notes

April 14, 2024

0.1 Pandas

Pandas is an open-source Python Library used for high-performance data manipulation and data analysis using its powerful data structures. Python with pandas is in use in a variety of academic and commercial domains, including Finance, Economics, Statistics, Advertising, Web Analytics, and more. Using Pandas, we can accomplish many steps in the processing and analysis of data, — load, organize, manipulate, model, and analyze the data.

****Key Features of Pandas****

- Fast and efficient DataFrame object with default and customized indexing.
- Can load many file formats.
- Data alignment and handling of missing data.
- Data manipulation like reshaping and pivoting and many more.
- Columns can be inserted and deleted.
- Group by data for aggregation and transformations.
- High performance merging and joining of data.

Series - One Dimensional with homogeneous data. - One type of data

Dataframe - Two dimensional - rows and columns - with heterogeneous data

0.2 NumPv

NumPy is a python package which stands for 'Numerical Python'.

Key Features

- Mathematical and Logical operations
- NumPy has in-built functions for linear algebra and random number generation.
- Shape Manipulation

NumPy is used along with scipy package [Scientific Python] and matplotlib [plotting]

0.2.1 ndarray

It is the most important object defined in NumPy and it is the N-dimensional array or ndarray. It describes the collection of items of the same type. Every item in an ndarray takes the same size of block in the memory. Each element in ndarray is an object of data-type object (called **dtype**). Any item extracted from ndarray object (by slicing) is represented by a Python object of one of array scalar types.

0.3 SciPy

SciPy library works together with NumPy and provides many user-friendly and efficient numerical practices such as routines for numerical integration and optimization.

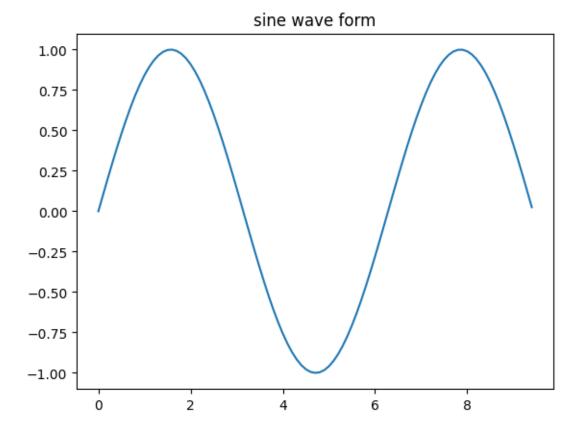
0.4 Matplotlib

It is used to create 2D graphs using python scripts. It has a module called pyplot which make it easy to plot and it also helps to control the line style, font styles and formatting axis. It supports a very wide variety of graphs and plots namely - histogram, bar charts, power spectra, error charts etc.

```
[1]: import numpy as np
import matplotlib.pyplot as plt

# Compute the x and y coordinates for points on a sine curve
x = np.arange(0, 3 * np.pi, 0.1)
y = np.sin(x)
plt.title("sine wave form")

# Plot the points using matplotlib
plt.plot(x, y)
plt.show()
```



0.5 Data Processing

Two main libraries: Pandas and NumPy to process various data formats ### Data Operations

0.5.1 Pandas Series

```
[1]: import pandas as pd
import numpy as np
data = np.array(['a','s','c'])
d = pd.Series(data)
print(d)
```

```
0 a
1 s
2 c
dtype: object
```

0.5.2 Pandas Dataframe

pandas.DataFrame(data, index, columns, dtype, copy)

```
[2]: import pandas as pd
data = {'Name':['Tom', 'Jack', 'Steve', 'Ricky'],'Age':[28,34,29,42]}
df = pd.DataFrame(data, index=['rank1','rank2','rank3','rank4'])
df
```

```
[2]: Name Age
rank1 Tom 28
rank2 Jack 34
rank3 Steve 29
rank4 Ricky 42
```

0.5.3 Data Cleansing

When collecting data or fetching data, most of the times people don't share all of their information so missing data happens and it needs to be fixed.

Example: Few people share their experience, but not how long they are using the product; few people share how long they are using the product, their experience but not their contact information.

