```
import pandas as pd
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt
data=pd.read csv("Customer Churn.csv")
data
      customerID gender
                           SeniorCitizen Partner Dependents
                                                               tenure \
      7590 - VHVEG
                   Female
                                               Yes
                                        0
                                                                     1
1
      5575-GNVDE
                     Male
                                                                    34
                                        0
                                                            No
                                                No
2
      3668-QPYBK
                     Male
                                        0
                                                No
                                                            No
                                                                     2
3
      7795-CF0CW
                     Male
                                        0
                                                No
                                                            No
                                                                    45
4
      9237-HQITU
                                        0
                                                                     2
                  Female
                                                No
                                                            No
                                               . . .
7038
      6840-RESVB
                                        0
                                                                    24
                     Male
                                               Yes
                                                           Yes
7039
      2234-XADUH
                  Female
                                        0
                                               Yes
                                                           Yes
                                                                    72
7040 4801-JZAZL
                                                                    11
                  Female
                                        0
                                               Yes
                                                           Yes
7041 8361-LTMKD
                     Male
                                        1
                                               Yes
                                                            No
                                                                     4
7042 3186-AJIEK
                     Male
                                        0
                                                                    66
                                                No
                                                            No
     PhoneService
                       MultipleLines InternetService
OnlineSecurity 0
                No No phone service
                                                   DSL
0
No
               Yes
                                                   DSL
1
                                   No
Yes
2
                                                   DSL
               Yes
                                   No
Yes
3
                No
                    No phone service
                                                   DSL
Yes
                                           Fiber optic
4
               Yes
                                   No
No
. . .
7038
               Yes
                                                   DSL
                                  Yes
Yes
7039
               Yes
                                  Yes
                                           Fiber optic
No ...
                    No phone service
                                                   DSL
7040
                No
Yes
7041
               Yes
                                  Yes
                                           Fiber optic
No ...
7042
               Yes
                                   No
                                           Fiber optic
Yes ...
     DeviceProtection TechSupport StreamingTV StreamingMovies
Contract \
                    No
                                 No
                                              No
                                                               No
                                                                   Month-
```

to-month 1	Yes	No	No	No
One year	163	NO	NO	NO
2	No	No	No	No Month-
to-month	V	Vaa	NI -	Na
3 One year	Yes	Yes	No	No
4	No	No	No	No Month-
to-month	110	110	110	NO HOHEH
		.,		
7038	Yes	Yes	Yes	Yes
One year 7039	Yes	No	Yes	Yes
One year	165	NO	165	165
7040	No	No	No	No Month-
to-month				
7041	No	No	No	No Month-
to-month				
7042	Yes	Yes	Yes	Yes
Two year				
Paperless	sBillina	Pavi	mentMethod Mon	thlvCharges
TotalCharges		,		, J
0	Yes	Electro	onic check	29.85
29.85				F.C. 0.F
1 1889.5	No	Mai	iled check	56.95
2	Yes	Ma	iled check	53.85
108.15	103	Tid.	red eneck	33103
3	No	Bank transfer (a	automatic)	42.30
1840.75		_		
4	Yes	Electro	onic check	70.70
151.65				
• • •	• • •			
7038	Yes	Ma	iled check	84.80
1990.5				
7039	Yes	Credit card (automatic)	103.20
7362.9	.,	-1		20.50
7040	Yes	Electro	onic check	29.60
346.45 7041	Yes	Ma	iled check	74.40
306.6	163	ria.	rteu check	74.40
7042	Yes	Bank transfer (a	automatic)	105.65
6844.5		,	,	
CI-				
Churn O No				
U NU				

```
1
        No
2
       Yes
3
        No
4
       Yes
7038
        No
7039
        No
7040
        No
7041
       Yes
7042
        No
[7043 rows x 21 columns]
# Rrtreive first 10 rows
data.head(10)
   customerID gender SeniorCitizen Partner Dependents tenure
PhoneService \
  7590-VHVEG Female
                                          Yes
                                                       No
                                                           1
No
1 5575-GNVDE
                 Male
                                           No
                                                       No
                                                               34
Yes
2 3668-QPYBK
                                           No
                                                       No
                                                                2
                 Male
Yes
3
  7795-CF0CW
                 Male
                                           No
                                                       No
                                                               45
No
4 9237-HQITU
               Female
                                                                2
                                           No
                                                       No
Yes
5 9305-CDSKC
               Female
                                           No
                                                       No
                                                                8
Yes
6 1452-KI0VK
               Male
                                           No
                                                      Yes
                                                               22
Yes
7 6713-OKOMC Female
                                                       No
                                           No
                                                               10
No
8 7892-P00KP
               Female
                                          Yes
                                                       No
                                                               28
Yes
9 6388-TABGU
                 Male
                                    0
                                           No
                                                      Yes
                                                               62
Yes
      MultipleLines InternetService OnlineSecurity ...
DeviceProtection \
0 No phone service
                                 DSL
                                                 No
No
1
                 No
                                 DSL
                                                 Yes
Yes
2
                                 DSL
                 No
                                                 Yes
No
```

DSL

Fiber optic

Yes

No ...

3 No phone service

No

Yes

4

No							
5		res Fiber	optic		No		
Yes							
6	`	res Fiber	optic		No		
No							
7	No phone servi	ice	DSL		Yes		
No	,	,			11		
8		res Fiber	optic		No		
Yes		Ma	DCI		Vaa		
9		No	DSL		Yes		
No							
	echSupport Sti	reamingTV Str	eamingMov	/ies	Contract		
	erlessBilling	\					
0	No	No		No	Month-to-month		
Yes		NI -		NI -	0		
1	No	No		No	One year		
No	No	No		No	Month-to-month		
2 Yes	No	No		No	MOTICIT- CO-IIIOTICIT		
3	Yes	No		No	One year		
No	163	NO		NO	one year		
4	No	No		No	Month-to-month		
Yes		110		110	nonen co monen		
5	No	Yes		Yes	Month-to-month		
Yes							
6	No	Yes		No	Month-to-month		
Yes							
7	No	No		No	Month-to-month		
No							
8	Yes	Yes		Yes	Month-to-month		
Yes							
9	No	No		No	One year		
No							
	P:	aymentMethod	MonthlyCh	narges	TotalCharges	Churn	
0		tronic check		29.85		No	
1		Mailed check		56.95		No	
0 1 2 3		Mailed check		53.85		Yes	
3	Bank transfer	(automatic)		42.30	1840.75	No	
4		tronic check		70.76		Yes	
5		tronic check		99.65		Yes	
5 6 7 8	Credit card			89.10		No	
7		Mailed check		29.75		No	
		tronic check]	L04.80		Yes	
9	Bank transfer	(automatic)		56.15	3487.95	No	
[16	rows x 21 col	lumns]					

Check how many null value persent in our dataset. data.isnull()

	cuct	omorTD /	aandar	Contact	i+i-on	Dartner	Donandonts	
tenure		ollei in d	gender	Senior C.	rtizen	Partner	Dependents	
0		False	False		False	False	False	False
1		False	False		False	False	False	False
2		False	False		False	False	False	False
3		False	False		False	False	False	False
4		False	False		False	False	False	False
7038		False	False		False	False	False	False
7039		False	False		False	False	False	False
7040		False	False		False	False	False	False
7041		False	False		False	False	False	False
7042		False	False		False	False	False	False
0 False 1 False 2	eSecu 	eService rity False False False	. \	False False False False	Inter	netService False False False		
False		False		False		False		
False 4 False		False		False		False		
7038		False		False		False		
False 7039 False 7040 False 7041	• • •	False		False		False		
		False		False		False		
		False		False		False		
False 7042		False		False		False		

False				
	viceProtection	TechSupport	StreamingTV S	treamingMovies
Contract	-	E-1	F-1	F-1
0 False	False	False	False	False
1	False	False	False	False
False	_ ,			
2 False	False	False	False	False
3	False	False	False	False
False				
4 [2] 60	False	False	False	False
False				
		• • • • • • • • • • • • • • • • • • • •		
7038	False	False	False	False
False 7039	False	False	False	False
False	Tatse	1 a c 3 e	Tacse	racse
7040	False	False	False	False
False 7041	False	False	False	False
False	Tatse	ratse	Tatse	ratse
7042	False	False	False	False
False				
Pag	erlessBilling	PaymentMethod	MonthlyCharge	es TotalCharges
Churn	_		, ,	_
0 False	False	False	Fals	se False
1	False	False	Fals	se False
False				
2	False	False	Fals	se False
False 3	False	False	Fals	se False
False	1 4 1 3 0	1 4 6 5 6	1 4 6	14130
4	False	False	Fals	se False
False				
			•	
7038	False	False	Fals	se False
False 7039	False	False	Fals	se False
False	ratse	ratse	rats	se raise
7040	False	False	Fals	se False
False	Fol co	Fol	F-1.	Folos
7041	False	False	Fals	se False

False

```
7042
                  False
                                  False
                                                   False
                                                                  False
False
[7043 rows \times 21 columns]
data.isnull().sum()
                     0
customerID
                     0
aender
SeniorCitizen
                     0
                     0
Partner
Dependents
                     0
                     0
tenure
PhoneService
                     0
                     0
MultipleLines
InternetService
                     0
OnlineSecurity
                     0
OnlineBackup
                     0
DeviceProtection
                     0
TechSupport
                     0
StreamingTV
                     0
StreamingMovies
                     0
                     0
Contract
PaperlessBilling
                     0
PaymentMethod
                     0
MonthlyCharges
                     0
TotalCharges
                     0
Churn
dtype: int64
data.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7043 entries, 0 to 7042
Data columns (total 21 columns):
                        Non-Null Count
#
     Column
                                          Dtype
- - -
     -----
                                          _ _ _ _ _
 0
                        7043 non-null
                                          object
     customerID
 1
     gender
                        7043 non-null
                                          object
 2
     SeniorCitizen
                        7043 non-null
                                          int64
 3
                        7043 non-null
                                          object
     Partner
 4
     Dependents
                        7043 non-null
                                          obiect
 5
                        7043 non-null
                                          int64
     tenure
 6
     PhoneService
                        7043 non-null
                                          object
 7
     MultipleLines
                        7043 non-null
                                          object
 8
     InternetService
                        7043 non-null
                                          object
 9
     OnlineSecurity
                        7043 non-null
                                          object
 10
     OnlineBackup
                        7043 non-null
                                          object
 11
     DeviceProtection
                        7043 non-null
                                          object
 12
     TechSupport
                        7043 non-null
                                          object
```

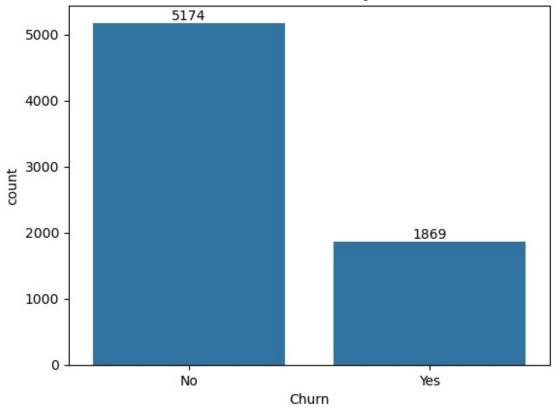
```
13
                        7043 non-null
     StreamingTV
                                         object
 14
     StreamingMovies
                        7043 non-null
                                         object
 15 Contract
                        7043 non-null
                                         object
 16 PaperlessBilling
                        7043 non-null
                                         object
 17
     PaymentMethod
                        7043 non-null
                                         object
 18
     MonthlyCharges
                        7043 non-null
                                         float64
19
                        7043 non-null
     TotalCharges
                                         object
20
                        7043 non-null
     Churn
                                         object
dtypes: float64(1), int64(2), object(18)
memory usage: 1.1+ MB
data.describe()
       SeniorCitizen
                                    MonthlyCharges
                            tenure
         7043.000000
                       7043.000000
                                        7043.000000
count
            0.162147
                         32.371149
                                          64.761692
mean
std
            0.368612
                         24.559481
                                          30.090047
min
            0.000000
                          0.000000
                                          18.250000
25%
            0.000000
                          9.000000
                                          35.500000
50%
            0.000000
                         29.000000
                                          70.350000
75%
            0.000000
                         55.000000
                                          89.850000
            1.000000
                         72.000000
                                         118.750000
max
data.shape
(7043, 21)
data["TotalCharges"]=data["TotalCharges"].replace(" ","0")
data["TotalCharges"]=data["TotalCharges"].astype("float")
data.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7043 entries, 0 to 7042
Data columns (total 21 columns):
#
     Column
                        Non-Null Count
                                         Dtype
- - -
 0
     customerID
                        7043 non-null
                                         object
 1
                        7043 non-null
                                         object
     gender
 2
     SeniorCitizen
                        7043 non-null
                                         int64
 3
     Partner
                        7043 non-null
                                         object
 4
     Dependents
                        7043 non-null
                                         object
 5
                        7043 non-null
                                         int64
     tenure
 6
     PhoneService
                        7043 non-null
                                         object
 7
                        7043 non-null
                                         object
     MultipleLines
 8
     InternetService
                        7043 non-null
                                         object
 9
                        7043 non-null
     OnlineSecurity
                                         object
 10
     OnlineBackup
                        7043 non-null
                                         object
 11
     DeviceProtection
                        7043 non-null
                                         object
 12
     TechSupport
                        7043 non-null
                                         object
 13
                        7043 non-null
     StreamingTV
                                         object
```

```
14 StreamingMovies
                       7043 non-null
                                        object
 15 Contract
                       7043 non-null
                                        object
 16 PaperlessBilling
                       7043 non-null
                                        object
 17
    PaymentMethod
                       7043 non-null
                                        object
 18 MonthlyCharges
                       7043 non-null
                                        float64
19
    TotalCharges
                       7043 non-null
                                        object
20 Churn
                       7043 non-null
                                        object
dtypes: float64(1), int64(2), object(18)
memory usage: 1.1+ MB
# Check duplicate value in datset
data.duplicated().sum()
0
# Chech duplicate based on the unique columns.
data["customerID"].duplicated().sum()
0
# In this code we change value of senior citizen if 0 (NO) and 1(Yes)
def convert(value):
    if value==1:
        return "yes"
    else:
        return "No"
data["SeniorCitizen"]=data["SeniorCitizen"].apply(convert)
data
      customerID gender SeniorCitizen Partner Dependents tenure \
0
      7590-VHVEG Female
                                     No
                                            Yes
                                                        No
                                                                  1
1
      5575 - GNVDE
                                                                 34
                    Male
                                     No
                                             No
                                                        No
2
      3668-QPYBK
                    Male
                                     No
                                             No
                                                        No
                                                                  2
3
      7795-CF0CW
                                                                 45
                    Male
                                             No
                                                        No
                                     No
4
                                                                  2
      9237-HOITU Female
                                     No
                                                        No
                                             No
                                            . . .
                                                        . . .
. . .
7038 6840-RESVB
                    Male
                                                       Yes
                                                                 24
                                     No
                                            Yes
7039
      2234-XADUH Female
                                     No
                                            Yes
                                                       Yes
                                                                 72
7040
      4801-JZAZL
                 Female
                                     No
                                            Yes
                                                       Yes
                                                                 11
7041 8361-LTMKD
                    Male
                                            Yes
                                                        No
                                                                  4
                                    yes
7042 3186-AJIEK
                    Male
                                     No
                                             No
                                                        No
                                                                 66
                      MultipleLines InternetService
     PhoneService
OnlineSecurity
               . . .
               No No phone service
                                                 DSL
0
No
                                                 DSL
              Yes
                                  No
1
Yes ...
```

