

What is pandas?

- Pandas is a Python library used for working with data sets.
- It has functions for analyzing, cleaning, exploring and manipulating data.

File Read Write operations

```
In [5]:
    #the type of the draft1 is dataFrame
    #DataFrame is nothing but the tabular structure of the data
    type(draft1)
```

pandas.core.frame.DataFrame

- Default delimiter for a csv is ','
- In case if the delimiter is anyting else apart from ',' then we can use the parameter sep="sepeartor" when reading the file eg: pd.read_csv('filename.csv',sep="seperator"
- Incase if we dont mention seperator then all the the data will come in only one column
- 1. draft1.head() -----> Default this will read the top 5 rows in the data
- 2. draft1.tail()----->Default this will read the last 5 rows in the data
- 3. In case if there are less than 5 rows then it will read how much ever data is there in a file

```
In [6]: draft1.head()

Out[6]: a b c d message

0 1 2 3 4 hello
1 5 6 7 8 world
2 9 10 11 12 foo
```

- 1. We can even mention custom number of rows that needs to be read from a file when using head() or tail().
- 2. This can be done by specifying the number as a function parameter

```
In [8]: draft1.head(1)

Out[8]: a b c d message

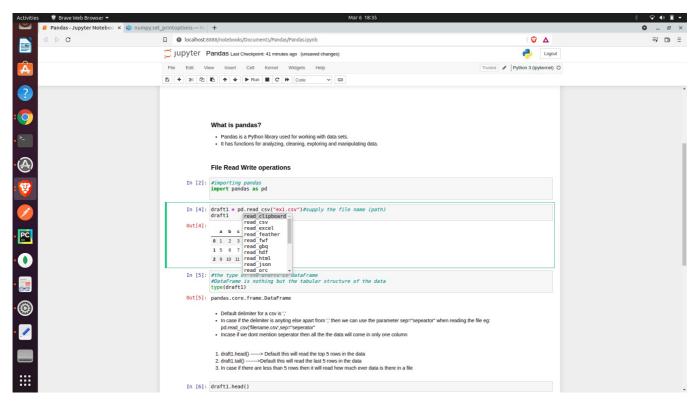
O 1 2 3 4 hello

In [9]: draft1.tail(1)

Out[9]: a b c d message

2 9 10 11 12 foo
```

1. In case if you want to see all the parameters that are allowed inside a function, place the cursor there and enter the 'tab' button



```
In [10]: #Incase if you want to read a \t(tab) seperated data
draft2 = pd.read_table('test.tsv') #Read a tsv into a dataframe
draft2
Out[10]: test test test.1 test.2 test.3
sudh sudh sudh sudh sudh sudh
kumar kumar kumar kumar kumar kumar kumar
```

Out[12]:

test test test.1 test.2 test.3

sudh sudh sudh sudh sudh sudh
kumar kumar kumar kumar kumar kumar

1. Incase if you dont want consider the first row as a constant.

1. Incase if you dont want consider the first row as a columns header we can specify header= None when reading the data using read_csv

1 5 6 7 8 world **2** 9 10 11 12 foo

2 9 10 11 12

foo NaN NaN

- 1. In case if want to mention our own column names in a dataset then we use names as parameter when reading a file
- 2. Incase if number of column names are more when compared to actual number of columns then those columns will be filled with NaN(Not a Number)

```
In [18]: # Reading data with two levels
    parsed = pd.read_csv('csv_mindex.csv')
    parsed
```

key2 value1 value2 Out[18]: key1 0 one 3 5 6 2 one С 7 8 3 one d 9 10 12 b 11 two 6 two С 13 14 15

- we try to perform multilevel indexing operation on the above data
- 1. In the above data we see that 'one' and 'two' in key1 are repeated 4 times.
- 2. When **key1** is **one** we have a,b,c,d and when it is **two** we have a,b,c,d
- 3. Instead of writing the one four times we can write it one time and internally it will create index of indices
- 4. This is called hierarchical indexing
- 5. Here we try to perform index_col=['key1','key2']

```
#By default we have 0,1,2,3,4,..... as index. But we dont want to mention that as index and we specify #another column as indices

parsed = pd.read_csv('csv_mindex.csv',index_col=['key1','key2'])

parsed

#Here we have index inside index
```

		value1	value2
key1	key2		
one	а	1	2
	b	3	4
	С	5	6
	d	7	8
two	а	9	10
	b	11	12
	С	13	14
	d	15	16

