```
# Pandas
 In [3]:
          # - panel data
          # - core library for data manipulation and data analysis
          #- single and multidimensional data sturcture for data manipulation
          # single-dimensional --> series object
          # multi-dimensional--> data frame
 In [7]:
                    pandas series object(one-dimensinonal)-----
          import pandas as pd
          a=pd.Series([1,2,3,4])
Out[7]: 0
              1
              2
         1
              3
         2
              4
         dtype: int64
In [11]: | #--- changing index ---
          b=pd.Series(([1,2,3,4]),index=['a','b','c','d'])
Out[11]: a
              2
              3
         С
              4
         dtype: int64
In [33]:
        # series object from dictionary
          c=pd.Series({'a':1,'b':2,'c':3,'d':4})
Out[33]: a
              2
              3
         С
              4
         dtype: int64
          c1=pd.Series({'a':1,'b1':2,'c':3,'d1':4})
In [36]:
          c+c1
                                    # opertsion between Series
               2.0
Out[36]:
         а
         b
               NaN
         b1
               NaN
               6.0
         C
         d
               NaN
               NaN
         dtype: float64
          # index position change
In [17]:
          c=pd.Series({'a':1,'b':2,'c':3,'d':4},index=['b','c','a','d'])
          С
              2
Out[17]:
              3
         C
              1
```

```
4
         dtype: int64
          # extracting a singel element
In [28]:
                      #0 1 2 3 4 5
          d=pd.Series([1,2,3,4,5,6])
          d[2]
Out[28]: 3
In [34]:
          d[:4]
                    # sequence of element
Out[34]: 0
              3
         2
              4
         3
         dtype: int64
In [36]:
          d[-3:]
                  # extracting elements from back
Out[36]: 3
              4
              5
              6
         dtype: int64
In [52]:
          # assign value to the elements(change value)
          d[3]=10
          d[4]='nikhil'
                   1
Out[52]:
                   2
         1
         2
                   3
         3
                  10
              nikhil
         4
                   6
         dtype: object
              defining Series from numpy array and other Series
In [57]:
          import numpy as np
          arr=np.array([1,2,3,4])
          e=pd.Series(arr)
Out[57]: 0
              1
         1
              2
         2
              3
              4
         dtype: int32
          arr[2]=-2
                       #change value
In [65]:
         0
              1
Out[65]:
              2
         2
             -2
              4
         dtype: int32
          # basic math operation on Series
In [80]:
          # Adding a scalar value to series elements
```

```
f=pd.Series([1,2,3,4,5])
          f1=f+10
                   # (+,-,*,/)
          f1
Out[80]: 0
              11
              12
         1
          2
              13
          3
              14
              15
         dtype: int64
          f+2 # (+,-,*,/)
In [84]:
              3
Out[84]:
         0
              4
              5
              6
              7
          dtype: int64
In [85]:
          np.log(f) # Log
         0
              0.000000
Out[85]:
         1
              0.693147
          2
              1.098612
          3
              1.386294
              1.609438
         dtype: float64
In [77]: | #adding two Series
          g=pd.Series([5,6,7,8,9])
          f1=f+g
          f1
                6
Out[77]:
                8
              10
          3
              12
              14
         dtype: int64
         # evaluting values
In [40]:
          import pandas as pd
          g=pd.Series([1,0,2,1,2,3],index=['white','white','blue','green','green','yellow'])
          g
                    1
Out[40]:
         white
         white
                    0
         blue
                    2
                    1
          green
                    2
          green
         yellow
                    3
         dtype: int64
In [41]:
          g.unique()
                                        # unique value()
Out[41]: array([1, 0, 2, 3], dtype=int64)
                                     # return unique values and calculate occurences within a Seri
In [42]:
          g.value_counts()
```

```
Out[42]: 2
              2
         1
         3
              1
              1
         dtype: int64
In [51]: | g.isin([0,3]) # values are contained within the data structure
Out[51]: white
                   False
         white
                   True
         blue
                   False
                   False
         green
                   False
         green
                   True
         yellow
         dtype: bool
         # NaN(Not a Number) values
In [22]:
          import numpy as np
          h=pd.Series([3,-6,np.NaN,14])
          h
              3.0
Out[22]: 0
              -6.0
         2
               NaN
              14.0
         dtype: float64
In [24]:
          # isnull()
           # notnull()
          # - identify the indexes without a value
          h.isnull()
Out[24]: 0
              False
         1
              False
         2
              True
              False
         3
         dtype: bool
In [26]: | h.notnull()
