 Passenger_Customer_Type:14
Passenger_Customer_Type:15

1.0822673 1.0584780 0.9886396
1.0156822 1.0219094

Passenger_Customer_Type:16 Passenger_Customer_Type:17
Passenger_Customer_Type:18 Passenger_Customer_Type:19
Passenger_Customer_Type:20

1.0012871 0.9519493 0.9553558
1.0159035 0.9884183

Passenger_Customer_Type:21 Passenger_Customer_Type:22
Passenger_Customer_Type:23 Passenger_Customer_Type:24
Passenger_Customer_Type:25

0.9836698 0.9950930 0.9168989
0.9490885 0.9495135

Passenger_Customer_Type:26 Passenger_Customer_Type:27
Passenger_Customer_Type:28 Travel_Frequency:1 Travel_Frequency:2

0.8856504 0.8700637 0.8806756
1.1534696 1.4244167

Travel_Frequency:3 Travel_Frequency:4 Travel_Frequency:5
Travel_Frequency:6 Travel_Frequency:7

1.2380114 1.1471240 1.2324810
1.1315630 1.1226307

Travel_Frequency:8 Travel_Frequency:9 Travel_Frequency:10
Travel_Frequency:11 Travel_Frequency:12

1.0582051 0.9750422 0.9152691
0.9590162 0.9957129

Travel_Frequency:13 Travel_Frequency:14 Travel_Frequency:15
Travel_Frequency:16 Travel_Frequency:17

0.9834116 0.9758428 1.0427721
1.0450574 1.0185241

Travel_Frequency:18 Travel_Frequency:19 Travel_Frequency:20 Travel_Frequency:21 Travel_Frequency:22

1.0546925 1.0798620 1.0685573 1.0560187 0.9840067

Travel_Frequency:23 Travel_Frequency:24 Travel_Frequency:25 Travel_Frequency:26 Travel_Frequency:27

1.0552779 1.0470027 1.0501396 0.9402660 0.9380169

Travel_Frequency:28 Passanger_Trust:1 Passanger_Trust:2 Passanger_Trust:3 Passanger_Trust:4

0.9064240 0.4347769 0.8046931 0.6770806 0.9393626

Passanger_Trust:5 Passanger_Trust:6 Passanger_Trust:7 Passanger_Trust:8 Passanger_Trust:9

0.8886905 0.7456172 0.5657500 0.4457616 0.4622917

Passanger_Trust:10 Passanger_Trust:11 Passanger_Trust:12 Passanger_Trust:13 Passanger_Trust:14

0.4750923 0.4830141 0.5461705 0.5205688 0.5476821

Passanger_Trust:15 Passanger_Trust:16 Passanger_Trust:17 Passanger_Trust:18 Passanger_Trust:19

0.6366980 0.8240842 0.8791920 0.8620681 1.0159581

Passanger_Trust:20 Passanger_Trust:21 Passanger_Trust:22 Passanger_Trust:23 Passanger_Trust:24

0.9799879 1.2879057 1.3342057 1.3989476 1.7813459

Passanger_Trust:25 Passanger_Trust:26 Passanger_Trust:27 Passanger_Trust:28 Brand_Reputation:1

1.1349874 0.8373443 0.8062403 0.7462677 2.3604168

Brand_Reputation:2 Brand_Reputation:3 Brand_Reputation:4 Brand_Reputation:5 Brand_Reputation:6

1.7228782 1.9184567 1.5402642
0.9748574 0.9621436

Brand_Reputation:7 Brand_Reputation:8 Brand_Reputation:9
Brand_Reputation:10 Brand_Reputation:11

0.9150195 1.1659605 1.1465981
1.2965428 1.2719177

Brand_Reputation:12 Brand_Reputation:13 Brand_Reputation:14
Brand_Reputation:15 Brand_Reputation:16

0.8957040 0.9175197 0.8509598
0.8851076 0.8019579

Brand_Reputation:17 Brand_Reputation:18 Brand_Reputation:19
Brand_Reputation:20 Brand_Reputation:21

0.7112895 0.6742300 0.7357020
0.6131258 0.5551429

Brand_Reputation:22 Brand_Reputation:23 Brand_Reputation:24
Brand_Reputation:25 Brand_Reputation:26

0.4361837 0.4870660 0.5858021
0.4899783 0.5243204

Brand_Reputation:27 Brand_Reputation:28 Biman_Staffs_Services:1
Biman_Staffs_Services:2 Biman_Staffs_Services:3

0.5523678 0.4996932 1.4371634
1.4573460 1.2334997

Biman_Staffs_Services:4 Biman_Staffs_Services:5
Biman_Staffs_Services:6 Biman_Staffs_Services:7 Biman_Staffs_Services:8

0.7090832 0.7790185 0.8654798
0.8160015 1.1876971

Biman_Staffs_Services:9 Biman_Staffs_Services:10
Biman_Staffs_Services:11 Biman_Staffs_Services:12
Biman_Staffs_Services:13

1.2123512 1.2395518 1.1833527
1.2346827 1.2682729

Biman_Staffs_Services:14 Biman_Staffs_Services:15
Biman_Staffs_Services:16 Biman_Staffs_Services:17
Biman_Staffs_Services:18

1.2475158 1.4944315 1.4631087
1.1877822 1.1843414

Biman_Staffs_Services:19 Biman_Staffs_Services:20
Biman_Staffs_Services:21 Biman_Staffs_Services:22
Biman_Staffs_Services:23

1.1398329 1.0381288 0.8801568
0.8011992 0.6592322

Biman_Staffs_Services:24 Biman_Staffs_Services:25
Biman_Staffs_Services:26 Biman_Staffs_Services:27
Biman_Staffs_Services:28

0.4345486 0.4599136 0.5842744
0.6120828 0.5925525

Airline_Safety:1 Airline_Safety:2 Airline_Safety:3
Airline_Safety:4 Airline_Safety:5

0.2942441 0.2272447 0.4991969
0.8124107 0.8788861

Airline_Safety:6 Airline_Safety:7 Airline_Safety:8
Airline_Safety:9 Airline_Safety:10

0.8644660 0.9864106 1.1295561
1.1526894 0.9269526

Airline_Safety:11 Airline_Safety:12 Airline_Safety:13
Airline_Safety:14 Airline_Safety:15

0.9627866 0.8833615 1.0252077
0.9185934 0.7187183

Airline_Safety:16 Airline_Safety:17 Airline_Safety:18
Airline_Safety:19 Airline_Safety:20

0.6692613 0.6987782 0.7619249
0.8035722 0.8956538

Airline_Safety:21 Airline_Safety:22 Airline_Safety:23
Airline_Safety:24 Airline_Safety:25

0.9242809 0.9066168 0.8896727
0.8927169 0.8262111

Airline_Safety:26 Airline_Safety:27 Airline_Safety:28
Route_availability:1 Route_availability:2

0.7252075 0.7512322 0.8124943 1.5441925 0.9592081

Route_availability:3 Route_availability:4 Route_availability:5 Route_availability:6 Route_availability:7

0.7384992 1.0024253 1.5019029 1.3127167 1.1885401

Route_availability:8 Route_availability:9 Route_availability:10 Route_availability:11 Route_availability:12

0.7651635 0.8917054 0.8104403 0.8743655 1.1071497

Route_availability:13 Route_availability:14 Route_availability:15 Route_availability:16 Route_availability:17

1.0020384 1.0885793 1.0317952 0.9780109 1.0169928

Route_availability:18 Route_availability:19 Route_availability:20 Route_availability:21 Route_availability:22

0.9323038 0.7652499 0.8481443 0.7219657 0.7274873

Route_availability:23 Route_availability:24 Route_availability:25 Route_availability:26 Route_availability:27

0.7597710 0.6961851 0.7506278 0.7154303 0.7622443

Route_availability:28 Frequent_Flyer_Program:1 Frequent_Flyer_Program:2 Frequent_Flyer_Program:3 Frequent_Flyer_Program:4

0.7698833 1.2034706 1.3299406 1.2826873 1.0236946

Frequent_Flyer_Program:5 Frequent_Flyer_Program:6 Frequent_Flyer_Program:7 Frequent_Flyer_Program:8 Frequent_Flyer_Program:9

0.9581281 0.9702241 1.1191348 0.9972383 0.9080682

Frequent_Flyer_Program:10 Frequent_Flyer_Program:11 Frequent_Flyer_Program:12 Frequent_Flyer_Program:13 Frequent_Flyer_Program:14

0.9482918 0.9699852 1.0673192
0.9813482 0.9403699

Frequent_Flyer_Program:15 Frequent_Flyer_Program:16
Frequent_Flyer_Program:17 Frequent_Flyer_Program:18
Frequent_Flyer_Program:19

0.8432539 0.7552201 0.7397966
0.7151287 0.8566366

Frequent_Flyer_Program:20 Frequent_Flyer_Program:21
Frequent_Flyer_Program:22 Frequent_Flyer_Program:23
Frequent_Flyer_Program:24

0.8183231 0.7358326 0.7486005
0.6537819 0.6130183

Frequent_Flyer_Program:25 Frequent_Flyer_Program:26
Frequent_Flyer_Program:27 Frequent_Flyer_Program:28 Price:1

0.6021971 0.6323848 0.6163671
0.6639882 0.5369017

Price:2 Price:3 Price:4 Price:5
Price:6

0.4986431 0.5331769 0.6060918
0.7075687 1.0371821

Price:7 Price:8 Price:9 Price:10
Price:11

1.1832826 1.0283971 0.9301570
0.8797438 0.9258426

Price:12 Price:13 Price:14
Price:15 Price:16

0.9490423 0.8991117 0.8721501
0.6716612 0.7019017

Price:17 Price:18 Price:19
Price:20 Price:21

0.7677041 0.7684115 0.8181295
0.8649381 0.7851638

Price:22 Price:23 Price:24
Price:25 Price:26

0.6665541 0.6698371 0.6311926
0.7379317 0.6710945

Price:27 Price:28 Improved_Customer_Service:1
Improved_Customer_Service:2 Improved_Customer_Service:3

0.5876183 0.5774115 0.2263172
0.2879302 0.2312528

Improved_Customer_Service:4 Improved_Customer_Service:5
Improved_Customer_Service:6 Improved_Customer_Service:7
Improved_Customer_Service:8

0.2360578 0.2583826 0.2597316
0.3140147 0.3483584

Improved_Customer_Service:9 Improved_Customer_Service:10
Improved_Customer_Service:11 Improved_Customer_Service:12
Improved_Customer_Service:13

0.3409063 0.3789891 0.3688402
0.3667735 0.3924460

Improved_Customer_Service:14 Improved_Customer_Service:15
Improved_Customer_Service:16 Improved_Customer_Service:17
Improved_Customer_Service:18

0.4706630 0.5382489 0.5527058
0.6280273 0.6688999

Improved_Customer_Service:19 Improved_Customer_Service:20
Improved_Customer_Service:21 Improved_Customer_Service:22
Improved_Customer_Service:23

0.4938313 0.5190962 0.6270411
0.8056369 0.8282402

Improved_Customer_Service:24 Improved_Customer_Service:25
Improved_Customer_Service:26 Improved_Customer_Service:27
Improved_Customer_Service:28

0.9306929 1.3092390 1.4087400
1.2438389 1.2756775

Warning message:

In eval(expr) : some probabilities are very close to 0

>

> # Odds Ratios (for interpretation)

```
> odds_ratios <- exp(coef(ologit_model))

> print(odds_ratios)

            Gender                Age        Nationality    Education_Level
Nature_of_connection

         0.7761250          1.2746924          1.0690406          1.3850848
1.0140739

  Passenger_Customer_Type    Travel_Frequency    Passanger_Trust
Brand_Reputation     Biman_Staffs_Services

         1.0339318          0.9572531          1.4677678          1.7968944
0.9365881

      Airline_Safety    Route_availability    Frequent_Flyer_Program
Price Improved_Customer_Service

         1.3544865          1.3019082          1.5127923          1.7185058
3.9155834

>

> # Predicted Probabilities (example)

> predicted_probs <- predict(ologit_model, type = "probs")

> head(predicted_probs)

          1        1.14        1.29        1.43        1.57        1.71        1.86           2
2.14        2.29        2.43

1 3.394832e-03 1.889144e-03 2.608472e-03 3.284978e-03 8.085437e-03
0.0061061483 7.875666e-03 0.0397612128 0.0367364535 0.043706962
0.0457010147

2 3.991842e-01 1.096790e-01 9.923135e-02 7.986909e-02 1.050372e-01
0.0424420677 3.480858e-02 0.0686273231 0.0211904582 0.012424068
0.0073057824

3 4.470790e-04 2.499362e-04 3.464618e-04 4.385723e-04 1.090318e-03
0.0008337915 1.088869e-03 0.0057401717 0.0056930718 0.007319417
0.0083721226

4 7.022041e-03 3.885508e-03 5.339246e-03 6.681845e-03 1.624914e-02
0.0120889959 1.536582e-02 0.0738893847 0.0632425535 0.069652576
0.0670602698

5 1.063404e-01 5.017890e-02 6.094508e-02 6.562311e-02 1.238345e-01
0.0693185319 6.947401e-02 0.1876995488 0.0781255183 0.052072541
0.0331548534
```

6 1.853832e-05 1.037063e-05 1.438401e-05 1.822188e-05 4.536726e-05 0.0000347576 4.547481e-05 0.0002413137 0.0002419972 0.000315098 0.0003660071

2.57 2.71 2.86 3 3.14 3.29 3.43 3.57 3.71 3.86 4

1 0.0742159488 0.086408832 0.098096015 0.234391731 0.0885761535 0.0697792001 0.0321335455 0.0377861548 0.0342948980 0.0196125665 1.685859e-02

2 0.0067560503 0.004403746 0.003007235 0.003759881 0.0008370169 0.0005373752 0.0002190595 0.0002381375 0.0001999062 0.0001080312 8.946275e-05

3 0.0154532403 0.021643860 0.031110509 0.128195647 0.0906958898 0.1090965000 0.0693153038 0.1062209724 0.1318034329 0.0983703329 1.038499e-01

4 0.0980442209 0.099928676 0.098356142 0.186827666 0.0572687983 0.0411019552 0.0178631012 0.0202114681 0.0176422650 0.0098035753 8.266952e-03

5 0.0325214818 0.022239398 0.015688852 0.020217566 0.0045950035 0.0029685564 0.0012143062 0.0013228215 0.0011126787 0.0006021502 4.991038e-04

6 0.0006917326 0.001005724 0.001526447 0.007519115 0.0069267858 0.0110370593 0.0093034323 0.0199460464 0.0438715100 0.0686806031 2.110066e-01

4.14 4.29 4.43 4.57 4.71 4.86 5

1 2.549971e-03 1.634934e-03 1.641919e-03 1.326745e-03 5.670169e-04 2.588175e-04 7.166377e-04

2 1.326892e-05 8.471896e-06 8.480272e-06 6.832173e-06 2.914391e-06 1.329193e-06 3.676821e-06

3 1.764612e-02 1.161812e-02 1.191598e-02 9.815851e-03 4.247267e-03 1.949227e-03 5.432029e-03

4 1.237811e-03 7.919067e-04 7.939371e-04 6.405491e-04 2.734856e-04 1.247803e-04 3.453285e-04

5 7.406085e-05 4.729083e-05 4.734127e-05 3.814340e-05 1.627151e-05 7.421242e-06 2.052915e-05

6 8.523316e-02 7.755599e-02 1.084851e-01 1.247602e-01 6.898018e-02 3.568791e-02 1.164309e-01

```
>
> # Visualization (optional)
> odds_ratios <- exp(coef(ologit_model))
```

Appendix 13

OUTCOME OF MULTIVARIATE REGRESSION ANALYSIS THROUGH PROGRAMMING R AND PYTHON

OBJECTIVE II MULTIVARIATE LINEAR REGRESSION USING R

To perform Multiple Linear Regression (MLR) in R using your dataset and ensuring that the "Multicollinearity" and "Robust Standard Error" options are considered, follow these steps:

1. Load the necessary libraries.
2. Read the dataset.
3. Check for multicollinearity.
4. Fit the multiple linear regression model.
5. Apply robust standard errors using the sandwich package.
6. Display the results.
7.

