





# **Report Overview**

This report was created for the EDA of *churn* data. It helps explore data to **understand** the data and find scenarios for performing the analysis.

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# Overview

### **Data Structures**

| division   | metrics               | value   |
|------------|-----------------------|---------|
| size       | observations          | 6,499   |
| size       | variables             | 21      |
| size       | values                | 136,479 |
| size       | memory size (MB)      | 1       |
| duplicated | duplicate observation | 0       |
| missing    | complete observation  | 6,490   |
| missing    | missing observation   | 9       |
| missing    | missing variables     | 1       |
| missing    | missing values        | 9       |

| division  | metrics         | value |
|-----------|-----------------|-------|
| data type | numerics        | 2     |
| data type | integers        | 2     |
| data type | factors/ordered | 0     |
| data type | characters      | 17    |
| data type | Dates           | 0     |
| data type | POSIXcts        | 0     |
| data type | others          | 0     |

Table 1: Data structures and types

### **Job Informations**

| division | metrics      | value                      |
|----------|--------------|----------------------------|
| dataset  | dataset      | churn                      |
| dataset  | dataset type | data.frame                 |
| dataset  | target       | not defied                 |
| job      | samples      | 6,499 / 6,499 (100%)       |
| job      | created      | 2024-05-28 15:09:49.123308 |
| job      | created by   | dlookr                     |
|          |              |                            |

Table 2: Job informations

# **Univariate Analysis**

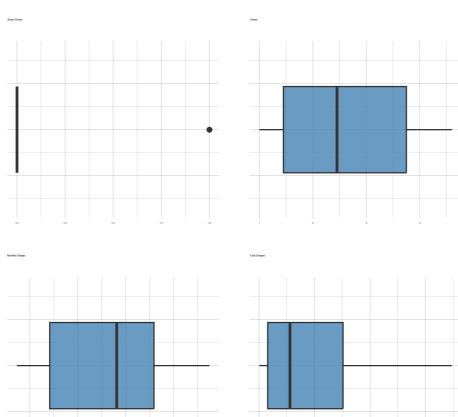
# **Descriptive Statistics**

#### **Numerical Variables**

| variables       | missing | mean     | sd       | min   | Q1    | median   | Q3       | max      |
|-----------------|---------|----------|----------|-------|-------|----------|----------|----------|
| Senior.Citizen  | 0       | 0.16     | 0.37     | 0.00  | 0.0   | 0.00     | 0.00     | 1.00     |
| Tenure          | 0       | 32.37    | 24.58    | 0.00  | 9.0   | 29.00    | 55.00    | 72.00    |
| Monthly.Charges | 0       | 64.73    | 30.14    | 18.25 | 35.4  | 70.35    | 89.85    | 118.75   |
| Total.Charges   | 9       | 2,282.94 | 2,270.03 | 18.80 | 399.3 | 1,397.10 | 3,786.61 | 8,684.80 |

Table 3: Descriptive statistics of numerical variables

#### Distribution by numerical variable



| variables       | data types | distinct | skewness | kurtosis | zero  | negative | outlier |
|-----------------|------------|----------|----------|----------|-------|----------|---------|
| Senior.Citizen  | integer    | 2        | 1.83     | 1.35     | 5,443 | 0        | 1,056   |
| Tenure          | integer    | 73       | 0.24     | -1.39    | 9     | 0        | 0       |
| Monthly.Charges | numeric    | 1,554    | -0.22    | -1.26    | 0     | 0        | 0       |
| Total.Charges   | numeric    | 6,047    | 0.96     | -0.23    | 0     | 0        | 0       |