         0
               True
Out[26]:
               True
         1
              False
               True
         dtype: bool
          h[h.notnull()]
In [30]:
Out[30]: 0
               3.0
              -6.0
              14.0
         dtype: float64
         h[h.isnull()]
In [32]:
Out[32]: 2
           NaN
         dtype: float64
          #-----Data frame()
                                      2 dimensional- -----
In [68]:
```

```
import pandas as pd
          a=pd.DataFrame({"Name":['nikhil','rahul','kk'],"marks":[80,75,78],"class":['TY','SY','F
Out[68]:
             Name marks class
                            ΤY
          0
             nikhil
                      80
          1
             rahul
                      75
                            SY
          2
                kk
                      78
                            FY
          a=pd.DataFrame(a,columns=['Name','marks']) # columns show specific columns
In [64]:
Out[64]:
             Name marks
             nikhil
                      80
             rahul
                      75
          2
                kk
                      78
          import pandas as pd
In [17]:
           import numpya as
           b=pd.DataFrame(np.arange(16).reshape((4,4)),
                          index=['red','blue','yellow','green'],
                          columns=['ball','pen','pencil','paper'])
           b
                 ball pen pencil paper
Out[17]:
                              2
            red
                   0
                        1
                                     3
            blue
                   4
                        5
                              6
                                     7
                                    11
                        9
                              10
          yellow
                   8
                  12
                       13
                              14
                                    15
          green
In [18]:
          # selecting elements
           b.columns
Out[18]: Index(['ball', 'pen', 'pencil', 'paper'], dtype='object')
In [19]:
           b.index
         Index(['red', 'blue', 'yellow', 'green'], dtype='object')
Out[19]:
          b.values
In [21]:
Out[21]: array([[ 0,
                      1,
                           2,
                               3],
                      5,
                 [ 4,
                          6, 7],
                 [8, 9, 10, 11],
                 [12, 13, 14, 15]])
```

```
pandas
In [23]: | # slicing
           b[:3]
Out[23]:
                  ball pen pencil paper
             red
                    0
                         1
                                2
                                       3
                                       7
                         5
                                6
            blue
                    4
          yellow
                    8
                               10
                                      11
           # convert column to row
In [24]:
           b.transpose()
Out[24]:
                 red blue yellow green
            ball
                   0
                         4
                                8
                                      12
                   1
                         5
                                9
                                      13
            pen
                   2
                         6
                               10
                                      14
          pencil
                   3
                        7
                               11
                                      15
          paper
In [25]:
           # adding new column
           b['price']=[5,7,8,10]
Out[25]:
                  ball pen pencil paper price
             red
                    0
                         1
                                2
                                       3
                                             5
            blue
                    4
                         5
                                6
                                       7
                                             7
          yellow
                    8
                         9
                               10
                                             8
                                      11
                   12
                        13
                               14
                                      15
                                            10
           green
           b1=np.arange(1,8,2)
                                                  # set new value for price
In [26]:
Out[26]: array([1, 3, 5, 7])
In [27]:
           b['price']=b1
Out[27]:
                  ball pen
                            pencil paper price
                    0
                         1
                                2
                                       3
             red
                                             1
            blue
                    4
                         5
                                6
                                       7
                         9
                                             5
          yellow
                    8
                               10
                                      11
```