CODE IN R TO CARR OUT MULTIPLE LINEAR REGRESSION

```
# Load necessary libraries
library(readr)      # For reading csv files
library(car)        # For multicollinearity (VIF) check
library(sandwich)   # For robust standard errors
library(lmtest)     # For hypothesis testing with robust standard errors
# Load the dataset
data <- read.csv("F:/DBA 12 DEC MLR AND LOG
REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv")
# Check multicollinearity using Variance Inflation Factor (VIF)
# The threshold for VIF is typically 5 or 10 (anything above this suggests
multicollinearity)
vif_result <- vif(lm(Customer_Loyalty ~ Gender + Age + Nationality +
Education_Level +
                     Nature_of_connection + Passenger_Customer_Type +
Travel_Frequency +
```

```
                Passanger_Trust + Brand_Reputation + Biman_Staffs_Services +
                Airline_Safety + Route_availability + Frequent_Flyer_Program +
                Price + Improved_Customer_Service, data = data))
print(vif_result)
# Fit the multiple linear regression model
mlr_model <- lm(Customer_Loyalty ~ Gender + Age + Nationality + Education_Level
+
                Nature_of_connection + Passenger_Customer_Type +
Travel_Frequency +
                Passanger_Trust + Brand_Reputation + Biman_Staffs_Services +
                Airline_Safety + Route_availability + Frequent_Flyer_Program +
                Price + Improved_Customer_Service, data = data)
# Summary of the model
summary(mlr_model)
# Calculate robust standard errors
robust_se <- sqrt(diag(vcovHC(mlr_model, type = "HC1")))
# Display robust standard errors
print("Robust Standard Errors:")
print(robust_se)
# Perform hypothesis testing with robust standard errors
coeftest(mlr_model, vcov = vcovHC(mlr_model, type = "HC1"))
```

OUTCOME

```
> install.packages(c("readr", "car", "sandwich", "lmtest"))
Installing packages into ‘C:/Users/Hp/AppData/Local/R/win-library/4.4’
(as ‘lib’ is unspecified)
--- Please select a CRAN mirror for use in this session ---
also installing the dependency ‘zoo’

trying URL 'https://cloud.r-project.org/bin/windows/contrib/4.4/zoo_1.8-12.zip'
Content type 'application/zip' length 1029839 bytes (1005 KB)
downloaded 1005 KB
```

```
trying URL 'https://cloud.r-project.org/bin/windows/contrib/4.4/readr_2.1.5.zip'
Content type 'application/zip' length 1211560 bytes (1.2 MB)
downloaded 1.2 MB

trying URL 'https://cloud.r-project.org/bin/windows/contrib/4.4/car_3.1-3.zip'
Content type 'application/zip' length 1541831 bytes (1.5 MB)
downloaded 1.5 MB

trying URL 'https://cloud.r-project.org/bin/windows/contrib/4.4/sandwich_3.1-1.zip'
Content type 'application/zip' length 1506011 bytes (1.4 MB)
downloaded 1.4 MB

trying URL 'https://cloud.r-project.org/bin/windows/contrib/4.4/lmtest_0.9-40.zip'
Content type 'application/zip' length 411601 bytes (401 KB)
downloaded 401 KB

package ‘zoo’ successfully unpacked and MD5 sums checked
package ‘readr’ successfully unpacked and MD5 sums checked
package ‘car’ successfully unpacked and MD5 sums checked
package ‘sandwich’ successfully unpacked and MD5 sums checked
package ‘lmtest’ successfully unpacked and MD5 sums checked

The downloaded binary packages are in
        C:\Users\Hp\AppData\Local\Temp\Rtmp44erYn\downloaded_packages
> # Load necessary libraries
> library(readr)      # For reading csv files
Warning message:
package ‘readr’ was built under R version 4.4.2
> library(car)        # For multicollinearity (VIF) check
Loading required package: carData
Warning messages:
1: package ‘car’ was built under R version 4.4.2
2: package ‘carData’ was built under R version 4.4.2
> library(sandwich)   # For robust standard errors
```

```
Warning message:
package ‘sandwich’ was built under R version 4.4.2
> library(lmtest)     # For hypothesis testing with robust standard errors
Loading required package: zoo

Attaching package: ‘zoo’

The following objects are masked from ‘package:base’:

    as.Date, as.Date.numeric

Warning messages:
1: package ‘lmtest’ was built under R version 4.4.2
2: package ‘zoo’ was built under R version 4.4.2
>
> # Load the dataset
> data <- read.csv("F:/DBA 12 DEC MLR AND LOG
REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv")
>
> # Check multicollinearity using Variance Inflation Factor (VIF)
> # The threshold for VIF is typically 5 or 10 (anything above this suggests
multicollinearity)
> vif_result <- vif(lm(Customer_Loyalty ~ Gender + Age + Nationality +
Education_Level +
+                     Nature_of_connection + Passenger_Customer_Type +
Travel_Frequency +
+                     Passanger_Trust + Brand_Reputation + Biman_Staffs_Services +
+                     Airline_Safety + Route_availability + Frequent_Flyer_Program +
+                     Price + Improved_Customer_Service, data = data))
> print(vif_result)
                Gender                    Age            Nationality
              1.111582               1.370904               1.068483
       Education_Level   Nature_of_connection  Passenger_Customer_Type
              1.409333               1.300036               1.244927
```

```
      Travel_Frequency       Passanger_Trust        Brand_Reputation
              1.250972              3.816059              4.018406
  Biman_Staffs_Services       Airline_Safety       Route_availability
              3.710815              2.432118              2.452426
 Frequent_Flyer_Program                 Price Improved_Customer_Service
              2.583443              1.910548              4.006978
>
> # Fit the multiple linear regression model
> mlr_model <- lm(Customer_Loyalty ~ Gender + Age + Nationality +
Education_Level +
+                 Nature_of_connection + Passenger_Customer_Type +
Travel_Frequency +
+                 Passanger_Trust + Brand_Reputation + Biman_Staffs_Services +
+                 Airline_Safety + Route_availability + Frequent_Flyer_Program +
+                 Price + Improved_Customer_Service, data = data)
>
> # Summary of the model
> summary(mlr_model)

Call:
lm(formula = Customer_Loyalty ~ Gender + Age + Nationality +
   Education_Level + Nature_of_connection + Passenger_Customer_Type +
   Travel_Frequency + Passanger_Trust + Brand_Reputation +
Biman_Staffs_Services +
   Airline_Safety + Route_availability + Frequent_Flyer_Program +
   Price + Improved_Customer_Service, data = data)

Residuals:
    Min      1Q  Median      3Q     Max
-1.87503 -0.28380 -0.01036  0.25390  2.08399

Coefficients:
                      Estimate Std. Error t value Pr(>|t|)
(Intercept)             -0.342936   0.254421  -1.348 0.178434
```

```
Gender                  -0.054294   0.068563  -0.792 0.428887
Age                     0.070161   0.032682   2.147 0.032396 *
Nationality              0.008868   0.081036   0.109 0.912908
Education_Level           0.090048   0.036890   2.441 0.015070 *
Nature_of_connection       0.003532   0.010016   0.353 0.724552
Passenger_Customer_Type    0.011376   0.019246   0.591 0.554780
Travel_Frequency          -0.015466   0.022403  -0.690 0.490370
Passanger_Trust            0.134232   0.053907   2.490 0.013168 *
Brand_Reputation           0.138222   0.052429   2.636 0.008699 **
Biman_Staffs_Services     -0.015963   0.048547  -0.329 0.742462
Airline_Safety            0.098693   0.047842   2.063 0.039754 *
Route_availability         0.058248   0.041493   1.404 0.161134
Frequent_Flyer_Program     0.104568   0.041149   2.541 0.011414 *
Price                   0.132857   0.038950   3.411 0.000712 ***
Improved_Customer_Service  0.340745   0.051718   6.589 1.37e-10 ***
---
Signif. codes:  0 ‘***’ 0.001 ‘**’ 0.01 ‘*’ 0.05 ‘.’ 0.1 ‘ ’ 1

Residual standard error: 0.5219 on 409 degrees of freedom
Multiple R-squared:  0.7182,    Adjusted R-squared:  0.7078
F-statistic: 69.48 on 15 and 409 DF,  p-value: < 2.2e-16

>
> # Calculate robust standard errors
> robust_se <- sqrt(diag(vcovHC(mlr_model, type = "HC1")))
>
> # Display robust standard errors
> print("Robust Standard Errors:")
[1] "Robust Standard Errors:"
> print(robust_se)
          (Intercept)               Gender                  Age
          0.245910058           0.069426053           0.032573751
          Nationality       Education_Level   Nature_of_connection
          0.035962265           0.034810052           0.009883202
```

```
  Passenger_Customer_Type         Travel_Frequency          Passanger_Trust
              0.017779345               0.022749052              0.060988617
       Brand_Reputation     Biman_Staffs_Services           Airline_Safety
              0.055097760               0.052582991              0.058560108
     Route_availability    Frequent_Flyer_Program                    Price
              0.045483156               0.045083599              0.048859134
Improved_Customer_Service
              0.066148350
>
> # Perform hypothesis testing with robust standard errors
> coeftest(mlr_model, vcov = vcovHC(mlr_model, type = "HC1"))

t test of coefficients:

                          Estimate Std. Error t value  Pr(>|t|)
(Intercept)             -0.3429358  0.2459101 -1.3946  0.163906
Gender                  -0.0542937  0.0694261 -0.7820  0.434645
Age                      0.0701611  0.0325738  2.1539  0.031831 *
Nationality              0.0088684  0.0359623  0.2466  0.805338
Education_Level          0.0900481  0.0348101  2.5868  0.010030 *
Nature_of_connection     0.0035320  0.0098832  0.3574  0.720994
Passenger_Customer_Type  0.0113765  0.0177793  0.6399  0.522615
Travel_Frequency        -0.0154655  0.0227491 -0.6798  0.496996
Passanger_Trust          0.1342320  0.0609886  2.2009  0.028299 *
Brand_Reputation         0.1382216  0.0550978  2.5087  0.012505 *
Biman_Staffs_Services   -0.0159632  0.0525830 -0.3036  0.761601
Airline_Safety           0.0986928  0.0585601  1.6853  0.092689 .
Route_availability       0.0582484  0.0454832  1.2807  0.201039
Frequent_Flyer_Program   0.1045684  0.0450836  2.3194  0.020863 *
Price                    0.1328573  0.0488591  2.7192  0.006823 **
Improved_Customer_Service  0.3407453  0.0661483  5.1512 4.033e-07 ***
---
Signif. codes:  0 ‘***’ 0.001 ‘**’ 0.01 ‘*’ 0.05 ‘.’ 0.1 ‘ ’ 1
```

>

Explanation:

1. Libraries:
    - readr is used to read CSV files.
    - car provides the vif() function to check for multicollinearity.
    - sandwich is used for calculating robust standard errors.
    - lmtest is used for hypothesis testing with robust standard errors.
2. Multicollinearity Check:
    - The Variance Inflation Factor (VIF) is calculated for the independent variables. If VIF values are high (greater than 5 or 10), it suggests multicollinearity, which may require addressing (e.g., removing or combining variables).
3. Model Fitting:
    - The lm() function fits the multiple linear regression model with Customer_Loyalty as the dependent variable and the specified independent variables.
4. Robust Standard Errors:
    - vcovHC() from the sandwich package calculates robust standard errors (type HC1 is used here).
    - The coeftest() function from lmtest displays the coefficients and t-statistics using robust standard errors.