2	Yes		No		DSL		
Yes	No N	lo phone	service		DSL		
Yes		·					
4	Yes		No	Fiber	optic		
No							
			• • •				
7038	Yes		Yes		DSL		
Yes							
7039	Yes		Yes	Fiber	optic		
No							
7040	No N	lo phone	service		DSL		
Yes 7041	Yes		Yes	Fiber	ontic		
No	163		163	IIDEI	optic		
7042	Yes		No	Fiber	optic		
Yes					•		
.		T 1.0		' T\/	C		
	rotectio	on Tecns	upport Stre	amingiv	StreamingMo	vies	
Contract \	N	lo	No	No		No	Month-
to-month	'	10	NO	NO		NO	Homen
1	Υe	es	No	No		No	
One year							
2	ľ	lo	No	No		No	Month-
to-month	V		Vos	No		No	
3 One year	Ye	25	Yes	No		No	
4	N	lo	No	No		No	Month-
to-month							
	.,		.,	.,			
7038	Υe	es	Yes	Yes		Yes	
One year 7039	Υe) C	No	Yes		Yes	
One year	10		NO	103		103	
7040	ľ	lo	No	No		No	Month-
to-month							
7041	1	lo	No	No		No	Month-
to-month	V		Voc	V		Vac	
7042 Two year	Ye	25	Yes	Yes		Yes	
iwo year							
PaperlessBilling PaymentMethod MonthlyCharges						S	
TotalCharges							
0	Ye	es	Electr	onic che	ck	29.8	5
29.85 1	N	lo	Ma	iled che	ck	56.9	5
1	ľ	10	ı'ld	Trea clie	CN	50.9	J

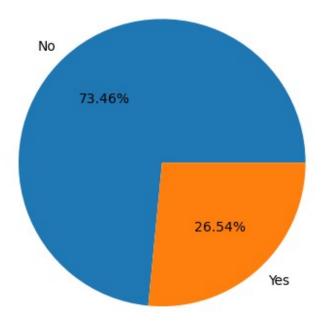
```
1889.5
                                      Mailed check
                   Yes
                                                             53.85
108.15
                    No Bank transfer (automatic)
                                                             42.30
1840.75
                   Yes
                                  Electronic check
                                                             70.70
151.65
. . .
                                                                . . .
                                      Mailed check
                                                             84.80
7038
                   Yes
1990.5
                          Credit card (automatic)
7039
                   Yes
                                                            103.20
7362.9
                                  Electronic check
7040
                   Yes
                                                             29.60
346.45
7041
                   Yes
                                      Mailed check
                                                             74.40
306.6
7042
                   Yes Bank transfer (automatic)
                                                            105.65
6844.5
     Churn
0
        No
1
        No
2
       Yes
3
        No
4
       Yes
       . . .
7038
        No
7039
        No
7040
        No
7041
       Yes
7042
        No
[7043 rows x 21 columns]
ax=sns.countplot(x = "Churn",data=data)
ax.bar label(ax.containers[0])
plt.title("Count Of Customer By Churn")
plt.show()
```

Count Of Customer By Churn



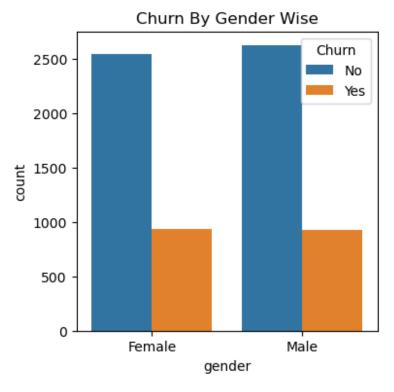
```
gb =data.groupby("Churn").agg({"Churn":"count"})
plt.pie(gb["Churn"],labels=gb.index ,autopct="%.2f%%")
plt.title("Count Of Customert By Percentage")
plt.show()
```

