

```
In [1]: import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
```

```
dataset = pd.read_csv("C:/Users/sunda/Desktop/PORTFOLIO/TECH _CUSTOMER CHURN/telco.csv")
```

```
In [2]: pd.set_option('display.max_columns', None)
```

```
In [3]: dataset.head(10)
```

Out[3]:

	customerID	gender	SeniorCitizen	Partner	Dependents	tenure	PhoneService	MultipleLines	Inte
0	7590-VHVEG	Female	0	Yes	No	1	No	No	
1	5575-GNVDE	Male	0	No	No	34	Yes	No	
2	3668-QPYBK	Male	0	No	No	2	Yes	No	
3	7795-CFOCW	Male	0	No	No	45	No	No	
4	9237-HQITU	Female	0	No	No	2	Yes	No	
5	9305-CDSKC	Female	0	No	No	8	Yes	Yes	
6	1452-KIOVK	Male	0	No	Yes	22	Yes	Yes	
7	6713-OKOMC	Female	0	No	No	10	No	No	
8	7892-POOKP	Female	0	Yes	No	28	Yes	Yes	
9	6388-TABGU	Male	0	No	Yes	62	Yes	No	

In [4]: dataset.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7032 entries, 0 to 7031
Data columns (total 21 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   customerID      7032 non-null   object  
 1   gender          7032 non-null   object  
 2   SeniorCitizen   7032 non-null   int64  
 3   Partner         7032 non-null   object  
 4   Dependents     7032 non-null   object  
 5   tenure          7032 non-null   int64  
 6   PhoneService    7032 non-null   object  
 7   MultipleLines   7032 non-null   object  
 8   InternetService 7032 non-null   object  
 9   OnlineSecurity  7032 non-null   object  
 10  OnlineBackup    7032 non-null   object  
 11  DeviceProtection 7032 non-null   object  
 12  TechSupport    7032 non-null   object  
 13  StreamingTV    7032 non-null   object  
 14  StreamingMovies 7032 non-null   object  
 15  Contract        7032 non-null   object  
 16  PaperlessBilling 7032 non-null   object  
 17  PaymentMethod   7032 non-null   object  
 18  MonthlyCharges 7032 non-null   float64 
 19  TotalCharges   7032 non-null   float64 
 20  Churn          7032 non-null   object  
dtypes: float64(2), int64(2), object(17)
memory usage: 1.1+ MB
```

```
In [5]: dataset.describe()
```

```
Out[5]:
```

	SeniorCitizen	tenure	MonthlyCharges	TotalCharges
<b>count</b>	7032.000000	7032.000000	7032.000000	7032.000000
<b>mean</b>	0.162400	32.421786	64.798208	2283.300441
<b>std</b>	0.368844	24.545260	30.085974	2266.771362
<b>min</b>	0.000000	1.000000	18.250000	18.800000
<b>25%</b>	0.000000	9.000000	35.587500	401.450000
<b>50%</b>	0.000000	29.000000	70.350000	1397.475000
<b>75%</b>	0.000000	55.000000	89.862500	3794.737500
<b>max</b>	1.000000	72.000000	118.750000	8684.800000

```
In [6]: dataset.drop_duplicates(inplace =True)
```

```
In [7]: dataset.count()
```

```
Out[7]: customerID      7032  
gender          7032  
SeniorCitizen   7032  
Partner         7032  
Dependents     7032  
tenure          7032  
PhoneService    7032  
MultipleLines   7032  
InternetService 7032  
OnlineSecurity  7032  
OnlineBackup    7032  
DeviceProtection 7032  
TechSupport     7032  
StreamingTV     7032  
StreamingMovies 7032  
Contract        7032  
PaperlessBilling 7032  
PaymentMethod   7032  
MonthlyCharges  7032  
TotalCharges    7032  
Churn           7032  
dtype: int64
```

```
In [8]: dataset.isnull().sum()
```

```
Out[8]: customerID      0  
gender          0  
SeniorCitizen   0  
Partner         0  
Dependents     0  
tenure          0  
PhoneService    0  
MultipleLines   0  
InternetService 0  
OnlineSecurity  0  
OnlineBackup    0  
DeviceProtection 0  
TechSupport     0  
StreamingTV     0  
StreamingMovies 0  
Contract        0  
PaperlessBilling 0  
PaymentMethod   0  
MonthlyCharges  0  
TotalCharges    0  
Churn           0  
dtype: int64
```

```
In [9]: dataset.columns
```

```
Out[9]: Index(['customerID', 'gender', 'SeniorCitizen', 'Partner', 'Dependents',  
       'tenure', 'PhoneService', 'MultipleLines', 'InternetService',  
       'OnlineSecurity', 'OnlineBackup', 'DeviceProtection', 'TechSupport',  
       'StreamingTV', 'StreamingMovies', 'Contract', 'PaperlessBilling',  
       'PaymentMethod', 'MonthlyCharges', 'TotalCharges', 'Churn'],  
       dtype='object')
```

```
In [10]: dataset.isnull().values.any()
```

```
Out[10]: np.False_
```

```
In [11]: ##FOUND OUT  
##astype(int)  
##dataset[newcolumn] = np.where(dataset[oldcolumn] == yes, 1, 0)
```

```
In [12]: #[CALCULATED COLUMN]
```

```
## CUSTOMER LIFETIME VALUE = tenure * monthly

dataset['Customer-lifetime-value'] = dataset['MonthlyCharges'] * dataset['tenure']
print('Customer-lifetime-value')
```