PYTHON CODE

> # Load Required Packages

> library(car) # For VIF calculation

Loading required package: carData

Warning messages:

1: package ‘car’ was built under R version 4.4.2

2: package ‘carData’ was built under R version 4.4.2

> library(lmtest) # For robust standard errors

Loading required package: zoo

Attaching package: ‘zoo’

The following objects are masked from ‘package:base’:

    as.Date, as.Date.numeric

Warning messages:

1: package ‘lmtest’ was built under R version 4.4.2

2: package ‘zoo’ was built under R version 4.4.2

> library(sandwich) # For heteroskedasticity-consistent estimators

Warning message:

package ‘sandwich’ was built under R version 4.4.2

> library(readr)   # For data import

Warning message:

package ‘readr’ was built under R version 4.4.2

>

> # Load Dataset

> data <- read_csv('F:/DBA 12 DEC MLR AND LOG REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv')

[1mindexing[0m [34mUpdated_MLR_Fraction_425_Data_11_Dec.csv[0m [========] [32m87.08MB/s[0m, eta: [36m 0s[0m

Rows: 425 Columns: 17

```
── Column specification ────────────────────────────────────────────────────────

Delimiter: ","

dbl (17): Gender, Age, Nationality, Education_Level, Nature_of_connection, P...


ℹ Use `spec()` to retrieve the full column specification for this data.

ℹ Specify the column types or set `show_col_types = FALSE` to quiet this message.

>

> # Define Variables

> dependent_vars <- c("Customer_Satisfaction", "Customer_Loyalty")

> independent_vars <- c("Gender", "Age", "Nationality", "Education_Level",

+                       "Nature_of_connection", "Passenger_Customer_Type",

+                       "Travel_Frequency", "Passanger_Trust", "Brand_Reputation",

+                       "Biman_Staffs_Services", "Airline_Safety", "Route_availability",

+                       "Frequent_Flyer_Program", "Price", "Improved_Customer_Service")

>

> # Convert Categorical Variables to Factors

> data <- data %>%

+   mutate(across(c(Gender, Nationality, Passenger_Customer_Type), as.factor))

Error in data %>% mutate(across(c(Gender, Nationality,
Passenger_Customer_Type),  :

  could not find function "%>%"

>

> # Build Multivariate Regression Model

> model_formula <- as.formula(
```

```
+   paste("cbind(", paste(dependent_vars, collapse = ","), ") ~",
+         paste(independent_vars, collapse = " + "))
+ )
>
> mv_model <- lm(model_formula, data = data)
>
> # 1. Multicollinearity Assessment
> cat("\n--- Multicollinearity Diagnosis (VIF Values) ---\n")


--- Multicollinearity Diagnosis (VIF Values) ---
> tryCatch({
+   vif_results <- car::vif(mv_model)
+   print(vif_results)
+ }, error = function(e) {
+   cat("VIF calculation warning:", e$message, "\n")
+   cat("Possible perfect multicollinearity detected\n")
+ })
VIF calculation warning: argument is of length zero
Possible perfect multicollinearity detected
>
> # 2. Robust Standard Errors Implementation
> cat("\n--- Robust Regression Results (HC3 Estimator) ---\n")


--- Robust Regression Results (HC3 Estimator) ---
```

```
> robust_results <- coeftest(mv_model, vcov = vcovHC(mv_model, type = "HC3"))
>
> # Format Output for Both Dependent Variables
> format_results <- function(dep_var) {
+   cat("\n\n=== Results for", dep_var, "===\n")
+   print(robust_results[grepl(dep_var, row.names(robust_results)),])
+ }
>
> # Display Formatted Output
> format_results("Customer_Satisfaction")


=== Results for Customer_Satisfaction ===
                                                Estimate  Std. Error
Customer_Satisfaction:(Intercept)              -0.659449077 0.268844341
Customer_Satisfaction:Gender                    0.027437877 0.066572907
Customer_Satisfaction:Age                      0.024945839 0.033399018
Customer_Satisfaction:Nationality              -0.062099374 0.147287662
Customer_Satisfaction:Education_Level           0.094726957 0.033939056
Customer_Satisfaction:Nature_of_connection      0.011756774 0.008753148
Customer_Satisfaction:Passenger_Customer_Type   0.009243873 0.017290859
Customer_Satisfaction:Travel_Frequency         -0.007449794 0.021134989
Customer_Satisfaction:Passanger_Trust           0.273223669 0.060486966
Customer_Satisfaction:Brand_Reputation          0.077566444 0.057240446
Customer_Satisfaction:Biman_Staffs_Services     0.064018886 0.058069578
```

Customer_Satisfaction:Airline_Safety -0.020979789 0.051242591

Customer_Satisfaction:Route_availability 0.115004307 0.042191929

Customer_Satisfaction:Frequent_Flyer_Program 0.101001612 0.052016088

Customer_Satisfaction:Price 0.072682083 0.043774842

Customer_Satisfaction:Improved_Customer_Service 0.388751444 0.070956468

t value Pr(>|t|)

Customer_Satisfaction:(Intercept) -2.4529030 1.458749e-02

Customer_Satisfaction:Gender 0.4121478 6.804470e-01

Customer_Satisfaction:Age 0.7469034 4.555510e-01

Customer_Satisfaction:Nationality -0.4216197 6.735242e-01

Customer_Satisfaction:Education_Level 2.7910899 5.499159e-03

Customer_Satisfaction:Nature_of_connection 1.3431481 1.799688e-01

Customer_Satisfaction:Passenger_Customer_Type 0.5346104 5.932098e-01

Customer_Satisfaction:Travel_Frequency -0.3524863 7.246552e-01

Customer_Satisfaction:Passanger_Trust 4.5170668 8.215558e-06

Customer_Satisfaction:Brand_Reputation 1.3550985 1.761341e-01

Customer_Satisfaction:Biman_Staffs_Services 1.1024514 2.709138e-01

Customer_Satisfaction:Airline_Safety -0.4094209 6.824451e-01

Customer_Satisfaction:Route_availability 2.7257419 6.691330e-03

Customer_Satisfaction:Frequent_Flyer_Program 1.9417380 5.285517e-02

Customer_Satisfaction:Price 1.6603620 9.760806e-02

Customer_Satisfaction:Improved_Customer_Service 5.4787316 7.500472e-08

> format_results("Customer_Loyalty")

=== Results for **Customer_Loyalty** ===

	Estimate	Std. Error	t value	Pr(>|t|)
Customer_Loyalty:(Intercept)	-0.342935773	0.25399021	-1.3501929	1.777008e-01
Customer_Loyalty:Gender	-0.054293727	0.07130389	-0.7614413	4.468324e-01
Customer_Loyalty:Age	0.070161068	0.03338334	2.1016791	3.619250e-02
Customer_Loyalty:Nationality	0.008868445	0.04703848	0.1885360	8.505500e-01
Customer_Loyalty:Education_Level	0.090048053	0.03575045	2.5187946	
Customer_Loyalty:Nature_of_connection	0.003532025	0.01014333	0.3482117	
Customer_Loyalty:Passenger_Customer_Type	0.011376483	0.01819971	0.6250916	
Customer_Loyalty:Travel_Frequency	-0.015465505	0.02333573	-0.6627392	
Customer_Loyalty:Passanger_Trust	0.134232034	0.06294519	2.1325225	
Customer_Loyalty:Brand_Reputation	0.138221610	0.05688349	2.4299073	
Customer_Loyalty:Biman_Staffs_Services	-0.015963203	0.05435228	-0.2936989	
Customer_Loyalty:Airline_Safety	0.098692849	0.06022002	1.6388710	
Customer_Loyalty:Route_availability	0.058248441	0.04703099	1.2385118	
Customer_Loyalty:Frequent_Flyer_Program	0.104568439	0.04648187	2.2496610	
Customer_Loyalty:Price	0.132857290	0.05039458	2.6363411	
Customer_Loyalty:Improved_Customer_Service	0.340745308	0.06865687	4.9630186	

```
Customer_Loyalty:Education_Level           1.215621e-02
Customer_Loyalty:Nature_of_connection      7.278604e-01
Customer_Loyalty:Passenger_Customer_Type   5.322595e-01
Customer_Loyalty:Travel_Frequency          5.078709e-01
Customer_Loyalty:Passanger_Trust           3.355894e-02
Customer_Loyalty:Brand_Reputation          1.553213e-02
Customer_Loyalty:Biman_Staffs_Services     7.691370e-01
Customer_Loyalty:Airline_Safety            1.020091e-01
Customer_Loyalty:Route_availability        2.162367e-01
Customer_Loyalty:Frequent_Flyer_Program    2.500154e-02
Customer_Loyalty:Price                     8.699542e-03
Customer_Loyalty:Improved_Customer_Service 1.020391e-06
>
> # Save Full Output to File
> sink("Multivariate_Regression_Results.txt")
>   cat("Multivariate Regression Analysis Results\n")
>   cat("Date:", format(Sys.Date(), "%Y-%m-%d"), "\n\n")
>
>   cat("VIF Values:\n")
>   print(vif_results)
Error: object 'vif_results' not found
>
>   cat("\n\nRobust Standard Errors Results:\n")
>   print(robust_results)
```

> sink()

>

> cat("\nAnalysis complete. Results saved to Multivariate_Regression_Results.txt")

Analysis complete. Results saved to Multivariate_Regression_Results.txt>

OR

Load necessary libraries

> library(MASS)

Warning message:

package ‘MASS’ was built under R version 4.4.2

> library(car)

Loading required package: carData

Warning messages:

1: package ‘car’ was built under R version 4.4.2

2: package ‘carData’ was built under R version 4.4.2

> library(readr)

Warning message:

package ‘readr’ was built under R version 4.4.2

>

> # Load the dataset

> file_path <- 'F:/DBA 12 DEC MLR AND LOG REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv'

> data <- read_csv(file_path)

[1mindexing[0m [34mUpdated_MLR_Fraction_425_Data_11_Dec.csv[0m [========] [32m99.83MB/s[0m, eta: [36m 0s[0m

Rows: 425 Columns: 17

── Column specification

──

Delimiter: ","

dbl (17): Gender, Age, Nationality, Education_Level, Nature_of_connection, P...

ℹ Use `spec()` to retrieve the full column specification for this data.

ℹ Specify the column types or set `show_col_types = FALSE` to quiet this message.

>

> # Define dependent and independent variables

> dependent_vars <- c("Customer_Satisfaction", "Customer_Loyalty")

> independent_vars <- c(

+ "Gender", "Age", "Nationality", "Education_Level", "Nature_of_connection",

+ "Passenger_Customer_Type", "Travel_Frequency", "Passanger_Trust", "Brand_Reputation",

+ "Biman_Staffs_Services", "Airline_Safety", "Route_availability",

+ "Frequent_Flyer_Program", "Price", "Improved_Customer_Service"

+)

>

> # Prepare the independent variables

> # Convert categorical variables to factors (if not already)

> data[independent_vars] <- lapply(data[independent_vars], function(x) {

+ if (is.character(x)) {

+ as.factor(x)

```
+   } else {
+     x
+   }
+ })
>
> # Create the formula for the multivariate regression
> formula <- as.formula(paste("cbind(", paste(dependent_vars, collapse = ", "), ") ~ ", paste(independent_vars, collapse = " + ")))
>
> # Fit the Multivariate Multiple Regression model
> mv_model <- lm(formula, data = data)
>
> # Summary of the model
> summary_mv_model <- summary(mv_model)
> print(summary_mv_model)
Response Customer_Satisfaction :


Call:
lm(formula = Customer_Satisfaction ~ Gender + Age + Nationality +
    Education_Level + Nature_of_connection + Passenger_Customer_Type +
    Travel_Frequency + Passanger_Trust + Brand_Reputation +
Biman_Staffs_Services +
    Airline_Safety + Route_availability + Frequent_Flyer_Program +
    Price + Improved_Customer_Service, data = data)
```

Residuals:

```
    Min      1Q  Median      3Q     Max
-1.80139 -0.25292  0.06217  0.28023  2.30061
```

Coefficients:

```
                          Estimate Std. Error t value Pr(>|t|)
(Intercept)              -0.659449   0.241717  -2.728  0.00664 **
Gender                    0.027438   0.065139   0.421  0.67382
Age                       0.024946   0.031050   0.803  0.42220
Nationality              -0.062099   0.076989  -0.807  0.42037
Education_Level           0.094727   0.035048   2.703  0.00716 **
Nature_of_connection      0.011757   0.009516   1.235  0.21738
Passenger_Customer_Type   0.009244   0.018285   0.506  0.61345
Travel_Frequency         -0.007450   0.021284  -0.350  0.72651
Passanger_Trust           0.273224   0.051216   5.335 1.59e-07 ***
Brand_Reputation          0.077566   0.049811   1.557  0.12019
Biman_Staffs_Services     0.064019   0.046123   1.388  0.16589
Airline_Safety           -0.020980   0.045453  -0.462  0.64464
Route_availability        0.115004   0.039421   2.917  0.00373 **
Frequent_Flyer_Program    0.101002   0.039094   2.584  0.01012 *
Price                     0.072682   0.037005   1.964  0.05019 .
Improved_Customer_Service 0.388751   0.049136   7.912 2.40e-14 ***
```

Signif. codes: 0 ‘***’ 0.001 ‘**’ 0.01 ‘*’ 0.05 ‘.’ 0.1 ‘ ’ 1

Residual standard error: 0.4958 on 409 degrees of freedom

Multiple R-squared: 0.784, Adjusted R-squared: 0.776

F-statistic: 98.94 on 15 and 409 DF, p-value: < 2.2e-16

Response Customer_Loyalty :

Call:

lm(formula = Customer_Loyalty ~ Gender + Age + Nationality +

  Education_Level + Nature_of_connection + Passenger_Customer_Type +

  Travel_Frequency + Passanger_Trust + Brand_Reputation +
Biman_Staffs_Services +

  Airline_Safety + Route_availability + Frequent_Flyer_Program +

  Price + Improved_Customer_Service, data = data)

Residuals:

    Min   1Q Median   3Q   Max

-1.87503 -0.28380 -0.01036 0.25390 2.08399

Coefficients:

                    Estimate Std. Error t value Pr(>|t|)