green

```
# membership of a value
In [59]:
           b.isin([3,'b'])
                                  # value present or not
Out[59]:
                   ball
                         pen pencil
                                      paper price
             red False False
                                False
                                       True False
             blue False False
                                False
                                       False
                                             True
           yellow False False
                                False
                                       False
                                             False
           green False False
                                False
                                       False False
In [63]:
           #delete column
           del b['pen']
Out[63]:
                  ball pencil price
                            2
             red
                     0
                                  1
             blue
                     4
                            6
                                  3
           yellow
                     8
                           10
                                  5
                           14
                                  7
                    12
           green
In [70]:
           #filtering
                 appply the filtering through the application of certain condition(\langle , \rangle, \rangle = , \langle = \rangle
           b[b<10]
           # b[b>10]
           # b[b<=10]
           # b[b>=10]
Out[70]:
                   ball pencil price
             red
                    0.0
                           2.0
                                   1
             blue
                    4.0
                           6.0
                                   3
           yellow
                    8.0
                          NaN
                                   5
                                   7
           green NaN
                          NaN
           # # The index objects
In [12]:
           # - show index
           c=pd.Series([5,0,3,8,4],index=['red','blue','yellow','white','green'])
           c.index
Out[12]: Index(['red', 'blue', 'yellow', 'white', 'green'], dtype='object')
In [27]:
           # methods on index
```

```
#---- for max value
          c.idxmax()
          'white'
Out[27]:
In [29]:
          c.idxmin()
                              # for min value
          'blue'
Out[29]:
          # index with duplicate labels
In [34]:
          c=pd.Series(range(7),index=['red','blue','yellow','white','green','red','blue'])
Out[34]:
         red
                    0
          blue
                    1
         yellow
                    2
          white
                    3
          green
                    4
                    5
          red
         blue
                    6
         dtype: int64
In [36]:
          c['red']
Out[36]: red
                 5
          red
         dtype: int64
          # other functionalities on indexes
In [37]:
          # 1) reindexing
          # 2) dropping
          # 3) alignment
In [52]:
          # 1) reindexing
          # to fill missing value(in order)
          d=pd.Series([2,5,7,4],index=['one','two','three','four']) # normal series
                   2
Out[52]:
         one
                   5
         two
                   7
          three
          four
                   4
         dtype: int64
          d.reindex(['three','four','five','eee'])
In [80]:
Out[80]: three
                   7.0
          four
                   4.0
         five
                   NaN
         eee
                   NaN
         dtype: float64
In [61]:
          # 2) dropping
          # for delete
          d.drop(['one','three'])
Out[61]: two
          four
```

```
dtype: int64
          # 3) airthmetic and data alignment
In [67]:
          d1=pd.Series([1,6,7,8,9],index=['one','brown','three','black','two'])
                   1
Out[67]:
         one
         brown
                   6
                   7
         three
         black
                   8
         two
                   9
         dtype: int64
In [81]:
          d+d1
                  # addition of d+d1, means one(2)+one(1)=3
         black
                    NaN
Out[81]:
         brown
                    NaN
         four
                    NaN
         one
                    3.0
         three
                   14.0
         two
                   14.0
         dtype: float64
In [86]:
          # operation between data structure
          ###--- flexible arithmetic methods
          # add() sub() div() mul()
          d.mul(d1) # div() sub() add()
         black
Out[86]:
                    NaN
         brown
                    NaN
         four
                    NaN
         one
                    2.0
                   49.0
         three
                   45.0
         two
         dtype: float64
          #operation between DataFrame and
                                               Series
In [104...
          import numpy as np
          b=pd.DataFrame(np.arange(16).reshape((4,4)),
                          index=['red','blue','yellow','green'],
                                                                               # dataframe
                          columns=['ball','pen','pencil','paper'])
          c=pd.Series([5,0,3,8,4],index=['ball','blue','pen','pencil','paper'])
                                                                                              # seri
          c-b
                            # +, *,/
Out[104...
                 ball blue paper pen pencil
            red
                   5 NaN
                                    2
                                          6
           blue
                   1 NaN
                              -3
                                   -2
                                          2
          yellow
                  -3 NaN
                              -7
                                   -6
                                         -2
```

```
ball blue paper pen pencil
          green
                  -7 NaN
                                  -10
                                          -6
                             -11
 In [4]:
           # function apllication and mapping
          b=pd.DataFrame(np.arange(16).reshape((4,4)),
                          index=['red','blue','yellow','green'],
                          columns=['ball','pen','pencil','paper'])
           b
 Out[4]:
                 ball
                     pen pencil paper
                   0
                        1
                                     3
            red
           blue
                   4
                        5
                                     7
          yellow
                   8
                        9
                              10
                                    11
          green
                  12
                       13
                              14
                                    15
 In [7]:
              sgrt()
                         ---- calculate square root
          np.sqrt(b)
 Out[7]:
                     ball
                             pen
                                    pencil
                                             paper
            red 0.000000 1.000000 1.414214 1.732051
           blue 2.000000 2.236068 2.449490 2.645751
          yellow 2.828427 3.000000 3.162278 3.316625
          green 3.464102 3.605551 3.741657 3.872983
In [12]:
              function by row or column-----
               # define function
          #lambda function:-block of code that can be passed as an argument to to a function call
          # used when you need a function for a short period time
          # anonymous function
          # calculate the range covered by the elements in an array
          b=lambda x:x.max()-x.min()
         <function __main__.<lambda>(x)>
Out[12]:
In [46]:
          def f(x):
               return x.max()-x.min()
Out[46]: <function __main__.f(x)>
```

