pandas_DataFrame

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- 0.1 Pandas.DataFrame: Hands-on Exercises
- 0.1.1 DataFrame is a tabular collection of data structure structure with labeled axes (rows and columns)

Creating pandas. DataFrame.

(458, 9)

Usually a DataFrame will be created by loading the datasets from a file.

However, Pandas DataFrame can also be created from the lists, dictionary, and from a list of dictionary etc

```
[2]: import pandas as pd
    import numpy as np
 []: | #### Creating dataFrame from a dictionary
 [3]: data = {'state': ['Ohio', 'Ohio', 'Ohio', 'Nevada', 'Nevada'],
     'year': [2000, 2001, 2002, 2001, 2002, 2003],
     'pop': [1.5, 1.7, 3.6, 2.4, 2.9, 3.2]}
    df = pd.DataFrame(data);
    print(df);
        state year pop
         Ohio 2000 1.5
    0
    1
         Ohio 2001 1.7
         Ohio 2002 3.6
    2
    3 Nevada 2001 2.4
    4 Nevada 2002 2.9
    5 Nevada 2003 3.2
 [9]: ## reading a csv file
    df = pd.read_csv('nba.csv')
[10]: ## find number of rows and columns in dataframe
    print(df.shape);
```

```
[11]: ## find no. of dimensions in dataframe
     print(df.ndim);
    2
[12]: ## check first few rows of dataframe
     print(df.head(3));
                Name
                                      Number Position
                                                        Age Height Weight \
    O Avery Bradley Boston Celtics
                                         0.0
                                                    PG 25.0
                                                                6-2
                                                                      180.0
         Jae Crowder Boston Celtics
                                        99.0
                                                                6-6
                                                                      235.0
    1
                                                    SF
                                                        25.0
        John Holland Boston Celtics
                                        30.0
                                                    SG 27.0
                                                                6-5
                                                                      205.0
                 College
                             Salary
    0
                   Texas 7730337.0
               Marquette
                          6796117.0
    2 Boston University
[17]: ## Since default index is assigned as numbers, we can also specify index
     df = pd.read_csv('nba.csv', index_col = 'Name')
[18]: ## Check first few rows
     print(df.head(3));
                             Team Number Position
                                                      Age Height Weight \
    Name
    Avery Bradley Boston Celtics
                                      0.0
                                                 PG
                                                     25.0
                                                             6-2
                                                                   180.0
    Jae Crowder
                   Boston Celtics
                                     99.0
                                                     25.0
                                                                   235.0
                                                 SF
                                                             6-6
                   Boston Celtics
    John Holland
                                     30.0
                                                 SG
                                                    27.0
                                                             6-5
                                                                   205.0
                             College
                                         Salary
    Name
    Avery Bradley
                                      7730337.0
                               Texas
    Jae Crowder
                           Marquette
                                      6796117.0
    John Holland
                   Boston University
                                            NaN
[19]: ## check column names
     print(df.columns);
    Index(['Team', 'Number', 'Position', 'Age', 'Height', 'Weight', 'College',
           'Salary'],
          dtype='object')
[21]: ## Check structure of dataframe
     print(df.info());
```

```
<class 'pandas.core.frame.DataFrame'>
Index: 458 entries, Avery Bradley to nan
Data columns (total 8 columns):
Team
            457 non-null object
            457 non-null float64
Number
Position 457 non-null object
Age
           457 non-null float64
            457 non-null object
Height
Weight
            457 non-null float64
            373 non-null object
College
            446 non-null float64
Salary
dtypes: float64(4), object(4)
memory usage: 32.2+ KB
None
```

0.1.2 Indexing and subsetting

Indexing also known as Subset Selection, Indexing in pandas means selecting particular rows and columns of data from a DataFrame.

```
[50]: ## Selecting a single column Age
print(df['Age'].head())
Name
```