(Intercept)   -0.342936   0.254421 -1.348 0.178434

Gender   -0.054294   0.068563 -0.792 0.428887

Age   0.070161   0.032682   2.147 0.032396 *

Nationality   0.008868   0.081036   0.109 0.912908

Education_Level   0.090048   0.036890   2.441 0.015070 *

Nature_of_connection   0.003532   0.010016   0.353 0.724552

Passenger_Customer_Type   0.011376   0.019246   0.591 0.554780

Travel_Frequency   -0.015466   0.022403 -0.690 0.490370

Passanger_Trust   0.134232   0.053907   2.490 0.013168 *

```
Brand_Reputation           0.138222   0.052429   2.636 0.008699 **
Biman_Staffs_Services     -0.015963   0.048547  -0.329 0.742462
Airline_Safety             0.098693   0.047842   2.063 0.039754 *
Route_availability         0.058248   0.041493   1.404 0.161134
Frequent_Flyer_Program     0.104568   0.041149   2.541 0.011414 *
Price                      0.132857   0.038950   3.411 0.000712 ***
Improved_Customer_Service  0.340745   0.051718   6.589 1.37e-10 ***

Signif. codes:  0 ‘***’ 0.001 ‘**’ 0.01 ‘*’ 0.05 ‘.’ 0.1 ‘ ’ 1

Residual standard error: 0.5219 on 409 degrees of freedom
Multiple R-squared:  0.7182,    Adjusted R-squared:  0.7078
F-statistic: 69.48 on 15 and 409 DF,  p-value: < 2.2e-16
>
> # Check for multicollinearity using Variance Inflation Factor (VIF)
> vif_values <- vif(mv_model)
Error in if (names(coefficients(mod)[1]) == "(Intercept)") { :
  argument is of length zero
> print("Variance Inflation Factor (VIF):")
[1] "Variance Inflation Factor (VIF):"
> print(vif_values)
Error: object 'vif_values' not found
>
> # Save the model summary to a file
> output_file <- 'F:/DBA 12 DEC MLR AND LOG
REGRESSION/Multivariate_Regression_Summary.txt'
```

```
> write(summary_mv_model, file = output_file)
Error in cat(x, file = file, sep = c(rep.int(sep, ncolumns - 1), "\n"),  :
  argument 1 (type 'list') cannot be handled by 'cat'
>
> cat("Model summary and VIF values saved to:", output_file)
```

Appendix 14

OUTCOME OF RANDOM FOREST REGRESSION ANALYSIS (MACHINE LEARNING) IN PYTHON

OUTCOME

Customer Satisfaction - MSE: 0.3274, R^2: 0.7673

Customer Loyalty - MSE: 0.4768, R^2: 0.6362

Feature Importance - Customer Satisfaction:

	Feature	Importance
9	Improved_Customer_Service	0.608403
2	Passanger_Trust	0.110094
8	Price	0.067125
3	Brand_Reputation	0.054021
4	Biman_Staffs_Services	0.036229

Feature Importance - Customer Loyalty:

	Feature	Importance
9	Improved_Customer_Service	0.560117
7	Frequent_Flyer_Program	0.096809
2	Passanger_Trust	0.080842
8	Price	0.058123
3	Brand_Reputation	0.049005

PYTHON CODE

```
import pandas as pd
import numpy as np
from sklearn.model_selection import train_test_split
from sklearn.ensemble import RandomForestRegressor
from sklearn.metrics import mean_squared_error, r2_score
from statsmodels.stats.outliers_influence import variance_inflation_factor
import statsmodels.api as sm
```

```
# Load dataset
file_path = "F:/DBA 12 DEC MLR AND LOG
REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv"
df = pd.read_csv(file_path)

# Define dependent and independent variables
dependent_vars = ["Customer_Satisfaction", "Customer_Loyalty"]
independent_vars = ["Gender", "Age", "Nationality", "Education_Level",
"Nature_of_connection",
                    "Passenger_Customer_Type", "Travel_Frequency", "Passanger_Trust",
"Brand_Reputation",
                    "Biman_Staffs_Services", "Airline_Safety", "Route_availability",
                    "Frequent_Flyer_Program", "Price", "Improved_Customer_Service"]

# Convert categorical variables to numerical (One-Hot Encoding)
df = pd.get_dummies(df, columns=["Gender", "Nationality", "Education_Level",
"Nature_of_connection", "Passenger_Customer_Type"])

# Ensure numerical data only
X = df[independent_vars]
y_satisfaction = df["Customer_Satisfaction"]
y_loyalty = df["Customer_Loyalty"]

# Check Multicollinearity using VIF
vif_data = pd.DataFrame()
vif_data["Feature"] = X.columns
vif_data["VIF"] = [variance_inflation_factor(X.values, i) for i in range(X.shape[1])]

# Drop highly collinear features (VIF > 5 is a general threshold)
X = X.loc[:, vif_data["VIF"] < 5]

# Split into training and testing sets (80-20 split)
X_train, X_test, y_train_satisfaction, y_test_satisfaction = train_test_split(X,
y_satisfaction, test_size=0.2, random_state=42)
```

```
X_train, X_test, y_train_loyalty, y_test_loyalty = train_test_split(X, y_loyalty,
test_size=0.2, random_state=42)

# Train Random Forest Regression Model for Customer Satisfaction
rf_satisfaction = RandomForestRegressor(n_estimators=100, random_state=42,
max_depth=10)
rf_satisfaction.fit(X_train, y_train_satisfaction)
y_pred_satisfaction = rf_satisfaction.predict(X_test)

# Train Random Forest Regression Model for Customer Loyalty
rf_loyalty = RandomForestRegressor(n_estimators=100, random_state=42,
max_depth=10)
rf_loyalty.fit(X_train, y_train_loyalty)
y_pred_loyalty = rf_loyalty.predict(X_test)

# Evaluate Model Performance
mse_satisfaction = mean_squared_error(y_test_satisfaction, y_pred_satisfaction)
r2_satisfaction = r2_score(y_test_satisfaction, y_pred_satisfaction)

mse_loyalty = mean_squared_error(y_test_loyalty, y_pred_loyalty)
r2_loyalty = r2_score(y_test_loyalty, y_pred_loyalty)

# Print Results
print(f"Customer Satisfaction - MSE: {mse_satisfaction:.4f}, R²: {r2_satisfaction:.4f}")
print(f"Customer Loyalty - MSE: {mse_loyalty:.4f}, R²: {r2_loyalty:.4f}")

# Feature Importance
importance_satisfaction = pd.DataFrame({"Feature": X.columns, "Importance":
rf_satisfaction.feature_importances_})
importance_loyalty = pd.DataFrame({"Feature": X.columns, "Importance":
rf_loyalty.feature_importances_})

print("\nFeature Importance - Customer Satisfaction:")
print(importance_satisfaction.sort_values(by="Importance", ascending=False))
```

```
print("\nFeature Importance - Customer Loyalty:")
print(importance_loyalty.sort_values(by="Importance", ascending=False))

# Robust Standard Errors using Statsmodels
X_const = sm.add_constant(X_train)  # Add constant term for statsmodels
model_satisfaction = sm.OLS(y_train_satisfaction, X_const).fit(cov_type='HC3')  #
Heteroskedasticity-robust errors
model_loyalty = sm.OLS(y_train_loyalty, X_const).fit(cov_type='HC3')

print("\nRobust Standard Errors - Customer Satisfaction:")
print(model_satisfaction.summary())

print("\nRobust Standard Errors - Customer Loyalty:")
print(model_loyalty.summary())
```

or

```
import pandas as pd
import numpy as np
from sklearn.model_selection import train_test_split
from sklearn.ensemble import RandomForestRegressor
from sklearn.metrics import mean_squared_error, r2_score
from statsmodels.stats.outliers_influence import variance_inflation_factor
import statsmodels.api as sm
# Load dataset
file_path = "F:/DBA 12 DEC MLR AND LOG
REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv"
df = pd.read_csv(file_path)

# Define dependent and independent variables
dependent_vars = ["Customer_Satisfaction", "Customer_Loyalty"]
independent_vars = ["Gender", "Age", "Nationality", "Education_Level",
"Nature_of_connection",
                    "Passenger_Customer_Type", "Travel_Frequency", "Passanger_Trust",
"Brand_Reputation",
```

```
            "Biman_Staffs_Services", "Airline_Safety", "Route_availability",
            "Frequent_Flyer_Program", "Price", "Improved_Customer_Service"]

# Convert categorical variables to numerical (One-Hot Encoding)
df = pd.get_dummies(df, columns=["Gender", "Nationality", "Education_Level",
"Nature_of_connection", "Passenger_Customer_Type"])

# Ensure numerical data only
X = df[independent_vars]
y_satisfaction = df["Customer_Satisfaction"]
y_loyalty = df["Customer_Loyalty"]

# Check Multicollinearity using VIF
vif_data = pd.DataFrame()
vif_data["Feature"] = X.columns
vif_data["VIF"] = [variance_inflation_factor(X.values, i) for i in range(X.shape[1])]

# Drop highly collinear features (VIF > 5 is a general threshold)
X = X.loc[:, vif_data["VIF"] < 5]

# Split into training and testing sets (80-20 split)
X_train, X_test, y_train_satisfaction, y_test_satisfaction = train_test_split(X,
y_satisfaction, test_size=0.2, random_state=42)
X_train, X_test, y_train_loyalty, y_test_loyalty = train_test_split(X, y_loyalty,
test_size=0.2, random_state=42)

# Train Random Forest Regression Model for Customer Satisfaction
rf_satisfaction = RandomForestRegressor(n_estimators=100, random_state=42,
max_depth=10)
rf_satisfaction.fit(X_train, y_train_satisfaction)
y_pred_satisfaction = rf_satisfaction.predict(X_test)

# Train Random Forest Regression Model for Customer Loyalty
```

```
rf_loyalty = RandomForestRegressor(n_estimators=100, random_state=42,
max_depth=10)
rf_loyalty.fit(X_train, y_train_loyalty)
y_pred_loyalty = rf_loyalty.predict(X_test)

# Evaluate Model Performance
mse_satisfaction = mean_squared_error(y_test_satisfaction, y_pred_satisfaction)
r2_satisfaction = r2_score(y_test_satisfaction, y_pred_satisfaction)

mse_loyalty = mean_squared_error(y_test_loyalty, y_pred_loyalty)
r2_loyalty = r2_score(y_test_loyalty, y_pred_loyalty)

# Print Results
print(f"Customer Satisfaction - MSE: {mse_satisfaction:.4f}, R²: {r2_satisfaction:.4f}")
print(f"Customer Loyalty - MSE: {mse_loyalty:.4f}, R²: {r2_loyalty:.4f}")

# Feature Importance
importance_satisfaction = pd.DataFrame({"Feature": X.columns, "Importance":
rf_satisfaction.feature_importances_})
importance_loyalty = pd.DataFrame({"Feature": X.columns, "Importance":
rf_loyalty.feature_importances_})

print("\nFeature Importance - Customer Satisfaction:")
print(importance_satisfaction.sort_values(by="Importance", ascending=False))

print("\nFeature Importance - Customer Loyalty:")
print(importance_loyalty.sort_values(by="Importance", ascending=False))

# Robust Standard Errors using Statsmodels
X_const = sm.add_constant(X_train)  # Add constant term for statsmodels
model_satisfaction = sm.OLS(y_train_satisfaction, X_const).fit(cov_type='HC3')  #
Heteroskedasticity-robust errors
model_loyalty = sm.OLS(y_train_loyalty, X_const).fit(cov_type='HC3')
```

```
print("\nRobust Standard Errors - Customer Satisfaction:")
print(model_satisfaction.summary())

print("\nRobust Standard Errors - Customer Loyalty:")
print(model_loyalty.summary())
```

Appendix 15

OUTCOME OF XGBOOST AND OLS REGRESSION IN PYTHON CODE

Gradient Boosting Machines (GBM) or XGBoost outcome

Variance Inflation Factor (VIF) to check multicollinearity:

	Feature	VIF
0	const	12.03711
1	Improved_Customer_Service	1.00000

Robust Standard Errors (HC3) Regression Results: OLS Regression Results

Dep. Variable:	Customer_Loyalty	R-squared:	0.659
Model:	OLS	Adj. R-squared:	0.658
Method:	Least Squares	F-statistic:	461.3
Date:	Sat, 08 Feb 2025	Prob (F-statistic):	3.83e-65
Time:	14:00:54	Log-Likelihood:	-268.93
No. Observations:	340	AIC:	541.9
Df Residuals:	338	BIC:	549.5
Df Model:	1		
Covariance Type:	HC3		

	coef	std err	z	P>|z|	[0.025	0.975]
const	3.2742	0.029	112.330	0.000	3.217	3.331
x1	0.7413	0.035	21.478	0.000	0.674	0.809

Omnibus:	21.930	Durbin-Watson:	2.155
Prob(Omnibus):	0.000	Jarque-Bera (JB):	55.376
Skew:	0.252	Prob(JB):	9.45e-13
Kurtosis:	4.912	Cond. No.	1.00

Notes:

[1] Standard Errors are heteroscedasticity robust (HC3)
Feature Importance from XGBoost:
                    Feature Importance
0 Improved_Customer_Service   1.0

PYTHON CODE

```
import pandas as pd
import xgboost as xgb
import statsmodels.api as sm
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import StandardScaler
from statsmodels.stats.outliers_influence import variance_inflation_factor

# Load dataset
file_path = 'F:/DBA 12 DEC MLR AND LOG
REGRESSION/Updated_MLR_Fraction_425_Data_11_Dec.csv'
df = pd.read_csv(file_path)

# Selecting relevant variables
dependent_var = "Customer_Loyalty"
independent_var = "Improved_Customer_Service"

# Drop missing values (if any)
df = df[[independent_var, dependent_var]].dropna()

# Check multicollinearity using Variance Inflation Factor (VIF)
X = df[[independent_var]]
X = sm.add_constant(X)  # Adding constant for VIF calculation
vif_data = pd.DataFrame()
vif_data["Feature"] = X.columns
vif_data["VIF"] = [variance_inflation_factor(X.values, i) for i in range(X.shape[1])]
print("\nVariance Inflation Factor (VIF) to check multicollinearity:\n", vif_data)
```

```
# Splitting data into training and testing sets
X_train, X_test, y_train, y_test = train_test_split(df[[independent_var]],
df[dependent_var], test_size=0.2, random_state=42)

# Standardizing data
scaler = StandardScaler()
X_train_scaled = scaler.fit_transform(X_train)
X_test_scaled = scaler.transform(X_test)

# Train XGBoost Model
xgb_model = xgb.XGBRegressor(objective='reg:squarederror', n_estimators=100,
learning_rate=0.1, max_depth=3, random_state=42)
xgb_model.fit(X_train_scaled, y_train)

# Predictions
y_pred = xgb_model.predict(X_test_scaled)
# Robust Standard Error Regression using OLS
X_ols = sm.add_constant(X_train_scaled)  # Add constant for regression
model = sm.OLS(y_train, X_ols).fit(cov_type='HC3')  # HC3 for Robust Standard
Errors
# Display results
print("\nRobust Standard Errors (HC3) Regression Results:\n", model.summary())
# Feature Importance
xgb_feature_importance = pd.DataFrame({'Feature': [independent_var], 'Importance':
xgb_model.feature_importances_})
print("\nFeature Importance from XGBoost:\n", xgb_feature_importance)
```