## **Categorical Variables**

| variables        | levels           | observations | frequency | frequency(%) | rank |
|------------------|------------------|--------------|-----------|--------------|------|
| CustomerID       | 0002-ORFBO       | 6,499        | 1         | 0.02         | 1    |
| CustomerID       | 0003-MKNFE       | 6,499        | 1         | 0.02         | 1    |
| CustomerID       | 0004-TLHLJ       | 6,499        | 1         | 0.02         | 1    |
| CustomerID       | 0011-IGKFF       | 6,499        | 1         | 0.02         | 1    |
| CustomerID       | 0013-EXCHZ       | 6,499        | 1         | 0.02         | 1    |
| CustomerID       | 0013-MHZWF       | 6,499        | 1         | 0.02         | 1    |
| CustomerID       | 0013-SMEOE       | 6,499        | 1         | 0.02         | 1    |
| CustomerID       | 0014-BMAQU       | 6,499        | 1         | 0.02         | 1    |
| CustomerID       | 0015-UOCOJ       | 6,499        | 1         | 0.02         | 1    |
| CustomerID       | 0016-QLJIS       | 6,499        | 1         | 0.02         | 1    |
| Gender           | Male             | 6,499        | 3,290     | 50.62        | 1    |
| Gender           | Female           | 6,499        | 3,209     | 49.38        | 2    |
| Partner          | No               | 6,499        | 3,359     | 51.68        | 1    |
| Partner          | Yes              | 6,499        | 3,140     | 48.32        | 2    |
| Dependents       | No               | 6,499        | 4,561     | 70.18        | 1    |
| Dependents       | Yes              | 6,499        | 1,938     | 29.82        | 2    |
| Phone.Service    | Yes              | 6,499        | 5,884     | 90.54        | 1    |
| Phone.Service    | No               | 6,499        | 615       | 9.46         | 2    |
| Multiple.Lines   | No               | 6,499        | 3,138     | 48.28        | 1    |
| Multiple.Lines   | Yes              | 6,499        | 2,746     | 42.25        | 2    |
| Multiple.Lines   | No phone service | 6,499        | 615       | 9.46         | 3    |
| Internet.Service | Fiber optic      | 6,499        | 2,860     | 44.01        | 1    |
| Internet.Service | DSL              | 6,499        | 2,217     | 34.11        | 2    |
| Internet.Service | No               | 6,499        | 1,422     | 21.88        | 3    |
| Online.Security  | No               | 6,499        | 3,208     | 49.36        | 1    |

Table 4: Top rank levels of categorical variables

|    | variables         | levels                    | observations | frequency | frequency(%) | rank |
|----|-------------------|---------------------------|--------------|-----------|--------------|------|
|    | variables         | levels                    | observations | frequency | frequency(%) | rank |
| 26 | Online.Security   | Yes                       | 6,499        | 1,869     | 28.76        | 2    |
| 27 | Online.Security   | No internet service       | 6,499        | 1,422     | 21.88        | 3    |
| 28 | Online.Backup     | No                        | 6,499        | 2,855     | 43.93        | 1    |
| 29 | Online.Backup     | Yes                       | 6,499        | 2,222     | 34.19        | 2    |
| 30 | Online.Backup     | No internet service       | 6,499        | 1,422     | 21.88        | 3    |
| 31 | Device.Protection | No                        | 6,499        | 2,843     | 43.75        | 1    |
| 32 | Device.Protection | Yes                       | 6,499        | 2,234     | 34.37        | 2    |
| 33 | Device.Protection | No internet service       | 6,499        | 1,422     | 21.88        | 3    |
| 34 | Tech.Support      | No                        | 6,499        | 3,209     | 49.38        | 1    |
| 35 | Tech.Support      | Yes                       | 6,499        | 1,868     | 28.74        | 2    |
| 36 | Tech.Support      | No internet service       | 6,499        | 1,422     | 21.88        | 3    |
| 37 | Streaming.TV      | No                        | 6,499        | 2,589     | 39.84        | 1    |
| 38 | Streaming.TV      | Yes                       | 6,499        | 2,488     | 38.28        | 2    |
| 39 | Streaming.TV      | No internet service       | 6,499        | 1,422     | 21.88        | 3    |
| 40 | Streaming.Movies  | No                        | 6,499        | 2,555     | 39.31        | 1    |
| 41 | Streaming.Movies  | Yes                       | 6,499        | 2,522     | 38.81        | 2    |
| 42 | Streaming.Movies  | No internet service       | 6,499        | 1,422     | 21.88        | 3    |
| 43 | Contract          | Month-to-month            | 6,499        | 3,576     | 55.02        | 1    |
| 44 | Contract          | Two year                  | 6,499        | 1,565     | 24.08        | 2    |
| 45 | Contract          | One year                  | 6,499        | 1,358     | 20.90        | 3    |
| 46 | Paperless.Billing | Yes                       | 6,499        | 3,836     | 59.02        | 1    |
| 47 | Paperless.Billing | No                        | 6,499        | 2,663     | 40.98        | 2    |
| 48 | Payment.Method    | Electronic check          | 6,499        | 2,182     | 33.57        | 1    |
| 49 | Payment.Method    | Mailed check              | 6,499        | 1,485     | 22.85        | 2    |
| 50 | Payment.Method    | Bank transfer (automatic) | 6,499        | 1,426     | 21.94        | 3    |
| 51 | Payment.Method    | Credit card (automatic)   | 6,499        | 1,406     | 21.63        | 4    |
| 52 | Churn             | No                        | 6,499        | 4,784     | 73.61        | 1    |
| 53 | Churn             | Yes                       | 6,499        | 1,715     | 26.39        | 2    |
|    |                   |                           |              |           |              |      |