```
Customer-lifetime-value
```

```
In [13]: ## TOTAL SERVICES USED BY CUSTOMERS
```

```
#CHNANGING TEXT COLUMN TO INT[YES =1, NO= 0]
##DROPPED OLDER COLUMN [INT SERVICE]

#count all services yes to 1 [then sum all of them up ]
#create a new column to add up all 1s as total services used by each customers THEN PRINT CHU
```

```
In [17]: ## REPLACING COLUMNS FROM YES TO 1
```

```
Conversion = ['PhoneService', 'InternetService', 'MultipleLines', 'OnlineSecurity', 'OnlineBackup',
              'DeviceProtection', 'TechSupport', 'StreamingTV', 'StreamingMovies']

dataset[Conversion] = dataset[Conversion].replace({'Yes':1, 'No':0})
```

```
In [18]: ##NUMBER OF SERVICES USED BY CUSTOMER
```

```
Conversion = ['PhoneService', 'InternetService', 'MultipleLines', 'OnlineSecurity', 'OnlineBackup',
              'DeviceProtection', 'TechSupport', 'StreamingTV', 'StreamingMovies']

dataset['Total_Service_Used'] = dataset[Conversion].sum(axis=1)
print(dataset[['customerID', 'Total_Service_Used', 'Churn']].head(10))
```

	customerID	Total_Service_Used	Churn
0	7590-VHVEG	2	No
1	5575-GNVDE	4	No
2	3668-QPYBK	4	Yes
3	7795-CFOCW	4	No
4	9237-HQITU	2	Yes
5	9305-CDSKC	6	Yes
6	1452-KIOVK	5	No
7	6713-OKOMC	2	No
8	7892-P0OKP	7	Yes
9	6388-TABGU	4	No

```
In [33]: ## RISK SCORE ANALYSIS/DISTRIBUTION
```

```
dataset['Risk_score'] = 0
dataset.loc[dataset['tenure'] < 12, 'Risk_score'] += 30
dataset.loc[dataset['Contract'] == 'Month-to-Month', 'Risk_score'] += 25
dataset.loc[dataset['MonthlyCharges'] > 70, 'Risk_score'] += 20
dataset.loc[dataset['Total_Service_Used'] < 3, 'Risk_score'] += 15
dataset.loc[dataset['TechSupport'] == 0, 'Risk_score'] += 10
```

```
dataset['Risk_Category'] = 'Low Risk'
dataset.loc[dataset['Risk_score'] >= 40, 'Risk_Category'] = 'Medium Risk'
dataset.loc[dataset['Risk_score'] >= 70, 'Risk_Category'] = 'High Risk'
```

```
In [34]: print(dataset[['Risk_score', 'Risk_Category', 'Churn']].head(20))
```

```
Risk_score Risk_Category Churn
0           55   Medium Risk    No
1            10   Low Risk     No
2            40   Medium Risk   Yes
3             0   Low Risk     No
4            75   High Risk    Yes
5            60   Medium Risk   Yes
6            30   Low Risk     No
7            55   Medium Risk   No
8            20   Low Risk    Yes
9            10   Low Risk     No
10           10   Low Risk     No
11           25   Low Risk     No
12           30   Low Risk     No
13           30   Low Risk    Yes
14           20   Low Risk     No
15           20   Low Risk     No
16           25   Low Risk     No
17           30   Low Risk     No
18           30   Low Risk    Yes
19           30   Low Risk     No
```

```
In [35]: print(dataset['Risk_Category'].value_counts())
```

```
Risk_Category
Low Risk      5081
Medium Risk    1861
High Risk       90
Name: count, dtype: int64
```

```
In [36]: #risk_analysis = dataset.groupby('Risk_Category')['Churn'].apply(lambda x: (x == 'Yes').sum())
#print(risk_analysis)
```

```
#or
```

```
dataset.groupby('Risk_Category')['Churn'].apply(lambda x: (x == 'Yes').sum() / len(x) * 100).
```

```
Out[36]: Risk_Category
High Risk      61.11
Low Risk       17.63
Medium Risk    49.33
Name: Churn, dtype: float64
```

```
In [37]: "I created a risk scoring model that assigns points based on 5 key churn indicators.
Customers scoring 70+ are flagged as High Risk - they have a 41% churn rate
vs
39% for Low Risk customers and keeping an eye on 19% for medium risk customers.
The company can now proactively target these
31 High Risk customers
and
2599 medium risk customers
with retention offers before they leave."
```

Cell In[37], line 1

"I created a risk scoring model that assigns points based on 5 key churn indicators.

^

SyntaxError: unterminated string literal (detected at line 1)

```
In [38]: #STATISTICAL ANALYSIS IN PYTHON
#CORRELATION ANALYSIS
```

```
dataset['TotalCharges'] = pd.to_numeric(dataset['TotalCharges'], errors = 'coerce')
dataset['TotalCharges'] = dataset['TotalCharges'].fillna(0)
```

```
dataset['Churn_tonumber'] = dataset['Churn'].replace({'Yes': 1, 'No': 0})
```

```

number_cols = ['tenure', 'MonthlyCharges', 'TotalCharges', 'Churn_tonumber']

correlation = dataset[number_cols].corr()
print(correlation.round(2))