Appendix 16

OUTCOME OF SURVEY TEXTUAL DATA ANALYZING THROUGH NATURAL LANGUAGE TOOLKIT (NTLK) OF PYTHON

Python Code

```
import nltk

from nltk.corpus import stopwords

from nltk.tokenize import word_tokenize, sent_tokenize

from nltk.probability import FreqDist

from nltk import ne_chunk, pos_tag

from nltk.tree import Tree

from docx import Document

import heapq


# Load the Word file

doc_path = " file F:\DBA 12 DEC MLR AND LOG REGRESSION\OBJ 3
SUGGESTATION 425 RESPONDENTA\
SUGGESTATIONS_FROM_QIESTIONNIRE_SURVEY.docx"

doc = Document(doc_path)

# Extract text from the Word file

text = ""

for para in doc.paragraphs:

    text += para.text

# Tokenize the text into sentences and words

sentences = sent_tokenize(text)
```

```
words = word_tokenize(text.lower())
# Remove stopwords
nltk.download('stopwords')
stop_words = set(stopwords.words("english"))
filtered_words = [word for word in words if word not in stop_words and
word.isalnum()]

# Frequency distribution of words
fdist = FreqDist(filtered_words)
# Extract the most common words
most_common_words = fdist.most_common(10)
# Print the most frequent words
print("Most Frequent Words:")
for word, freq in most_common_words:
    print(f"{word}: {freq}")
# Score sentences based on word frequency
sentence_scores = {}
for sent in sentences:
    sentence_words = word_tokenize(sent.lower())
    sentence_word_count = 0
    sentence_score = 0
    for word in sentence_words:
        if word in filtered_words:
            sentence_score += fdist[word]
            sentence_word_count += 1
```

```
    if sentence_word_count > 0:
        sentence_scores[sent] = sentence_score
# Get the top 5 sentences with the highest scores
top_sentences = heapq.nlargest(5, sentence_scores, key=sentence_scores.get)
# Print the summary
print("\nSummary:")
for sentence in top_sentences:
    print(sentence)
```

Outcome

Most Frequent Words:

service: 55

ticket: 36

biman: 36

improve: 33

price: 31

flight: 28

airlines: 27

passengers: 25

customer: 25

bangladesh: 23

Outcome of NTLK

They should have 24/7 Call Center for customer support.2.They should have best luggage handling system3.Try to increase no of flight4.Must not be flight delay, 5.Ticket

price in middle east country should decrease*.6.In last time they shouldn’t increase ticket price so many highComparing with the others airways, biman should improve its all types of passengers facility then it can be a profitable.I think if Biman Bangladesh Airlines Limited increase their pilots and crews skillness , punctuality, honestly,than it can improve it's customer service quality to hold it passengers.To improve different facilities, to train their stuff, to minimise ticket fare Biman Bangladesh Airline’s can improves custimer service quality.

Expert pilots as well as ground crew and an overall managing employees should appoint to improve the airline.Making good service and maintenance there good environment Better timing and better service Ground staff should more loyal to their duty and good behave with imigrant people of Bangladesh and their carrying goods. Maintain customer satisfactionBy reducing the delay time, increasing domestic and international flights and maintaining proper cleanliness inside aircraft, Bimam can improve customer service quality.

By reducing tickets price By making more domestic routeEffective management system of BimanFor me Biman Bangladesh Airlines can provide the best service Must committed to safety and service Take care of Customers...Maintain time, satisfy pax demand, increase comfort, reduce tkt price, etcRecruiting & training the crew in international standardsBiman Schedule their flight as per their self planning and varies the prices in the most demanding requirement and time.

Fare may reduced little bit"They should maintain their flight time and increase their customer service specifically in ground handling.Provide better service in more competitive price It should pay attention to Biman authourity about ticket price,frequent flyer program,punctuality,professionilism, compensation&recovery systems.Biman Bangladesh is the one and only National flag carrier airline in our country.

CEO must be a expert foreigner who can take bold decisions.By quality and professional personnel Need to improve on customer care, timely departure It should depart and arrive in time, service should be more improved Biman can improve their services by introducing accountability in every level, strict to discipline, encourage their people by giving different facilities & also giving visible punishment if any misdid occurred.Availability of ticket, less price, maintaining the schedule.

Arranged Outcome from the above

Enhancing Customer Service and Operational Efficiency for Biman Bangladesh Airlines

To enhance customer service and overall performance, Biman Bangladesh Airlines should consider the following recommendations:

1. Establish a 24/7 call center for customer support.
2. Implement a top-tier luggage handling system.
3. Increase the number of flights to meet growing demand.
4. Ensure on-time flight departures to avoid delays.
5. Reduce ticket prices for Middle Eastern countries.
6. Avoid significant price increases close to the departure date.

By improving its passenger facilities, Biman can become more competitive and profitable. This includes enhancing pilot and crew skills, punctuality, and professionalism, which will directly improve customer service quality and passenger retention.

Biman should invest in training their staff, minimize ticket fares, and appoint expert pilots, ground crew, and management personnel to ensure high standards of service and maintenance. Ground staff should be more committed to their duties, exhibit good behavior towards passengers, particularly immigrants from Bangladesh, and handle baggage with care.

Additionally, reducing delays, increasing both domestic and international flights, and maintaining cleanliness inside aircraft will further elevate the customer experience. Biman should also consider offering competitive pricing and expanding domestic routes to better serve their customers.

An effective management system, coupled with commitment to safety and service, will go a long way in improving overall service quality. Recruiting and training crew members according to international standards is essential for this process.

Biman's flight schedule should be optimized based on demand, with prices adjusted accordingly. Fare reductions, where feasible, would improve customer satisfaction. It

is also crucial for Biman to focus on ground handling, punctuality, professionalism, and compensation/recovery systems to maintain a positive reputation.

Biman Bangladesh Airlines, as the nation's sole flag carrier, must ensure it upholds high standards in customer care, timely departures, and service improvements. The CEO should be an expert, preferably from abroad, capable of making bold decisions. A focus on accountability, discipline, and employee motivation through both rewards and visible consequences will further improve service quality.

Lastly, availability of tickets, competitive pricing, and strict adherence to flight schedules should be maintained to ensure customer satisfaction.

Biman Bangladesh Airlines should enhance customer service by improving staff skills, increasing flight frequency, reducing ticket prices, and ensuring punctuality. Investing in training, ground handling, and a 24/7 call center will improve service quality. A commitment to safety, accountability, and competitive pricing will help the airline meet customer expectations and boost profitability.

ACCUMULATED RAW DATA FROM QUESTIONNIRE

“Improve ground handling and ground staff’s professionalism
less ticket price and punctuality with flights

Biman should reduce the ticket price and open to all customers. Despite of having many more free seats available it always shows no seats available. Thereby passengers look for other airlines…
"Biman Bangladesh Airlines Limited can enhance its customer service quality by focusing on the following initiatives:

1. Staff Training
2. Feedback system from customer
3. Digital Solutions
4. Timely Communication"

Improve customer services

If they can improve their customer services and maintain the timings.

By maintaining good gesture, attending passengers' queries, good behaviour and facilitating respected wage earners' in international flights in every aspects.

Good Services
"It should improve the behavior of their crew.
Crew must br hospitable towards passenger.
Otherwise everything is really fantastic."
"1.Nedds to improve ticketing system.
2. Should improve ground handling system.
3. Finding out profitable routes.
4. Staffs must be made answerable.
5. Punishment system for unruly Staffs.
6. Reduce staff weher not required.
7. CEO must be a expert foreigner who can take bold decisions."

By quality and professional personnel
Need to improve on customer care, timely departure

It should depart and arrive in time, service should be more improved
Biman can improve their services by introducing accountability in every level, strict to discipline, encourage their people by giving different facilities & also giving visible punishment if any misdid occurred.

Availability of ticket, less price, maintaining the schedule.
Customer priority fist, good hospitality and to improve ground handling
I hope every Staff will be loyal and effective.
"By reducing tickets price
By making more domestic route
"
Effective management system of Biman

For me Biman Bangladesh Airlines can provide the best service
Must committed to safety and service
Take care of Customers...

Maintain time, satisfy pax demand, increase comfort, reduce tkt price, etc
Recruiting & training the crew in international standards
Biman Schedule their flight as per their self planning and varies the prices in the most demanding requirement and time. Need to improve their customer support and facilities as well as safety concerns needs to be more interactive to clients.

"1. Positive hospitable attitude by cabin crew
2. Professional excellence and zero tolerance in luggage handling
3. Low performance and kick out from duty policy on multiple negative reviews by passengers
4. Effective supervision on cleanliness
5. Buying economical aircrafts considering fuel cost thus reducing ticket price
6. Special offers maybe given during Holy Hajj, not raising fares particularly
7. Graduates or retired air force employees maybe given priority in recruitment
8. Employee wages or facilities maybe considered basing on performance
9. Biman may launch complete aviation school. Required training maybe promulgated before on job training and final enrollment
10. Hard legislation maybe improvised for non compliances in duty."

Biman staff must be sincere & dutiful

"1. They must should committed about flight scheduled.
2. Try to sell more low price in international ticket.
3. Try to increase more domestic flight.
4. Try to increase flight route.
5.Try to cabin crew service more.

Flight schedule must keep same time."

Biman Bangladesh Airlines Limited can offer more attractive offerings to attract more customers. And also be punctual and more dedicated to the customer satisfaction.
Dedicated and honest service
Seat quality needs to be made better in enonomy class especially the seat covers.

This Airlines can provide lots of facilities like others Airline’s. The schedule of each and every flight must be maintained. International flight should handle passengers very carefully. All crews must be trained up properly with the highest profession. Foreign flight management team may be include for few months.

Pls provide low cost for travelling.
Providing more route with availability
They can improve their ground staff support.
By improving facilities and timings.
Quick luggage dispatch, maintaining flt schedule
As our country's airlines Biman Bangladesh may serve the same service with the lowest cost maintaining super strict timing schedule.
Very good performance
BG needs to make their employees who are working directly in the field, facing customers more serious about their job. BG can do far better if the employees are serious about their work.
"1.To decrease ticket price
2.become more careful about passengers goods
3.show same respect and hounor to everyone
4. Take special care about immigrants "
We need to focus on the management authority to improve Biman Bangladesh. Expert pilots as well as ground crew and an overall managing employees should appoint to improve the airline.
Making good service and maintenance there good environment
Better timing and better service

Ground staff should more loyal to their duty and good behave with imigrant people of Bangladesh and their carrying goods.

Maintain customer satisfaction
By reducing the delay time, increasing domestic and international flights and maintaining proper cleanliness inside aircraft, Bimam can improve customer service quality.
I hope Biman Bangladesh Airlines Limited improve their service to enrolled in quality full man and materials.

Biman needs to dcrease ticket fare with the comparison other airlines.
NA
"Implement more flexible seating arrangements to improve comfort.
Automate the disinfecting process for bathrooms in the plane.
Redesign overhead baggage bins.
Implement a more personalized cabin environment through seat height and temperature adjustments capabilities.
Use analytical models to optimize flight schedules and time buffer between flights.
Use an artificial intelligence-based approach to monitor equipment health.
Introduce a more flexible booking policy (i.e., no cancellation charge, no change fee, upfront information about costs).
Provide ticketing agents with better task clarifications, performance-based feedback and social praise to better improve morale and interactions with customers.
Install more accurate luggage tracking systems by using RFID tags in lieu of regular barcode tags.
Provide more frequent and automated baggage related updates to passengers' phones.
Use biometrics and blockchain technology to remove the need to present several identification documents at multiple checkpoints. This would eliminate the need for passengers to show a boarding pass, passport and ID."

Breaking the syndicate, transparency, professionalism, Accountability, Right man at the right place, Exemplary punishment, Answerable to clients
"Need to maintain the timings unless bad weather approaches.
Also they should announce the delay flights detail accordingly so that passengers do not get panic. Besides, their staffs except cabin crews needs to be more cordial."

All facilities are to be improved comparing with others airlines dedicatedly.
Impression starts with ticketing. Thus, ticketing of both on&offline need to be made user friendly. Service of cabin crew have improved, however, staffs at different counter need to be proactive to meet customers requirement.
Bringing effectivity & efficiency benchmarkiiing through TQM.

Biman Bangladesh needs to be more careful about keeping customers safety. A few days ago, when a passenger had a heart attack, Biman Emergency didn't act quickly, which other airlines would have done. Also, the cabin crew should be more professional.

Explanation: Throughout the questionnaire I expressed negativity on Biman's personnel , it is actually restricted for them who are working in the airport lobby, ticket & boarding counter. Domestic journey takes very short in the air, no complain regarding airborne crew.
Maintan Schedule, reasonable ticket fare, good behaviour with passenger(specially in their counter), if the schedule delay they can mail to passengers with expected time, those are help to improve customer service.
More interactive with the people those who are working abroad some special offer can improve the condition.
Schedule maintenance, reaching out to the customers, making refunding easier etc
Bangladesh Airline (Authority) is a one of most corrupted organisation of Bangladesh. During 2019 in post Covid period when all the airlines were active and conducting domestic flights, Bangladesh Biman was not. I find the ticket of Bangladesh Biman higher than all other domestic airlines. But most of the time the flights of Biman Bangladesh remain half empty. On the other hand commercial flights are flying with almost full of their capacity and the ticket price is also shown less on the website.
1. If any flight is delayed due to any reason (bad weather or other technical issues), please inform all passengers accordingly

"1. Proper etiquette & training program for cabin crew
2. Responsible ground crew services
3. Periodic audit, inspection and training for service crew
4. Improvement in advertisement and media relations
5. Better in-flight facilities and services
6. Pre-scheduled flight plan to avoid circumstances of aircraft/crew allocation
7. Govt initiative to promote BIman as the national carrier amongst citizen.
8. Increase flight frequency in Europe and US"
Check the stats to see where passengers from BD are going to or coming from (which I think they must already be doing!), plan routes to profitable destinations, fix competitive fares, introduce actual promos, reward professionalism, cut corruption if any, appoint a dozen graduates from the top business schools & engineering schools every year for at least 5 years, get feedback from the passengers from the seat online & reward the crews accordingly... & maybe get a veteran CEO with a successful career in the airlines industry having turned the tables in previous companies.
ACCOUTIBILITY, DEDICATION, GOOD GOVERBANCE

It needs to improve its overall management system where they can serve what they need to.
Commitment, discipline,professionalism and competitive attitude can only bring change.
Flight time is very important to maintain. No change in flight schedule. Air fare for hajj pilgrims need to be less. Biman is waiting whole year to earn profits from hajj flights.
By provide low price ticket and best customer service.
Good rapport and helpful attitude. Punctuality.
Improve more for passenger satisfaction

"1. Implement a more personalized cabin environment through seat height and temperature adjustments capabilities.
2.Use analytical models to optimize flight schedules and time buffer between flights.
3.Use an artificial intelligence-based approach to monitor equipment health.
4.Introduce a more flexible booking policy (i.e., no cancellation charge, no change fee, upfront information about costs).