Skip rows

UUT[23]:

```
In [24]: pd.read_csv('ex4.csv')

Out[24]: #hey!

a b c d message

# just wanted to make things more difficult for you NaN NaN NaN NaN NaN

# who reads CSV files with computers anyway? NaN NaN NaN NaN

1 2 3 4 hello

5 6 7 8 world

9 10 11 12 foo
```

1. In the above it is observed that the rows 0, 2,3 are not proper. So we can try to skip that rows using the parameter skiprows=[numbers of rows to be skipped]

Checking Null values

result = pd.read_csv('ex5.csv') result

- 1. In the above we can observe that we have two $\text{null}(\mathbf{NaN})$ values
- 2. We can use isnull(dataset) inorder to check if the value is null or not
- 3. This will return a boolean value as shown below

```
In [28]:
            pd.isnull(result)
              something
Out[28]:
                                   b
                                               d message
                               False
                                     False
                                           False
                  False
                  False
                        False False
                                           False
                                                     False
                                      True
                  False
                        False False
                                     False
                                                     False
```

1. Incase if you want to read specific sheet in a given excel file then we can add a parameter named **sheetname** when reading the excel file

```
draft3
```

Out[37]:		qwef	Unnamed: 1	vddsx	Unnamed: 3	xaas
	0	NaN	asasa	dadaxxa	NaN	NaN
	1	NaN	adadfsd	NaN	casaed	w
	2	sdfsdfsdf	d	gdsg	ddsgsd	NaN

Reading html data

```
In [41]:
           url = "http://www.basketball-reference.com/leagues/NBA_2015_totals.html"
           BB data = pd.read html(url)
           df = BB_data[0]
           df.head(10)
                             Pos
                       Player
                                             G GS
                                                     MP
                                                          FG FGA ... FT% ORB DRB TRB AST STL BLK TOV
                                                                                                                PF
                                                                                                                    PTS
Out[41]:
                                  Age
                   Quincy Acy
                                   24
                                       NYK
                                            68
                                                22
                                                    1287
                                                          152
                                                               331
                                                                      .784
                                                                             79
                                                                                  222
                                                                                       301
                                                                                             68
                                                                                                       22
                                                                                                            60
                                                                                                               147
                                                                                                                     398
                 Jordan Adams
                                   20
                                       MEM
                                                     248
                                                          35
                                                                86
                                                                              9
                                                                                   19
                                                                                        28
                                                                                             16
                                                                                                            14
                                                                                                                      94
```

```
2
        Steven Adams
                         С
                              21
                                   OKC
                                              67
                                                   1771
                                                        217
                                                               399
                                                                         .502
                                                                                199
                                                                                      324
                                                                                            523
                                                                                                          38
                                                                                                                86
                                                                                                                      99
                                                                                                                          222
                                                                                                                                 537
    3
                                         70
                                                                                                    66
                        PF
3
           Jeff Adrien
                              28
                                    MIN
                                         17
                                               0
                                                    215
                                                          19
                                                                 44
                                                                         .579
                                                                                 23
                                                                                       54
                                                                                              77
                                                                                                    15
                                                                                                           4
                                                                                                                 9
                                                                                                                       9
                                                                                                                           30
                                                                                                                                  60
4
    5
          Arron Afflalo
                        SG
                              29
                                   TOT
                                         78
                                              72
                                                   2502
                                                         375
                                                               884
                                                                                 27
                                                                                       220
                                                                                            247
                                                                                                   129
                                                                                                                     116
                                                                                                                          167
                                                                                                                                1035
                              29
                                                         281
                                                                                 21
                                                                                                          32
                                                                                                                 5
                                                                                                                      83
                                                                                                                                 771
5
    5
          Arron Afflalo
                        SG
                                   DEN 53
                                              53 1750
                                                               657
                                                                         .841
                                                                                      159
                                                                                             180
                                                                                                   101
                                                                                                                          108
                                                                                                    28
                        SG
                                                                                  6
                                                                                       61
                                                                                              67
                                                                                                           9
                                                                                                                 2
                                                                                                                      33
                                                                                                                                 264
6
    5
          Arron Afflalo
                              29
                                   POR 25
                                              19
                                                    752
                                                          94
                                                               227
                                                                         .851
                                                                                                                           59
         Alexis Ajinça
                         С
                              26
                                   NOP
                                         68
                                                    957
                                                         181
                                                               329
                                                                         .818
                                                                                104
                                                                                      211
                                                                                            315
                                                                                                    47
                                                                                                          21
                                                                                                                51
                                                                                                                      69
                                                                                                                          151
                                                                                                                                 443
       Furkan Aldemir
                              23
                                    PHI 41
                                               9
                                                    540
                                                          40
                                                                 78
                                                                         .481
                                                                                 78
                                                                                       98
                                                                                            176
                                                                                                    28
                                                                                                          17
                                                                                                                16
                                                                                                                      17
                                                                                                                                  93
                                                                                                                           96
                                                               301
                                                                                101
                                                                                                         37
          Cole Aldrich
                              26
                                   NYK
                                        61
                                              16
                                                    976
                                                         144
                                                                         .781
                                                                                      237
                                                                                            338
                                                                                                    75
                                                                                                                65
                                                                                                                      59
                                                                                                                          122
                                                                                                                                 338
```