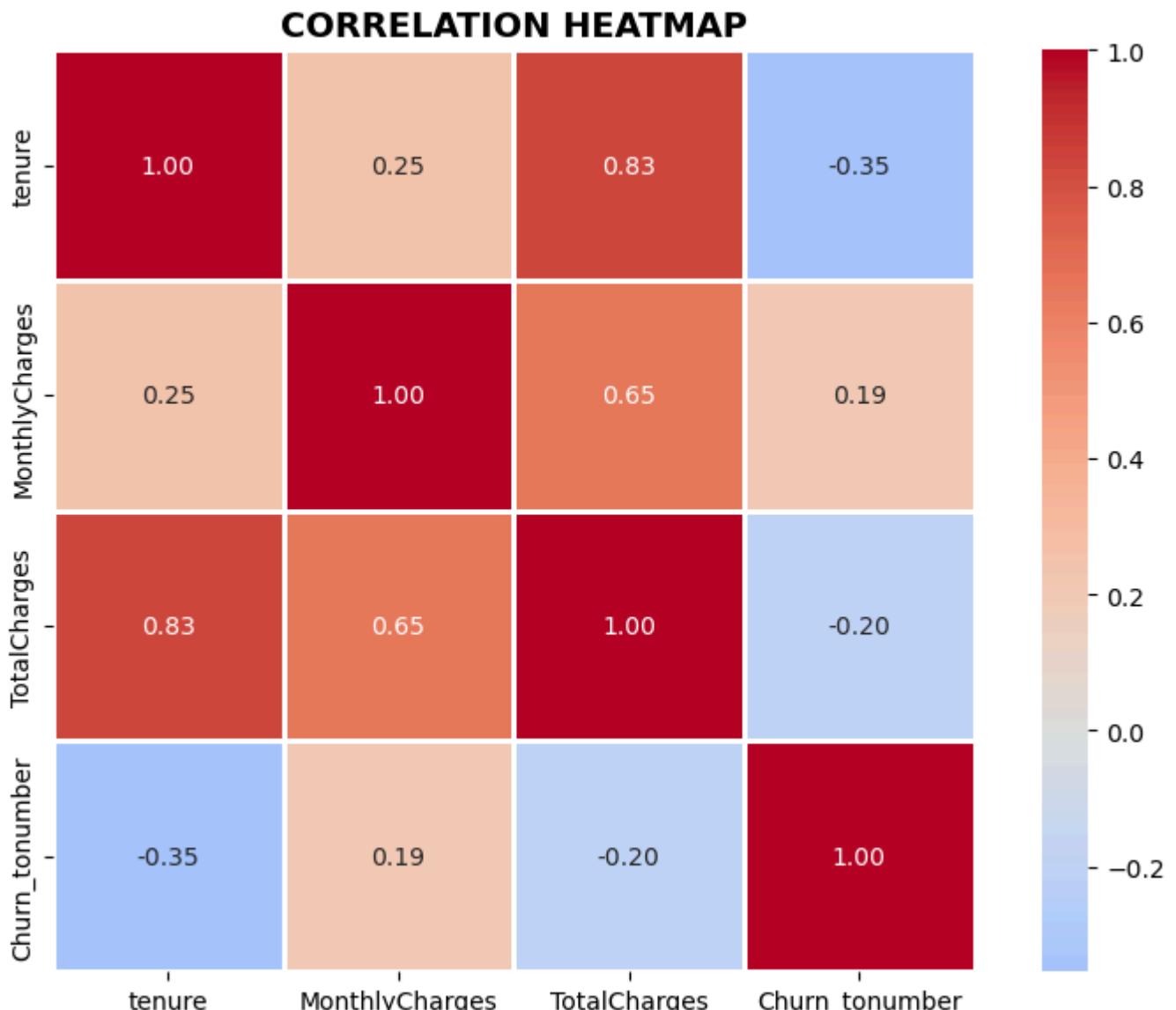
```

	tenure	MonthlyCharges	TotalCharges	Churn_tonumber
tenure	1.00	0.25	0.83	-0.35
MonthlyCharges	0.25	1.00	0.65	0.19
TotalCharges	0.83	0.65	1.00	-0.20
Churn_tonumber	-0.35	0.19	-0.20	1.00

```
C:\Users\sunda\AppData\Local\Temp\ipykernel_3700\1970231681.py:8: FutureWarning: Downcasting behavior in `replace` is deprecated and will be removed in a future version. To retain the old behavior, explicitly call `result.infer_objects(copy=False)`. To opt-in to the future behavior, set `pd.set_option('future.no_silent_downcasting', True)`
dataset['Churn_tonumber'] = dataset['Churn'].replace({'Yes': 1, 'No': 0})
```

```
In [39]: plt.figure(figsize=(8,6))
sns.heatmap(correlation, annot=True, cmap='coolwarm', center=0, square=True, linewidths =1, fmt='.2f')
plt.title('CORRELATION HEATMAP', fontsize=14, fontweight='bold')
plt.tight_layout()
plt.savefig('correlation_heatmap.png')
plt.show()

print('Heatmap saved')
```



Heatmap saved

```
In [40]: WHAT EACH PARAMETER DOES:
ParameterWhat It Doesannot=TrueShows the numbers inside boxescmap='coolwarm'Red = positive, B
WHAT YOU'LL SEE:
```

A colored grid **with** numbers showing relationships

Red boxes = positive correlation

Blue boxes = negative correlation

White boxes = no correlation

Cell In[40], line 2

Parameter What It Does  
annotation=What Shows the numbers inside boxes  
center=center Makes 0 white (neutral)  
cmap=cmap='coolwarm' Red = positive  
fmt=fmt='.{2f}' Shows 2 decimals (0.35 not 0.353456)  
square=square=True Makes boxes perfect squares  
linewidths=linewidths=1 Adds borders between boxes

^

SyntaxError: invalid decimal literal

In [41]:

#DISTRIBUTIONS ANALYSIS