Avery Bradley 25.0
Jae Crowder 25.0
John Holland 27.0
R.J. Hunter 22.0
Jonas Jerebko 29.0
Name: Age, dtype: float64

```
[52]: ## Selecting multiple columns, Age, Height, Weight print(df[['Age', 'Height', 'Weight']].head())
```

```
Age Height Weight
Name
Avery Bradley
               25.0
                              180.0
                        6-2
Jae Crowder
               25.0
                        6-6
                              235.0
John Holland
               27.0
                        6-5
                              205.0
R.J. Hunter
               22.0
                        6-5
                              185.0
Jonas Jerebko 29.0
                       6-10
                              231.0
```

0.1.3 Indexing a DataFrame using .loc[]

.loc method selects subset of data by label of rows and columns

```
[53]: ## Extracting by loc method
## Extract record for Player Avery Bradley
```

```
print(df.loc['Avery Bradley']);
```

Team Boston Celtics
Number 0
Position PG
Age 25
Height 6-2
Weight 180
College Texas
Salary 7.73034e+06

Name: Avery Bradley, dtype: object

```
[54]: ## Extract rows of specific columns
df.loc[['Avery Bradley','John Holland'], ['Team', 'Number', 'Position', 'Age']]
```

[54]: Team Number Position Age
Name
Avery Bradley Boston Celtics 0.0 PG 25.0
John Holland Boston Celtics 30.0 SG 27.0

0.1.4 Indexing a DataFrame using .iloc[]:

.loc allows us to retrieve rows and columns by position

```
[57]: # retrieve first 3 rows and first 5 columns of dataset print(df.iloc[0:3, 0:5])
```

	Te	am Number	Number Position		Age Height	
Name						
Avery Bradley	Boston Celti	.cs 0.0	PG	25.0	6-2	
Jae Crowder	Boston Celti	cs 99.0	SF	25.0	6-6	
John Holland	Boston Celti	.cs 30.0	SG	27.0	6-5	

0.1.5 Selecting rows in pandas DataFrame based on conditions

```
[59]: ## Find all players whose age is max in dataset

df.loc[df['Age'] == df['Age'].max()]
```

[59]:		Team Number Positio		sition	Age Height		Weight	\
	Name							
	Tim Duncan	San Antonio Spurs	21.0	С	40.0	6-11	250.0	
	Andre Miller	San Antonio Spurs	24.0	PG	40.0	6-3	200.0	
	Kevin Garnett	Minnesota Timberwolves	21.0	PF	40.0	6-11	240.0	

