Chapter2

March 1, 2022

1 Chapter 2 - Data Preparation Basics

1.1 Segment 1 - Filtering and selecting data

```
[1]: import numpy as np
import pandas as pd

from pandas import Series, DataFrame
```

1.1.1 Selecting and retrieving data

You can write an index value in two forms. - Label index or - Integer index

```
[2]: row 1
               0
     row 2
               1
               2
     row 3
               3
     row 4
               4
     row 5
               5
     row 6
     row 7
               6
     row 8
               7
     dtype: int32
```

```
[3]: series_obj['row 7']
```

```
[3]: 6
```

```
[4]: series_obj[[0, 7]]
```

```
[4]: row 1 0
row 8 7
dtype: int32
```

```
[5]: np.random.seed(25)
     DF_obj = DataFrame(np.random.rand(36).reshape((6,6)),
                          index=['row 1', 'row 2', 'row 3', 'row 4', 'row 5', 'row 6'],
                          columns=['column 1','column 2','column 3','column 4','column_
      \hookrightarrow5','column 6'])
     DF_obj
[5]:
             column 1
                       column 2
                                  column 3
                                             column 4
                                                        column 5
                                                                   column 6
            0.870124
                       0.582277
                                  0.278839
                                             0.185911
                                                        0.411100
                                                                   0.117376
     row 1
```

```
row 2
       0.684969
                 0.437611
                            0.556229
                                       0.367080
                                                 0.402366
                                                            0.113041
       0.447031
                  0.585445
                            0.161985
                                       0.520719
                                                  0.326051
                                                            0.699186
row 3
       0.366395
                  0.836375
                            0.481343
                                       0.516502
                                                  0.383048
                                                            0.997541
       0.514244
                  0.559053
                            0.034450
                                       0.719930
                                                  0.421004
                                                            0.436935
row 6
       0.281701
                  0.900274
                            0.669612
                                       0.456069
                                                 0.289804
                                                            0.525819
```

```
[6]: DF_obj.loc[['row 2', 'row 5'], ['column 5', 'column 2']]
```

```
[6]: column 5 column 2
row 2 0.402366 0.437611
row 5 0.421004 0.559053
```

1.1.2 Data slicing

You can use slicing to select and return a slice of several values from a data set. Slicing uses index values so you can use the same square brackets when doing data slicing.

How slicing differs, however, is that with slicing you pass in two index values that are separated by a colon. The index value on the left side of the colon should be the first value you want to select. On the right side of the colon, you write the index value for the last value you want to retrieve. When you execute the code, the indexer then simply finds the first record and the last record and returns every record in between them.

1.1.3 Comparing with scalars

Now we're going to talk about comparison operators and scalar values. Just in case you don't know that a scalar value is, it's basically just a single numerical value. You can use comparison operators like greater than or less than to return true/false values for all records to indicate how each element compares to a scalar value.

```
[8]: DF_obj < .2
```

```
[8]:
            column 1
                       column 2
                                  column 3
                                            column 4
                                                       column 5
                                                                  column 6
                          False
                                     False
                                                          False
     row 1
               False
                                                 True
                                                                      True
     row 2
               False
                          False
                                     False
                                                False
                                                          False
                                                                      True
               False
                          False
                                      True
                                                False
                                                          False
                                                                     False
     row 3
               False
                          False
                                                False
                                                          False
                                                                     False
     row 4
                                     False
               False
                          False
                                      True
                                                False
                                                          False
                                                                     False
     row 5
     row 6
               False
                          False
                                     False
                                                False
                                                          False
                                                                     False
```

1.1.4 Filtering with scalars

```
[9]: series_obj[series_obj > 6]
```

[9]: row 8 7 dtype: int32

1.1.5 Setting values with scalars

```
[10]: series_obj['row 1', 'row 5', 'row 8'] = 8 series_obj
```

```
[10]: row 1
                8
      row 2
                1
                2
      row 3
                3
      row 4
      row 5
                5
      row 6
      row 7
                6
      row 8
                8
      dtype: int32
```

Filtering and selecting using Pandas is one of the most fundamental things you'll do in data analysis. Make sure you know how to use indexing to select and retrieve records.