```
# Distribution of Monthly Charges
plt.figure(figsize=(8, 5))
plt.hist(dataset['MonthlyCharges'], bins=30, color='coral', edgecolor='black', alpha=0.7)

#mean line
plt.axvline(dataset['MonthlyCharges'].mean(), color='red', linestyle='--', linewidth=2,
            label=f'Mean: ${dataset["MonthlyCharges"].mean():.2f}')

#median line
plt.axvline(dataset['MonthlyCharges'].mean(), color='red', linestyle='--', linewidth=2,
            label=f'Mean: ${dataset["MonthlyCharges"].median():.2f}')

plt.title('Distribution of Monthly Charges')
plt.xlabel('Monthly Charges ($)')
plt.ylabel('Number of Customers')
plt.tight_layout()
plt.savefig('monthly_charges_distribution.png')
plt.legend()
plt.show()
print('chart successfully saves')
```

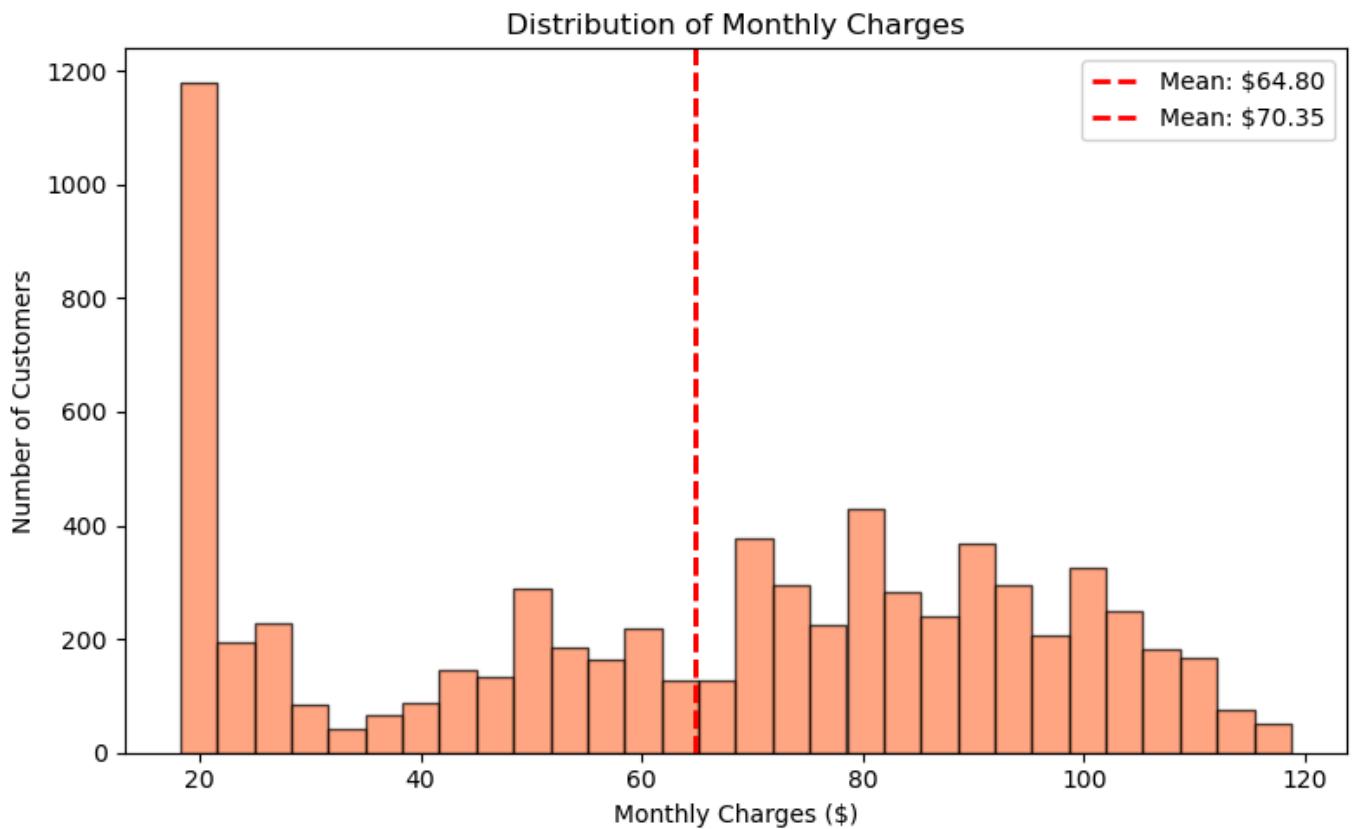


chart successfully saves

In [42]:

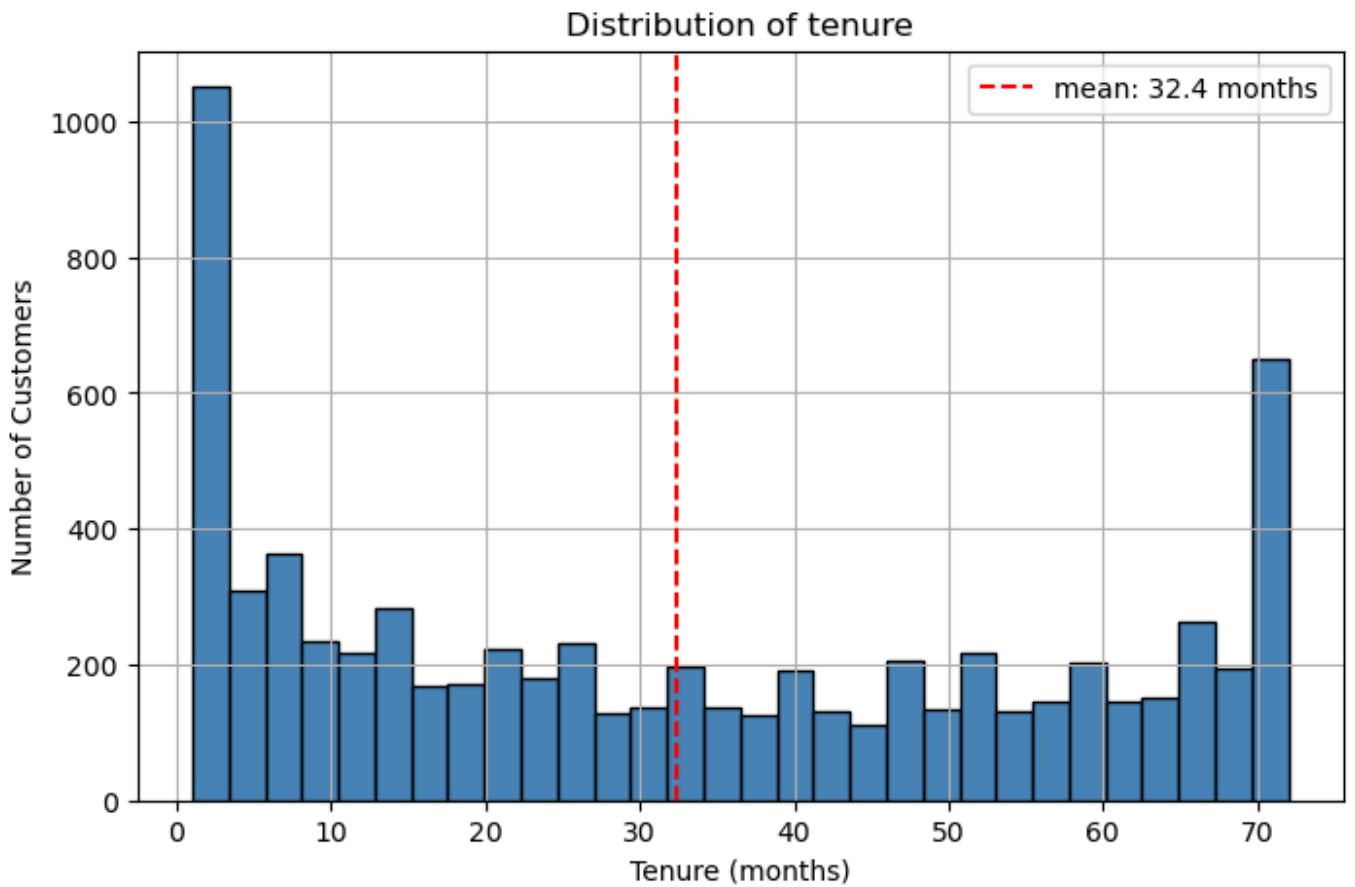
# Distribution of Tenure