College Salary

Name

```
Tim Duncan
                    Wake Forest 5250000.0
     Andre Miller
                                  250750.0
                           Utah
     Kevin Garnett
                            NaN
                                 8500000.0
[61]: ## Find all players who play at Position C and older than 35 years of age
     df.loc[(df['Position'] == 'C') & (df['Age'] > 35)]
[61]:
                                      Team Number Position
                                                              Age Height
                                                                          Weight \
     Name
     Matt Bonner
                        San Antonio Spurs
                                              15.0
                                                          C 36.0
                                                                     6-10
                                                                            235.0
                                              21.0
                                                          C 40.0
                                                                     6-11
                                                                            250.0
     Tim Duncan
                        San Antonio Spurs
     Nazr Mohammed Oklahoma City Thunder
                                              13.0
                                                          C 38.0
                                                                     6-10
                                                                            250.0
                        College
                                     Salary
     Name
     Matt Bonner
                                  947276.0
                        Florida
     Tim Duncan
                    Wake Forest
                                 5250000.0
     Nazr Mohammed
                       Kentucky
                                  222888.0
    0.1.6 isin() method
[64]: ## Selecting those players who are from College 'Florida', 'Kentucky'
     college_list = ['Florida', 'Kentucky']
     df.loc[df['College'].isin(college_list)].head()
[64]:
                                          Team Number Position
                                                                  Age Height \
     Name
     James Young
                                                                 20.0
                               Boston Celtics
                                                  13.0
                                                             SG
                                                                          6-6
                                                   4.0
                                                             PF
                                                                 22.0
     Nerlens Noel
                           Philadelphia 76ers
                                                                         6-11
     Patrick Patterson
                                                  54.0
                                                                 27.0
                                                                          6-9
                              Toronto Raptors
                                                             PF
     Marreese Speights
                        Golden State Warriors
                                                   5.0
                                                              С
                                                                 28.0
                                                                         6-10
     Julius Randle
                                                  30.0
                                                             PF
                                                                 21.0
                                                                          6-9
                           Los Angeles Lakers
                        Weight
                                  College
                                              Salary
     Name
     James Young
                         215.0
                                Kentucky 1749840.0
                                Kentucky 3457800.0
     Nerlens Noel
                         228.0
     Patrick Patterson
                         235.0 Kentucky 6268675.0
     Marreese Speights
                         255.0
                                 Florida 3815000.0
     Julius Randle
                         250.0 Kentucky 3132240.0
[66]: | ## Selecting those players who are Not from College 'Florida', 'Kentucky'
     college_list = ['Florida', 'Kentucky']
     df.loc[~ df['College'].isin(college_list)].head()
```

```
[66]:
                               Team Number Position
                                                        Age Height Weight \
     Name
                                                       25.0
                                                                6-2
                                                                      180.0
     Avery Bradley Boston Celtics
                                         0.0
                                                   PG
     Jae Crowder
                     Boston Celtics
                                        99.0
                                                   SF
                                                        25.0
                                                                6-6
                                                                      235.0
     John Holland
                     Boston Celtics
                                        30.0
                                                   SG
                                                        27.0
                                                                6-5
                                                                      205.0
     R.J. Hunter
                     Boston Celtics
                                        28.0
                                                   SG
                                                        22.0
                                                                6-5
                                                                      185.0
     Jonas Jerebko Boston Celtics
                                         8.0
                                                   PF
                                                        29.0
                                                               6-10
                                                                      231.0
                               College
                                            Salary
     Name
     Avery Bradley
                                 Texas
                                         7730337.0
     Jae Crowder
                             Marquette
                                         6796117.0
     John Holland
                     Boston University
     R.J. Hunter
                         Georgia State
                                         1148640.0
     Jonas Jerebko
                                   NaN
                                         5000000.0
[68]: ## Find mean salary of players whose age is > 35
     df.loc[df['Age'] > 35, 'Salary'].mean()
[68]: 3959599.5
    0.1.7 Drop rows from the dataframe based on certain condition applied on a column
[69]: ## filter out those rows which does not contain any data
     df = df.dropna(how='all')
[78]: ## drop specific columns
     df.drop(['College','Number'], axis=1).head()
[78]:
                               Team Position
                                                Age Height
                                                             Weight
                                                                        Salary
     Name
     Avery Bradley
                    Boston Celtics
                                           PG
                                               25.0
                                                        6-2
                                                              180.0
                                                                     7730337.0
     Jae Crowder
                     Boston Celtics
                                           SF
                                               25.0
                                                        6-6
                                                              235.0
                                                                     6796117.0
     John Holland
                     Boston Celtics
                                               27.0
                                                              205.0
                                           SG
                                                        6-5
                                                                            NaN
     R.J. Hunter
                    Boston Celtics
                                           SG 22.0
                                                        6-5
                                                              185.0
                                                                     1148640.0
     Jonas Jerebko Boston Celtics
                                           PF 29.0
                                                       6-10
                                                              231.0
                                                                     5000000.0
[77]: ## drop specific row by index
     df.drop(['Avery Bradley'], axis=0).head()
                                                         Age Height
                                                                     Weight
[77]:
                               Team Number Position
     Name
     Jae Crowder
                     Boston Celtics
                                        99.0
                                                   SF
                                                        25.0
                                                                6-6
                                                                      235.0
     John Holland
                     Boston Celtics
                                        30.0
                                                   SG
                                                        27.0
                                                                6-5
                                                                      205.0
     R.J. Hunter
                     Boston Celtics
                                        28.0
                                                   SG
                                                        22.0
                                                                6-5
                                                                      185.0
     Jonas Jerebko
                    Boston Celtics
                                         8.0
                                                   PF
                                                        29.0
                                                               6-10
                                                                      231.0
     Amir Johnson
                     Boston Celtics
                                        90.0
                                                   PF
                                                        29.0
                                                                6-9
                                                                      240.0
                               College
                                             Salary
```

