Bank Churn Analysis

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1. Executive Summary

This report analyzes **customer churn** in a **retail banking dataset** to determine key factors driving attrition. Using **Power BI for visualization and SQL for data analysis**, we identified **demographic**, **behavioral**, **and financial** trends impacting churn.

Key findings include higher churn among female, middle-aged (35-54), and German clients. Customers with 2 products churn the least, while those with 3+ products churn at extreme rates (83%-100%). Inactive clients churn at nearly double the rate of active ones.

Our recommendations include **engagement strategies for high-risk groups, product optimization to prevent multi-product churn, and targeted interventions for the German market**.

2. Introduction

Problem Statement

Customer churn is a significant challenge for banks, as it leads to revenue loss and increased acquisition costs. This analysis aims to **identify key factors influencing churn** and provide actionable insights to **improve customer retention**.

Importance of Analysis

- Reduce churn among high-value customers
- Optimize product offerings to ensure customers are satisfied
- Identify at-risk customers and intervene early to prevent churn

Dataset Overview

- **10,000 customers,** with attributes such as credit score, balance, salary, age, region, tenure, and churn status
- Churn Rate: 20.4% overall
- Three main analysis areas: Demographic, Behavioral, and Financial

3. Data Preparation & Methodology

Data Cleaning & Preprocessing

- Checked for and removed any NULLs, duplicates, or severe outliers
- Created age buckets to better analyze customer segments
- Converted categorical variables (gender, active status)
- Standardized column names and dropped unnecessary columns (surname, row number)
- Created churn rate calculations

Tools & Techniques

- SQL: Data extraction, transformation, and analysis
- Power BI: Dashboard development (demographic, behavioral, financial churn trends)

Assumptions & Limitations

- The dataset does not include insight into specifics about the products offered to clients
 - This information is needed to understand why more projects = higher churn
- No transaction history or customer feedback, which could provide deeper individual churn insights
- Unknown reason for extreme churn (100%) among 4-product customers requires further investigation
- High number of \$0 balance for individuals
 - Need further information as to whether this is expected or if the data needs updating

4. Exploratory Data Analysis (EDA)

Demographic Trends

- Female customers churn at 25.6% (higher than male churn of 17%)
- Ages 35-54 account for over 50% of clients (churn of 26.7%)
 - Ages 55+ churn at 39.1% (much smaller sample size)
- Germany has the highest churn rate (32.1%), nearly double that of France and Spain (~17%)

Behavioral Patterns

- Customers with 2 products churn the least (8%), while 3+ product customers churn at a 83-100% rate (requires further analysis)
- Inactive customers churn at a much higher rate (27.6%) than active ones (14.8%)
- Credit card ownership has no major impact on churn (~.4% difference)

Financial Factors

- Credit score and salary have a minimal impact on churn (variations within 2-3%)
- **High-balance customers (\$80K+) churn more (24%),** despite representing over half the client base
- Low-balance customers (<\$1k) churn the least (15%)

5. Recommendations & Business Impact

Retention Strategies

- Target female and middle-aged customers with loyalty programs and personalized support
- Investigate and address the high churn in Germany this market needs urgent attention

Product & Engagement Optimization

- Encourage 1-product customers to adopt a second product, as this drastically reduces churn
- Investigate extreme churn (100%) among 4-product clients this could be a policy-driven issue
- Re-engage inactive customers with special offers to reduce churn
- Offer exclusive retention benefits to high-balance clients (\$80K+) to reduce churn

6. Conclusion & Next Steps

This analysis highlights key churn drivers and provides **strategies for retention**, **engagement**, **and product optimization**.

Next steps:

- Investigate the German market for churn causes
- Target strategies for Females and Middle-aged clients to lower churn
- Understand why high-product clients leave at extreme rates
- Use predictive models to flag at-risk customers proactively