In [71]:

z1=pd.DataFrame(np.arange(49).reshape((7,7)),

```
index=['red','blue','yellow','green','black','purple','white'],
                           columns=['ball','pen','pencil','paper','book','textbook','notebook'])
           z1
Out[71]:
                  ball
                      pen
                            pencil paper book textbook notebook
                    0
                         1
                                2
                                       3
                                             4
                                                       5
                                                                  6
             red
            blue
                    7
                         8
                                9
                                      10
                                            11
                                                      12
                                                                 13
          yellow
                   14
                        15
                               16
                                      17
                                            18
                                                      19
                                                                 20
           green
                   21
                        22
                               23
                                      24
                                            25
                                                      26
                                                                 27
           black
                   28
                        29
                               30
                                      31
                                            32
                                                      33
                                                                 34
          purple
                   35
                        36
                               37
                                      38
                                            39
                                                      40
                                                                 41
           white
                   42
                        43
                               44
                                      45
                                            46
                                                      47
                                                                 48
In [72]:
           # apply() -- apply the function just defined on the DataFrame
           z1.apply(f,axis=0)
Out[72]:
                     pen pencil paper book textbook notebook
                ball
                  0
                       1
                              2
                                     3
                                                     5
                                                                6
           min
                                    45
                                                    47
                 42
                      43
                             44
                                           46
                                                               48
          max
             # DataFrame in-build function
In [74]:
               # 1) head()--> 1st five records
               # 2) tail()---> last 5 records
               # 3) shape()--> how much records presents
               # 4) describe()--> information about records
           #1) head()
           z1.head()
Out[74]:
                  ball
                       pen
                            pencil paper book textbook notebook
                    0
                         1
                                2
                                       3
                                             4
                                                       5
                                                                  6
             red
                    7
                         8
                                9
                                      10
                                                      12
                                                                 13
            blue
                                            11
          yellow
                   14
                        15
                               16
                                      17
                                                      19
                                                                 20
                                            18
                        22
                               23
                                      24
                                            25
                                                      26
                                                                 27
           green
                   21
           black
                   28
                        29
                               30
                                      31
                                            32
                                                      33
                                                                 34
           # 2) tail()
In [94]:
           z1.tail()
          <bound method NDFrame.tail of</pre>
                                                                pencil paper
                                                    ball
                                                          pen
                                                                                book textbook notebook
Out[94]:
```

```
black
                                28
                                       29
                                                  30
localhost:8888/nbconvert/html/pandas.ipynb?download=false
```

red

blue

yellow

green

```
39
                                                                        41
          purple
                     35
                           36
                                    37
                                           38
                                                             40
                                                                        48>
          white
                     42
                           43
                                    44
                                           45
                                                  46
                                                             47
           # 3) shape()
In [91]:
           z1.shape
Out[91]: (7, 7)
In [95]:
           # 4) describe()
           z1.describe()
Out[95]:
                                                               book
                       ball
                                         pencil
                                                                      textbook notebook
                                 pen
                                                    paper
           count
                  7.000000
                             7.000000
                                       7.000000
                                                 7.000000
                                                            7.000000
                                                                      7.000000
                                                                                 7.000000
                 21.000000
                            22.000000
                                      23.000000
                                                24.000000
                                                           25.000000
                                                                     26.000000
                                                                                27.000000
           mean
                 15.121728 15.121728
                                      15.121728
                                                15.121728
                                                          15.121728
                                                                     15.121728
                                                                               15.121728
             std
                  0.000000
                             1.000000
                                       2.000000
                                                 3.000000
                                                            4.000000
                                                                      5.000000
            min
                                                                                 6.000000
            25%
                 10.500000
                            11.500000
                                      12.500000
                                                13.500000
                                                           14.500000
                                                                     15.500000
                                                                                16.500000
            50%
                 21.000000
                            22.000000
                                      23.000000
                                                 24.000000
                                                           25.000000
                                                                     26.000000
                                                                                27.000000
            75%
                 31.500000
                            32.500000
                                      33.500000
                                                34.500000
                                                           35.500000
                                                                     36.500000
                                                                                37.500000
            max 42.000000 43.000000 44.000000 45.000000 46.000000 47.000000 48.000000
               sorting and Ranking
 In [7]:
            # sort
               # ascending order
           import pandas as pd
           s=pd.Series([4,1,2,5,9],index=['a','b','c','d','e'])
           s.sort_values()
 Out[7]: b
               1
                2
          C
               4
          а
          d
                5
                9
          dtype: int64
In [13]:
           # Ranking
           # -- it will know which value is at which rank
           s.rank()
          а
               3.0
Out[13]:
               1.0
          b
               2.0
          С
                4.0
                5.0
          dtype: float64
           # assigning a NaN value
 In [7]:
           #(Not a Number)
           import pandas as pd
           import numpy as np
```

```
n=pd.Series([0,1,2,np.NaN],index=['red','black','white','blue'])
          n
         red
                   0.0
 Out[7]:
         black
                   1.0
         white
                   2.0
         blue
                   NaN
         dtype: float64
          n['black']=None
In [37]:
         red
                   0.0
Out[37]:
         black
                   NaN
         white
                   2.0
         blue
                   NaN
          dtype: float64
          # filtering out NaN values
In [39]:
          n.dropna()
                          # eliminated all NaN values
                   0.0
Out[39]:
         red
         white
                   2.0
          dtype: float64
          n[n.notnull()]
                           # another way to drop Nan values
In [41]:
                   0.0
Out[41]: red
          white
                   2.0
         dtype: float64
          #filling in NaN Occurrences
In [44]:
          n.fillna(3)
                           # fill NaN value
Out[44]:
         red
                   0.0
          black
                   3.0
         white
                   2.0
          blue
                   3.0
         dtype: float64
          n.fillna({'black':5,'blue':4})
 In [8]:
         red
                   0.0
 Out[8]:
          black
                   1.0
         white
                   2.0
         blue
                   4.0
         dtype: float64
In [14]:
          # hierachical indexing and leveling
          h=pd.Series(np.random.rand(9),
                      index=[['white','white','white','blue','blue','red','red','red'],
                            ['up','down','right','up','down','right','up','down','left']])
          h
         white
                up
                          0.928982
Out[14]:
                 down
                          0.504775
                          0.060468
                 right
         blue
                 up
                          0.036114
                          0.828382
                 down
                          0.413168
                 right
```

```
0.458447
          red
                 up
                           0.998822
                 down
                 left
                           0.029433
          dtype: float64
In [16]:
          h.index
Out[16]: MultiIndex([('white',
                                    'up'),
                       ('white',
                                  'down'),
                        'white',
                                 'right'),
                         'blue',
                                    'up'),
                         'blue',
                                  'down'),
                         'blue',
                                 'right'),
                          'red',
                                     'up'),
                                  'down'),
                          'red',
                          'red',
                                  'left')],
In [19]:
           h['white']
                   0.928982
Out[19]: up
          down
                   0.504775
          right
                   0.060468
          dtype: float64
           h[:,'up']
In [21]:
                   0.928982
Out[21]:
          white
          blue
                   0.036114
                   0.458447
          red
          dtype: float64
           h['white','up']
In [23]:
          0.9289817809959987
Out[23]:
In [24]:
           # unstack()
           #--converts the Series with hierachical index in a simple DataFrame,
           # where the second set of indexes is converted into a new set of columns
               # convert series to dataframe
           h.unstack()
Out[24]:
                   down
                             left
                                     right
                                                up
           blue 0.828382
                             NaN 0.413168
                                          0.036114
            red 0.998822 0.029433
                                      NaN 0.458447
          white 0.504775
                             NaN 0.060468 0.928982
           h1=pd.DataFrame([1,2,3,4,5],index=['a','b','c','d','e'])
In [31]:
           h1.stack()
                                               # convert dataframe to series
            0
                  1
          а
Out[31]:
          b
            0
                  2
          С
            0
                  3
          d
             0
                  4
            0
                  5
          e
          dtype: int64
```

```
# index option and column option
 In [9]:
          import pandas as pd
          import numpy as np
          ic=pd.DataFrame(np.random.rand(16).reshape(4,4),
                          index=[['white','white','red','red'],['up','down','up','down']],
                         columns=[['pen','pen','paper','paper'],[1,2,1,2]])
          ic
 Out[9]:
                                  pen
                                                  paper
                            1
                                             1
                                                     2
          white
                  up 0.061587 0.832907 0.386859 0.020504
                down 0.680455 0.693956 0.825806 0.842088
           red
                     down 0.313891 0.813661 0.456050 0.527880
In [10]:
          # Recordering and sorting levels
          ic.columns.names=['objects','id']
          ic.index.names=['colors','status']
          ic
Out[10]:
                objects
                                    pen
                                                   paper
                    id
                             1
                                      2
                                              1
                                                       2
          colors
                 status
          white
                    up 0.061587 0.832907 0.386859 0.020504
                 down 0.680455 0.693956 0.825806
                                                0.842088
            red
                       0.604831 0.461955 0.946557
                                                 0.936826
                 down 0.313891 0.813661 0.456050 0.527880
          # return new object with two levels
In [11]:
          ic.swaplevel('colors','status')
Out[11]:
                objects
                                    pen
                                                   paper
                             1
                                      2
                                              1
                                                       2
                    id
          status
                 colors
                 white 0.061587 0.832907 0.386859 0.020504
            up
                       0.680455 0.693956 0.825806
                                                 0.842088
          down
                 white
                       0.604831 0.461955 0.946557
                                                 0.936826
            up
                       down
          ic.sort_values(by='colors')
In [25]:
Out[25]:
                objects
                                    pen
                                                   paper
```