For dataframe, it is ALWAYS pd.DataFrame

```
df
 [3]:
             one
                       two
                               three
     a -2.011379 -0.804862
                            1.687874
             {\tt NaN}
                       {\tt NaN}
                                 NaN
     c -0.773984 -0.730600 1.291006
             NaN
                       NaN
                                 NaN
     e 2.147558 0.602790 -0.131916
     f -0.044347 -0.597930 0.682180
     g -1.552349 0.120235 -0.060360
     h 1.780655 0.816198 -0.054545
 [9]: #checking for null values
      #the entire df
     df.isnull()
 [9]:
          one
                 two three
     a False False False
               True True
         True
     c False False False
     d True
               True True
     e False False False
     f False False False
     g False False False
     h False False False
[33]: #checking for null values
      #the one column
     df['one'].isnull()
[33]: a
          False
     b
          True
          False
     С
     d
          True
          False
     е
          False
     f
          False
     g
          False
     h
     Name: one, dtype: bool
[34]: #filling the nan values with O
     df.fillna(0)
[34]:
                               three
             one
                       two
     a 1.610199 -0.433307 0.050328
     ь 0.000000 0.000000 0.000000
     c -0.761050 0.579514 -0.258856
```

```
d 0.000000 0.000000 0.000000
      e 0.543653 -1.848697 -1.399187
      f -0.046237 1.276574 0.195437
      g 1.025117 -0.839656 0.433096
      h 1.535614 0.795355 0.618780
[40]: df.fillna(method='pad')
       #since row d was null, method pad uses the previous row's data [c column to_\sqcup
        ⇔fill in the d column]
[40]:
              one
                        two
                                 three
      a 1.610199 -0.433307 0.050328
      b 1.610199 -0.433307 0.050328
      c -0.761050 0.579514 -0.258856
      d -0.761050 0.579514 -0.258856
      e 0.543653 -1.848697 -1.399187
      f -0.046237 1.276574 0.195437
      g 1.025117 -0.839656 0.433096
      h 1.535614 0.795355 0.618780
[39]: df.dropna()
[39]:
              one
                        two
                                 three
      a 1.610199 -0.433307 0.050328
      c -0.761050 0.579514 -0.258856
      e 0.543653 -1.848697 -1.399187
      f -0.046237 1.276574 0.195437
      g 1.025117 -0.839656 0.433096
      h 1.535614 0.795355 0.618780
[129]: | df = pd.DataFrame(np.random.randn(5, 3), index=['a', 'c', 'e', 'f', '

    'h'],columns=['one', 'two', 'three'])
      df = df.reindex(['a', 'b', 'c', 'd', 'e', 'f', 'g', 'h'])
      df
[129]:
              one
                        two
                                 three
      a 0.347242 -0.110605 1.516642
      b
              NaN
                        NaN
                                  NaN
      c 0.063763 0.460191
                            1.347027
                        NaN
              NaN
                                  NaN
      e 0.031764 -1.142955 -0.447163
      f -0.171389 0.973598 -0.227122
              \mathtt{NaN}
                        NaN
                                  NaN
      h -0.615443 -0.645140 0.374451
[67]: df = pd.read_csv(r'C:\Users\KAREN J FERNANDES\Downloads\Sheet1.csv')
```

```
[68]: df
[68]:
          id
                       salary
                                start_date
                                                   dept
                                                          Unnamed: 5
                                                                       Unnamed: 6 \
                name
      0
           1
                       623.30
                                2012-01-01
                                                      ΙT
                Rick
                                                                  NaN
                                                                               NaN
           2
      1
                 Dan
                       515.20
                                2013-09-23
                                             Operations
                                                                  NaN
                                                                               NaN
      2
           3
               Tusar
                       611.00
                                2014-11-15
                                                      ΙT
                                                                  NaN
                                                                               NaN
      3
           4
                Rvan
                       729.00
                                2014-05-11
                                                      HR
                                                                  NaN
