```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
df = pd.read csv(r"C:\Users\NISHA\Desktop\python\import files\Customer
Churn.csv")
df.head()
   customerID gender SeniorCitizen Partner Dependents tenure
PhoneService \
               Female
  7590 - VHVEG
                                                                1
                                          Yes
                                                       No
No
1 5575-GNVDE
                 Male
                                    0
                                           No
                                                       No
                                                               34
Yes
2 3668-QPYBK
                                                                2
                 Male
                                           No
                                                       No
Yes
3 7795-CF0CW
                                                               45
                 Male
                                           No
                                                       No
No
4 9237-HQITU Female
                                    0
                                           No
                                                       No
                                                                2
Yes
      MultipleLines InternetService OnlineSecurity ...
DeviceProtection
0 No phone service
                                 DSL
                                                 No
No
                                 DSL
                                                Yes ...
1
                 No
Yes
2
                 No
                                 DSL
                                                Yes
No
3 No phone service
                                 DSL
                                                Yes ...
Yes
                        Fiber optic
4
                 No
                                                 No ...
No
  TechSupport StreamingTV StreamingMovies
                                                  Contract
PaperlessBilling \
           No
                        No
                                        No
                                            Month-to-month
Yes
           No
                        No
                                                  One year
1
                                        No
No
2
           No
                        No
                                            Month-to-month
                                        No
Yes
3
          Yes
                        No
                                        No
                                                  One year
No
           No
                                            Month-to-month
4
                        No
                                        No
Yes
               PaymentMethod MonthlyCharges TotalCharges Churn
0
            Electronic check
                                       29.85
                                                      29.85
                                                               No
```

```
1
                 Mailed check
                                        56.95
                                                      1889.5
                                                                 No
2
                                        53.85
                 Mailed check
                                                      108.15
                                                                Yes
3
   Bank transfer (automatic)
                                        42.30
                                                     1840.75
                                                                 No
            Electronic check
                                        70.70
                                                      151.65
                                                                Yes
[5 rows x 21 columns]
df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7043 entries, 0 to 7042
Data columns (total 21 columns):
                        Non-Null Count
#
     Column
                                         Dtype
 0
                                         object
     customerID
                        7043 non-null
 1
     gender
                        7043 non-null
                                         object
 2
     SeniorCitizen
                        7043 non-null
                                         int64
 3
                        7043 non-null
                                         object
     Partner
                        7043 non-null
 4
     Dependents
                                         object
 5
                        7043 non-null
                                         int64
     tenure
 6
                        7043 non-null
     PhoneService
                                         object
 7
     MultipleLines
                        7043 non-null
                                         object
 8
     InternetService
                        7043 non-null
                                         object
 9
     OnlineSecurity
                        7043 non-null
                                         object
                        7043 non-null
 10
     OnlineBackup
                                         object
     DeviceProtection
                        7043 non-null
 11
                                         object
 12
    TechSupport
                        7043 non-null
                                         object
 13
     StreamingTV
                        7043 non-null
                                         object
 14
     StreamingMovies
                        7043 non-null
                                         object
                        7043 non-null
 15
     Contract
                                         object
 16
    PaperlessBilling
                        7043 non-null
                                         object
     PaymentMethod
 17
                        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
df["TotalCharges"] = df["TotalCharges"].replace("
", "0", regex=True).astype("float")
df[df["TotalCharges"] == 0]
                           SeniorCitizen Partner Dependents
                                                                       \
      customerID
                   gender
                                                               tenure
488
      4472-LVYGI
                   Female
                                        0
                                               Yes
                                                          Yes
                                                                     0
                                        0
753
      3115-CZMZD
                     Male
                                               No
                                                          Yes
                                                                     0
                                                                     0
936
                                        0
                                               Yes
      5709 - LV0EQ
                   Female
                                                          Yes
1082
      4367-NUYA0
                     Male
                                        0
                                               Yes
                                                          Yes
                                                                     0
1340
      1371-DWPAZ
                                        0
                                               Yes
                                                          Yes
                                                                     0
                   Female
3331
      7644-0MVMY
                     Male
                                        0
                                               Yes
                                                          Yes
                                                                     0
```

4380 25 5218 29 6670 46	213-VVOLG 520-SGTTA 923-ARZLG 975-WKNIU 975-SEFEE	Male Female Male Female Male		0 Yes 0 Yes 0 Yes 0 Yes 0 Yes 0 No	Yes Yes Yes	6 0 6 0 6 0
	Yes Yes Yes No	\ No phone	pleLines In service No No Yes service No Yes No Yes No Yes	nternetSer	DSL No No in DSL No No in DSL No No in No No in No No in	nternet nternet nternet nternet nternet
No 6754 Yes	Yes		Yes		DSL	
936 1082 No 1340 3331 No 3826 No 4380 No	DevicePro internet internet internet internet internet internet	Yes service Yes service service service	No internet No internet No internet No internet No internet No internet	No t service Yes t service t service t service	No interne No interne No interne No interne No interne No interne	Yes et service et service et service et service
936	Streamin internet internet	service Yes	Contract Pa Two year Two year Two year Two year Two year	aperlessBi	lling \ Yes No No No No No	

```
3331
      No internet service
                            Two year
                                                     No
3826
      No internet service
                                                     No
                            Two year
4380
      No internet service
                            Two year
                                                     No
5218
                                                    Yes
      No internet service
                             One year
6670
                            Two year
                                                     No
6754
                        No
                            Two year
                                                    Yes
                   PaymentMethod MonthlyCharges
                                                   TotalCharges
                                                                  Churn
488
      Bank transfer (automatic)
                                            52.55
                                                             0.0
                                                                     No
753
                                                             0.0
                    Mailed check
                                           20.25
                                                                     No
936
                    Mailed check
                                           80.85
                                                             0.0
                                                                     No
1082
                    Mailed check
                                           25.75
                                                             0.0
                                                                     No
1340
        Credit card (automatic)
                                           56.05
                                                             0.0
                                                                     No
3331
                                                             0.0
                    Mailed check
                                           19.85
                                                                     No
3826
                    Mailed check
                                           25.35
                                                             0.0
                                                                     No
4380
                    Mailed check
                                                             0.0
                                           20.00
                                                                     No
5218
                    Mailed check
                                           19.70
                                                             0.0
                                                                     No
6670
                    Mailed check
                                           73.35
                                                             0.0
                                                                     No
6754
                                           61.90
      Bank transfer (automatic)
                                                             0.0
                                                                     No
[11 rows x 21 columns]
df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7043 entries, 0 to 7042
Data columns (total 21 columns):
#
     Column
                        Non-Null Count
                                         Dtype
 0
                                         object
     customerID
                        7043 non-null
 1
     aender
                        7043 non-null
                                         object
 2
     SeniorCitizen
                        7043 non-null
                                         int64
 3
     Partner
                        7043 non-null
                                         object
 4
     Dependents
                        7043 non-null
                                         object
 5
                        7043 non-null
     tenure
                                         int64
 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
                        7043 non-null
     OnlineBackup
                                         object
 11
     DeviceProtection
                        7043 non-null
                                         object
 12
     TechSupport
                        7043 non-null
                                         object
 13
     StreamingTV
                        7043 non-null
                                         object
 14
     StreamingMovies
                        7043 non-null
                                         object
 15
     Contract
                        7043 non-null
                                         object
 16
     PaperlessBilling
                        7043 non-null
                                         object
                        7043 non-null
 17
     PaymentMethod
                                         object
 18
                        7043 non-null
                                         float64
     MonthlyCharges
 19
     TotalCharges
                        7043 non-null
                                         float64
                        7043 non-null
 20
     Churn
                                         object
```

```
dtypes: float64(2), int64(2), object(17)
memory usage: 1.1+ MB
df.isnull().sum().sum()
0
df.describe()
       SeniorCitizen
                            tenure
                                    MonthlyCharges
                                                     TotalCharges
                                        7043.000000
                                                      7043.000000
         7043.000000
                       7043.000000
count
mean
            0.162147
                         32.371149
                                          64.761692
                                                      2279.734304
            0.368612
                         24.559481
                                          30.090047
                                                      2266.794470
std
                          0.000000
                                          18.250000
min
            0.000000
                                                         0.000000
25%
            0.000000
                          9.000000
                                          35.500000
                                                       398.550000
                                          70.350000
            0.000000
                         29.000000
                                                      1394.550000
50%
75%
            0.000000
                         55.000000
                                         89.850000
                                                      3786.600000
                         72,000000
                                         118.750000
                                                      8684.800000
max
            1.000000
df["customerID"].duplicated().sum()
0
def conv(value):
    if value == 1:
        return "Yes"
    else:
        return "No"
df["SeniorCitizen"] = df["SeniorCitizen"].apply(conv)
```

converted 0 and 1 values of senior citizen to yes/no to make it easier to understand

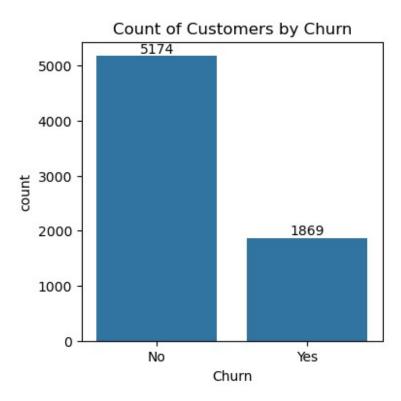
```
df[df["SeniorCitizen"] == "Yes"]
                   gender SeniorCitizen Partner Dependents
      customerID
                                                               tenure \
20
      8779 - QRDMV
                                     Yes
                     Male
                                               No
                                                           No
                                                                    1
                                                                   71
30
      3841-NFECX
                  Female
                                     Yes
                                              Yes
                                                           No
31
      4929-XIHVW
                                     Yes
                                                           No
                     Male
                                              Yes
                                                                    2
34
      3413-BMNZE
                                                                    1
                     Male
                                     Yes
                                               No
                                                           No
50
                                                                   43
      8012-SOUDQ
                   Female
                                     Yes
                                               No
                                                           No
. . .
7023
      1035-IPQPU
                   Female
                                     Yes
                                              Yes
                                                           No
                                                                   63
7029
      2235-DWLJU
                                     Yes
                   Female
                                               No
                                                           No
                                                                    6
      3605-JISKB
                                                                   55
7031
                     Male
                                     Yes
                                              Yes
                                                           No
7032
                     Male
                                     Yes
                                                                    1
      6894-LFHLY
                                               No
                                                           No
7041 8361-LTMKD
                                              Yes
                     Male
                                     Yes
                                                           No
     PhoneService
                       MultipleLines InternetService
OnlineSecurity
20
                                                   DSL
                No No phone service
```

30	No					
31	30	Yes	Yes	Fiber	optic	
No 34		Yes	No	Fiber	optic	
No 50	No					
50 Yes Yes Fiber optic No		Yes	No		DSL	
		Yes	Yes	Fiber	optic	
Total Test Test Test Test Test Test Test Test	No				•	
No 7029 No No phone service DSL No 7031 Yes Yes DSL Yes 7032 Yes Yes Fiber optic No 7041 Yes Yes Fiber optic No DeviceProtection TechSupport StreamingTV StreamingMovies Contract \ 20 Yes No No Yes Month- to-month 30 Yes Yes No Yes Yes Month- to-month 31 Yes No Yes Yes Month- to-month 50 No No No No No Month- to-month 50 No No No Yes No Month- to-month 50 No No Yes No Month- to-month 50 No No Yes Yes Month- to-month 7023 Yes No Yes Yes Month- to-month 7029 No No Yes Yes Month- to-month 7029 No No Yes Yes Month- to-month 7029 No No No Yes Yes Month- to-month 7031 No No No No No No One year 7032 No No No No No No No One year 7032 No No No No No No Month- to-month 7041 No No No No No No Month- to-month 7041 No No No No No Month- to-month 7041 No No No No No Month- to-month						
7029 No No phone service DSL No 7031 Yes Yes DSL Yes 7032 Yes Yes Fiber optic No 7041 Yes Yes Fiber optic No DeviceProtection TechSupport StreamingTV StreamingMovies Contract \ 20 Yes No No Yes Month- to-month 30 Yes Yes No Yes Yes Month- to-month 34 No No No Yes Yes Month- to-month 50 No No Yes No Month- to-month 50 No No Yes No Month- to-month 50 No No Yes Yes Month- to-month 7023 Yes No Yes Yes Month- to-month 7029 No No Yes Yes Month- to-month 7031 No No No Yes Yes Month- to-month 7031 No No No No No No No One year 7032 No No No No No No No Month- to-month 7031 No No No No No No No Month- to-month 7041 No No No No No No Month- to-month 7041 No No No No No No Month- to-month 7041 No No No No No No Month- to-month	7023	Yes	Yes	Fiber	optic	
No 7031 Yes Yes Piber optic 7032 Yes Yes Fiber optic No 7041 Yes Yes Fiber optic No DeviceProtection TechSupport StreamingTV StreamingMovies Contract \ 20 Yes No No Yes Month- to-month 30 Yes Yes No Yes Yes Month- to-month 31 Yes No Yes Yes Month- to-month 50 No No No Yes Yes Month- to-month 50 No No Yes No Month- to-month 50 No No Yes No Month- to-month 7023 Yes No Yes Yes Month- to-month 7029 No No Yes Yes Month- to-month 7031 No No Yes Yes Month- to-month 7031 No No No No No No One year 7032 No No No No No No No One year 7032 No No No No No No Month- to-month 7041 No No No No No No Month- to-month 7041 No No No No No No Month- to-month 7041 No No No No No Month- to-month					DCI	
7031 Yes Yes Piber optic Yes 7032 Yes Yes Fiber optic No 7041 Yes Yes Fiber optic No DeviceProtection TechSupport StreamingTV StreamingMovies Contract \ 20 Yes No No Yes Month- to-month 30 Yes Yes No Yes Yes Month- to-month 34 No No No Yes Yes Month- to-month 50 No No Yes No Month- to-month 50 No No Yes No Month- to-month 7023 Yes No Yes Yes Month- to-month 7029 No No No Yes Yes Month- to-month 7031 No No No Yes Yes Month- to-month 7031 No No No No No No No One year 7032 No No No No No No No One year 7032 No No No No No No No One year 7031 No No No No No No No Month- to-month 7041 No No No No No No Month- to-month 7041 No No No No No No Month- to-month 7041 No No No No No Month- to-month		NO NO I	ohone service		DSL	
7032 Yes Yes Fiber optic No 7041 Yes Yes Fiber optic No DeviceProtection TechSupport StreamingTV StreamingMovies Contract \ 20 Yes No No No Yes Month- to-month 30 Yes Yes No Yes Yes Month- to-month 31 Yes No Yes Yes Month- to-month 34 No No No No No Month- to-month 50 No No Yes No Month- to-month 7023 Yes No Yes Yes Month- to-month 7029 No No Yes Yes Month- to-month 7031 No No Yes Yes Month- to-month 7031 No One year 7032 No No No No No No No No Month- to-month 7031 No No No No No No Month- to-month 7041 No No No No No Month- to-month		Yes	Yes		DSL	
No 7041 Yes Yes Fiber optic No DeviceProtection TechSupport StreamingTV StreamingMovies Contract \ 20 Yes No No Yes Month- to-month 30 Yes Yes No Yes Yes Month- to-month 34 No No No No No Month- to-month 50 No No No Yes No Month- to-month 50 No No Yes No Month- to-month 7023 Yes No Yes Yes Month- to-month 7029 No No Yes Yes Month- to-month 7031 No No No Yes Yes Month- to-month 7031 No		Vas	V	E i b a a		
7041 Yes Yes Fiber optic No DeviceProtection TechSupport StreamingTV StreamingMovies Contract \ 20		res	Yes	Fiber	optic	
DeviceProtection TechSupport StreamingTV StreamingMovies Contract \ 20		Yes	Yes	Fiber	optic	
Contract \ 20	No					
Contract \ 20	DevicePr	otection ⁻	TechSupport Strea	mingTV	StreamingMovies	
to-month 30	Contract \			_	_	
30		Yes	No	No	Yes	Month-
Two year 31		Yes	Yes	No	No	
to-month 34						
34 No No No No Month-to-month 50 No No Yes No Month-to-month 70-month 7023 Yes No Yes Yes Month-to-month 7029 No No Yes Yes Month-to-month 7031 No No No No No 0ne year 7032 No No No No Month-to-month 7041 No No No No No Month-to-month PaperlessBilling PaymentMethod MonthlyCharges		Yes	No	Yes	Yes	Month-
to-month 50 No No Yes No Month- to-month 7023 Yes No Yes Yes Month- to-month 7029 No No No Yes Yes Month- to-month 7031 No No No No No One year 7032 No No No No No Month- to-month 7041 No No No No No Month- to-month 7041 No No No No No Month- to-month 7041 No No No No No Month- to-month		No	No	No	No	Month-
to-month 7023 Yes No Yes Yes Month- to-month 7029 No No No Yes Yes Month- to-month 7031 No No No No No One year 7032 No No No No No Month- to-month 7041 No No No No No Month- to-month PaperlessBilling PaymentMethod MonthlyCharges						
		No	No	Yes	No	Month-
7023 Yes No Yes Yes Month-to-month 7029 No No Yes Yes Month-to-month 7031 No No No No No One year 7032 No No No No No Month-to-month 7041 No No No No No Month-to-month 7041 PaperlessBilling PaymentMethod MonthlyCharges						
to-month 7029 No No Yes Yes Month- to-month 7031 No No No No One year 7032 No No No No No Month- to-month 7041 No No No No No Month- to-month PaperlessBilling PaymentMethod MonthlyCharges						
7029 No No Yes Yes Month- to-month 7031 No No No No No One year 7032 No No No No No Month- to-month 7041 No No No No No Month- to-month PaperlessBilling PaymentMethod MonthlyCharges		Yes	No	Yes	Yes	Month-
to-month 7031 No No No No One year 7032 No No No No No Month- to-month 7041 No No No No No Month- to-month PaperlessBilling PaymentMethod MonthlyCharges		No	No	Yes	Yes	Month-
One year 7032 No No No No Month- to-month 7041 No No No No No Month- to-month PaperlessBilling PaymentMethod MonthlyCharges	to-month					
7032 No No No No Month-to-month 7041 No No No No No Month-to-month PaperlessBilling PaymentMethod MonthlyCharges		No	No	No	No	
to-month 7041 No No No No Month- to-month PaperlessBilling PaymentMethod MonthlyCharges		No	No	No	No	Month-
to-month PaperlessBilling PaymentMethod MonthlyCharges	to-month					
PaperlessBilling PaymentMethod MonthlyCharges		No	No	No	No	Month-
	to-montn					
TotalCharges \			Paym	entMeth	nod MonthlyCharge	es
	TotalCharges	\				

20 39.65	Yes	Electronic check 39.65					
30	Yes	Credit card (automatic) 96.35					
6766.95 31	Yes	Credit card (automatic) 95.50					
181.65 34	No Ba	ank transfer (automatic) 45.25					
45.25 50	Yes	Electronic check 90.25					
3838.75							
 7023	Yes	Electronic check 103.50					
6479.40							
7029 263.05	Yes						
7031 3316.10	No	Credit card (automatic) 60.00					
7032 75.75	Yes	Electronic check 75.75					
7041 306.60	Yes	Mailed check 74.40					
Churn 20 Yes 30 No 31 No 34 No 50 No 7023 No 7029 No 7031 No 7032 Yes 7041 Yes [1142 rows x 21 c	olumns]						
<pre>df[df["SeniorCitizen"] == "No"]</pre>							
customerID 0 7590-VHVEG 1 5575-GNVDE 2 3668-QPYBK 3 7795-CFOCW 4 9237-HQITU 7037 2569-WGERO 7038 6840-RESVB 7039 2234-XADUH	gender Female Male Male Female Female Male Female	No No 34 No No No 2 No No No 45 No No No 2 No No No 72 No Yes Yes 24					

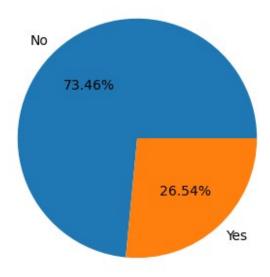
	01-JZAZL 86-AJIEK	Female Male		No No	Yes No	Yes No	11 66
Pho OnlineSe 0	neService curity No	\	pleLines	Intern		ce SL	
No 1	Yes	No phone	No			SL	
Yes 2 Yes	Yes		No		D	SL	
Yes Yes	No	No phone	service		D	SL	
4 No	Yes		No	Fi	ber opt	ic	
7037 service	Yes		No			No No inte	ernet
7038 Yes	Yes		Yes		D	SL	
7039 No	Yes		Yes	Fi	ber opt	ic	
7040 Yes	No	No phone	service		D	SL	
7042 Yes	Yes		No	Fi	ber opt	ic	
0 1 2 3 4	DevicePro	otection No Yes No Yes No		ГесhSup	port No No No Yes No	Str	eamingTV \ No No No No No No No
7037 No 7038 7039 7040 7042	internet	service Yes Yes No Yes	No inter	net ser	vice N Yes No No Yes	o internet	service Yes Yes No Yes
0 1 2 3 4 7037 No	Streamin	No No No No	Month-to- One Month-to- One Month-to-	-month e year -month e year	Paperle	ssBilling Yes No Yes No Yes Yes	

7039 7040 7042	Yes No Month Yes	One year -to-month Two year	Yes Yes Yes			
0 1 2 3 4 7037 7038 7039 7040 7042	PaymentMethod I Electronic check Mailed check Mailed check Bank transfer (automatic) Electronic check Bank transfer (automatic) Mailed check Credit card (automatic) Electronic check Bank transfer (automatic)	MonthlyCharges 29.85 56.95 53.85 42.30 70.70 21.15 84.80 103.20 29.60 105.65	TotalCharges	Churn No No Yes No Yes No No No No No		
<pre>[5901 rows x 21 columns] plt.figure(figsize = (4,4)) ax = sns.countplot(x = df["Churn"]) ax.bar_label(ax.containers[0]) plt.title("Count of Customers by Churn") plt.show()</pre>						



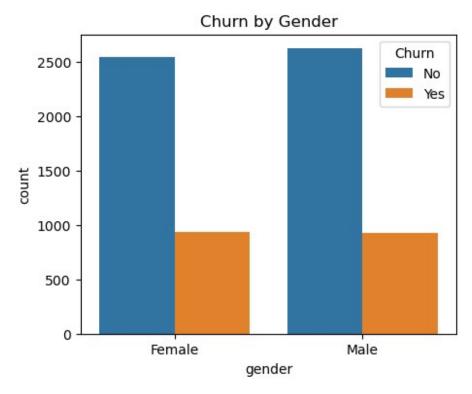
```
plt.figure(figsize = (4,4))
gb = df.groupby("Churn").agg({"Churn":"count"})
plt.pie(gb["Churn"],labels = gb.index, autopct= "%1.2f%%")
plt.title("Percentage of Chrned Customers")
plt.show()
```

Percentage of Chrned Customers

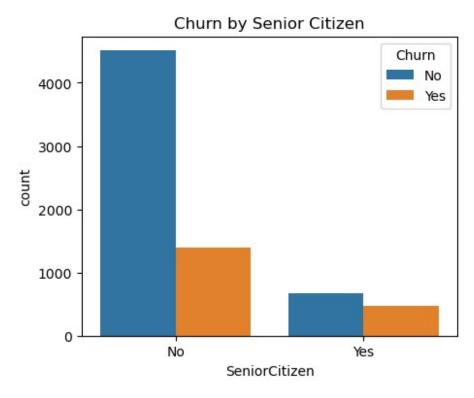


from the given pie chart we can conclude that 26.54% of our customershave churned out. #not let's explore the reason behind it

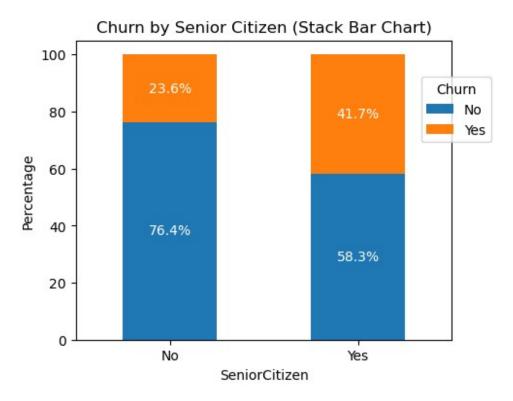
```
plt.figure(figsize = (5,4))
sns.countplot(x = "gender", data = df , hue = "Churn")
plt.title("Churn by Gender")
plt.show()
```



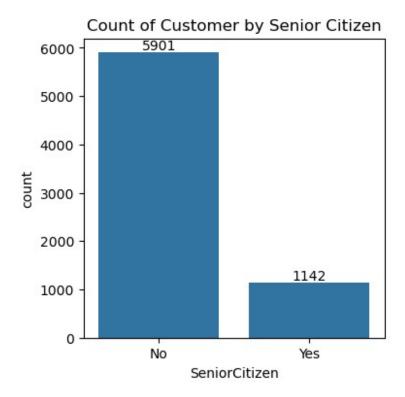
```
plt.figure(figsize = (5,4))
sns.countplot(x = "SeniorCitizen", data = df , hue = "Churn")
plt.title("Churn by Senior Citizen")
plt.show()
```



```
# Calculate counts for each combination of SeniorCitizen and Churn
count data = df.groupby(['SeniorCitizen',
'Churn']).size().unstack(fill value=0)
# Calculate percentages
percent data = count data.div(count data.sum(axis=1), axis=0) * 100
# Create a stacked bar chart
percent data.plot(kind='bar', stacked=True, color=['#1f77b4',
'#ff7f0e'], figsize=(5, 4))
# Adding percentage labels
for i in range(len(percent data)):
    for j in range(len(percent data.columns)):
        plt.text(i, percent_data.iloc[i].cumsum().iloc[j] -
percent data.iloc[i].iloc[j]/2,
                 f"{percent data.iloc[i].iloc[j]:.1f}%",
                 ha='center', va='center', color='white')
# Customizing the plot
plt.title("Churn by Senior Citizen (Stack Bar Chart)")
# plt.xlabel("SeniorCitizen")
plt.ylabel("Percentage")
plt.xticks(rotation=0)
#plt.legend(title='Churn', loc='upper right')
plt.legend(title='Churn', bbox_to_anchor = (0.9,0.9))
plt.show()
```

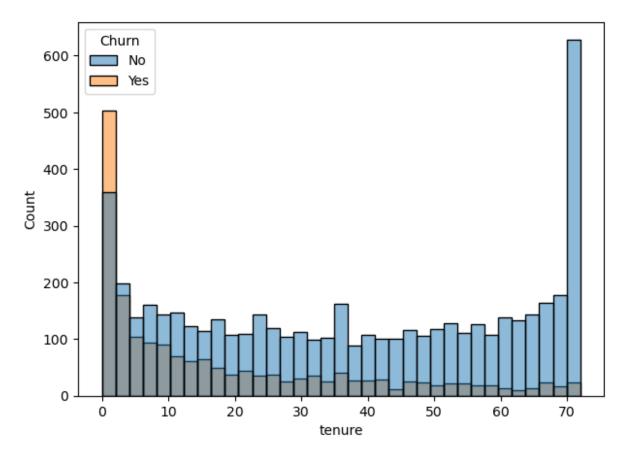


```
plt.figure(figsize = (4,4))
ax = sns.countplot(x = "SeniorCitizen", data = df)
ax.bar_label(ax.containers[0])
plt.title("Count of Customer by Senior Citizen")
plt.show()
```



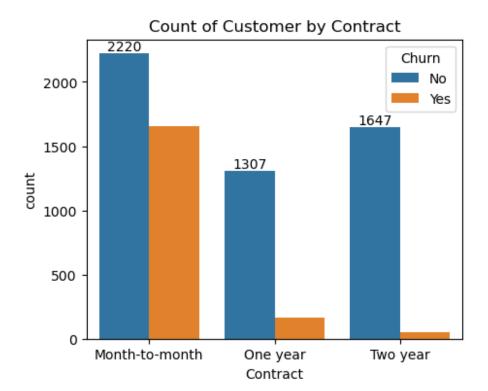
comparative a greater percentage of people in senior citizen category have churned

```
plt.figure(figsize = (7,5))
sns.histplot(x = "tenure" ,data = df, bins= 35, hue = "Churn")
plt.show()
```



People who have used our services for a long time stayed and people who have used our services #1 or #2 months have churned.

```
plt.figure(figsize = (5,4))
ax = sns.countplot(x = "Contract", data = df , hue = "Churn")
ax.bar_label(ax.containers[0])
plt.title("Count of Customer by Contract")
plt.show()
```



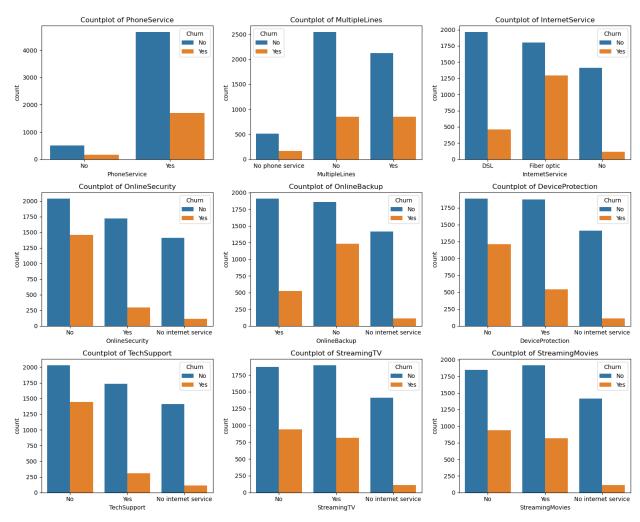
People who have month to month contract are likely to churn thrn from those who have 1 or 2 years of contract.

```
df.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)
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
# Assume you have a DataFrame 'df' with the columns specified
# Example: df = pd.read csv('your data.csv')
# Set up the matplotlib figure
plt.figure(figsize=(15, 12))
# List of columns to create subplots for
columns = [
     'PhoneService', 'MultipleLines', 'InternetService', 'OnlineSecurity', 'OnlineBackup', 'DeviceProtection',
```

```
'TechSupport', 'StreamingTV', 'StreamingMovies'

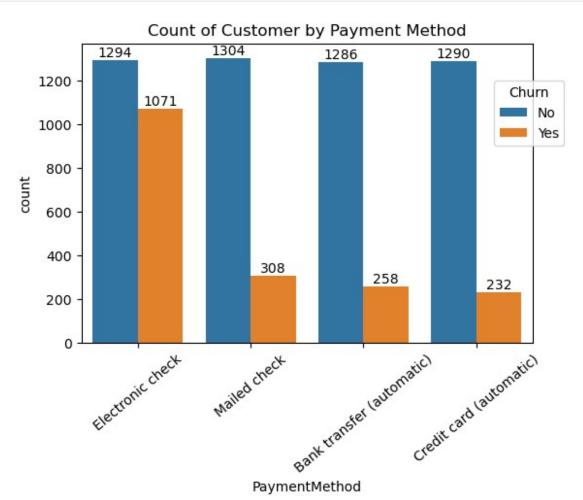
# Create a count plot for each column
for i, column in enumerate(columns, 1):
    plt.subplot(3, 3, i) # 3 rows, 3 columns
    sns.countplot(data=df, x=column, hue=df["Churn"]) # Create a
countplot for the current column
    plt.title(f'Countplot of {column}') # Set the title using an f-
string

plt.tight_layout() # Adjust layout to prevent overlap
plt.show()
```



The majority of customers who do not churn tend to have services like PhoneSevice, InternetService (particularly DSL), and OnlineSecurity enabled. For services like OnlineBackup, TechSupport and StreamingTV. churn rates are noticeably higher when these services are not used or are unavailable.

```
plt.figure(figsize = (6,4))
ax = sns.countplot(x = "PaymentMethod", data = df , hue = "Churn")
ax.bar_label(ax.containers[0])
ax.bar_label(ax.containers[1])
plt.title("Count of Customer by Payment Method")
plt.xticks(rotation = 40)
plt.legend(title='Churn', bbox_to_anchor = (0.9,0.9))
plt.show()
```



Customer is likely to churn when he is using electronic check as payment method