

# Telco customers churn analysis

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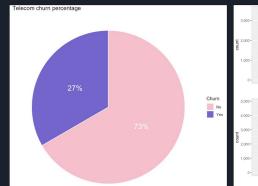
## Introduction

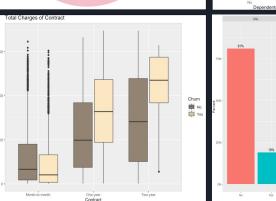
- How to retain customers in business environment
- Telecom Churn dataset
  - why customers were leaving the network provider?
- Exploratory Data Analysis(EDA)
- Correlation
- Feature Selection
  - Stepwise Selection
- Logistic Regression
  - o ROC Curve, AUC value
- Evaluation
  - Confusion Matrix
- Conclusion



# Exploratory Data Analysis (EDA)

- Total 7,044 rows, 20 columns
- Churn No 5,163(73%), Yes 1,869(27%)
- Contract and Total Charges
  - o Month-to-month, one year, two year
  - \$18.8 ~ \$8,684.8
  - $\circ$  Longer contract  $\rightarrow$  Higher charges
  - o Total charges → Different churn range
- Gender(Female/Male)
  - Similar Churn
- Partner(No/Yes)
  - More Churn when people have no partner
- Dependents(No/Yes)
  - o More Churn when people are independent
- Phone Service(No/Yes)
  - A lot more churn with phone service
- Internet Service(DSL/Fiber Optic/No)
  - Fiber Optic Most Churn rate
- Churn  $\rightarrow$  SMOTE() to balance the rate





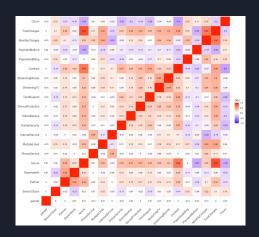


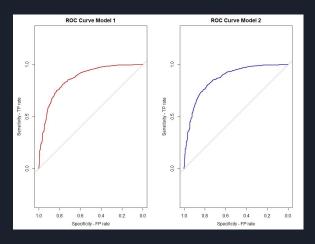
> table(balanced.data.train\$Churn) > table(balanced.data.test\$Churn)

No Yes 2618 2618 No Yes 1120 1120

# Logistics Regression Analysis

- Contract correlation -0.4
- Tenure correlation -0.35
- Feature Selection
  - Stepwise method
  - Model 1
    - Dependents, Tenure, multiple lines, internet service, online backup, device protection, streaming TV, streaming movies, contract, paperless billing, payment method, and total charges.
- Model 2
  - Statistically significant from original model
  - o Similar predictor variables as Model 1 except online back up
- Comparison
  - Model 1 and Model 2
    - AIC
    - ROC
    - AUC
- Conclusion
  - Model 1 is significantly better than model 2





## Evaluation

#### Model 1 Confusion Matrix

- True Negative = 847 False Negative = 203
- False Positive = 273 True Positive = 917
- Accuracy: 0.78
- Sensitivity: 0.818
- Specificity: 0.756
- Precision: 0.7706

#### Confusion Matrix and Statistics

Reference Prediction No Yes No 847 203 Yes 273 917

> Accuracy: 0.7875 95% CI: (0.77, 0.8043)

No Information Rate: 0.5

P-Value [Acc > NIR] : < 2.2e-16

Kappa : 0.575

Mcnemar's Test P-Value: 0.001564

Sensitivity: 0.8187 Specificity: 0.7562 Pos Pred Value: 0.7706 Neg Pred Value: 0.8067

Prevalence: 0.5000 Detection Rate: 0.4094

Detection Prevalence: 0.5312 Balanced Accuracy: 0.7875

'Positive' Class : Yes

## Conclusion

- EDA was conducted
  - Relative graphs were provided and interpreted
  - Audience have an understanding of the dataset
- Two variables have mild correlation to Churn
  - Contract
  - Tenure
- Solutions
  - Improve contracts policy, such as, activation fee and hidden fee
  - Give out free subscription services like Spotify and Netflix for contracted customers
  - Used phone trade in promotion to make customers stay longer or even extend the contract
  - VIP status, point earning program

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