Executive Summary: Customer Churn Analysis

This project investigates customer churn patterns in a telecommunications company. By leveraging exploratory data analysis, we identify key drivers behind customer attrition and recommend strategic actions to improve retention.

Project Objectives:

- Analyze customer attributes influencing churn.
- Visualize patterns using EDA.
- Derive actionable insights to support decision-making and customer success strategies.

Dataset Snapshot:

The dataset consists of 7,043 customer records with the following features:

- **Demographics:** Gender, SeniorCitizen, Partner, Dependents
- Account Info: Tenure, Contract, PaperlessBilling, PaymentMethod
- Service Info: InternetService, OnlineSecurity, TechSupport, StreamingServices
- Target Variable: Churn (Yes/No)

Key Findings & Insights:

1. Overall Churn Rate

• 26.5% of customers in the dataset have churned.

 This is a critical retention concern and exceeds the typical industry benchmark (~15– 20%).

2. Contract Type Is a Major Driver

- Churn rate among month-to-month contract users: 43.9%
- Churn rate among **one-year** contract users: **11.5**%
- Churn rate among two-year contract users: 2.8%
- **Insight:** Customers on shorter contracts are 15x more likely to churn than those on two-year contracts.
- Recommendation: Promote longer contracts with loyalty discounts and value bundles.

3. Tenure Affects Loyalty

- Customers with <12 months tenure account for 52% of churn.
- Longer-tenured customers (>24 months) exhibit <6% churn.
- **Recommendation:** Focus on **first-year experience**—welcome offers, proactive support, and personalized onboarding.

4. Payment Method & Churn

- Churn among Electronic Check users: 45.5%
- Churn among Bank Transfer (automatic) users: 15.2%
- Churn among Credit Card (automatic) users: 16.1%
- Insight: Manual payment customers churn at nearly 3x the rate of auto-pay users.
- Recommendation: Encourage auto-pay enrollment via incentives or simplified setup.

5. Tech Support & Online Security

• Churn among customers without tech support: 37.7%

- Churn among customers with tech support: 14.1%
- Similar patterns observed for **online security** and **device protection**.
- Recommendation: Offer free trials or service bundles to showcase the value of support tools.

6. Senior Citizens Churn More

- Churn rate for **Senior Citizens**: **41.2**%
- For non-seniors: 24.9%
- **Recommendation:** Tailored communication, simplified services, or dedicated support lines may help retention.

7. Internet Type & Churn

- Fiber optic users churn at 41%, whereas DSL users churn at only 19.5%.
- Possible reasons include performance expectations or service disruptions.
- Recommendation: Monitor satisfaction and offer service quality guarantees for fiber customers.

8. Monthly Charges Are a Trigger

- Customers paying > \$80/month churn at 41.3%, versus < 20% for those under \$50.
- **Recommendation:** Tiered pricing, bundling, or loyalty discounts can help retain high-paying customers.

9. Paperless Billing May Reduce Engagement

- Churn rate for paperless billing users: 33.6%
- For paper billing: 22.5%
- May reflect lower engagement or communication gaps in digital channels.

• Recommendation: Improve email communications and add personalized engagement strategies for paperless users.

10. Multi-Service Users Are More Loyal

- Customers using 4+ services have a churn rate of 13%
- Those using **1-2 services** churn at over **35%**
- Recommendation: Promote service bundling and value packages to increase stickiness.

11. Gender, Partner Status Have Minimal Impact

- Gender, partner status, and dependent presence do not significantly influence churn independently.
- However, combined with contract and tenure, they can contribute to predictive modeling.

Strategic Recommendations:

- Launch **churn prediction models** using key predictors (tenure, contract, payment method, monthly charges).
- Build **retention campaigns** for high-risk segments (short-tenure, electronic check users).
- Promote long-term contracts and bundles.
- Enhance digital experience for **paperless billing** customers.
- Offer **loyalty programs** to reward longevity and service upgrades.