Table 4: Top rank levels of categorical variables (continued)

The number of categorical (factor/ordered) variables is 0.

# **Normality Test**

| described_variables | min  | Q1    | median | Q3     | max    | skewness | kurtosis | balance      |
|---------------------|------|-------|--------|--------|--------|----------|----------|--------------|
| Senior.Citizen      | 0.0  | 0.0   | 0.0    | 0.0    | 1.0    | 1.8      | 1.4      | Right-Skewed |
| Tenure              | 0.0  | 9.0   | 29.0   | 55.0   | 72.0   | 0.2      | -1.4     | Balanced     |
| Monthly.Charges     | 18.2 | 35.4  | 70.3   | 89.8   | 118.8  | -0.2     | -1.3     | Balanced     |
| Total.Charges       | 18.8 | 399.3 | 1397.1 | 3786.6 | 8684.8 | 1.0      | -0.2     | Balanced     |

Table 5: Descriptive statistics of numerical variables

### Senior.Citizen

(unique) sample size must be greater then 3

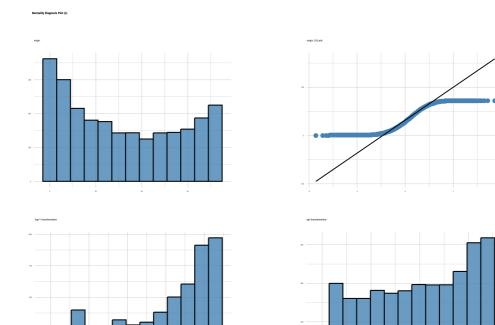
### **Tenure**

| statistic | p_value    | remark       |
|-----------|------------|--------------|
| 0.90432   | 1.8053e-48 | 5000 samples |

Table 6: Shapiro-Wilk normality test

| type                 | skewness | kurtosis |
|----------------------|----------|----------|
| original             | 0.2592   | 1.6292   |
| log+1 transformation | -0.7630  | 2.3583   |
| sqrt transformation  | -0.2164  | 1.7194   |

Table 6: skewness and kurtosis



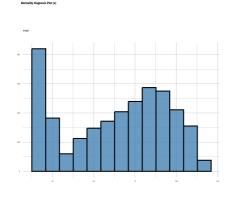
## Monthly.Charges

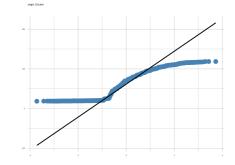
| statistic | p_value    | remark       |
|-----------|------------|--------------|
| 0.91801   | 6.2919e-46 | 5000 samples |

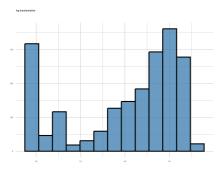
Table 6: Shapiro-Wilk normality test

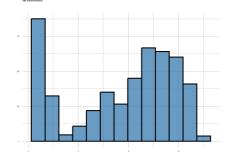
| type                | skewness | kurtosis |
|---------------------|----------|----------|
| original            | -0.2007  | 1.7155   |
| log transformation  | -0.6923  | 1.9666   |
| sqrt transformation | -0.4572  | 1.7927   |

Table 6: skewness and kurtosis









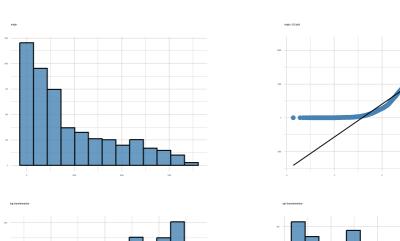
## **Total.Charges**

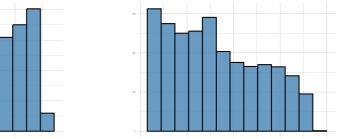
| statist | ic     | p_value  | remark       |
|---------|--------|----------|--------------|
| 0.8558  | 31 1.4 | 4443e-55 | 5000 samples |

Table 6: Shapiro-Wilk normality test

| type                | skewness | kurtosis |
|---------------------|----------|----------|
| original            | 1.0062   | 2.8768   |
| log transformation  | -0.7335  | 2.6870   |
| sqrt transformation | 0.3373   | 1.9784   |

Table 6: skewness and kurtosis





# **Bivariate Analysis**

# **Compare Numerical Variables**

| first variable  | second variable | correlation coefficient |
|-----------------|-----------------|-------------------------|
| Senior.Citizen  | Tenure          | 0.01573                 |
| Senior.Citizen  | Monthly.Charges | 0.22010                 |
| Senior.Citizen  | Total.Charges   | 0.10256                 |
| Tenure          | Monthly.Charges | 0.24895                 |
| Tenure          | Total.Charges   | 0.82555                 |
| Monthly.Charges | Total.Charges   | 0.65169                 |

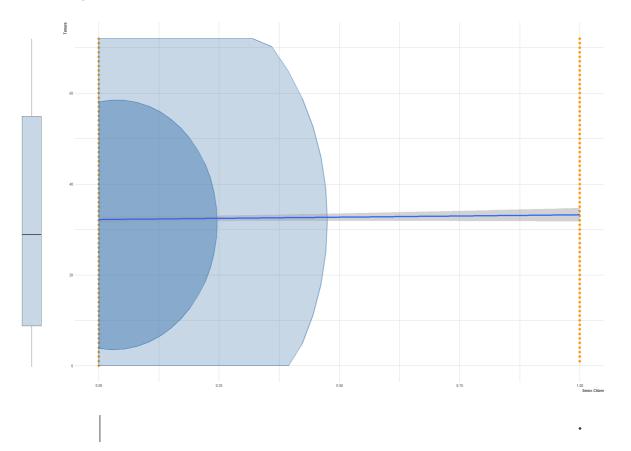
Table 7: Correlation coefficient

### 'Senior.Citizen' vs 'Tenure'

| first variable | second variable | r.squared | adj.r.squared | sigma     | statistic | p.value   | df |
|----------------|-----------------|-----------|---------------|-----------|-----------|-----------|----|
| Senior.Citizen | Tenure          | 0.0002475 | 9.36e-05      | 0.3689077 | 1.608412  | 0.2047606 | 1  |

Table 7: Summary of linear model



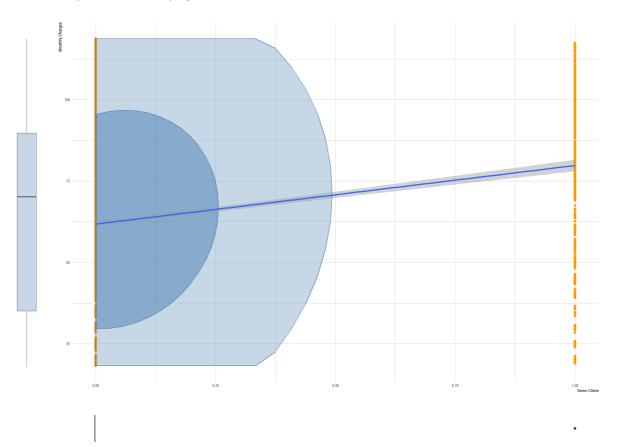


# 'Senior.Citizen' vs 'Monthly.Charges'

| first variable | second variable | r.squared | adj.r.squared | sigma    | statistic | p.value | df |
|----------------|-----------------|-----------|---------------|----------|-----------|---------|----|
| Senior.Citizen | Monthly.Charges | 0.048442  | 0.0482956     | 0.359906 | 330.7501  | 0       | 1  |

Table 7: Summary of linear model

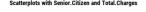


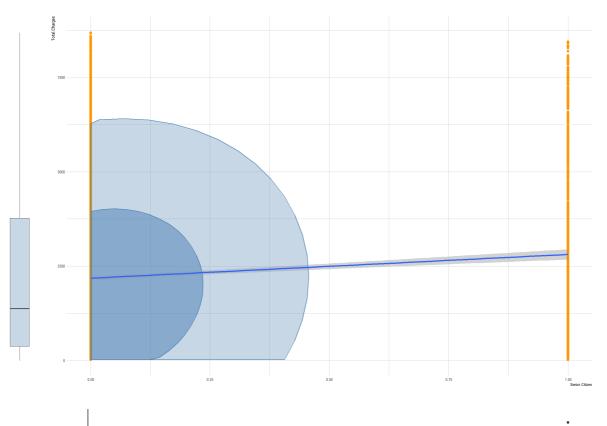


# 'Senior.Citizen' vs 'Total.Charges'

| first variable | second variable | r.squared | adj.r.squared | sigma     | statistic | p.value | df |
|----------------|-----------------|-----------|---------------|-----------|-----------|---------|----|
| Senior.Citizen | Total.Charges   | 0.0105191 | 0.0103666     | 0.3672127 | 68.97319  | 0       | 1  |

Table 7: Summary of linear model

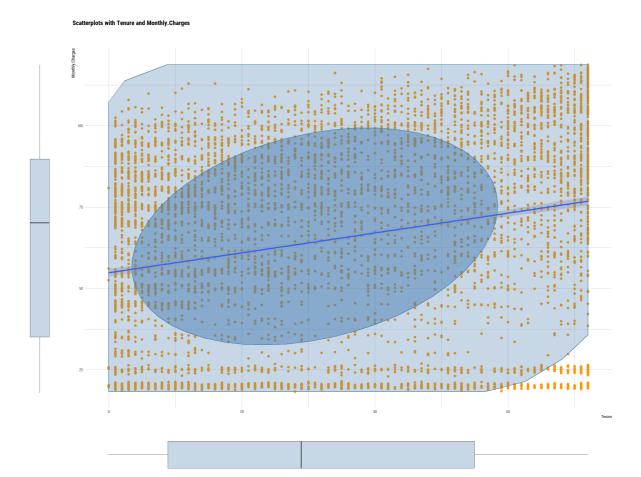




### 'Tenure' vs 'Monthly.Charges'

| first variable | second variable | r.squared | adj.r.squared | sigma    | statistic | p.value | df |
|----------------|-----------------|-----------|---------------|----------|-----------|---------|----|
| Tenure         | Monthly.Charges | 0.0619755 | 0.0618312     | 23.81252 | 429.2586  | 0       | 1  |