Name

```
Jae Crowder
                             Marquette
                                         6796117.0
     John Holland
                    Boston University
                                               NaN
     R.J. Hunter
                         Georgia State
                                         1148640.0
     Jonas Jerebko
                                   NaN
                                         5000000.0
     Amir Johnson
                                   NaN
                                        12000000.0
[83]: ## filter out those rows which do not satisfy condition
     ## Create a a df young_players where age is less than 25
     young_players = df.drop(df[df['Age'] >= 25].index)
     young_players.head()
[83]:
                                 Team Number Position
                                                          Age Height
                                                                      Weight
     Name
     R.J. Hunter
                      Boston Celtics
                                         28.0
                                                     SG
                                                         22.0
                                                                 6-5
                                                                        185.0
                      Boston Celtics
                                         55.0
                                                     PF
                                                         21.0
                                                                 6-8
                                                                       235.0
     Jordan Mickey
                                         12.0
                                                         22.0
                                                                 6-2
     Terry Rozier
                      Boston Celtics
                                                     PG
                                                                        190.0
     Marcus Smart
                      Boston Celtics
                                         36.0
                                                     PG
                                                         22.0
                                                                 6-4
                                                                        220.0
     Jared Sullinger
                      Boston Celtics
                                          7.0
                                                         24.0
                                                                 6-9
                                                                        260.0
                              College
                                          Salary
     Name
     R.J. Hunter
                       Georgia State
                                       1148640.0
     Jordan Mickey
                                  LSU
                                       1170960.0
     Terry Rozier
                           Louisville
                                       1824360.0
     Marcus Smart
                       Oklahoma State
                                       3431040.0
     Jared Sullinger
                           Ohio State
                                       2569260.0
    0.1.8 Filter records using query method: Dataframe.query()
[89]: ## query(), filter query should be given in string
```

```
df.query('Age >=35 and Position =="SG" and College=="Duke"')
[89]:
                                    Team Number Position
                                                                          Weight
                                                             Age Height
     Name
     Mike Dunleavy
                           Chicago Bulls
                                             34.0
                                                        SG
                                                            35.0
                                                                     6-9
                                                                           230.0
                                             30.0
                                                            35.0
                                                                           225.0
     Dahntay Jones Cleveland Cavaliers
                                                        SG
                                                                     6-6
                    College
                                Salary
     Name
     Mike Dunleavy
                             4500000.0
                       Duke
     Dahntay Jones
                       Duke
                                   NaN
```

0.1.9 groupby(): split-apply-combine

Splitting the data into groups based on some criteria

Applying a function to each group independently

Combining the results into a data structure

Utah Jazz

Washington Wizards

Split step is the most straightforward. In the apply step, we might wish to do one of the following

Aggregation: compute a summary statistic (or statistics) for each group

Transformation: perform some group-specific computations and return a like-indexed object

Filtration: discard some groups, according to a group-wise computation that evaluates True or False

```
[100]: ## Find average salary for each team
      df.groupby('Team')['Salary'].mean()
[100]: Team
      Atlanta Hawks
                                4.860197e+06
      Boston Celtics
                                4.181505e+06
     Brooklyn Nets
                                3.501898e+06
      Charlotte Hornets
                                5.222728e+06
      Chicago Bulls
                                5.785559e+06
      Cleveland Cavaliers
                                7.642049e+06
      Dallas Mavericks
                                4.746582e+06
      Denver Nuggets
                                4.294424e+06
      Detroit Pistons
                                4.477884e+06
      Golden State Warriors
                                5.924600e+06
      Houston Rockets
                                5.018868e+06
      Indiana Pacers
                                4.450122e+06
      Los Angeles Clippers
                                6.323643e+06
      Los Angeles Lakers
                                4.784695e+06
      Memphis Grizzlies
                                5.467920e+06
      Miami Heat
                                6.347359e+06
     Milwaukee Bucks
                                4.350220e+06
     Minnesota Timberwolves
                                4.593054e+06
      New Orleans Pelicans
                                4.355304e+06
      New York Knicks
                                4.581494e+06
      Oklahoma City Thunder
                                6.251020e+06
      Orlando Magic
                                4.297248e+06
      Philadelphia 76ers
                                2.213778e+06
      Phoenix Suns
                                4.229676e+06
      Portland Trail Blazers
                                3.220121e+06
      Sacramento Kings
                                4.778911e+06
      San Antonio Spurs
                                5.629516e+06
      Toronto Raptors
                                4.741174e+06
```

4.204006e+06

5.088576e+06

```
Name: Salary, dtype: float64
[102]: ## Find mean salary of players based on position they play
      df.groupby('Position')['Salary'].mean()
[102]: Position
           5.967052e+06
      C
      PF
            4.562483e+06
      PG
           5.077829e+06
      SF
            4.857393e+06
      SG
            4.009861e+06
      Name: Salary, dtype: float64
     0.1.10 merge()
[136]: t1 = pd.DataFrame(\{'A' : [1,5,7,9],
                         'B' : [2,4,6,8]}, index=['K0', 'K1', 'K2', 'K3'])
      t2 = pd.DataFrame({'C': [5,9,11,13],
                         'D': [2,6,10,12]}, index = ['KO', 'K1', 'K2', 'K3'])
[137]: print(t1);
         A B
     ΚO
        1 2
     K1 5 4
     K2 7 6
     K3 9 8
[138]: print(t2);
          С
              D
     ΚO
          5
              2
     Κ1
          9
              6
     K2 11
             10
     K3 13
            12
[139]: ## inner join between t1 and t2 where values of column A and C match
      pd.merge(left=t1, right=t2, how='inner', left_on=['A'], right_on=['C'])
[139]:
         A B
      0 5 4 5 2
      1 9 8 9 6
```

```
[140]: # t1.A left join t2.C
      pd.merge(left=t1, right=t2, how='left', left_on=['A'], right_on=['C'])
[140]:
        A B
                С
                     D
           2 NaN
     0 1
                  {\tt NaN}
      1 5 4 5.0 2.0
      2 7 6
              NaN NaN
      3 9 8 9.0 6.0
[141]: # t1.A right join t2.C
     pd.merge(left=t1, right=t2, how='right', left_on=['A'], right_on=['C'])
                       D
[141]:
          Α
               В
                   С
     0 5.0
             4.0
                   5
                       2
      1 9.0 8.0
                       6
                   9
                  11 10
      2 NaN NaN
      3 NaN NaN
                  13 12
[142]: # t1.A outer join t2.C
     pd.merge(left=t1, right=t2, how='outer', left_on=['A'], right_on=['C'])
[142]:
          Α
               В
                     С
                          D
      0 1.0
             2.0
                         {\tt NaN}
                   NaN
     1 5.0 4.0
                         2.0
                   5.0
     2 7.0 6.0
                   {\tt NaN}
                         NaN
     3 9.0 8.0
                   9.0
                         6.0
      4 NaN NaN
                  11.0
                        10.0
     5 NaN NaN
                  13.0
                        12.0
  []:
```