```
plt.figure(figsize = (8, 5)), dataset['tenure'].hist(bins = 30, color='steelblue', edgecolor='black')
plt.title('Distribution of tenure')
```

```

plt.xlabel('Tenure (months)')
plt.ylabel('Number of Customers')
plt.axvline(dataset['tenure'].mean(), color='red', linestyle='--',
            label=f'mean: {dataset["tenure"].mean():.1f} months')
plt.legend()
plt.savefig('Distribution of tenure.png')
plt.show()

```

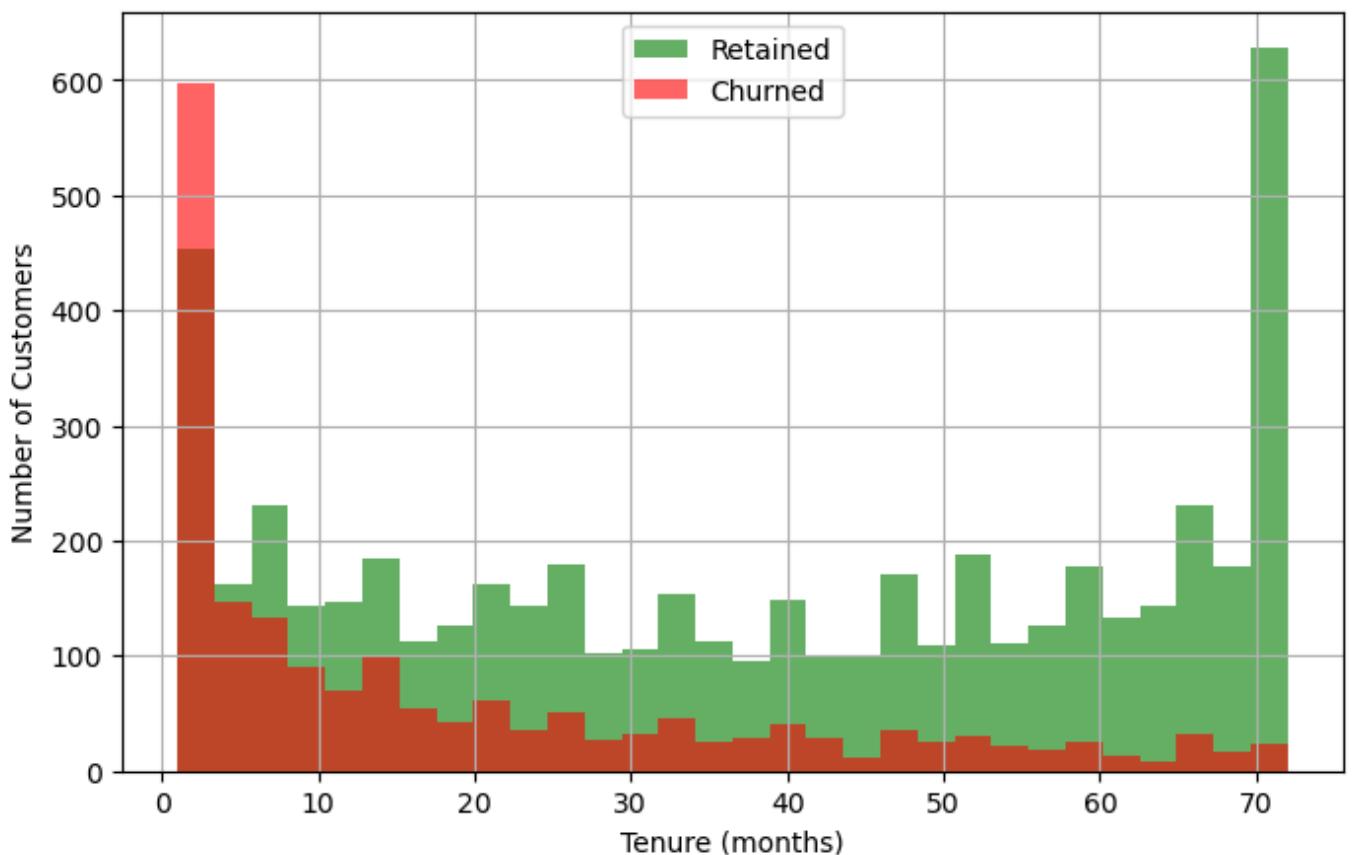