Count Of Customert By Percentage



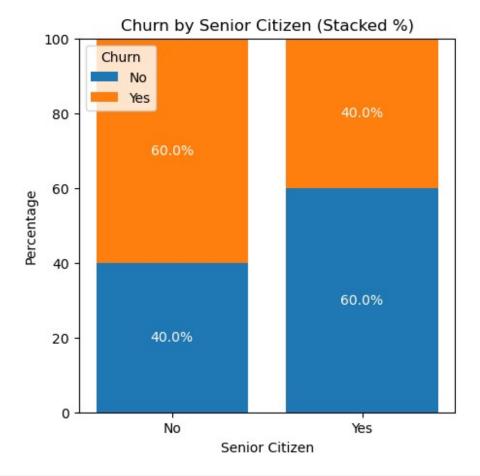
From the give pie chart we conclued 26.54 percentage of our customer have churned out.

```
plt.figure(figsize =(4,4))
sns.countplot(x="gender",data=data,hue="Churn")
plt.title("Churn By Gender Wise")
plt.show()
```

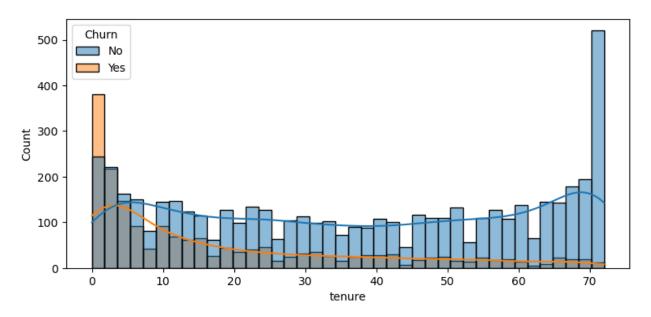


```
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
# Sample Data
data = pd.DataFrame({
    "SeniorCitizen": ["Yes", "No", "Yes", "No", "Yes", "No", "Yes",
"No", "Yes", "No"],
   "Churn": ["Yes", "No", "No", "Yes", "No", "No", "Yes", "Yes",
"No", "Yes"]
})
# Create a cross-tabulation (counts)
ct = pd.crosstab(data["SeniorCitizen"], data["Churn"])
# Convert counts to percentages
ct percent = ct.div(ct.sum(axis=1), axis=0) * 100
# Plot settings
fig, ax = plt.subplots(figsize=(5, 5))
# Define bar positions
bottom values = [0] * len(ct_percent) # Initial bottom positions
# Plot stacked bars
for churn status in ct percent.columns:
    bars = plt.bar(ct_percent.index, ct_percent[churn_status],
```

```
bottom=bottom_values, label=churn_status)
    # Add percentage labels
    for bar in bars:
        height = bar.get height()
        if height > 0:
            plt.text(
                bar.get_x() + bar.get_width() / 2, # X Position
                bar.get_y() + height / 2, # Y Position
                f"{height:.1f}%",
                                                  # Label as
percentage
                ha="center", va="center", fontsize=10, color="white"
            )
    # Update bottom values for stacking
    bottom values += ct percent[churn status]
# Title & Label
plt.title("Churn by Senior Citizen (Stacked %)")
plt.xlabel("Senior Citizen")
plt.ylabel("Percentage")
plt.legend(title="Churn")
plt.ylim(0, 100) # Limit Y-axis to 100%
plt.show()
```

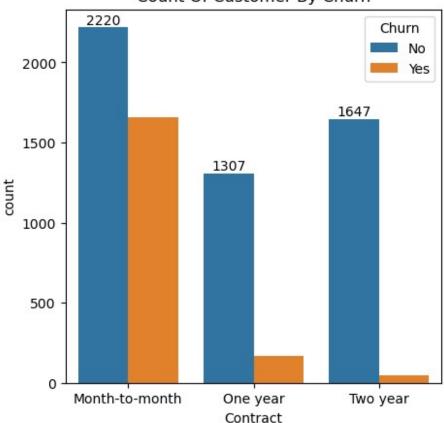


```
plt.figure(figsize=(9,4))
sns.histplot(x="tenure", data=data, bins=40, kde=True,
color="blue",hue="Churn")
plt.show()
```



```
plt.figure(figsize=(5,5))
ax=sns.countplot(x = "Contract",data=data,hue="Churn")
ax.bar_label(ax.containers[0])
plt.title("Count Of Customer By Churn")
plt.show()
```

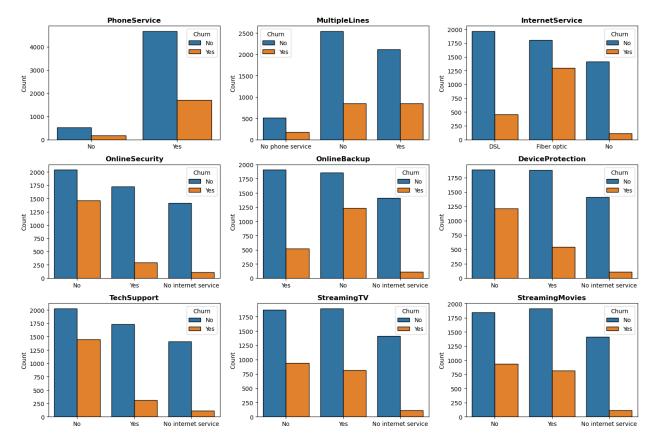
Count Of Customer By Churn



```
data.columns.values
array(['customerID', 'gender', 'SeniorCitizen', 'Partner',
    'Dependents',
        'tenure', 'PhoneService', 'MultipleLines', 'InternetService',
        'OnlineSecurity', 'OnlineBackup', 'DeviceProtection',
        'TechSupport', 'StreamingTV', 'StreamingMovies', 'Contract',
        'PaperlessBilling', 'PaymentMethod', 'MonthlyCharges',
        'TotalCharges', 'Churn'], dtype=object)

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

```
1
# Set up subplots
num cols = 3 # Number of columns in subplot grid
num rows = -(-len(columns) // num cols) # Calculate required rows
fig, axes = plt.subplots(num rows, num cols, figsize=(15, 10))
axes = axes.flatten() # Flatten the 2\overline{D} array of axes to 1D for easy
iteration
# Loop through columns and create count plots
for i, col in enumerate(columns):
    sns.countplot(data=data, x=col, ax=axes[i],
edgecolor="black", hue=data["Churn"])
    axes[i].set_title(col, fontsize=12, fontweight="bold")
    axes[i].set xlabel("")
    axes[i].set_ylabel("Count")
    axes[i].tick params(axis='x') # Rotate x labels if needed
# Remove any empty subplots (if the number of columns is not a perfect
multiple of num cols)
for j in range(i + 1, len(axes)):
    fig.delaxes(axes[j])
# Adjust layout
plt.tight_layout()
plt.show()
```



Customers without OnlineSecurity, OnlineBackup, and TechSupport have a higher churn rate. Fiber optic users churn more than DSL users. PhoneService doesn't show a strong churn impact, but having additional services seems to reduce churn.

```
plt.figure(figsize=(6,4))
ax=sns.countplot(x = "PaymentMethod",data=data,hue="Churn")
ax.bar_label(ax.containers[0])
ax.bar_label(ax.containers[1])
plt.title("Churned Customer By Payment Method")
plt.xticks(rotation=20)
plt.show()
```