10 rows × 30 columns

df.tail(10)

- Whenever you want to access single column then we can mention only one square braces and mention the column name
- Whenever you want to access multiple columns then we mention all the column names inside a list. Then only we will be able to access the data.

```
In [43]:
           df[['MP','Tm']]
Out[43]:
                MP
                      Tm
               1287
                     NYK
                248
                    MEM
               1771
                     OKC
                215
                     MIN
               2502
                     TOT
          670
              2434
                     TOT
          671
               1605
                     MIN
          672
                829
                     BRK
          673
               1487
                     CHO
          674 1731 BOS
         675 rows × 2 columns
```

. Whenever you are reading data only from one column then the type of data is considered as series

```
In [44]: type(df['MP'])
```

• If you want the type of data to be dataframe even when we give only one column name then put [[column name]]. Then it will be treated as dataframe

```
In [45]: type(df[['MP']])
```

Out[45]: pandas.core.frame.DataFrame

Working on titanic dataset

In [46]: #Reading the data from github
 titanic_train = pd.read_csv("https://raw.githubusercontent.com/datasciencedojo/datasets/master/titanic.csv")
 titanic_train

Out[46]:		Passengerld	Survived	Pclass	Name	Sex	Age	SibSp	Parch	Ticket	Fare	Cabin	Embarked
	0	1	0	3	Braund, Mr. Owen Harris	male	22.0	1	0	A/5 21171	7.2500	NaN	S
	1	2	1	1	Cumings, Mrs. John Bradley (Florence Briggs Th	female	38.0	1	0	PC 17599	71.2833	C85	С
	2	3	1	3	Heikkinen, Miss. Laina	female	26.0	0	0	STON/O2. 3101282	7.9250	NaN	S
	3	4	1	1	Futrelle, Mrs. Jacques Heath (Lily May Peel)	female	35.0	1	0	113803	53.1000	C123	S
	4	5	0	3	Allen, Mr. William Henry	male	35.0	0	0	373450	8.0500	NaN	S
	886	887	0	2	Montvila, Rev. Juozas	male	27.0	0	0	211536	13.0000	NaN	S
	887	888	1	1	Graham, Miss. Margaret Edith	female	19.0	0	0	112053	30.0000	B42	S
	888	889	0	3	Johnston, Miss. Catherine Helen "Carrie"	female	NaN	1	2	W./C. 6607	23.4500	NaN	S
	889	890	1	1	Behr, Mr. Karl Howell	male	26.0	0	0	111369	30.0000	C148	С
	890	891	0	3	Dooley, Mr. Patrick	male	32.0	0	0	370376	7.7500	NaN	Q

891 rows × 12 columns

#Reading the first 10 rows titanic train.head(10)

Out[47]:		Passengerld	Survived	Pclass	Name	Sex	Age	SibSp	Parch	Ticket	Fare	Cabin	Embarked
	0	1	0	3	Braund, Mr. Owen Harris	male	22.0	1	0	A/5 21171	7.2500	NaN	S
	1	2	1	1	Cumings, Mrs. John Bradley (Florence Briggs Th	female	38.0	1	0	PC 17599	71.2833	C85	С
	2	3	1	3	Heikkinen, Miss. Laina	female	26.0	0	0	STON/O2. 3101282	7.9250	NaN	S
	3	4	1	1	Futrelle, Mrs. Jacques Heath (Lily May Peel)	female	35.0	1	0	113803	53.1000	C123	S
	4	5	0	3	Allen, Mr. William Henry	male	35.0	0	0	373450	8.0500	NaN	S
	5	6	0	3	Moran, Mr. James	male	NaN	0	0	330877	8.4583	NaN	Q
	6	7	0	1	McCarthy, Mr. Timothy J	male	54.0	0	0	17463	51.8625	E46	S
	7	8	0	3	Palsson, Master. Gosta Leonard	male	2.0	3	1	349909	21.0750	NaN	S
	8	9	1	3	Johnson, Mrs. Oscar W (Elisabeth Vilhelmina Berg)	female	27.0	0	2	347742	11.1333	NaN	S
	9	10	1	2	Nasser, Mrs. Nicholas (Adele Achem)	female	14.0	1	0	237736	30.0708	NaN	С

```
In [48]:
#Reading a data from specified columns (Pclass, Name)
titanic_train[["Name",'Pclass']].head()
```

Out[48]: Name Pclass

```
Braund, Mr. Owen Harris 3
Cumings, Mrs. John Bradley (Florence Briggs Th... 1
Heikkinen, Miss. Laina 3
Futrelle, Mrs. Jacques Heath (Lily May Peel) 1
Allen, Mr. William Henry 3
```

The beauty of pandas is it will understand the datatype of a column by itself

. If you want to know the data types of all the columns in the dataset then we use dtypes

```
In [49]:
           titanic_train.dtypes
          PassengerId
                            int64
Out[49]:
          Survived
                            int64
          Pclass
                            int64
          Name
                           object
          Sex
                           object
                          float64
          Age
          SibSp
                            int64
          Parch
                            int64
          Ticket
                           object
          Fare
                           float64
          Cabin
                           object
          Embarked
                           object
          dtype: object
```

```
Task
In [52]:
             #1.Read data with proper delimiter
             data = pd.read_csv("https://raw.githubusercontent.com/akhil12028/Bank-Marketing-data-set-analysis/master/bank-add
In [53]:
             data
                                    marital
                                                     education
                                                                  default
                                                                                                             day_of_week
                   age
                               job
                                                                          housing
                                                                                    loan
                                                                                            contact month
                                                                                                                               campaign
                                                                                                                                          pdays
                                                                                                                                                  previous
                                                                                                                                                             р
                0
                    56
                         housemaid
                                     married
                                                       basic.4y
                                                                                          telephone
                                                                                                                                             999
                                                                                                                                                         0
                                                                                                                                                            no
                     57
                                                    high.school
                                                                                                                                             999
                                                                                                                                                         0
                           services
                                    married
                                                                unknown
                                                                                no
                                                                                          telephone
                                                                                                                     mon
                                                                                                                                                           no
                                                                                      no
                                                                                                       may
                    37
                                                                                                                                             999
                2
                           services
                                    married
                                                    high.school
                                                                                          telephone
                                                                                                                                       1
                                                                                                                                                         0 no
                                                                      no
                                                                               ves
                                                                                      no
                                                                                                       mav
                                                                                                                     mon
                                                                                                                                             999
                3
                    40
                             admin.
                                    married
                                                       basic.6y
                                                                      no
                                                                                no
                                                                                      no
                                                                                          telephone
                                                                                                       may
                                                                                                                     mon
                                                                                                                                                         0
                                                                                                                                                           no
                     56
                                                    high.school
                                                                                                                                             999
                                                                                                                                                         0 no
                                                                      no
                                                                                no
                                                                                          telephone
                                                                                                       may
                                                                                                                     mon
                                                                                                                                       1
            41183
                    73
                             retired
                                   married
                                             professional.course
                                                                      no
                                                                               yes
                                                                                      no
                                                                                            cellular
                                                                                                        nov
                                                                                                                        fri
                                                                                                                                       1
                                                                                                                                             999
                                                                                                                                                         0 no
            41184
                     46
                                                                                                                                             999
                                                                                                                                                         0
                         blue-collar
                                    married
                                             professional.course
                                                                      no
                                                                                             cellular
                                                                                                                                                           no
                                                                                no
                                                                                      no
                                                                                                        nov
            41185
                     56
                                                                                                                        fri
                                                                                                                                       2
                                                                                                                                             999
                                                                                                                                                         0 no
                                               university.dearee
                                                                                            cellular
                             retired
                                    married
                                                                      no
                                                                               ves
                                                                                      no
                                                                                                        nov
                                                                                                                        fri ...
            41186
                     44
                          technician
                                    married
                                             professional.course
                                                                      no
                                                                                no
                                                                                      no
                                                                                             cellular
                                                                                                        nov
                                                                                                                                             999
                                                                                                                                                         0
                                                                                                                                                           no
                                                                                                                                             999
            41187
                                    married
                                             professional.course
                                                                      no
                                                                               yes
                                                                                             cellular
           41188 rows × 21 columns
In [54]:
             #2.Print first 5 rows
             data.head(5)
                                                      default housing
                                marital
                                                                                                 day_of_week
                                                                                                                                                 poutcome
Out[54]:
                           iob
                                         education
                                                                                contact month
                                                                                                                              pdays
                                                                                                                                      previous
               age
                                                                        loan
                                                                                                                   campaign
                                                                                                                                 999
                    housemaid
                                married
                                            basic.4y
                                                                              telephone
                                                                                                                                                 nonexistent
                                                                    no
                                                                           no
                                                                                            may
                                                                                                          mon
                                                                                                                                 999
                57
                                         high.school unknown
                                                                                                                                                 nonexistent
                       services married
                                                                    no
                                                                          no
                                                                              telephone
                                                                                            may
                                                                                                          mon
            2
                37
                       services
                                married
                                         high.school
                                                           no
                                                                   yes
                                                                              telephone
                                                                                            may
                                                                                                          mon
                                                                                                                                 999
                                                                                                                                                 nonexistent
                40
                                                                                                                                 999
                        admin.
                                married
                                            basic.6y
                                                                              telephone
                                                                                                                                                 nonexistent
                                                           no
                                                                    no
                                                                                            may
                                                                                                          mon
                56
                       services married high.school
                                                                                                                                 999
                                                                                                                                                nonexistent
                                                                              telephone
                                                           no
                                                                    no
                                                                          ves
                                                                                            mav
                                                                                                          mon
```

dtype: int64

```
In [55]:
           #3.print last 2 rows
           data.tail(2)
                                            education default housing loan contact month day_of_week ... campaign pdays previous
Out[55]:
                age
                          job marital
                                                                                                fri ...
          41186
                44 technician married professional.course
                                                                          cellular
                                                                                   nov
                                                                                                             1
                                                                                                                  999
                                                                                                                            0 nonexis
                                                         no
                                                                 no
                                                                      no
          41187
                 74
                       retired married professional.course
                                                                                                fri ...
                                                                                                             3
                                                                                                                  999
                                                         no
                                                                yes
                                                                      no
                                                                          cellular
                                                                                   nov
         2 rows × 21 columns
 In [ ]:
In [60]:
           #5. select one column and print its data types
           data['pdays'].dtype
Out[60]: dtype('int64')
In [61]:
           # 6. print data dtype
           data.dtypes
Out[61]: age
                               int64
          job
                              object
          marital
                              object
          education
                              object
          default
                              object
          housing
                              object
          loan
                              object
          contact
                              object
          month
                              object
          day_of_week
                              object
          duration
                               int64
                               int64
          campaign
          pdays
                               int64
          previous
                               int64
          poutcome
                              object
                             float64
          emp.var.rate
          cons.price.idx
                             float64
          cons.conf.idx
                             float64
          euribor3m
                             float64
          nr.employed
                             float64
                              object
          dtype: object
In [67]:
           #7. check if any data is null
           data.isnull().sum()
Out[67]: age
                             0
          job
                             0
          marital
                             0
                             0
          education
          default
                             0
          housing
                             0
          loan
                             0
                             0
          contact
          month
                             0
          day of week
          duration
                             0
          campaign
                             0
          pdays
                             0
                             0
          previous
          poutcome
                             0
          emp.var.rate
                             0
          cons.price.idx
                             0
          cons.conf.idx
                             0
          euribor3m
                             0
          nr.employed
                             0
                             0
```

In [68]:

#8. Skip random rows
pd.read_csv("https://raw.githubusercontent.com/akhil12028/Bank-Marketing-data-set-analysis/master/bank-additional

8]:		age	job	marital	education	default	housing	loan	contact	month	day_of_week	 campaign	pdays	previous	р
	0	56	housemaid	married	basic.4y	no	no	no	telephone	may	mon	 1	999	0	no
	1	45	services	married	basic.9y	unknown	no	no	telephone	may	mon	 1	999	0	no
	2	59	admin.	married	professional.course	no	no	no	telephone	may	mon	 1	999	0	no
	3	41	blue-collar	married	unknown	unknown	no	no	telephone	may	mon	 1	999	0	no
	4	24	technician	single	professional.course	no	yes	no	telephone	may	mon	 1	999	0	no
	41179	73	retired	married	professional.course	no	yes	no	cellular	nov	fri	 1	999	0	no
	41180	46	blue-collar	married	professional.course	no	no	no	cellular	nov	fri	 1	999	0	no
	41181	56	retired	married	university.degree	no	yes	no	cellular	nov	fri	 2	999	0	no
	41182	44	technician	married	professional.course	no	no	no	cellular	nov	fri	 1	999	0	no
	41183	74	retired	married	professional.course	no	yes	no	cellular	nov	fri	 3	999	1	
4	1184 ı	rows	× 21 columi	าร											

In []:

Loading [MathJax]/jax/output/CommonHTML/fonts/TeX/fontdata.js