

## Executive Summary – Customer Churn Analysis

The customer churn analysis provides a data-driven understanding of why customers discontinues services and highlights the demographic, behavioural, and service-related patterns strongly associated with churn. The insights come from multiple visualizations, including pie charts, countplots, and service adoption charts, enabling a structured and measurable assessment of churn risks.

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### 1. Overall Churn Performance

- **26.54% of customers have churned**, representing more than one-quarter of the telecom provider's customer base.
  - This churn level is sizeable and indicates an urgent need for targeted retention strategies.
  - Initial preprocessing steps — such as replacing blank values in TotalCharges and converting 0/1 SeniorCitizen flags to yes/no — improved interpretability and made the analysis more accurate.
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### 2. Demographic Insights

#### Senior Citizens

- The proportion of **senior citizens who churn is noticeably higher** compared to non-senior customers.
  - This indicates that older customers may experience more dissatisfaction or service-related challenges.
  - A focused strategy for this demographic may significantly reduce churn.
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### 3. Tenure & Customer Lifetime Value

- **Long-tenure customers (multiple years)** show **very low churn rates**, often contributing stable revenue.
  - **New customers (with 1–2 months of tenure)** show **the highest churn percentage**, indicating:
    - possible onboarding issues,
    - unmet expectations,
    - or price/feature dissatisfaction early in the customer journey.
  - Retention interventions within the first **60 days** could yield significant improvements.
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### 4. Impact of Contract Type

- Customers on **month-to-month contracts account for the largest share of churn**.

- In contrast:
    - **One-year contracts** show **moderately lower churn**.
    - **Two-year contracts** show the **lowest churn percentage** across all contract types.
  - Lock-in periods clearly improve customer stickiness.  
Offering incentives to shift month-to-month customers to annual contracts would reduce churn substantially.
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## 5. Service Usage Patterns & Churn

The analysis of value-added service usage (OnlineSecurity, OnlineBackup, TechSupport, StreamingTV, etc.) shows that:

- Customers **not using additional services** exhibit **higher churn percentages**.
  - Customers who remain show much higher adoption of:
    - **Online Security**
    - **Online Backup**
    - **Device Protection**
    - **Tech Support**
  - This suggests that greater engagement with premium/bundled services increases satisfaction and reduces churn risk.
  - In the streaming services categories (StreamingTV and StreamingMovies), churn is also **higher among non-users**, indicating that service richness and engagement help retain customers.
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## 6. Payment Method Influence

- Customers paying via **Electronic Check** show the **highest churn rate** among all payment modes.
  - Possible reasons include:
    - higher transaction fees,
    - lack of automation,
    - lower convenience compared to card or bank automatic payments.
  - Payment digitalization campaigns may help shift users toward more stable billing channels.
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## Key Strategic Takeaways

1. **Reduce Early-Stage Churn**

Focus on the first 1–2 months with onboarding, tutorials, service walkthroughs, and personalized support.

2. **Promote Long-Term Contracts**

Discounts, loyalty points, or bundled packages can shift customers from month-to-month to 1–2 year plans.

3. **Increase Adoption of Value-Added Services**

Customers using multiple services churn significantly less; cross-sell and up-sell strategies should be enhanced.

4. **Target High-Risk Segments**

- Senior Citizens
- Electronic Check users
- New customers

These groups should receive high-touch interventions.

5. **Improve Payment Experience**

Encouraging auto-pay or card payments may reduce churn.