                                                                               NaN
      4
           5
                Gary
                       843.25
                                2015-03-27
                                                Finance
                                                                  NaN
                                                                               NaN
      5
           6
               Rasmi
                       578.00
                                2013-05-21
                                                      IT
                                                                  NaN
                                                                               NaN
      6
           7
              Pranab
                       632.80
                                2013-07-30
                                             Operations
                                                                  NaN
                                                                               NaN
      7
           8
                       722.50
                                2014-06-17
                                                                               NaN
                Guru
                                                Finance
                                                                  NaN
         Unnamed: 7
                             id, name, salary, start date, dept
                                  1, Rick, 623.3, 2012-01-01, IT
      0
                 NaN
      1
                 NaN
                          2, Dan, 515.2, 2013-09-23, Operations
      2
                 NaN
                                   3, Tusar, 611, 2014-11-15, IT
      3
                 NaN
                                    4, Ryan, 729, 2014-05-11, HR
      4
                 NaN
                           5, Gary, 843.25, 2015-03-27, Finance
      5
                 NaN
                                   6, Rasmi, 578, 2013-05-21, IT
      6
                 NaN
                       7, Pranab, 632.8, 2013-07-30, Operations
      7
                 NaN
                            8, Guru, 722.5, 2014-06-17, Finance
[69]: df.columns
[69]: Index(['id', 'name', 'salary', 'start_date', 'dept', 'Unnamed: 5',
              'Unnamed: 6', 'Unnamed: 7', 'id, name, salary, start_date, dept'],
             dtype='object')
[74]: #to drop columns
      df = df.drop(['Unnamed: 6'], axis = 1)
[75]: df.columns
[75]: Index(['id', 'name', 'salary', 'start_date', 'dept'], dtype='object')
[77]:
      df
                               start_date
[77]:
          id
                name
                       salary
                                                   dept
           1
                Rick
                       623.30
                                                      IT
      0
                                2012-01-01
           2
                 Dan
                       515.20
                                2013-09-23
                                             Operations
      1
      2
                       611.00
           3
               Tusar
                                2014-11-15
                                                      ΙT
                                                      HR.
      3
           4
                Ryan
                       729.00
                                2014-05-11
      4
           5
                Gary
                       843.25
                                2015-03-27
                                                Finance
      5
           6
               Rasmi
                       578.00
                                                      ΙT
                                2013-05-21
      6
           7
              Pranab
                       632.80
                                2013-07-30
                                             Operations
                       722.50
           8
                Guru
                                2014-06-17
                                                Finance
```

```
[82]: #to return specific columns
      df.loc[:,['name', 'salary']]
[82]:
          name salary
      0
          Rick 623.30
           Dan 515.20
      1
      2
          Tusar 611.00
      3
          Ryan 729.00
          Gary 843.25
      4
      5
         Rasmi 578.00
      6 Pranab 632.80
          Guru 722.50
[83]: #to return specific columns and rows
      df.loc[[1,2,5],['name','salary']]
[83]:
         name
               salary
      1
          Dan
                515.2
      2 Tusar
                611.0
                578.0
      5 Rasmi
[86]: #to return a range
      df.loc[3:6,['name','salary']]
[86]:
          name salary
          Ryan 729.00
      3
          Gary 843.25
      4
      5
         Rasmi 578.00
      6 Pranab 632.80
```

