```
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```

**Topic: Pandas Tutorial: DataFrames in Python** 

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```
In [3]:
```

```
import pandas as pd
import numpy as np
```

# missing data

```
In [5]:

d = {
    'A': [1,2, np.nan],
    'B': [5, np.nan, np.nan],
    'C': [1,2,3]
}
```

```
In [6]:
```

```
df = pd.DataFrame(d)
```

### In [7]:

```
df
```

### Out[7]:

```
        A
        B
        C

        0
        1.0
        5.0
        1

        1
        2.0
        NaN
        2

        2
        NaN
        NaN
        3
```

## drop nan method

```
In [10]:
```

```
df.dropna()
```

Out[10]:

```
        A
        B
        C

        0
        1.0
        5.0
        1
```

```
In [11]:
```

```
df.dropna(axis = 0)
```

Out[11]:

```
A B C 0 1.0 5.0 1
```

```
In [13]:
df.dropna??
In [14]:
df.dropna(axis = 1)
Out[14]:
 С
1 2
2 3
filling value
In [15]:
df
Out[15]:
  A B C
0 1.0 5.0 1
1 2.0 NaN 2
2 NaN NaN 3
In [16]:
df.fillna(value = 'Filling Value')
Out[16]:
                  в с
      2 Filling Value 2
2 Filling Value Filling Value 3
In [19]:
df = pd.DataFrame(d)
In [22]:
a = df['A'].fillna(value = df['A'].mean())
In [23]:
df
Out[23]:
   A B C
0 1.0 5.0 1
1 2.0 NaN 2
2 NaN NaN 3
```

```
In [24]:
Out[24]:
0 1.0
1 2.0
2 1.5
Name: A, dtype: float64
In [25]:
df
Out[25]:
 A B C
0 1.0 5.0 1
1 2.0 NaN 2
2 NaN NaN 3
In [26]:
df['A'].fillna(value = df['A'].mean())
Out[26]:
0 1.0
1 2.0
2 1.5
Name: A, dtype: float64
In [27]:
df
Out[27]:
 A B C
0 1.0 5.0 1
1 2.0 NaN 2
2 NaN NaN 3
In [28]:
df.fillna??
In [29]:
df['A'].fillna(value = df['A'].mean(), inplace = True)
In [30]:
df
Out[30]:
A B C
0 1.0 5.0 1
```

A B C

```
1 2A NaB Q
2 1.5 NaN 3
```

## **Group By**

```
In [31]:
data = {
     'Company':['Google', 'Google', 'MSFT', 'FB','FB','IBM'],
'Person': ['Sam','Nihad','Any','Van','Rakib','Ovi'],
'Sales': [200, 120, 340, 124, 243, 350]
In [32]:
df = pd.DataFrame(data)
In [33]:
df
Out[33]:
   Company Person Sales
   Google
                Sam
                       200
               Nihad
                       120
1
    Google
    MSFT
2
                 Any
                       340
         FΒ
                       124
3
                 Van
        FB
               Rakib
                       243
5
        IBM
                 Ovi
                       350
In [34]:
byComp = df.groupby('Company')
In [35]:
byComp.mean()
Out[35]:
           Sales
Company
  FB 183.5
   Google 160.0
   IBM 350.0
    MSFT 340.0
In [36]:
byComp.sum()
Out[36]:
           Sales
Company
      FB
            367
```

```
Google Salge
Company.
   MSFT
         340
In [37]:
df
Out[37]:
  Company Person Sales
  Google
                  200
            Sam
1 Google
            Nihad
                  120
2 MSFT
             Any
                  340
   FB
3
             Van
                  124
4 FB
           Rakib
                  243
            Ovi
                  350
5 IBM
In [38]:
byComp.std()
Out[38]:
        Sales
Company
FB 84.145707
  Google 56.568542
IBM
            NaN
  MSFT
            NaN
In [39]:
df.groupby('Company').count()
Out[39]:
        Person Sales
Company
FB
  Google
                 2
IBM
                 1
  MSFT
In [40]:
df
Out[40]:
  Company Person Sales
0 Google
                  200
            Sam
1 Google
            Nihad
                  120
                  340
2 MSFT
             Any
```

FB

Van

124

```
4 Compañily Pertskib Salles
       IBM
                  350
In [41]:
df.groupby('Company').describe()
Out[41]:
        Sales
        count mean std min 25% 50% 75% max
Company
  FB 2.0 183.5 84.145707 124.0 153.75 183.5 213.25 243.0
         2.0 160.0 56.568542 120.0 140.00 160.0 180.00 200.0
  Google
         1.0 350.0
                      NaN 350.0 350.00 350.0 350.00 350.0
   MSFT
         1.0 340.0 NaN 340.0 340.00 340.0 340.00 340.0
Merging, Joining and Concatenating
Concatenating
In [42]:
df1 = pd.DataFrame(np.random.randint(1, 20, size = (4, 3)), [1,2,3,4], ['W', 'X', 'Y'])
In [51]:
df2 = pd.DataFrame(np.random.randint(20,40, size = (4, 3)), [5,6,7,8], ['W', 'X', 'Y'])
In [52]:
df3 = pd.DataFrame(np.random.randint(40,60, size = (4, 3)), [9,10,11,12], ['W', 'X', 'Y'])
In [53]:
df1
Out[53]:
   W X Y
2 14 15 8
3 6 13 6
4 4 11 14
In [54]:
df2
Out[54]:
```

```
In [55]:
df3
Out[55]:
  W X Y
9 52 50 47
10 54 53 40
11 57 53 51
12 43 58 47
In [56]:
farme = [df1, df2, df3]
In [57]:
pd.concat(farme)
Out[57]:
  W X Y
1 9 10 19
 2 14 15 8
3 6 13 6
 4 4 11 14
5 32 26 24
 6 25 35 20
7 29 36 25
 8 23 27 29
9 52 50 47
10 54 53 40
11 57 53 51
12 43 58 47
In [58]:
pd.concat(farme, axis = 1)
Out[58]:
    \mathsf{w} \mathsf{x} \mathsf{y} \mathsf{w} \mathsf{x} \mathsf{y} \mathsf{w} \mathsf{x} \mathsf{y}
 1 9.0 10.0 19.0 NaN NaN NaN NaN NaN NaN
 2 14.0 15.0 8.0 NaN NaN NaN NaN NaN NaN
 3 6.0 13.0 6.0 NaN NaN NaN NaN NaN NaN
 4 4.0 11.0 14.0 NaN NaN NaN NaN NaN NaN
 5 NaN NaN NaN 32.0 26.0 24.0 NaN NaN NaN
 6 NaN NaN NaN 25.0 35.0 20.0 NaN NaN NaN
7 NaN NaN NaN 29.0 36.0 25.0 NaN NaN NaN
 8 NaN NaN NaN 23.0 27.0 29.0 NaN NaN NaN
 9 NaN NaN NaN NaN NaN 52.0 50.0 47.0
```

10 NaN NaN NaN NaN NaN 54.0 53.0 40.0

8 23 27 29

12 NaN NaN NaN NaN NaN NaN 43.0 58.0 47.0

### Merging

Out[65]:

```
In [59]:
left = {
    'key':['k0','k1','k2','k3'],
    'A':[10,20,30,40],
    'B':[1,2,3,4]
In [60]:
right = {
   'key':['k0','k1','k2','k3'],
    'C':[100,200,300,400],
    'D':[11,12,13,14]
}
In [61]:
left = pd.DataFrame(left)
In [62]:
right = pd.DataFrame(right)
In [63]:
left
Out[63]:
  key A B
0 k0 10 1
1 k1 20 2
2 k2 30 3
3 k3 40 4
In [64]:
right
Out[64]:
  key C D
0 k0 100 11
1 k1 200 12
2 k2 300 13
3 k3 400 14
In [65]:
pd.merge(left, right, on='key')
```

```
key A B 6 B
   k0 10 1 100 11
 1 k1 20 2 200 12
2 k2 30 3 300 13
 3 k3 40 4 400 14
In [66]:
pd.merge??
Joining
In [67]:
left = {
    'A':['A0','A1','A2'],
'B':['B0','B1','B2']
In [68]:
right = {
    'C':['C0','C2','C3'],
    'D':['D0','D2','D3']
In [69]:
left = pd.DataFrame(left, index = ['k0','k1','k2'])
In [70]:
right = pd.DataFrame(right, index = ['k0','k2','k3'])
In [71]:
left
Out[71]:
    А В
 k0 A0 B0
 k1 A1 B1
 k2 A2 B2
In [72]:
right
Out[72]:
   C D
k0 C0 D0
 k2 C2 D2
 k3 C3 D3
In [76]:
left.join(right, how = 'inner')
```

```
Out[76]:
    \mathbf{A} \quad \mathbf{B} \quad \mathbf{C} \quad \mathbf{D}
k0 A0 B0 C0 D0
k2 A2 B2 C2 D2
In [74]:
left.join??
Operations
In [77]:
df = pd.DataFrame({
    'col1':[444,555,666,444],
    'col2':[1,2,3,4],
    'col3':['abc','def','ghi','xyz']
})
In [78]:
df
Out[78]:
 col1 col2 col3
         1 abc
1 555
          2 def
2 666
         3 ghi
         4 xyz
3 444
In [79]:
df['col1'].unique()
Out[79]:
array([444, 555, 666], dtype=int64)
In [80]:
df['col1'].nunique()
Out[80]:
3
In [82]:
df['col1'].value_counts()
Out[82]:
444 2
     1
555
666
       1
Name: col1, dtype: int64
```

## **Apply Method**

# **Reading File**

```
In [88]:

df = pd.read_excel('SampleData.xlsx', sheet_name = 'SalesOrders')

In [89]:

df
Out[89]:
```

	OrderDate	Region	Rep	Item	Units	Unit Cost	Total
0	2019-01-06	East	Jones	Pencil	95	1.99	189.05
1	2019-01-23	Central	Kivell	Binder	50	19.99	999.50
2	2019-02-09	Central	Jardine	Pencil	36	4.99	179.64
3	2019-02-26	Central	Gill	Pen	27	19.99	539.73
4	2019-03-15	West	Sorvino	Pencil	56	2.99	167.44
5	2019-04-01	East	Jones	Binder	60	4.99	299.40
6	2019-04-18	Central	Andrews	Pencil	75	1.99	149.25
7	2019-05-05	Central	Jardine	Pencil	90	4.99	449.10
8	2019-05-22	West	Thompson	Pencil	32	1.99	63.68
9	2019-06-08	East	Jones	Binder	60	8.99	539.40
10	2019-06-25	Central	Morgan	Pencil	90	4.99	449.10
11	2019-07-12	East	Howard	Binder	29	1.99	57.71
12	2019-07-29	East	Parent	Binder	81	19.99	1619.19
13	2019-08-15	East	Jones	Pencil	35	4.99	174.65
14	2019-09-01	Central	Smith	Desk	2	125.00	250.00
15	2019-09-18	East	Jones	Pen Set	16	15.99	255.84

16	2019-10-05 <b>OrderDate</b>	Central <b>Region</b>	Morgan <b>Rep</b>	Binder It <b>em</b>	Units	Unit Cost	251.72 <b>Total</b>
17	2019-10-22	East	Jones	Pen	64	8.99	575.36
18	2019-11-08	East	Parent	Pen	15	19.99	299.85
19	2019-11-25	Central	Kivell	Pen Set	96	4.99	479.04
20	2019-12-12	Central	Smith	Pencil	67	1.29	86.43
21	2019-12-29	East	Parent	Pen Set	74	15.99	1183.26
22	2020-01-15	Central	Gill	Binder	46	8.99	413.54
23	2020-02-01	Central	Smith	Binder	87	15.00	1305.00
24	2020-02-18	East	Jones	Binder	4	4.99	19.96
25	2020-03-07	West	Sorvino	Binder	7	19.99	139.93
26	2020-03-24	Central	Jardine	Pen Set	50	4.99	249.50
27	2020-04-10	Central	Andrews	Pencil	66	1.99	131.34
28	2020-04-27	East	Howard	Pen	96	4.99	479.04
29	2020-05-14	Central	Gill	Pencil	53	1.29	68.37
30	2020-05-31	Central	Gill	Binder	80	8.99	719.20
31	2020-06-17	Central	Kivell	Desk	5	125.00	625.00
32	2020-07-04	East	Jones	Pen Set	62	4.99	309.38
33	2020-07-21	Central	Morgan	Pen Set	55	12.49	686.95
34	2020-08-07	Central	Kivell	Pen Set	42	23.95	1005.90
35	2020-08-24	West	Sorvino	Desk	3	275.00	825.00
36	2020-09-10	Central	Gill	Pencil	7	1.29	9.03
37	2020-09-27	West	Sorvino	Pen	76	1.99	151.24
38	2020-10-14	West	Thompson	Binder	57	19.99	1139.43
39	2020-10-31	Central	Andrews	Pencil	14	1.29	18.06
40	2020-11-17	Central	Jardine	Binder	11	4.99	54.89
41	2020-12-04	Central	Jardine	Binder	94	19.99	1879.06
42	2020-12-21	Central	Andrews	Binder	28	4.99	139.72

### In [91]:

df.head(10)

### Out[91]:

	OrderDate	Region	Rep	Item	Unite	Unit Cost	Total
	OrderDate	Region	Kep	Item	Units	Unit Cost	l Otal
0	2019-01-06	East	Jones	Pencil	95	1.99	189.05
1	2019-01-23	Central	Kivell	Binder	50	19.99	999.50
2	2019-02-09	Central	Jardine	Pencil	36	4.99	179.64
3	2019-02-26	Central	Gill	Pen	27	19.99	539.73
4	2019-03-15	West	Sorvino	Pencil	56	2.99	167.44
5	2019-04-01	East	Jones	Binder	60	4.99	299.40
6	2019-04-18	Central	Andrews	Pencil	75	1.99	149.25
7	2019-05-05	Central	Jardine	Pencil	90	4.99	449.10
8	2019-05-22	West	Thompson	Pencil	32	1.99	63.68
9	2019-06-08	East	Jones	Binder	60	8.99	539.40

### In [92]:

df.tail()

### Out[92]:

OrderDate Region Rep Item Units Unit Cost Total

```
38 2012ter/Date Regiest Thomp-Sep Biltem Units Unit19088 113948
39 2020-10-31 Central
                     Andrews Pencil
                                      14
                                             1 29
                                                   18 06
40 2020-11-17 Central
                      Jardine Binder
                                      11
                                             4.99
                                                   54.89
                                            19.99 1879.06
41 2020-12-04 Central
                      Jardine Binder
                                      94
                    Andrews Binder
42 2020-12-21 Central
                                             4.99
                                                  139.72
                                      28
In [93]:
df.columns
Out[93]:
Index(['OrderDate', 'Region', 'Rep', 'Item', 'Units', 'Unit Cost', 'Total'], dtype='object')
In [94]:
df.columns.to_list()
Out[94]:
['OrderDate', 'Region', 'Rep', 'Item', 'Units', 'Unit Cost', 'Total']
In [95]:
df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 43 entries, 0 to 42
Data columns (total 7 columns):
OrderDate
             43 non-null datetime64[ns]
             43 non-null object
Region
             43 non-null object
Rep
Item
             43 non-null object
             43 non-null int64
Units
Unit Cost 43 non-null float64
Total 43 non-null float64
dtypes: datetime64[ns](1), float64(2), int64(1), object(3)
memory usage: 2.5+ KB
In [97]:
df.nunique()
Out[97]:
OrderDate
             43
Region
              3
Rep
              11
Tt.em
              37
Units
Unit Cost
             12
             41
Total
dtype: int64
In [98]:
df.head()
```

### Out[98]:

		OrderDate	Region	Кер	Item	Units	Unit Cost	l otal
	0	2019-01-06	East	Jones	Pencil	95	1.99	189.05
	1	2019-01-23	Central	Kivell	Binder	50	19.99	999.50
	2	2019-02-09	Central	Jardine	Pencil	36	4.99	179.64
	3	2019-02-26	Central	Gill	Pen	27	19 99	539 73

```
OrderDate Region
2019-03-15 West
                               Item Units Unit Cost Total
                         Rep
In [99]:
df['20% Dis'] = df['Total'].apply(lambda x: <math>x*(20/100))
In [100]:
df.head()
Out[100]:
    OrderDate Region
                                Item Units Unit Cost Total 20% Dis
                         Rep
0 2019-01-06
                        Jones
                              Pencil
                                                1.99 189.05
                                                              37.810
                                               19.99 999.50
                                                             199.900
 1 2019-01-23 Central
                        Kivell
                              Binder
                                        50
2 2019-02-09
               Central
                       Jardine
                              Pencil
                                        36
                                                4.99 179.64
                                                              35.928
                                Pen
 3 2019-02-26 Central
                          Gill
                                        27
                                               19.99 539.73
                                                            107.946
 4 2019-03-15
                West Sorvino Pencil
                                                2.99 167.44
                                                              33.488
In [101]:
df['Payment'] = df['Total'] - df['20% Dis']
In [102]:
df.head()
Out[102]:
    OrderDate Region
                         Rep
                                Item Units Unit Cost Total
                                                            20% Dis Payment
0 2019-01-06
                              Pencil
                                                                      151.240
                 East
                                        95
                                                1.99 189.05
                                                              37.810
                        Jones
 1 2019-01-23 Central
                                               19.99 999.50
                                                             199.900
                                                                      799.600
                        Kivell
                              Binder
                                        50
 2 2019-02-09
               Central
                       Jardine
                              Pencil
                                        36
                                                4.99 179.64
                                                              35.928
                                                                      143.712
 3 2019-02-26 Central
                                               19.99 539.73
                                                             107.946
                                                                      431.784
                          Gill
                                Pen
                                        27
 4 2019-03-15
                West Sorvino Pencil
                                        56
                                                2.99 167.44
                                                             33.488
                                                                      133.952
In [103]:
import matplotlib.pyplot as plt
In [105]:
plt.figure(figsize = (12,6))
plt.plot(df['OrderDate'], df['Total'])
plt.show()
 1750
 1500
 1250
 1000
  750
  500
```