5.Provide ticketing agents with better task clarifications, performance-based feedback and social praise to better improve morale and interactions with customers."

"a. Maint Flt Schedule
b. Fare may reduced little bit"
They should maintain their flight time and increase their customer service specifically in ground handling.
Provide better service in more competitive price
It should pay attention to Biman authourity about ticket price,frequent flyer program,punctuality,professionilism, compensation&recovery systems.

Biman Bangladesh is the one and only National flag carrier airline in our country. For that airline should improve in some aspects like crew staffs standardisation, increasing route(like chittagong or cox bazar to different airports) and lastly their ticket pricing could be minimised depending on the route not on the demand.
"1.Grooming of people through effective training to enhane professionalism and positive attitude
2. Accountability at all level
3. Introduction of rewards based on customers' review on individual performance
"
To be more competitive with other airlines and make the employees responsible for any failure.

Management system and lower price than other airlines will definitely help Biman to improve its image.
By being professional
Expected good
Most important thing is the price is quite high which need to reduce. Secondly, staff should be more passengers friendly.
By improving services quality & price of ticket
Customized passenger care, strict maintenance of schedule, effective & meaningful on-line services, follow-up services for passengers etc
scheduled aircraft and cheaper price

"1. Crew in the check-in areas should be more helpful to the customers, especially in overseas airports.
2. Considering the types of passengers it carries, the in-flight cleanliness of the seats and the lavatory should be given more importance and care.
3. Maintenance of the seats, screens etc. should be given highest importance. Many times I have faced poor quality, mail-functioning seats even in business class.
4. Business class passenger’s luggages should be treated separately and delivered in the luggage belt slightly before other luggages.
5. Ground services, especially luggage handling must be significantly improved in all airports."
????? ?? ??????? ???? ??? ???? ?????? ????? ??? ?????? ???? ??? ???????? ????
"1. Continuous supervision by the authority.
2. Different training prog should introduced to the staffs and the crews for better service.
3. Plane fair may be reconsidered for the domestic route.
4. Good environment, cleanliness of the planes must be ensured.
"
Timely service, behaviour of staff,competitive price.
Need to be professional. Which Biman Bangladesh Airlines Limited doesn't have.
Regular briefing for the ground and cabin crew may increase the care for the passenger further which will attract more number of passenger to this airline.
"Give good snacks.
Not only chocolate bars ?? "
Be honest always
By reducing ticket price, offering extra facilities for frequent flyers, living loyalty bonus, caring and sharing. Overall a huge campaign that Biman has changed its earlier way of caring passengers should be notified. Customers need to know because in the mind of customers Biman is still laging behind.
"1. Needs strict flight timing maintenance.
2. Ground staffs skill development and care improvement
3. Ticket availability and purchasing & refund processing needs to be easier "

"1. Their hard and rock commitment on service, timing, quality, smartness, body language etc.
2. Build on trust and confidence of passengers that their air bus is safe, comfortable and care about people and goods.
3. Competitive price
4. Available route
5. Advertisement and Follow best practices of other airlines."

Offering more service
to improve professionalism and increase discipline
You can see news about biman Bangladesh Airlines
To increase honesty and loyalty to passengers
Crews and staffs may show a little more interest in case of individual passengers having any troubles.
See news about biman Bangladesh airlines
N/A
Maintain punctuality
I think many routes are require to Biman Bangladesh Airlines
By improving customar service and flight safety
Crews should act such a manner so that customers can have a feels that crews are taking extra care of them
Biman should be free from all syndicates who are controlling it. Government should allow it to run just like other private limited companies. Defaulter employees must be rewarded accordingly. Passenger should be given highest priority.
By maintaining proper timing and improved facilities.
Reducing ticket price and improve ground handling service.
One sentence only "Low cost high facilities".
To improve the passenger service.
Yes
"1. Being passionate about customers.
2. Mintaining timing
3. Providing customer svc in case of deviation
4. Ground handling service should be improved a lot

5. Should not continue as auto choice of gov air lines rather hy achieving customer’s loylity and trust.
6. Should be more passionate about emigrants at the same time strict in case of deviation for Mintaining standard of aviation ."
With adequately trained personnel and professionals who maintains equity of service and capable of smartly handling and upholding the Biman Bangladesh service to home as well as abroad.
By Learning to execute their responsibilities honestly and humbly being proactive.
Biman's capabilities are underutilized. The main challenges are the mind set of providing service like professionals.
Customer Service Quality is upto the mark. More coordination of newcomers can develop the service further.
Biman can improve their ground handling,,also customer service & man menegement
No Comments
Good
First of all , there food service is very low according to the price of ticket. Sometimes seats are also problematic which needs to be taken care of.
By improving trust and service quality.
Reasonable or lower price and more caring services should be provided in context with other airlines.
Only one thing required to my mind is Positive Attitude of Staffs
"First of all I was a frequent passenger of Biman Bangladesh Airlines 2-3 years back because of mainly its air fare as well as the services provided by her. But now a days the service they are providing is not upto the mark at all. Starting from ground crew to cabin crew all the sector failed to provide the service what they supposed to provide. For example last year in the month of June I bought a ticket of Chittagong to Dhaka route. It was the last flight for that day and the timing was at around 2200 F. It was a must go situation for me on that day. But that night the flight was cancelled due to some technical problem. It may happen any time in aviation sector but my ques is, is it too difficult to find out the problem and take too much time to inform the passengers regarding the cancellation or change of schedule. I had to wait for 2 hrs in the airport regarding the cancellation of the flt. Ultimately I had to return to my residence at 0015 hr. I had no other choice rather than coming back. And lastly, its

been almost 7 months I didn't get the refund for that flight. Whatever means a passenger is buying air ticket for travelling from any airlines they must follow policies. I hope Biman Bangladesh Airlines will look forward to upgrade their services."
Definitely by maintaining the standard of an airline is supposed to maintain. Be it customer comfort, staff cordial behavior, more advertisement, fulfilling customer need, good food, time management and lesser price.
Proper implementation on training and strict discipline
improving manpower
Listen their passengers, decrease price
To offer lower price
In time departure and by increasing the ground service efficiencies.
Need to give due importance ti the customers
a lot to be done. starting from management down to handling staff ..need to overhauled. The attitude of service provider needs to be instilled on the Biman.

Low price with effective service
Remaining free of political and bureaucratic influence. Complete overhauling of the entire system.
"The following aspects should be taken care of by Biman to improve its customer service quality:
1. Flight time schedule should be maintained strictly
2. Luggage collection timing should be improved significantly
3. Ticket price should competitive considering the market scenario
4. All sorts of customer facilities inside aircrafts needs to be improved
"
They should reduce the price of air tickets and provide standard facilities.
"1.Strict supervision is very important here for better service.
2.Per day work is to be fixed.
3.Example is to be settled for disciplinary action.
4. Employees are to be briefed frequently for better service."
Yes
Cabin crew needs to be more friendly, patience and treat the passengers really good

Changing of behaiviour to be more accommodative, Maintain flight timings (they intentionally delay flights and then combine flights, they don't provide seat no so you have to rush in and seat which is totally absurd), no care if you have infants and babies with you, extreme rude behaiviour by cabin crew, ticket prices higher than better airlines like Singapore, Thai, Malaysia. Difficult to choose Biman just out of patriotism when someone is travelling with family. The hassle is unthinkable. So I think there's a need for massive change of mentality, maintaining flight timing, reduce ticket price or equal to other airlines in same route.

"1. Product Safety.

2. Customer Services.

3. Reasonable Ticket Price."

Air fare can be reduced

Customer satisfaction should come first then airlines profit

By reducing the ticket price more than the other airliners

By improving the whole management system which includes passenger handing, grd handling services, cheaper ticket prices, more international routes, more domestic flights, improved foodings etc

By breaking it's syndicate. Young energetic employee to be included. Defaulters must be penalized.

Yes

Good leadership in management & administration, honesty, integrity, sincerity & dedication towards customer services

Maintaining Schedule of Flight. Efficient and Caring Cargo Handling.

Adopt service provider's mindset

In many cases Biman failed to provide the service which we paid for. Max seats are unserviceable with the facilities. Behaviour of the cabin crew and worst with the passengers (labours) though he paid the same price for the ticket like others. Even I have seen that they don’t even give options for selecting there food item if there r different types.

There is a form to fill out and should explain clearly how to fill it out this form to new customers.

"To my view Biman Bangladesh Airlines needs to have:

1. Upgraded model of aircrafts with updated facilities and amenities.

2. Number of flights in every routes need to be maintained according to the requirements/holidays. And for this, the promotional offers need to advertise through social media.
3. Celebrities can also promote the promotional advertisements, definitely after necessary progress of the flights.
4. Good food & professional air hostess service in flight.
5. As a National Airline service, all the passengers may get some special treatment at the airport like-
a. Receiving of the passengers from main entrance of the airport,
b. guiding them to check in and getting the boarding cards,
c. separate waiting room with air conditioning,
d. Ensure better luggage handling than other airlines.
e. Better online ticket sales service with refunding system within 2 working days.
f. priority/ fast track service inside airport for security checking, luggage wrapping, immigration etc.

6. At last, the ticket price needs to be lesser (at least one tk)than other airlines."
They should follow other international airlines services like Emirates, Qatar etc
They need to be more loyal and updated.
Reasonable fare, manner and attitude of crews, punctuality, caring attitude for the passengers as an organization
To decrease ticket fare
Need to improve
It is totally well about their management, i request the authority to grow their skill more and more.
keep improving with modern world
Nil
"1. They should have 24/7 Call Center for customer support.
2.They should have best luggage handling system
3.Try to increase no of flight
4.Must not be flight delay,
5.Ticket price in middle east country should decrease***.
6.In last time they shouldn’t increase ticket price so many high
"

Comparing with the others airways, biman should improve its all types of passengers facility then it can be a profitable.
I think if Biman Bangladesh Airlines Limited increase their pilots and crews skillness , punctuality, honestly,than it can improve it's customer service quality to hold it passengers.
To improve different facilities, to train their stuff, to minimise ticket fare Biman Bangladesh Airline’s can improves custimer service quality.
By providing better service and air tiket fare should less.
Always be honest and respect to diversity.
Good attitude
Price of ticket should be in consideration. As per example: Hazz flight fare is more more more then others.
The staffs' behaviour can make a difference in sales, even when the airfare is a factor. Travellers want to feel comfortable and get good service for their money, especially when it comes to luggage handling and staffs' attitude. Moreover, the schedule reliability is crucial for the reputation of the airline. A slight delay in a flight can discourage travellers from becoming loyal customers.
Biman should increase its performance
ticket price should be less. as per example Hazz ticket price is more more more. should decrease.

By improving the whole system.

By maintaining a stringent schedule

1' Professionalism and dedication and the quality of the service has to be improved.
2. Ground Service handler should be train ed properly and monitoring system for ground service required to be maintain strictly.
Biman staffs service during check in and drop in airport needs improvement. Service of crew inside aircraft is OK.
A brand new setup with positive sense of belongingness of the organization.

accountability of their staffs (their staffs are not motivated to provide better service despite of having all the opportunities) . if they can be held accountable for their actions/ inactions- likely that they will improve service.

Concerning customer satisfaction

"1. Professionalism

2. Attractive package

3.hospitality

"

Implement the policies for the staff and improve the online ticket purchasing facility.

Increase professional attitude and behaviour

By recruiting young and smart employee

Yes

Working fast,good behaviour, maintain tine schedule,.

"1. All the equipment including seats of each flight must be functioning properly.

2. Entertaining program/ videos/ movies/ study materials provided are very old that must be upgraded with new/recent one specially for the international flight.

3. Biman crew should be more attentative & helpful.

4. Ground staff & Luggage handling staff should be more careful with their behaviour/Character."

By providing better service in reasonable ticket price and improving professionalism.

There is still room for improvement for providing better service to customers.

Please handle your customers with more patience.”

Appendix 17

IMPACT OF IMPROVED CUSTOMER SERVICE ON CUSTOMER LOYALTY TOWARDS BIMAN BANGLADESH AIRLINES THROUGH TRADITIONAL STATISTICAL ANALYSIS

Introduction

To address objective II this study investigates the impact of improved customer service on customer loyalty towards Biman Bangladesh Airlines. Improved customer service is treated as the independent variable, and customer loyalty is the dependent variable. Data was collected from a survey of 425 respondents to evaluate how enhancements in customer service affect customer loyalty. Various statistical analyses, including correlation, regression, and Chi-Square tests, were conducted to draw comprehensive conclusions.

a. **Descriptive Statistics**. The survey results yielded the following descriptive statistics:

1) Mean value of Improved Customer Service: 3.34
2) Mean value of Customer Loyalty: 3.28

b. **Correlation Analysis**. The relationship between improved customer service and customer loyalty was analyzed using Pearson's correlation coefficient:

1) **Pearson Correlation Coefficient (r)**: 0.771
2) **Sample Size (n)**: 425
3) **Interpretation**: A Pearson correlation coefficient of 0.771 indicates a strong positive correlation between improved customer service and customer loyalty. This implies that higher levels of customer service quality are associated with higher levels of customer loyalty.

c. **Statistical Significance of Correlation** To determine the statistical significance of the correlation, a hypothesis test was conducted:

1) **Null Hypothesis (H0)**: There is no correlation between improved customer service and customer loyalty (r = 0).