1

peØ

1

pape2

objec**is** 

```
colors
                statध्र
                                     2
                                             1
                                                     2
         colors
                 status
           red
                   up 0.604831 0.461955 0.946557 0.936826
                 down 0.313891 0.813661 0.456050 0.527880
          white
                      down 0.680455 0.693956 0.825806 0.842088
          ic.sort_index()
In [31]:
Out[31]:
               objects
                                   pen
                                                  paper
                   id
                            1
                                 2
                                             1
                                                     2
         colors
                status
                 down 0.313891 0.813661 0.456050 0.527880
           red
                   up 0.604831 0.461955 0.946557 0.936826
          white
                 down 0.680455 0.693956 0.825806 0.842088
                   up 0.061587 0.832907 0.386859 0.020504
          # summary Statistic by Level
In [34]:
          ic.sum(level='colors')
Out[34]: objects
                            pen
                                           paper
             id 1
                         2
                                      1
          colors
          white 0.742042 1.526863 1.212664 0.862592
            red 0.918722 1.275616 1.402606 1.464707
In [39]:
          ic.sum(level='id',axis=1) # for column (axis=1)
                      1 2
Out[39]:
            id
         colors status
          white
                  up 0.448446 0.853412
                down 1.506261 1.536044
           red
                  up 1.551388 1.398781
                down 0.769941 1.341541
```

In [ ]: