In [1]: 1 import pandas as pd

In [2]: 1 df = pd.read_csv("telecom_churn.csv")

Out[3]:

	State	Account length	Area code	International plan	Voice mail plan	Number vmail messages	Total day minutes	Total day calls	Total day charge	Total eve minutes
0	KS	128	415	No	Yes	25	265.1	110	45.07	197.4
1	ОН	107	415	No	Yes	26	161.6	123	27.47	195.5
2	NJ	137	415	No	No	0	243.4	114	41.38	121.2
3	ОН	84	408	Yes	No	0	299.4	71	50.90	61.9
4	OK	75	415	Yes	No	0	166.7	113	28.34	148.3

In [4]: 1 df.head(15)

Out[4]:

	State length cod		Area code	International plan	Voice mail plan	Number vmail messages	Total day minutes	Total day calls	Total day charge	Total eve minutes
0	KS	128	415	No	Yes	25	265.1	110	45.07	197.4
1	ОН	107	415	No	Yes	26	161.6	123	27.47	195.5
2	NJ	137	415	No	No	0	243.4	114	41.38	121.2
3	ОН	84	408	Yes	No	0	299.4	71	50.90	61.9
4	OK	75	415	Yes	No	0	166.7	113	28.34	148.3
5	AL	118	510	Yes	No	0	223.4	98	37.98	220.6
6	MA	121	510	No	Yes	24	218.2	88	37.09	348.5
7	МО	147	415	Yes	No	0	157.0	79	26.69	103.1
8	LA	117	408	No	No	0	184.5	97	31.37	351.6
9	WV	141	415	Yes	Yes	37	258.6	84	43.96	222.0
10	IN	65	415	No	No	0	129.1	137	21.95	228.5
11	RI	74	415	No	No	0	187.7	127	31.91	163.4
12	IA	168	408	No	No	0	128.8	96	21.90	104.9
13	MT	95	510	No	No	0	156.6	88	26.62	247.6
14	IA	62	415	No	No	0	120.7	70	20.52	307.2

In [5]: # shape : gives count of rows and columns
df.shape

Out[5]: (3333, 20)

In [6]: | 1 # size : number of data points (row * columns)

df.size

Out[6]: 66660

2 df.tail()

Out[7]:

	State	Account length	Area code	International plan	Voice mail plan	Number vmail messages	Total day minutes	Total day calls	Total day charge	To e minut
3328	AZ	192	415	No	Yes	36	156.2	77	26.55	215
3329	WV	68	415	No	No	0	231.1	57	39.29	153
3330	RI	28	510	No	No	0	180.8	109	30.74	288
3331	СТ	184	510	Yes	No	0	213.8	105	36.35	159
3332	TN	74	415	No	Yes	25	234.4	113	39.85	265

In [8]: | 1 | df.tail(7) # display last 7 rows of my table

Out[8]:

	State	Account length	Area code	International plan	Voice mail plan	Number vmail messages	Total day minutes	Total day calls	Total day charge	To e minut
3326	ОН	96	415	No	No	0	106.6	128	18.12	284
3327	SC	79	415	No	No	0	134.7	98	22.90	189
3328	AZ	192	415	No	Yes	36	156.2	77	26.55	215
3329	WV	68	415	No	No	0	231.1	57	39.29	153
3330	RI	28	510	No	No	0	180.8	109	30.74	288
3331	СТ	184	510	Yes	No	0	213.8	105	36.35	159
3332	TN	74	415	No	Yes	25	234.4	113	39.85	265

```
In [9]:
             # columns : to view all columns
             df.columns
         Index(['State', 'Account length', 'Area code', 'International plan
 Out [9]:
                 'Voice mail plan', 'Number vmail messages', 'Total day minu
         tes',
                'Total day calls', 'Total day charge', 'Total eve minutes',
                 'Total eve calls', 'Total eve charge', 'Total night minutes
                 'Total night calls', 'Total night charge', 'Total intl minu
         tes',
                'Total intl calls', 'Total intl charge', 'Customer service
         calls',
                 'Churn'],
               dtype='object')
In [10]:
             # info : return information related to individual columns
             df.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 3333 entries, 0 to 3332
         Data columns (total 20 columns):
              Column
                                       Non-Null Count
                                                       Dtype
              _____
```

0 State 3333 non-null object Account length int64 1 3333 non-null 2 Area code 3333 non-null int64 3 International plan 3333 non-null object 4 Voice mail plan 3333 non-null object 5 Number vmail messages 3333 non-null int64 Total day minutes 6 3333 non-null float64 7 Total day calls 3333 non-null int64 8 Total day charge 3333 non-null float64 Total eve minutes 9 3333 non-null float64 int64 10 Total eve calls 3333 non-null Total eve charge 3333 non-null float64 11 Total night minutes 3333 non-null 12 float64 Total night calls 13 3333 non-null int64 Total night charge 14 3333 non-null float64 15 Total intl minutes 3333 non-null float64 Total intl calls 3333 non-null int64 16 17 Total intl charge 3333 non-null float64 18 Customer service calls 3333 non-null int64 3333 non-null 19 Churn bool dtypes: bool(1), float64(8), int64(8), object(3) memory usage: 498.1+ KB

```
In [11]:  # describe : it gibes statistical information present in the da
2
3 df.describe()
```

Out[11]:

	Account length	Area code	Number vmail messages	Total day minutes	Total day calls	Total day charge	1
count	3333.000000	3333.000000	3333.000000	3333.000000	3333.000000	3333.000000	3336
mean	101.064806	437.182418	8.099010	179.775098	100.435644	30.562307	200
std	39.822106	42.371290	13.688365	54.467389	20.069084	9.259435	5(
min	1.000000	408.000000	0.000000	0.000000	0.000000	0.000000	(
25%	74.000000	408.000000	0.000000	143.700000	87.000000	24.430000	166
50%	101.000000	415.000000	0.000000	179.400000	101.000000	30.500000	20°
75%	127.000000	510.000000	20.000000	216.400000	114.000000	36.790000	23
max	243.000000	510.000000	51.000000	350.800000	165.000000	59.640000	360

Out[12]:

	State	International plan	Voice mail plan	Churn
count	3333	3333	3333	3333
unique	51	2	2	2
top	WV	No	No	False
freq	106	3010	2411	2850

Out[13]: False 2850 True 483

Name: Churn, dtype: int64

```
In [14]: 1 df['International plan'].value_counts()
```

Out[14]: No 3010 Yes 323

Name: International plan, dtype: int64

Out[15]: 3333

Out[16]: False 85.508551 True 85.508551

Name: Churn, dtype: float64

2 df['Churn'].value_counts(normalize = True)

Out[17]: False 0.855086 True 0.144914

Name: Churn, dtype: float64

In [18]: | 1 | # indexing using loc : provide row index and column names as an

3 df.loc[0:10,"State":"International plan"]

Out[18]:

	State	Account length	Area code	International plan
0	KS	128	415	No
1	ОН	107	415	No
2	NJ	137	415	No
3	ОН	84	408	Yes
4	OK	75	415	Yes
5	AL	118	510	Yes
6	MA	121	510	No
7	МО	147	415	Yes
8	LA	117	408	No
9	WV	141	415	Yes
10	IN	65	415	No

In [19]: df.loc[0:10,["State","International plan"]]

Out[19]:

	State	International plan
0	KS	No
1	ОН	No
2	NJ	No
3	ОН	Yes
4	OK	Yes
5	AL	Yes
6	MA	No
7	МО	Yes
8	LA	No
9	WV	Yes
10	IN	No

In [20]:

indexing using iloc : slicing based on index
df.iloc[0:10,0:4]

Out[20]:

	State	Account length	Area code	International plan
0	KS	128	415	No
1	ОН	107	415	No
2	NJ	137	415	No
3	ОН	84	408	Yes
4	OK	75	415	Yes
5	AL	118	510	Yes
6	MA	121	510	No
7	МО	147	415	Yes
8	LA	117	408	No
9	WV	141	415	Yes

Out[21]:

		State	Account length		International plan	Voice mail plan	Number vmail messages	Total day minutes	Total day calls	Total day charge	To e minut
2	273	WY	139	415	No	No	0	192.8	104	32.78	234
7	'31	WY	90	415	No	No	0	207.2	121	35.22	292
29	12	WY	151	415	No	No	0	170.2	89	28.93	187
16	28	WY	131	510	No	No	0	110.9	74	18.85	115
29	15	WY	58	510	No	No	0	210.1	126	35.72	248

In [22]: 1 df.sort_values(by = 'Area code').head()

Out[22]:

	State	Account length	Area code	International plan	Voice mail plan	Number vmail messages	Total day minutes	Total day calls	Total day charge	To e minut
2536	СТ	119	408	No	No	0	294.2	100	50.01	232
887	IA	128	408	No	No	0	158.8	75	27.00	264
2486	MS	76	408	No	No	0	173.2	93	29.44	131
2482	MT	157	408	No	No	0	240.2	67	40.83	153
2476	WV	84	408	No	No	0	146.8	133	24.96	171

Out[23]:

ount	Area code	International plan	Voice mail plan	Number vmail messages	Total day minutes	Total day calls	Total day charge	Total eve minutes	Total eve calls	Total eve charge
36	408	No	Yes	30	146.3	128	24.87	162.5	80	13.81
104	408	No	No	0	278.4	106	47.33	81.0	113	6.89
78	408	No	No	0	225.1	67	38.27	199.2	127	16.93
110	408	No	No	0	100.1	90	17.02	233.3	93	19.83
127	408	No	No	0	182.3	124	30.99	169.9	110	14.44

```
df.isnull().sum()
Out[24]: State
                                    0
         Account length
                                    0
         Area code
                                    0
         International plan
                                    0
         Voice mail plan
                                    0
         Number vmail messages
                                    0
         Total day minutes
                                    0
         Total day calls
                                    0
         Total day charge
                                    0
         Total eve minutes
                                    0
         Total eve calls
                                    0
         Total eve charge
                                    0
         Total night minutes
                                    0
         Total night calls
                                    0
         Total night charge
                                    0
         Total intl minutes
                                    0
```

isnull().sum() : it gives sum of missing values of an individ

dtype: int64

Churn

Total intl calls

Total intl charge

Customer service calls

```
In [25]: 1 df_t = pd.read_csv("titanic_train.csv")
2 df_t.head()
```

0

0

0

0

Out [25]:

In [24]:

	Passengerld	Survived	Pclass	Name	Sex	Age	SibSp	Parch	Ticket	Far
0	1	0	3	Braund, Mr. Owen Harris	male	22.0	1	0	A/5 21171	7.250
1	2	1	1	Cumings, Mrs. John Bradley (Florence Briggs Th	female	38.0	1	0	PC 17599	71.283
2	3	1	3	Heikkinen, Miss. Laina	female	26.0	0	0	STON/O2. 3101282	7.925
3	4	1	1	Futrelle, Mrs. Jacques Heath (Lily May Peel)	female	35.0	1	0	113803	53.100
4	5	0	3	Allen, Mr. William Henry	male	35.0	0	0	373450	8.050

```
In [26]:
             df_t.shape
Out[26]: (891, 12)
In [27]:
              df_t.isnull().sum()
Out[27]: PassengerId
                           0
                           0
         Survived
         Pclass
                           0
         Name
                           0
         Sex
                           0
                         177
         Age
         SibSp
                           0
         Parch
                           0
         Ticket
                           0
         Fare
                           0
         Cabin
                         687
         Embarked
                           2
         dtype: int64
In [28]:
              (df_t.isnull().sum() / df_t.shape[0])*100
Out[28]: PassengerId
                          0.000000
         Survived
                          0.000000
         Pclass
                          0.000000
         Name
                          0.000000
         Sex
                          0.000000
         Age
                         19.865320
         SibSp
                          0.000000
         Parch
                          0.000000
         Ticket
                          0.000000
         Fare
                          0.000000
         Cabin
                         77.104377
         Embarked
                          0.224467
         dtype: float64
              sum(df_t.isnull().sum())
In [29]:
Out[29]: 866
In [30]:
              import numpy as np
```

```
# apply() : useful when we wants to perform some operation over
In [31]:
               df.apply(np.max)
Out[31]: State
                                           WY
                                          243
          Account length
          Area code
                                          510
          International plan
                                          Yes
          Voice mail plan
                                          Yes
          Number vmail messages
                                           51
          Total day minutes
                                        350.8
          Total day calls
                                          165
          Total day charge
                                        59.64
          Total eve minutes
                                        363.7
          Total eve calls
                                          170
          Total eve charge
                                        30.91
          Total night minutes
                                          395
          Total night calls
                                          175
          Total night charge
                                        17.77
          Total intl minutes
                                           20
          Total intl calls
                                           20
          Total intl charge
                                          5.4
          Customer service calls
                                            9
          Churn
                                         True
          dtype: object
In [32]:
               df.head()
Out [32]:
                                                                   Total
                                            Voice
                                                    Number
                                                              Total
                                                                          Total
                                                                                  Total
                   Account Area International
             State
                                             mail
                                                               day
                                                                    day
                                                                           day
                                                      vmail
                                                                                   eve
                     length code
                                             plan
                                                  messages
                                                           minutes
                                                                   calls
                                                                         charge
                                                                               minutes
           0
               KS
                       128
                            415
                                                              265.1
                                                                          45.07
                                        No
                                              Yes
                                                        25
                                                                    110
                                                                                  197.4
           1
               ОН
                       107
                            415
                                        No
                                              Yes
                                                        26
                                                              161.6
                                                                    123
                                                                          27.47
                                                                                  195.5
           2
               NJ
                       137
                            415
                                              No
                                                         0
                                                             243.4
                                                                    114
                                                                          41.38
                                                                                  121.2
                                        No
           3
               ОН
                        84
                            408
                                        Yes
                                              No
                                                         0
                                                              299.4
                                                                     71
                                                                          50.90
                                                                                  61.9
           4
               OK
                        75
                            415
                                        Yes
                                              No
                                                         0
                                                              166.7
                                                                    113
                                                                          28.34
                                                                                  148.3
               new = df['Area code'].apply(lambda x : x + 1000)
In [33]:
In [34]:
               new['area_changed'] = df['Area code'].apply(lambda x : x + 1000
In [35]:
               #new.head()
In [36]:
               #new_df = pd.DataFrame(new,columns = ['Index','Area_changed'])
 In [ ]:
```

In [37]: 1 type(new)

Out[37]: pandas.core.series.Series

In [38]: # subset of data using conditions (one condition)

3 df_filter = df[df['Churn'] == True]

In [39]: 1 df_filter.head()

Out [39]:

	State	Account length		International plan	Voice mail plan	Number vmail messages	Total day minutes	Total day calls	Total day charge	Total eve minutes
10	IN	65	415	No	No	0	129.1	137	21.95	228.5
15	NY	161	415	No	No	0	332.9	67	56.59	317.8
21	CO	77	408	No	No	0	62.4	89	10.61	169.9
33	AZ	12	408	No	No	0	249.6	118	42.43	252.4
41	MD	135	408	Yes	Yes	41	173.1	85	29.43	203.9

In [40]: 1 df_filter['Churn'].value_counts()

Out[40]: True 483

Name: Churn, dtype: int64

In [41]: 1 # subset of data using conditions (multiple condition)

df_filter_multiple = df[(df['Churn'] == True) & (df['Area code'

4 df_filter_multiple.head()

Out [41]:

	State	Account length		International plan	Voice mail plan	Number vmail messages	Total day minutes	Total day calls	Total day charge	Total eve minutes
10	IN	65	415	No	No	0	129.1	137	21.95	228.5
15	NY	161	415	No	No	0	332.9	67	56.59	317.8
48	ID	119	415	No	No	0	159.1	114	27.05	231.3
54	WY	87	415	No	No	0	151.0	83	25.67	219.7
76	DC	82	415	No	No	0	300.3	109	51.05	181.0

In [42]: | 1 | df_filter_multiple.shape[0]

Out[42]: 236

In [43]: | 1 | df_filter_multiple['Area code'].value_counts()

Out[43]: 415 236

Name: Area code, dtype: int64

```
In [44]:
               # crosstab() : it gives calculation between two or more columns
               pd.crosstab(df['Churn'], df['International plan'])
Out [44]:
           International plan No
                               Yes
                    Churn
                          2664
                    False
                               186
                           346 137
                     True
               pd.crosstab(df['Churn'], df['Area code'])
In [45]:
Out [45]:
           Area code 408 415
                              510
              Churn
               False
                   716 1419 715
               True
                    122
                         236 125
               pd.crosstab(df['Churn'], [df['Area code'],df['International pla
In [46]:
Out [46]:
                                            510
           Area code
                          408
                                   415
           International plan
                                        Yes No
                                                Yes
                          No
                              Yes No
                    Churn
                    False
                          677
                               39
                                  1331
                                         88
                                            656
                                                 59
                           90
                               32
                                   174
                                         62
                                             82
                                                 43
                     True
 In [ ]:
In [47]:
               # groupby
               # df.groupby(grouping columns)[columns_to_show].function()
In [51]:
               columns_to_show = ['Total day minutes',"Total eve minutes"]
               df.groupby(['Churn'])[columns_to_show].mean()
Out [51]:
                 Total day minutes  Total eve minutes
           Churn
            False
                      175.175754
                                     199.043298
            True
                      206.914079
                                     212.410145
 In [ ]:
                        - churn_false - total day min col - take maximum of all
                        - churn_true - total day min col - take maximum of all
```

```
In [59]:
               columns_to_show = ['Total day minutes',"Total eve minutes"]
               df.groupby(['Area code'])[columns_to_show].mean()
Out [59]:
                     Total day minutes  Total eve minutes
           Area code
                          177.175418
                                          201.284248
                 408
                           181.592628
                                          200.652085
                 415
                                          201.323929
                 510
                           178.787619
               columns_to_show = ['Total intl calls']
In [55]:
               df.groupby(['Churn','Area code'])[columns_to_show].sum()
Out [55]:
                            Total intl calls
           Churn Area code
            False
                       408
                                   3208
                                   6537
                       415
                       510
                                   3174
             True
                       408
                                    501
                       415
                                   1013
                       510
                                    497
 In [ ]:
               # pivot table : similar to groupby
In [58]:
               df.pivot_table(['Total day minutes',"Total eve minutes"],['Area
Out [58]:
                     Total day minutes  Total eve minutes
           Area code
                           177.175418
                                          201.284248
                 408
                           181.592628
                                          200.652085
                 415
                                          201.323929
                 510
                           178.787619
 In [ ]:
                           : joining two dataframes
 In [ ]:
               # concat
```

series1 = pd.Series([1,2,3])

series2 = pd.Series(['A','B','C'])

In [61]:

```
In [62]:
              series1
Out[62]: 0
               1
               2
               3
          dtype: int64
In [63]:
              series2
Out[63]:
               Α
               В
          2
               C
         dtype: object
              # normal concat
In [64]:
              pd.concat([series1,series2])
Out[64]: 0
              1
               2
          1
          2
               3
          0
               Α
          1
               В
          2
               C
         dtype: object
              # Horizonal concat
In [65]:
              pd.concat([series1,series2],axis = 1)
Out [65]:
          1 2 B
          2 3 C
 In [ ]:
              # concatenation on dataframe
 In [ ]:
              # merge
```

```
In [66]:
              import pandas as pd
              data1 = {
                "name": ["Sally", "Mary", "John"],
"age": [50, 40, 30]
              data2 = {
               "name": ["Sally", "Peter", "Micky"],
               "age": [77, 44, 22]
              df1 = pd.DataFrame(data1)
              df2 = pd.DataFrame(data2)
In [67]:
              df1
Out [67]:
             name age
              Sally
                    50
             Mary
                    40
          2 John
                   30
In [68]:
              df2
Out [68]:
             name age
                    77
           0 Sally
           1 Peter
                   44
           2 Micky
                   22
In [69]:
              newdf = df1.merge(df2, how='right')
              print(newdf)
              name age
                      77
          0 Sally
          1 Peter
                      44
```

2 Micky

22

```
In [70]:
            # importing pandas module
            import pandas as pd
            # Define a dictionary containing employee data
            data1 = {'key': ['K0', 'K1', 'K2', 'K3'],
                     'key1': ['K0', 'K1', 'K0', 'K1'],
'Name':['Jai', 'Princi', 'Gaurav', 'Anuj'],
                    'Age':[27, 24, 22, 32],}
            # Define a dictionary containing employee data
            # Convert the dictionary into DataFrame
            df = pd.DataFrame(data1)
            # Convert the dictionary into DataFrame
            df1 = pd.DataFrame(data2)
            print(df, "\n\n", df1)
           key key1
                      Name Age
                       Jai
         0
           K0
                K0
                             27
                K1 Princi
                             24
         1
           Κ1
                             22
         2 K2
                K0 Gaurav
         3 K3
                Κ1
                             32
                      Anuj
            key key1
                       Address Qualification
         0
           K0
                K0
                       Nagpur
                                      Btech
         1
           K1
                K0
                       Kanpur
                                        B.A
         2
           K2
                K0 Allahabad
                                       Bcom
         3 K3
                K0
                      Kannuaj
                                     B.hons
In [71]:
            # diff merge methods :
            # left : use keys from left dataframe only
            # right : use keys from right dataframe only
            # outer : used union from both dataframes
            # inner: used intersection from both dataframes
In [72]:
            # merging using "left"
```

output = pd.merge(df, df1, how = 'left',on = ["key","key1"])

```
In [73]:
                output
Out [73]:
                          Name Age
                  key1
                                      Address
                                               Qualification
               key
            0
               K0
                     K0
                            Jai
                                 27
                                       Nagpur
                                                     Btech
               K1
                     K1
                          Princi
                                                      NaN
            1
                                 24
                                          NaN
            2
               K2
                     K0
                         Gaurav
                                 22
                                     Allahabad
                                                     Bcom
            3
               K3
                     K1
                           Anui
                                 32
                                          NaN
                                                      NaN
In [74]:
                # merging using "right"
                output_left = pd.merge(df, df1, how = 'right', on = ["key", "key1
                output_left
Out [74]:
                                      Address
                                               Qualification
               key
                   key1
                          Name
                                Age
            0
               K0
                     K0
                                27.0
                                                     Btech
                            Jai
                                       Nagpur
                                22.0 Allahabad
            1
               K2
                     K0
                         Gaurav
                                                     Bcom
            2
               K1
                     K0
                                        Kanpur
                                                       B.A
                           NaN
                                NaN
            3
               K3
                     K0
                           NaN NaN
                                       Kannuaj
                                                    B.hons
In [75]:
                # merging using "outer"
                output_outer = pd.merge(df, df1, how = 'outer', on = ["key", "key
                output_outer
Out [75]:
                                               Qualification
                   key1
                          Name
                                Age
                                      Address
               key
            0
               K0
                     K<sub>0</sub>
                            Jai
                                27.0
                                                     Btech
                                       Nagpur
               K1
                     K1
                          Princi 24.0
                                                      NaN
                                          NaN
               K2
                     K0
                         Gaurav 22.0 Allahabad
            2
                                                     Bcom
               K3
                     K1
                           Anuj 32.0
                                          NaN
                                                      NaN
            3
            4
               K1
                     K0
                           NaN NaN
                                        Kanpur
                                                       B.A
               K3
                     K0
                           NaN NaN
                                       Kannuaj
                                                    B.hons
            5
In [76]:
                # merging using "inner"
                output_inner = pd.merge(df, df1, how = 'inner', on = ["key", "key
                output_inner
Out [76]:
                                      Address
                                               Qualification
               key
                   key1
                          Name
                                Age
```

K0

K2

0

K0

K0

Jai

Gaurav

27

22

Nagpur

Allahabad

Btech

Bcom

In []:	
In []:	
In []:	1