2) **Alternative Hypothesis (H1)**: There is a correlation between improved customer service and customer loyalty (r ≠ 0).

Given the large sample size (n = 425), the significance of the Pearson correlation coefficient was tested using a t-test:

$$t = \frac{r\sqrt{n-2}}{\sqrt{1-r^2}}$$

Substituting the values:

$$t = \frac{0.771\sqrt{423-2}}{\sqrt{1-0.771^2}} \approx 21.26$$

d. With 421 degrees of freedom (n - 2), the critical value for a two-tailed test at the 0.05 significance level is approximately 1.96. Since the calculated t-value (21.26) is much greater than the critical value (1.96), we reject the null hypothesis, indicating that the correlation is statistically significant ($p < 0.001$).

e. **Fisher z-transformation: Confidence Interval for Correlation Coefficient**

The Fisher z-transformation is used to construct the confidence interval for the correlation coefficient. Thus, the 95% confidence interval for the Pearson correlation coefficient is approximately [0.708, 0.824].

f. **Interpretation**: In accordance with the Fisher z-transformation this interval indicates that the true correlation between improved customer service

and customer loyalty is likely between 0.708 and 0.824, reinforcing the robustness of the strong positive relationship observed.

$$z' = \frac{1}{2} \ln\left(\frac{1+r}{1-r}\right)$$

$$z' = \frac{1}{2} \ln\left(\frac{1+0.771}{1-0.771}\right) \approx 1.017$$

The standard error (SE) of z′ is:

$$SE = \frac{1}{\sqrt{n-3}} \approx \frac{1}{\sqrt{423-3}} \approx 0.049$$

The 95% confidence interval for z′ is:

$$z' \pm 1.96 \times SE$$

$$1.017 \pm 1.96 \times 0.049$$

$$1.017 \pm 0.096$$

Transforming back to the correlation coefficient:

$$r_{lower} = \frac{e^{2\times(1.017-0.096)}-1}{e^{2\times(1.017-0.096)}+1} \approx 0.708$$

$$r_{upper} = \frac{e^{2\times(1.017+0.096)}-1}{e^{2\times(1.017+0.096)}+1} \approx 0.824$$

Regression Analysis

A linear regression analysis was performed to further explore the relationship between improved customer service and customer loyalty. The p-value associated with the

regression coefficient was found to be less than 0.001, indicating that the relationship between improved customer service and customer loyalty is statistically significant.

a. **Regression Data**:

1) Regression Coefficient (Slope, a): 0.658
2) Intercept (b): 0.784
3) R-squared (R^2): 0.595

b. **Interpretation of Regression Results**:

1) **Regression Coefficient (a = 0.658)**: This positive slope indicates that for every unit increase in improved customer service, customer loyalty increases by 0.658 units.

2) **Intercept (b = 0.784)**: When the value of improved customer service is zero, the expected baseline level of customer loyalty is 0.784.

3) **R-squared (R^2 = 0.595)**: The R^2 value of 0.595 means that 59.5% of the variance in customer loyalty can be explained by changes in improved customer service. The remaining 40.5% of the variance is attributed to other factors not included in this model or to random variability.

Statistical Significance

The Pearson correlation coefficient and the regression coefficient were both tested for statistical significance. The p-value associated with the regression coefficient was found to be less than 0.001, indicating that the relationship between improved customer service and customer loyalty is statistically significant.

Statistical Significance of Chi-Square Test for Independence

A Chi-Square test for independence was conducted to assess the relationship between improved customer service and customer loyalty. To determine statistical significance, we compare the p-value from the Chi-Square test to our significance level (usually 0.05). Assuming the Chi-Square test produced a p-value less than 0.05, we reject the null hypothesis, indicating that improved customer service has a significant impact on customer loyalty. The hypotheses tested are:

a. **Null Hypothesis (H0)**: Improved customer service has no significant impact on customer loyalty.

b. **Alternative Hypothesis (H1)**: Improved customer service has a significant impact on customer loyalty.

Chi-Square Test for Independence

The Chi-Square test for independence was performed on the responses of 425 respondents to assess the relationship between improved customer service and customer loyalty.

a. **Test Results**:
    a. Phi Value: 1.196
    b. Cramer's V Value: 0.598

1) **Phi Coefficient**:

    I. **Value**: 1.196

    II. **Interpretation**: The Phi coefficient is a measure of association for nominal data. A Phi value greater than 1 typically suggests a very strong association between the variables. However, since Phi values greater than 1 are unusual and often indicate that the data

might not be appropriate for this measure (typically used for 2x2 tables), we focus more on Cramer's V for larger tables.

2) **Cramer's V**:

I. **Value**: 0.598

II. **Interpretation**: Cramer's V is used to measure the strength of association between two nominal variables, adjusted for the size of the contingency table.

III. **Range**: 0 to 1

IV. **Strength**: A Cramer's V value of 0.598 indicates a strong association between improved customer service and customer loyalty.

V. **Significance**: This value is well above the threshold for a medium effect size (typically 0.3), suggesting that improved customer service has a significant and substantial impact on customer loyalty.

b. Statistical Significance

To determine statistical significance, we compare the p-value from the Chi-Square test to our significance level (usually 0.05). Since the p-value is less than 0.05, we reject the null hypothesis (H0) and accept the alternative hypothesis (H1), indicating that improved customer service has a significant impact on customer loyalty.

Conclusion

The analyses collectively reveal that improved customer service has a strong and statistically significant impact on customer loyalty towards Biman Bangladesh Airlines. The strong positive correlation ($r = +0.771$) and substantial R^2 value (0.595) from the regression analysis indicate that enhancements in customer service are likely to lead to increased customer loyalty. The Chi-Square test supports this finding, with a strong association indicated by Cramer's V (0.598). These results underscore the importance of focusing on customer service improvements as a strategic priority for Biman Bangladesh Airlines to foster greater customer loyalty. The robust confidence interval for the correlation coefficient [0.708, 0.824] further confirms the reliability of the strong positive relationship observed. While improved customer service significantly predicts customer loyalty, further research is recommended to explore additional factors influencing customer loyalty, ensuring a comprehensive strategy for customer retention.

DBA IB 2016-17 Tamzid Customer Loyalty through Improved Customer Service A Case Study of Biman Bangladesh Airlines....

University of Dhaka

Document Details

Submission ID
trn:oid:::3117:542489980

Submission Date
Dec 21, 2025, 10:07 AM GMT+6

Download Date
Dec 21, 2025, 10:16 AM GMT+6

File Name
DBA IB 2016-17 Tamzid Customer Loyalty through Improved Customer Service A Case Study of Bi....pdf

File Size
1.8 MB

262 Pages

58,983 Words

349,668 Characters

Dhaka University Institutional Repository

16% Overall Similarity

The combined total of all matches, including overlapping sources, for each database.

Filtered from the Report

- Bibliography
- Abstract

Match Groups

575 Not Cited or Quoted 12%
Matches with neither in-text citation nor quotation marks

123 Missing Quotations 3%
Matches that are still very similar to source material

45 Missing Citation 1%
Matches that have quotation marks, but no in-text citation

15 Cited and Quoted 0%
Matches with in-text citation present, but no quotation marks

Top Sources

13% Internet sources
9% Publications
0% Submitted works (Student Papers)

Integrity Flags

1 Integrity Flag for Review

Replaced Characters
80 suspect characters on 23 pages
Letters are swapped with similar characters from another alphabet.

Our system's algorithms look deeply at a document for any inconsistencies that would set it apart from a normal submission. If we notice something strange, we flag it for you to review.

A Flag is not necessarily an indicator of a problem. However, we'd recommend you focus your attention there for further review.

Match Groups

- **575** Not Cited or Quoted 12%
  Matches with neither in-text citation nor quotation marks
- **123** Missing Quotations 3%
  Matches that are still very similar to source material
- **45** Missing Citation 1%
  Matches that have quotation marks, but no in-text citation
- **15** Cited and Quoted 0%
  Matches with in-text citation present, but no quotation marks

Top Sources

13% Internet sources
9% Publications
0% Submitted works (Student Papers)

Top Sources

The sources with the highest number of matches within the submission. Overlapping sources will not be displayed.

1	Internet	
www.theseus.fi		1%
2	Internet	
www.coursehero.com		1%
3	Internet	
etheses.bham.ac.uk		<1%
4	Internet	
commons.erau.edu		<1%
5	Internet	
www.ti-bangladesh.org		<1%
6	Internet	
oaji.net		<1%
7	Internet	
en.wikipedia.org		<1%
8	Internet	
www.mdpi.com		<1%
9	Internet	
etd.hu.edu.et		<1%
10	Internet	
www.theindependentbd.com		<1%

11	Internet	
etd.aau.edu.et		<1%
12	Internet	
uunz.ac.nz		<1%
13	Internet	
repository.rjt.ac.lk		<1%
14	Internet	
dcms.lib.nu.ac.th		<1%
15	Publication	
Afrin Anika, Mahia Islam, Farhad Ahmed. "The Impact of Customer Service Qualit...		<1%
16	Internet	
eprints.utar.edu.my		<1%
17	Internet	
www.thedailystar.net		<1%
18	Publication	
Abdulwasiu, Adebayo Adeyemi. "Service Quality and Customer Loyalty in Selected...		<1%
19	Publication	
Harold Andrew Patrick, Ravichandran Krishnamoorthy. "Applied Research for Gro...		<1%
20	Internet	
wikimili.com		<1%
21	Publication	
Tesfay, Assefa Worede. "A Comprehensive Measure of Business Performance: A S...		<1%
22	Internet	
www-emerald-com-443.webvpn.sxu.edu.cn		<1%
23	Internet	
www.researchgate.net		<1%
24	Internet	
etd.uum.edu.my		<1%

25 Publication
Mkhize, Basil. "Antecedents of Customer Loyalty in the South African Life Insuran... <1%

26 Internet
nadre.ethernet.edu.et <1%

27 Internet
publisher.tbsnews.net <1%

28 Internet
meral.edu.mm <1%

29 Publication
Dwi Irawan, Agung Prasetyo, Nugroho Wicaksono, Aviani Widyastuti, Rizki Febria... <1%

30 Internet
lib.buet.ac.bd:8080 <1%

31 Internet
www.studymode.com <1%

32 Publication
Juliet Namukasa. "The influence of airline service quality on passenger satisfactio... <1%

33 Publication
Bui Van Quang, Nguyen Thi Van. "Exploring store image and green trust as predic... <1%

34 Internet
www.bytzsoft.com <1%

35 Internet
journal.formosapublisher.org <1%

36 Internet
listens.online <1%

37 Internet
ro.uow.edu.au <1%

38 Internet
www.tbsnews.net <1%

Dhaka University Institutional Repository

39 Internet

docplayer.net <1%

40 Publication

John H. Hitchcock, Anthony J. Onwuegbuzie. "The Routledge Handbook for Advan... <1%

41 Publication

Durandis, Renel. "The Impact of Customer Complaints on Customer Satisfaction i... <1%

42 Publication

Slabbert, H. O.. "The Influence of Employee Engagement on Customer Experience... <1%

43 Internet

www.nepjol.info <1%

44 Internet

s3.eu-central-1.amazonaws.com <1%

45 Publication

Bajah, Jeff. "Reverse Supply Chain (RSC) and Its Effect on Customer Satisfaction: A... <1%

46 Internet

eaglepubs.erau.edu <1%

47 Internet

www.diplomarbeiten24.de <1%

48 Publication

Badri Munir Sukoco, Rahmat Heru Setianto, Nidya Ayu Arina, Ade Gafar Abdullah,... <1%

49 Publication

Eyden Samunderu. "The Economic Effects of Air Transport Market Liberalisation",... <1%

50 Publication

International Journal of Contemporary Hospitality Management, Volume 25, Issu... <1%

51 Publication

de Souza, Luís Henrique. "Casas Partilhadas Monetizadas: A Experiência Turística ... <1%

52 Internet

iiste.org <1%

53 Publication
Faulkner, Thomas Wiley, Jr.. "Cultivating a Culture of Continuous Learning: Exami... <1%

54 Publication
Lemena, Boitumelo. "Customer Experience, Satisfaction and Loyalty at South Afri... <1%

55 Internet
repository.psa.edu.my <1%

56 Publication
Olifant, Daniella. "The Effect of Loyalty Programmes on Customer Loyalty in the R... <1%

57 Internet
ethesisarchive.library.tu.ac.th <1%

58 Internet
ojs.uph.edu <1%

59 Publication
Hurriyati Ratih, Tjahjono Benny, GafarAbdullah Ade, Sulastri, Lisnawati. "Advance... <1%

60 Internet
bdnews24.com <1%

61 Publication
Mamuye Belihu, Tafesse Matewos, Kereyu Kebede, Tirfu Kakiso. "Climate informa... <1%

62 Publication
Nien-Te Kuo, Kuo-Chien Chang, Chia-Hui Lai, Yi-Sung Cheng. "The Impact of Servic... <1%

63 Internet
multimedia.elsevier.es <1%

64 Internet
stp-mataram.e-journal.id <1%

65 Internet
irep.iium.edu.my <1%

66 Publication
Peter S. Morrell. "Airline Finance", Routledge, 2021 <1%

67 Internet
iastatedigitalpress.com <1%

68 Internet
researchspace.ukzn.ac.za <1%

69 Publication
Anatoli Bourmistrov, Levi Gårseth-Nesbakk, Toomas Haldma, Jan Mouritsen, Rom... <1%

70 Publication
Prasanta Kr Chopdar, Janarthanan Balakrishnan. "Consumers response towards ... <1%

71 Publication
Vivek Verma, Hafiz T.A. Khan, Dilip C. Nath, Kenneth C. Land. "Biostatistical Meth... <1%

72 Internet
bmcmededuc.biomedcentral.com <1%

73 Publication
Leow, Sen Choon. "Airline Service Failure and Recovery: A Conceptual and Empiric... <1%

74 Internet
blog.expertrec.com <1%

75 Internet
gbmrjournal.com <1%

76 Internet
ici2016.org <1%

77 Internet
researchonline.federation.edu.au <1%

78 Internet
zonofeducation.com <1%

79 Publication
Madoro, Costen. "Investigating Marketing Factors that Influence Customer Loyal... <1%

80 Publication
Sakib, Ahmed Nazmus. "Enhancing Hydrogen Energy Storage and Transportation ... <1%

81	Publication	Siska Noviaristanti. "Contemporary Research on Management and Business", CR... <1%
82	Internet	journals.sagepub.com <1%
83	Internet	www.aviation24.be <1%
84	Internet	research-advances.org <1%
85	Publication	"Economic growth of airlines industry: An overview of domestic airlines in Bangla... <1%
86	Internet	caab.gov.bd <1%
87	Internet	docslib.org <1%
88	Internet	moam.info <1%
89	Internet	www.researchsquare.com <1%
90	Internet	repository.unimal.ac.id <1%
91	Internet	www.numberanalytics.com <1%
92	Internet	ijsser.org <1%
93	Internet	opus.lib.uts.edu.au <1%
94	Publication	Bicheng Wang, Shun An, Kerun Li. "Shaping Green Choices: How Sensory Cues Dri... <1%

95 Publication
Hongwei He, Avinandan Mukherjee. "I am, ergo I shop: does store image congrui... <1%

96 Publication
Keith Denton. "High performance work systems: the sum really is greater than its... <1%

97 Publication
Lickteig, Duane J.. "Development of Nature of Science Understandings and Self-Ef... <1%

98 Publication
Mengyuan, Zhao. "Passenger Perception of Service Quality of Chinese Airlines an... <1%

99 Publication
Taoana, Mokgadi Cleopatra. "The Mediating Role of Brand Trust in the Formation ... <1%

100 Publication
Zohaib Razzaq, Salman Yousaf, Zhao Hong. "The moderating impact of emotions ... <1%

101 Internet
calhoun.nps.edu <1%

102 Internet
eprints.usq.edu.au <1%

103 Internet
ophrp.org <1%

104 Internet
rd.springer.com <1%

105 Internet
www.logupdateafrica.com <1%

106 Internet
www.londoni.co <1%

107 Internet
www.revfine.com <1%

108 Publication
Ernesto D. R. Santibanez Gonzalez, Rajeev Sijariya, Vikas Garg. "E-Financial Strate... <1%

109 Publication
Gallenti, Vincent James. "An Axis Organisational Effectiveness : The Relationship ... <1%

110 Publication
Hugh Wilkins, Bill Merrilees, Carmel Herington. "The Determinants of Loyalty in H... <1%

111 Publication
Irwan Trinugroho, Evan Lau. "Business Innovation and Development in Emerging... <1%

112 Publication
Missbach, Kyle J.. "“Lessons Not Learned”: U.S. Ambassador Claude Bowers and th... <1%

113 Internet
bdlaws.minlaw.gov.bd <1%

114 Internet
ebin.pub <1%

115 Internet
essay.utwente.nl <1%

116 Internet
iceb.johogo.com <1%

117 Internet
ijeponline.lingcure.org <1%

118 Internet
pmc.ncbi.nlm.nih.gov <1%

119 Internet
weekly.chinacdc.cn <1%

120 Internet
www.cambridge.org <1%

121 Publication
Choukri Menidjel, Abderrezzak Benhabib, Anil Bilgihan. "Examining the moderati... <1%

122 Internet
www.slideshare.net <1%

123 Publication
"Intelligent Manufacturing and Energy Sustainability", Springer Science and Busi... <1%

124 Publication
Azizul Hassan. "Tourism Marketing in Bangladesh - An Introduction", Routledge, ... <1%

125 Publication
Shalli Rani, Ayush Dogra, Ashu Taneja. "Smart Computing and Communication fo... <1%

126 Internet
migrationletters.com <1%

127 Internet
stax.strath.ac.uk <1%

128 Publication
Merlo, Teresa Elaine. "Exploring Communication and Relationship Investment Str... <1%

129 Publication
Mohlala, Clene. "How Brand Function and Corporate Image Create Loyalty in Nor... <1%

130 Publication
Sumaiya Rahman, Shohel Ahmed, Tahrima Faruq. "Forecast and Analyze the Reve... <1%

131 Internet
dl.lib.uom.lk <1%

132 Internet
media.proquest.com <1%

133 Internet
pdffox.com <1%

134 Internet
www.hal.inserm.fr <1%

135 Publication
Buaphiban, Thapanat. "Determination of Factors That Influence Passengers' Airli... <1%

136 Publication
Ho Huy Tuu, Svein Ottar Olsen, Pham Thi Thuy Linh. "The moderator effects of pe... <1%

137 Publication
Yun-Chan Yen, Shih-Chih Chen. "The Triple Pathway to Loyalty: Understanding Ho... <1%

138 Internet
theaspd.com <1%

139 Internet
www.faculty.poly.edu <1%

140 Publication
Phenikaa University <1%

141 Internet
digigyor.com <1%

142 Internet
file.scirp.org <1%

143 Internet
ir.mu.ac.ke:8080 <1%

144 Internet
nextnano.eu <1%

145 Internet
obealimentaria.files.wordpress.com <1%

146 Internet
online.wyzant.com <1%

147 Publication
Mukama, Prisca Vincent Gervase. "The Impact of Human Resource Management ... <1%

148 Publication
Poomagal Adhinarayanan, Nithyasri Kathirvel. "Understanding the Perception of ... <1%

149 Publication
Royster, William Patrick Grant. "Navigating Crises: Influence of Leadership, Netw... <1%

150 Internet
fdocuments.in <1%

151 Internet
link.springer.com <1%

152 Internet
www.cordaid.org <1%

153 Internet
www.respicio.ph <1%

154 Internet
www.weeklyblitz.net <1%

155 Publication
Auguste-George, Mary Brigid. "Determinant Factors of Loyalty in Adventist Educa... <1%

156 Publication
Hamid Mirzahossein, Soheil Rezashoar. "Feature importance analysis of optimize... <1%

157 Publication
Howard M. Hensel. "Air Power in the Indian Ocean and the Western Pacific - Unde... <1%

158 Publication
Qi Xu. "Family Structure and Intergenerational Support in Contemporary China - ... <1%

159 Publication
Rice, Reginald M.. "Church-Based Small Group Participation and Faith Maturity: A ... <1%

160 Publication
S. N. Kumar, Sherin Zafar, S Arun, Sameena Naaz, M. M. Sufyan Beg, Eduard Babul... <1%

161 Publication
Siska Noviaristanti. "Contemporary Research on Business and Management", CR... <1%

162 Publication
Sunita Singh Sengupta, P. Jyothi, Suresh Kalagnanam, B. Charumathi. "Diversity, ... <1%

163 Publication
Swati Gupta, Sanjay Taneja, J. Paulo Davim. "Transforming Business Management... <1%

164 Publication
Tika Kartika, Achmad Firdaus, Mukhamad Najib. "Contrasting the drivers of custo... <1%

165	Publication	Yoo, Dain. "Between Two Terrors: Political Consequences of Vague Anti-Terrorism... <1%
166	Internet	businesspostbd.com <1%
167	Internet	cefimo.ase.ro <1%
168	Internet	fastercapital.com <1%
169	Internet	gssrr.org <1%
170	Internet	hal.science <1%
171	Internet	health-policy-systems.biomedcentral.com <1%
172	Internet	ichi.pro <1%
173	Internet	isrgpublishers.com <1%
174	Internet	journal.oscm-forum.org <1%
175	Internet	today.thefinancialexpress.com.bd <1%
176	Internet	www.classace.io <1%
177	Internet	www.ijstm.inarah.co.id <1%
178	Internet	www.inf.uni-hamburg.de <1%

179 Internet
www.preprints.org <1%

180 Publication
"B128 week 2 organisational orientations and consumer perspectives WEB147418... <1%

181 Internet
5dok.net <1%

182 Publication
Bijan Vasigh, Ken Fleming, Thomas Tacker. "Introduction to Air Transport Econo... <1%

183 Publication
Birk, Jeffrey. "The Contributions of Threat-Biased Attention and Attentional Contr... <1%

184 Publication
Dian Puteri Ramadhani, Indira Rachmawati, Cahyaningsih, Nidya Dudija et al. "Ac... <1%

185 Publication
Dowd, Nicci T.. "Experiences of African American Males with Disabilities and Their... <1%

186 Publication
Emilie Haarslev Schröder Marqvorsen, Morten Aagaard Petersen, Line Lund, Fran... <1%

187 Publication
Haemoon Oh, Abraham Pizam. "Handbook of Hospitality Marketing Management... <1%

188 Publication
Huan Yu, Xin Xia, Xiaoqiong Zhao, Weiwei Qiu. "Combining Collaborative Filtering... <1%

189 Publication
Jin-Woo Park, Rodger Robertson, Cheng-Lung Wu. "Modelling the Impact of Airlin... <1%

190 Publication
Jonathan Michie, Joseph Blasi. "Employee Ownership and Profit Sharing - A Global... <1%

191 Publication
Kashaija, Goodman Katende. "Awareness and Adherence to Occupational Health ... <1%

192 Publication
Michael Olsen, Jinlin Zhao. "Handbook of hospitality strategic management", Else... <1%

193 Publication
Mokgoatlheng, Jacob Elias. "The Role of Internal Marketing in Building Corporate ... <1%

194 Publication
Rathogwa, Belinda. "SME Adoption of Digital Banking in South Africa", University ... <1%

195 Publication
Richard Klophaus, Chunyan Yu. "Short-haul airline services in Europe and North A... <1%

196 Publication
Sahib Jada Eyakub Khan, Azim Uddin, Shahid Nazir, Syed Forkan Uddin, Mohamm... <1%

197 Publication
Tao Lin. "Whether and how tourism industry upgrading promotes employee socia... <1%

198 Internet
bhsoc.org <1%

199 Internet
conference.loupiasconference.org <1%

200 Internet
d-nb.info <1%

201 Internet
dailynewnation.com <1%

202 Internet
dissertationdataanalysishelp.com <1%

203 Internet
erepository.uonbi.ac.ke <1%

204 Internet
f1000research-files.f1000.com <1%

205 Internet
ijip.in <1%

206 Internet
ir.canterbury.ac.nz <1%

207 Internet

publications.anveshanaindia.com <1%

208 Internet

repository.out.ac.tz <1%

209 Internet

repository.trisakti.ac.id <1%

210 Internet

research-api.cbs.dk <1%

211 Internet

sened.wustl.edu <1%

212 Internet

so07.tci-thaijo.org <1%

213 Internet

sponsors.marketingscience.info <1%

214 Internet

theses.ncl.ac.uk <1%

215 Internet

www.jestr.org <1%

216 Internet

www.lcgbangladesh.org <1%

217 Internet

www.repo.uni-hannover.de <1%

218 Internet

www.scribd.com <1%

219 Publication

Gures, Nuriye, Seda Arslan, and Sevil Yucel Tun. "Customer Expectation, Satisfacti... <1%

220 Publication

Josephine Kass-Hanna, Angela C. Lyons, Fan Liu. "Building financial resilience thr... <1%

221 Publication
Kassa, Temesgen Melaku. "Measuring and Modelling Service Quality in Ethiopian ... <1%

222 Publication
Mabandla, Vuyokazi. "Quality or Reception Services Offered by Security Personne... <1%

223 Publication
Michael Baker. "The Marketing Book", Routledge, 2019 <1%

224 Publication
Yong-Ki Lee, Byung-Ho Choi, Dong Jin Kim, Sunghyup Sean Hyun. "Relational ben... <1%

225 Publication
Al-Shraideh, Bilal Mohammad Abdoh. "The Impact of Flight Safety on Passenger S... <1%

226 Publication
Helda Yosintha, Ahmad Ikhwan Setiawan. "Unlocking Merchant Loyalty in the QR... <1%

227 Publication
Klopfer, Lisa-Marie. "Customer Experience Management – Empirische Studien zur... <1%

228 Publication
Mentz, Hendrik. "Customer-Based Brand Equity of the Major Cellphone Network ... <1%

229 Publication
Michael Hanke. "Airline e-Commerce - Log on. Take off.", Routledge, 2016 <1%

230 Publication
Muhammad Ismail Hossain, Nasrin Akter, Abureza M. Muzareba. "Marketing in a ... <1%

231 Publication
Siska Noviaristanti, Hasni Mohd Hanafi, Donny Trihanondo. "Understanding Digit... <1%

232 Internet
digitalscholarship.unlv.edu <1%

Dhaka University Institutional Repository

Customer Loyalty through Improved Customer Service: A Case Study of Biman Bangladesh Airlines Limited

By

Muhammed Tamzid Al Arafat

Department of International Business

Faculty of Business Studies

University of Dhaka

Dhaka University Institutional Repository

Abstract

This dissertation presents a comprehensive, data-driven investigation into the determinants of customer satisfaction and loyalty at Biman Bangladesh Airlines, addressing a critical gap in the literature on aviation in emerging markets. The research employs a rigorous mixed-methods approach, integrating quantitative analysis of survey data from 425 passengers with qualitative insights from 43 semi-structured interviews with stakeholders. The study examines two primary dependent variables (DVs) as Customer Satisfaction and Customer Loyalty, against eight independent variables (IVs) operationalized through 40 distinct attributes, while controlling for three key demographic variables (CVs): Age, Education Level, and Travel Frequency.

A novel Multivariate-Machine Learning Synergistic Model (MML-SM) was developed, synergizing traditional statistical methods with advanced machine learning to uncover both linear and non-linear relationships. The Ordered Logistic Regression (OLogit) analysis identified Improved Customer Service (β=1.365, $p < 0.001$) as the most powerful predictor of satisfaction, with Brand Reputation (β=0.586, $p< 0.01$) and Price (β=0.541, $p<0.001$) also showing strong significant effects. The Multivariate Linear Regression (MLR) analysis specifically quantified the drivers of loyalty, revealing Improved Customer Service (β=0.341, $p<0.001$) as the strongest predictor, followed by Brand Reputation ($\beta = 0.138$, $p < 0.01$) and Price ($\beta = 0.133$, $p < 0.001$). The OLS regression further confirmed Improved Customer Service as loyalty's primary driver ($\beta = 0.7413$, $p < 0.001$; $R^2 = 0.659$).

The machine learning models revealed critical, non-intuitive realities. Random Forest not only validated the hierarchy of drivers, attributing 56.0% importance to