0.5.4 How to convert json to dataframe

https://sparkbyexamples.com/pandas/pandas-convert-json-to-dataframe/#:~:text=You%20can%20convert%20JS

```
[118]: #Convert json to dataframe
import json
from pandas import json_normalize

jsonstr = '''{
    "ID":["1","2","3","4","5","6","7","8"],
    "Name":["Rick","Dan","Michelle","Ryan","Gary","Nina","Simon","Guru"],
    "Salary":["623.3","515.2","611","729","843.25","578","632.8","722.5"],

    "StartDate":["1/1/2012","9/23/2013","11/15/2014","5/11/2014","3/27/2015","5/
    \( \text{$\dagger} \) 21/2013",
    \( \text{"7/30/2013","6/17/2014"],}
    \( \text{"Dept":["IT","Operations","IT","HR","Finance","IT","Operations","Finance"]} \]
```

```
7111
[119]:
      jsonstr
[119]: '{ \n
               "ID":["1","2","3","4","5","6","7","8"],\n
       "Name":["Rick","Dan","Michelle","Ryan","Gary","Nina","Simon","Guru"],\n
       "Salary":["623.3","515.2","611","729","843.25","578","632.8","722.5"],\n
       "StartDate":[
       "1/1/2012", "9/23/2013", "11/15/2014", "5/11/2014", "3/27/2015", "5/21/2013", \n
       "7/30/2013","6/17/2014"],\n
                                      "Dept":[
       "IT", "Operations", "IT", "HR", "Finance", "IT", "Operations", "Finance"] \n \} '
[140]: import pandas as pd
       jsonStrr = '''{
          "ID":["1","2","3","4","5","6","7","8"],
          "Name":["Rick","Dan","Michelle","Ryan","Gary","Nina","Simon","Guru"],
          "Salary":["623.3","515.2","611","729","843.25","578","632.8","722.5"],
          "StartDate":[ "1/1/2012","9/23/2013","11/15/2014","5/11/2014","3/27/2015","5/
        921/2013",
             "7/30/2013", "6/17/2014"],
          "Dept":[ "IT", "Operations", "IT", "HR", "Finance", "IT", "Operations", "Finance"]
       7111
       # Convert JSON to DataFrame Using read json()
       json_data = pd.read_json(jsonStrr, orient ='index')
       json_data
[140]:
                         0
                                                   2
                                                              3
                                                                          4
                                                                                     5
                                                                                        \
                                      1
       TD
                         1
                                      2
                                                   3
                                                              4
                                                                          5
                                                                                     6
       Name
                      Rick
                                    Dan
                                           Michelle
                                                           Ryan
                                                                      Gary
                                                                                  Nina
       Salary
                     623.3
                                  515.2
                                                611
                                                            729
                                                                    843.25
                                                                                   578
                                                      5/11/2014
       StartDate
                  1/1/2012
                              9/23/2013
                                         11/15/2014
                                                                 3/27/2015
                                                                             5/21/2013
                            Operations
                                                                   Finance
       Dept
                        ΙT
                                                  IT
                                                             HR.
                                                                                    IT
                            6
                                       7
       ID
                            7
                                       8
                                    Guru
       Name
                       Simon
                                   722.5
       Salary
                       632.8
       StartDate
                   7/30/2013
                               6/17/2014
       Dept
                  Operations
                                 Finance
[143]:
      json_data.to_csv('json_data.csv')
       json = pd.read_csv(r'C:\Users\KAREN J_
[146]:
        →FERNANDES\AppData\Local\Programs\Python\Python311\Scripts\Files\Study⊔
        ⇔Notes\json_data.csv')
```

```
[147]: json
[147]:
                                                                             0
                                                                                                              1
                                                                                                                                               2
                                                                                                                                                                              3
                                                                                                                                                                                                            4
                        Unnamed: 0
                                                                                                              2
                                                                                                                                                3
                                                                                                                                                                              4
                   0
                                              ID
                                                                             1
                   1
                                         Name
                                                                    Rick
                                                                                                        Dan
                                                                                                                            Michelle
                                                                                                                                                                      Ryan
                                                                                                                                                                                                    Gary
                   2
                                   Salary
                                                                  623.3
                                                                                                   515.2
                                                                                                                                          611
                                                                                                                                                                        729
                                                                                                                                                                                               843.25
                   3
                           StartDate
                                                          1/1/2012
                                                                                        9/23/2013
                                                                                                                     11/15/2014
                                                                                                                                                        5/11/2014
                                                                                                                                                                                      3/27/2015
                   4
                                         Dept
                                                                          ΙT
                                                                                    Operations
                                                                                                                                            IT
                                                                                                                                                                           HR.
                                                                                                                                                                                            Finance
                                                 5
                                                                                   6
                                                                                                                 7
                                                 6
                                                                                  7
                   0
                                                                                                                 8
                   1
                                         Nina
                                                                       Simon
                                                                                                        Guru
                   2
                                           578
                                                                       632.8
                                                                                                      722.5
                   3
                          5/21/2013
                                                            7/30/2013
                                                                                           6/17/2014
                                                         Operations
                                                                                                Finance
[155]: df_long = json.melt(id_vars=["ID", "Name", "StartDate", "Dept"],
                       ⇔var_name="Variable", value_name="Value")
                     KeyError
                                                                                                                                          Traceback (most recent call last)
                     Cell In[155], line 1
                     ----> 1 df_long =_
                         -json.melt(id_vars=["ID", "Name", "StartDate", "Dept"], var_name="Variable", value_name="Variable", value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_name="Value_
                     File
                         --~\AppData\Local\Programs\Python\Python311\Lib\site-packages\pandas\core\frame
                         upy:9124, in DataFrame.melt(self, id_vars, value_vars, var_name, value_name,
                         ⇔col level, ignore index)
                              9113 @Appender(_shared_docs["melt"] % {"caller": "df.melt(", "other": "melt")
                              9114 def melt(
                              9115
                                                      self,
                              (...)
                                                      ignore_index: bool = True,
                              9121
                              9122 ) -> DataFrame:
                     -> 9124
                                                      return melt(
                              9125
                                                                  self,
                              9126
                                                                  id_vars=id_vars,
                              9127
                                                                  value_vars=value_vars,
                              9128
                                                                  var_name=var_name,
                              9129
                                                                 value_name=value_name,
                              9130
                                                                  col level=col level,
                                                                  ignore_index=ignore_index,
                             9131
                                                       ). finalize (self, method="melt")
                              9132
```

```
File
         -~\AppData\Local\Programs\Python\Python311\Lib\site-packages\pandas\core\reshare\melt.
         opy:77, in melt(frame, id_vars, value_vars, var_name, value_name, col_level, u
         →ignore_index)
             75
                        missing = Index(com.flatten(id_vars)).difference(cols)
             76
                        if not missing.empty:
        ---> 77
                            raise KeyError(
             78
                                "The following 'id_vars' are not present "
             79
                                f"in the DataFrame: {list(missing)}"
             80
                            )
             81 else:
             82
                    id vars = []
       KeyError: "The following 'id_vars' are not present in the DataFrame: ['Dept', __
         →'ID', 'Name', 'StartDate']"
[121]: import pandas as pd
       jsonStr = '''{"Index0":{"Courses": "Pandas","Discount": "1200"},
                  "Index1":{"Courses": "Hadoop", "Discount": "1500"},
                  "Index2":{"Courses": "Spark", "Discount": "1800"}
                 }!!!
       # Convert JSON to DataFrame Using read json()
       df2 = pd.read_json(jsonStr, orient ='index')
       df2
[121]:
              Courses Discount
       Index0 Pandas
                           1200
       Index1 Hadoop
                           1500
       Index2
                Spark
                           1800
[157]: import pandas as pd
       with pd.ExcelFile('C:/Users/Rasmi/Documents/pydatasci/input.xlsx') as xls:
           df1 = pd.read_excel(xls, 'Sheet1')
           df2 = pd.read_excel(xls, 'Sheet2')
       print("****Result Sheet 1****")
       print (df1[0:5]['salary'])
       print("")
       print("***Result Sheet 2****")
       print (df2[0:5]['zipcode'])
       FileNotFoundError
                                                  Traceback (most recent call last)
       Cell In[157], line 2
              1 import pandas as pd
```

```
⊶xls:
           df1 = pd.read_excel(xls, 'Sheet1')
     3
     4
           df2 = pd.read_excel(xls, 'Sheet2')
 -~\AppData\Local\Programs\Python\Python311\Lib\site-packages\pandas\io\excel\_oase.
 opy:1652, in ExcelFile. init_(self, path_or_buffer, engine, storage_options)
           ext = "xls"
   1650
   1651 else:
-> 1652
           ext = inspect excel format(
   1653
               content_or_path=path_or_buffer, storage_options=storage_options
   1654
   1655
           if ext is None:
   1656
               raise ValueError(
                   "Excel file format cannot be determined, you must specify "
   1657
                   "an engine manually."
   1658
   1659
File
 --~\AppData\Local\Programs\Python\Python311\Lib\site-packages\pandas\io\excel\_base.
 apy:1525, in inspect_excel_format(content_or_path, storage_options)
   1522 if isinstance(content_or_path, bytes):
   1523
           content_or_path = BytesIO(content_or_path)
-> 1525 with get handle(
           content_or_path, "rb", storage_options=storage_options, is_text=Fal =
   1526
   1527 ) as handle:
   1528
           stream = handle.handle
   1529
           stream.seek(0)
File
 -~\AppData\Local\Programs\Python\Python311\Lib\site-packages\pandas\io\common.
 py:865, in get_handle(path_or_buf, mode, encoding, compression, memory_map,_
 ⇔is text, errors, storage options)
               handle = open(
   856
    857
                   handle,
    858
                   ioargs.mode,
   (...)
   861
                   newline="",
               )
   862
    863
           else:
    864
               # Binary mode
--> 865
               handle = open(handle, ioargs.mode)
    866
           handles.append(handle)
    868 # Convert BytesIO or file objects passed with an encoding
FileNotFoundError: [Errno 2] No such file or directory: 'C:/Users/Rasmi/
 →Documents/pydatasci/input.xlsx'
```

```
[16]: #import numpy as np
      #import pandas as pd
      #create DataFrame
      percentile = pd.DataFrame({'var1': [25, 12, 15, 14, 19, 23, 25, 29, 33, 35],
                          'var2': [5, 7, 7, 9, 12, 9, 9, 4, 14, 15],
                          'var3': [11, 8, 10, 6, 6, 5, 9, 12, 13, 16]})
      #percentile is the 'of the total lot or population', so if it is 95 percentile,
       ⇒you are in the among the 95% of the lot or
      #population
      #numpy.percentile(a, q)
      #a: Array of values
      \#q: Percentile or sequence of percentiles to compute, which must be between O_{\sqcup}
       ⇔and 100 inclusive.
      #for all the columns
      percentile.quantile(.95)
[16]: var1
              34.10
      var2
              14.55
      var3
              14.65
      Name: 0.95, dtype: float64
[15]: #selected columns
      percentile[['var1','var2']].quantile(.95)
[15]: var1
              34.10
              14.55
      var2
      Name: 0.95, dtype: float64
 []: #find the difference in the highest salaries between two depts ie; dept_id 4u
       \rightarrow and 1
      # Import your libraries
      import pandas as pd
      # Start writing code
      db_employee.head()
      db_dept.head()
      db employee[db employee['department id'] == 4]['salary'].
       →max()-db_employee[db_employee['department_id']==1]['salary'].max()
 []: #Popularity of Hack
```

```
#Based on the above, find the average popularity of the Hack per office
      \rightarrow location.
     #Output the location along with the average popularity.
     import pandas as pd
     import numpy as np
     merged = pd.merge(facebook_employees,facebook_hack_survey, left_on = 'id',__
      Gright_on = 'employee_id', how = 'inner')
     result = merged.groupby(['location'])['popularity'].mean().reset_index()
[]: #sort in ascending order of id
     # Import your libraries
     import pandas as pd
     import numpy as np
     # Start writing code
     ms_employee_salary.head()
     ms_employee_salary.groupby('id').max().reset_index()
     #or
     ms_employee_salary.sort_values(['id', 'salary'], ascending = (True, False)).

¬groupby(['id']).first().reset_index()
[]: #Compare each employee's salary with the average salary of the corresponding.
      ⇔department.
     #Import your libraries
     import pandas as pd
     # Start writing code
     employee.head()
     df = employee
     df
     df["avg_sal"] = employee.groupby('department')['salary'].transform('mean')
     df[['department','first_name','salary','avg_sal']]
[]: #count the no of users who use macbook pro or Count the number of user events
      ⇔performed by MacBookPro users.
     #Import your libraries
     import pandas as pd
     # Start writing code
     df = playbook_events
```

```
df
     df[df['device'] == 'macbook pro']['event_name'].value_counts().reset_index()
     #by default, meaning without many parameters in the brackets, it is \Box
      ⇔ascending=False meaning descending
     Syntax: Series.value_counts(normalize=False, sort=True, ascending=False, ___
      ⇔bins=None, dropna=True)
[1]: py = {1:'Apple',2:'Mango'}
[2]: py
[2]: {1: 'Apple', 2: 'Mango'}
[]:
[]:
[]:
[]:
[]:
[]:
[]:
```