```

In [43]: # Compare Tenure: Churned vs Retained
plt.figure(figsize=(8, 5))
dataset[dataset['Churn'] == 'No']['tenure'].hist(bins=30, alpha=0.6,
                                                color='green', label='Retained')
dataset[dataset['Churn'] == 'Yes']['tenure'].hist(bins=30, alpha=0.6,
                                                color='red', label='Churned')
plt.title('Tenure: Churned vs Retained Customers')
plt.xlabel('Tenure (months)')
plt.ylabel('Number of Customers')
plt.savefig('churned vs retained customers.png')
plt.legend()
plt.show()

```

## Tenure: Churned vs Retained Customers



In [44]:

#VISUALISATIONS  
#VISUALISATIONS

```
#CHURN RATE BY TENURE
churn_percentage = dataset.groupby('tenure')[ 'Churn_tonumber'].mean() * 100
plt.figure(figsize=(12,6))

plt.plot(churn_percentage.index,churn_percentage.values,color='red', linewidth=2)
plt.title('CHURN RATE BY TENURE', fontsize=14, fontweight='bold')
plt.xlabel('TENURE (MONTHS)')
plt.ylabel('CHURN RATE (%)')

plt.axhline(churn_percentage.mean(), color='blue', linestyle='--', label=f'Average: {churn_pe

plt.legend()
plt.tight_layout()
plt.savefig('churn_by_tenure.png')
plt.show()
print('chart saved!')

print(churn_percentage.round(2))
```

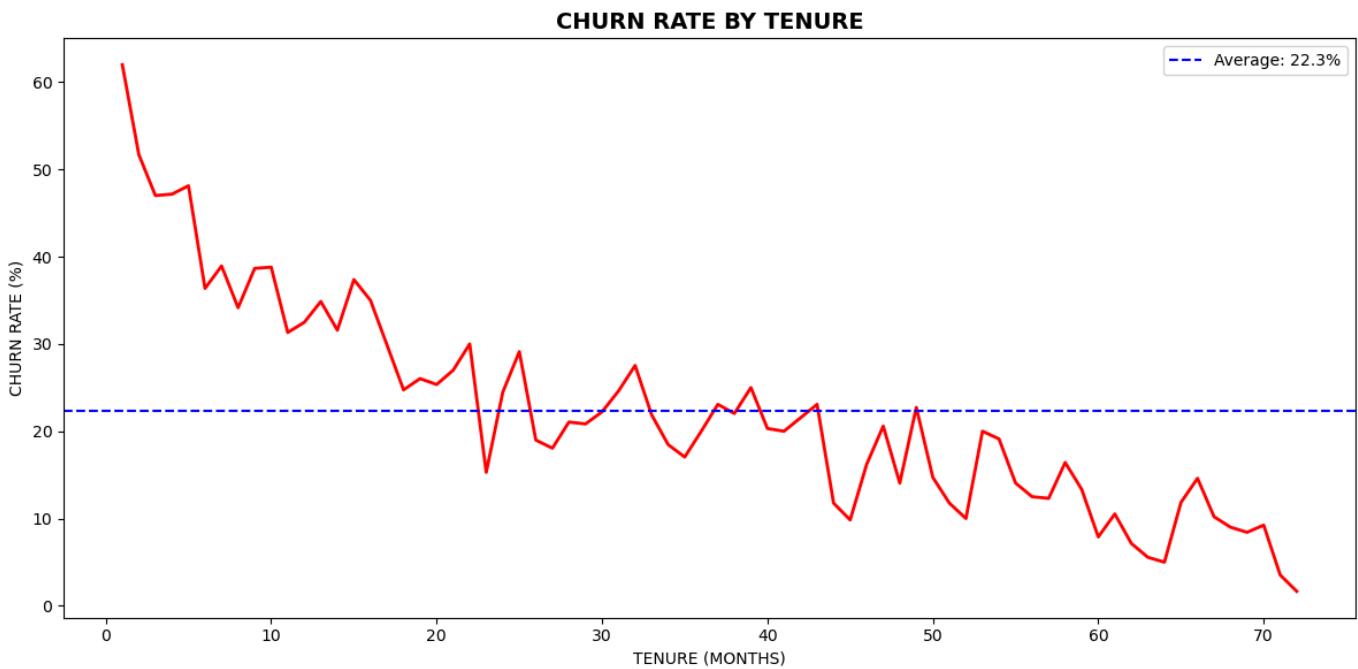


chart saved!

```
tenure
1    61.99
2    51.68
3    47.00
4    47.16
5    48.12
...
68    9.00
69    8.42
70    9.24
71    3.53
72    1.66
```

Name: Churn\_tonumber, Length: 72, dtype: float64

In [45]: #SERVICES VS CHURN(BAR-CHART)

```
Churn_by_services = dataset.groupby('Total_Service_Used')['Churn_tonumber'].mean() * 100
plt.figure(figsize=(10, 6))
plt.bar(Churn_by_services.index, Churn_by_services.values, color='steelblue', edgecolor='black')
plt.title('CHURN RATE BY NUMBER OF SERVICES')
plt.xlabel('NUMBER OF SERVICES')
plt.ylabel('CHURN RATE (%)')

for i, v in enumerate(Churn_by_services.values):
    plt.text(i, v + 1, f'{v:.1f}%', ha='center', fontweight='bold')
plt.tight_layout()
plt.savefig('services_vs_churn.png')

plt.show()

print('chart saved!')
```

#customers that used Less services churns the most.

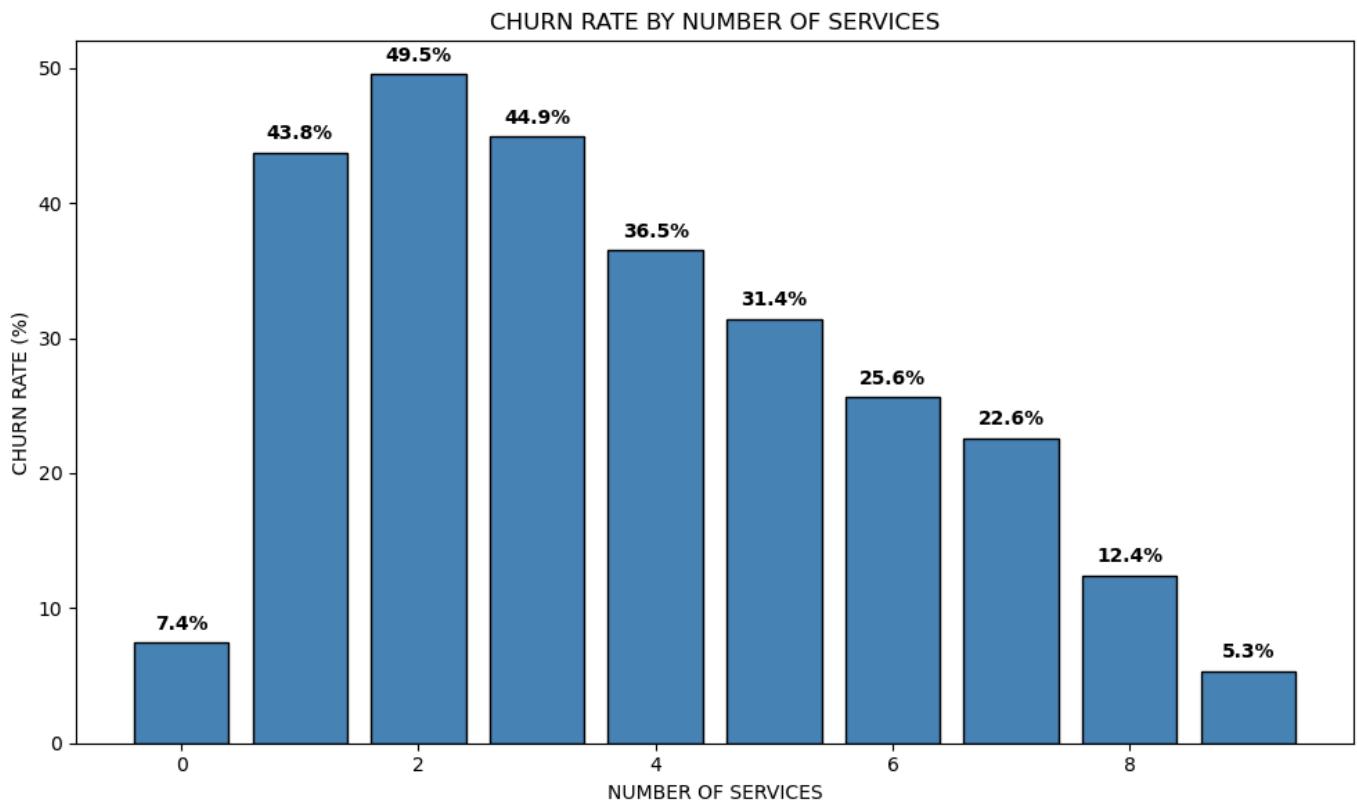


chart saved!

In [46]: #Contract type comparison (grouped bars)

```

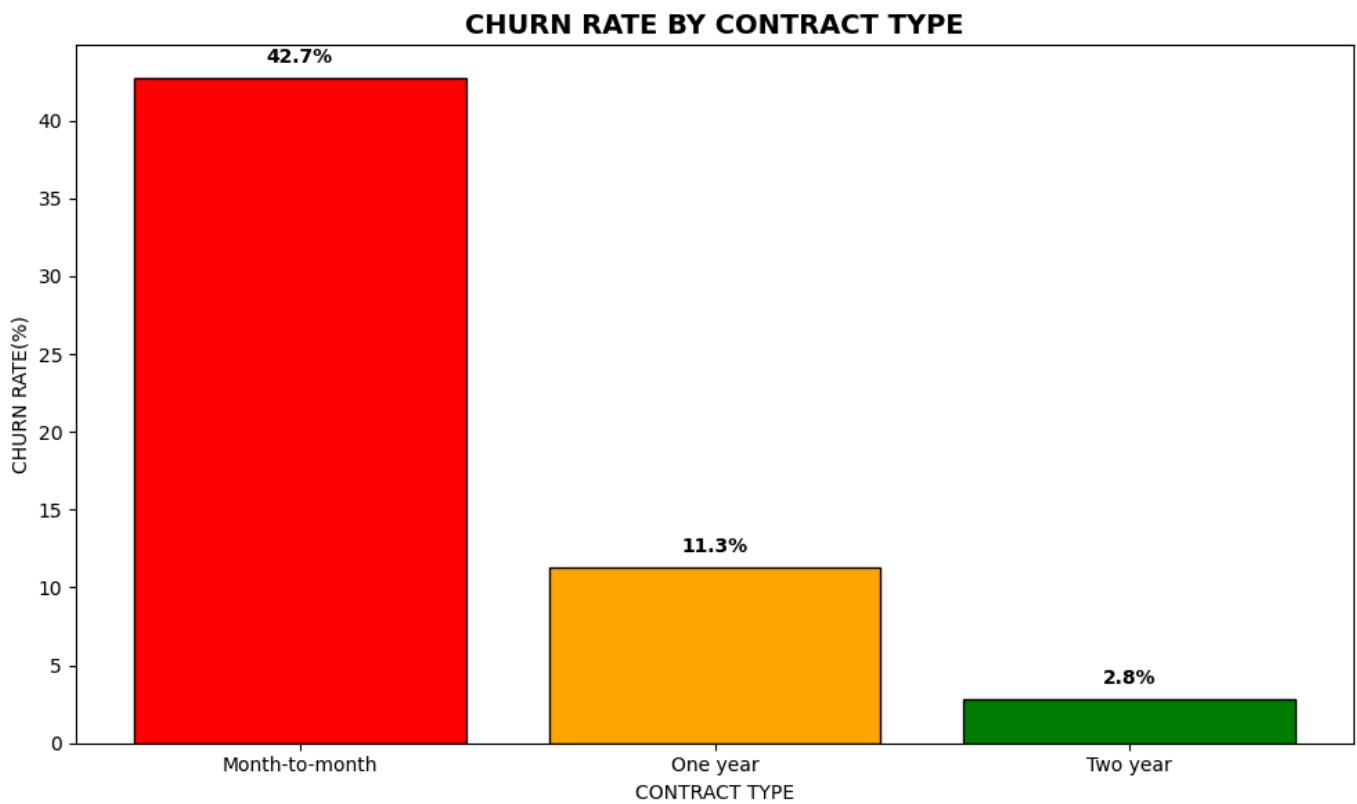
Churn_by_contract = dataset.groupby('Contract')['Churn'].apply(
    lambda x: (x == 'Yes').sum() / len(x) * 100

#or
##Churn_by_contract = dataset.groupby('Contract')[['Churn_to_number']].mean() * 100

#DRAWING GROUPED BAR CHART
plt.figure(figsize=(10,6))
plt.bar(Churn_by_contract.index, Churn_by_contract.values,
        color=['red', 'orange', 'green'], edgecolor='black')
plt.title('CHURN RATE BY CONTRACT TYPE', fontsize = 14, fontweight= 'bold')
plt.xlabel('CONTRACT TYPE')
plt.ylabel('CHURN RATE(%)')

#ADDING PERCENTAGES ON BARS
for i, v in enumerate(Churn_by_contract.values):
    plt.text(i, v + 1, f'{v:.1f}%', ha ='center', fontweight='bold')
plt.tight_layout()
plt.savefig('contract_vs_churn.png')
plt.show()
print('chart_saved')

```



chart\_saved

```
In [47]: dataset.to_csv('Cleaned_telco_python.csv', index=False)
```

In [48]: `dataset.head()`

Out[48]:

**customerID** gender SeniorCitizen Partner Dependents tenure PhoneService MultipleLines Inte

0	7590-VHVEG	Female	0	Yes	No	1	0	0
1	5575-GNVDE	Male	0	No	No	34	1	0
2	3668-QPYBK	Male	0	No	No	2	1	0
3	7795-CFOCW	Male	0	No	No	45	0	0
4	9237-HOITU	Female	0	No	No	2	1	0

A set of small, semi-transparent navigation icons located at the bottom right of the screen. From left to right, they include: a left arrow, a square, a right arrow, and a double right arrow.

In [1]:

Tn [ ]:

Tn [ ]: