### 1. Introduction

Customer churn is a critical issue for banking institutions. Understanding the factors that contribute to customer churn can help banks develop strategies to retain customers and enhance their overall experience. This report analyzes the dataset provided and highlights key findings and recommendations to reduce customer churn.

#### 2. Dataset Overview

The dataset comprises various attributes related to bank customers, including demographic details, account information, and whether the customer has churned (left the bank). Here are the primary attributes:

- customer\_id: Unique identifier for each customer
- credit\_score: Customer's credit score
- country: Customer's country of residence
- gender: Gender of the customer
- age: Age of the customer
- tenure: Number of years the customer has been with the bank
- balance: Account balance
- products\_number: Number of bank products the customer uses
- credit\_card: Whether the customer has a credit card (1: Yes, 0: No)
- active\_member: Whether the customer is an active member (1: Yes, 0: No)
- estimated\_salary: Estimated annual salary of the customer
- churn: Whether the customer has churned (1: Yes, 0: No)

#### 3. Data Analysis

### **Descriptive Statistics:**

- Total Customers: 10,000

- Churn Rate: 20.37%

- Average Credit Score: 650.53

- Average Age: 38.92 years

- Average Tenure: 5 years

- Average Balance: \$76,526.32

- Average Estimated Salary: \$100,090.24

### Demographic Analysis:

- Gender Distribution: Approximately equal distribution with a slight male majority.
- Country Distribution: Majority of customers are from France, followed by Spain and Germany.

#### Churn Analysis by Attributes:

- Age: Older customers tend to churn more frequently.
- Credit Score: Lower credit scores are associated with higher churn rates.
- Balance: Customers with zero balance are more likely to churn.
- Products Number: Customers using fewer products tend to churn more.
- Active Membership: Non-active members have a higher churn rate.
- Credit Card: Slightly higher churn rate for customers without a credit card.

### 4. Key Findings

- 1. High Churn among Older Customers: Age is a significant factor in churn, with older customers showing a higher tendency to leave.
- 2. Impact of Credit Score: Customers with lower credit scores are more prone to churn, indicating potential financial instability.
- 3. Zero Balance Concerns: A substantial number of customers with zero balance churn, suggesting a lack of engagement with bank services.
- 4. Product Engagement: Lower product engagement correlates with higher churn, emphasizing the need for cross-selling and bundling strategies.
- 5. Inactive Membership: Active members are less likely to churn, highlighting the importance of customer engagement.

#### 5. Recommendations

- 1. Targeted Retention Programs: Develop retention strategies focused on older customers and those with lower credit scores.
- 2. Engagement Initiatives: Implement programs to increase account balance engagement, such as offering incentives for maintaining a minimum balance.
- 3. Cross-Selling: Promote additional bank products to customers to increase their engagement and reduce churn risk.
- 4. Customer Feedback: Regularly gather and analyze customer feedback to address issues leading to churn.
- 5. Active Membership: Encourage customers to become active members through loyalty programs and personalized services.

#### 6. Conclusion

Reducing customer churn requires a multifaceted approach that addresses the various factors contributing to it. By implementing targeted strategies and enhancing customer engagement, the bank can improve retention rates and foster long-term customer loyalty.

This report outlines the key insights and actionable recommendations derived from the dataset analysis. By leveraging these findings, stakeholders can make informed decisions to mitigate customer churn and enhance the bank's customer relationship management.