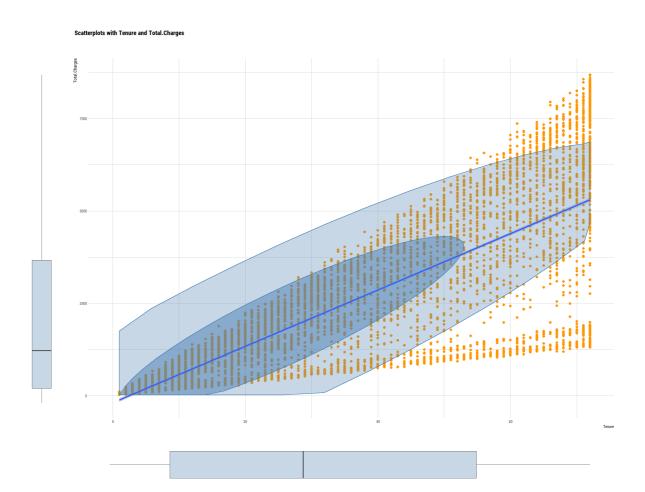
Table 7: Summary of linear model



# 'Tenure' vs 'Total.Charges'

| first variable | second variable | r.squared | adj.r.squared | sigma   | statistic | p.value | df |
|----------------|-----------------|-----------|---------------|---------|-----------|---------|----|
| Tenure         | Total.Charges   | 0.6815394 | 0.6814903     | 13.8677 | 13885.01  | 0       | 1  |

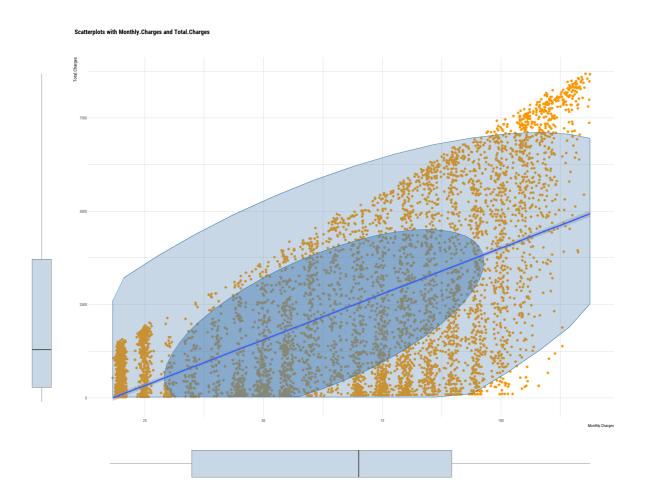
Table 7: Summary of linear model



# 'Monthly.Charges' vs 'Total.Charges'

| first variable  | second variable | r.squared | adj.r.squared | sigma    | statistic | p.value | df |
|-----------------|-----------------|-----------|---------------|----------|-----------|---------|----|
| Monthly.Charges | Total.Charges   | 0.4246978 | 0.4246091     | 22.85304 | 4789.55   | 0       | 1  |

Table 7: Summary of linear model



# **Compare Categorical Variables**

The number of categorical variables is less than 2.

# Multivariate Analysis

## **Correlation Analysis**

#### **Correlation Coefficient Matrix**

#### second variable

| first variable  | Senior.Citizen | Tenure | Monthly.Charges | Total.Charges |
|-----------------|----------------|--------|-----------------|---------------|
| Senior.Citizen  | NA             | 0.016  | 0.220           | 0.103         |
| Tenure          | 0.016          | NA     | 0.249           | 0.826         |
| Monthly.Charges | 0.220          | 0.249  | NA              | 0.652         |
| Total.Charges   | 0.103          | 0.826  | 0.652           | NA            |

Table 8: Matrix table of correlation coefficient

### **Correlation Plot**