2 Chapter 2 - Data Preparation Basics

2.1 Segment 2 - Treating missing values

```
[11]: import numpy as np import pandas as pd from pandas import Series, DataFrame
```

2.1.1 Figuring out what data is missing

```
[12]: missing = np.nan
```

```
series_obj = Series(['row 1', 'row 2', missing, 'row 4', 'row 5', 'row 6', _

→missing, 'row 8'])
     series_obj
[12]: 0
          row 1
          row 2
     1
     2
            NaN
     3
          row 4
     4
          row 5
     5
          row 6
     6
            NaN
     7
          row 8
     dtype: object
[13]: series_obj.isnull()
[13]: 0
          False
          False
     1
     2
           True
          False
     3
     4
          False
     5
          False
     6
           True
          False
     dtype: bool
     2.1.2 Filling in for missing values
[14]: np.random.seed(25)
     DF_obj = DataFrame(np.random.rand(36).reshape(6,6))
     DF_obj
[14]:
                                   2
                                                       4
                                                                 5
               0
                         1
                                             3
     0 0.870124 0.582277
                            0.278839 0.185911 0.411100 0.117376
     1 0.684969 0.437611 0.556229
                                      0.367080 0.402366
                                                          0.113041
     2 0.447031 0.585445 0.161985 0.520719 0.326051 0.699186
     3 0.366395 0.836375 0.481343
                                      0.516502 0.383048
                                                          0.997541
     4 0.514244 0.559053 0.034450 0.719930 0.421004 0.436935
     5 0.281701 0.900274 0.669612 0.456069 0.289804 0.525819
[15]: DF_obj.loc[3:5, 0] = missing
     DF_obj.loc[1:4, 5] = missing
     DF_obj
[15]:
               0
                                   2
                                             3
                                                       4
                                                                 5
                         1
     0 0.870124 0.582277
                            0.278839
                                     0.185911 0.411100 0.117376
     1 0.684969 0.437611 0.556229 0.367080 0.402366
                                                               NaN
```

```
0.447031 \quad 0.585445 \quad 0.161985 \quad 0.520719 \quad 0.326051
     2
                                                              NaN
     3
             NaN
                  0.836375 0.481343
                                     0.516502 0.383048
                                                              NaN
     4
             NaN
                  0.559053 0.034450
                                     0.719930
                                               0.421004
                                                              NaN
     5
                 0.900274 0.669612
                                                         0.525819
             {\tt NaN}
                                     0.456069
                                               0.289804
[16]: filled_DF = DF_obj.fillna(0)
     filled DF
[16]:
                                  2
                                                      4
                                                                5
               0
                         1
                                            3
                 0.582277
                            0.278839
                                     0.185911
                                                         0.117376
        0.870124
                                               0.411100
     1 0.684969
                  0.437611
                            0.556229
                                     0.367080
                                               0.402366
                                                         0.000000
     2 0.447031 0.585445 0.161985
                                     0.520719
                                               0.326051
                                                         0.000000
     3 0.000000 0.836375 0.481343 0.516502 0.383048
                                                         0.000000
     4 0.000000 0.559053 0.034450
                                     0.719930 0.421004
                                                         0.000000
     5 0.000000 0.900274 0.669612 0.456069 0.289804 0.525819
[17]: filled_DF = DF_obj.fillna({0: 0.1, 5:1.25})
     filled_DF
[17]:
               0
                                   2
                                            3
                                                      4
                                                                5
                         1
     0 0.870124 0.582277
                            0.278839
                                     0.185911 0.411100
                                                         0.117376
     1 0.684969 0.437611
                           0.556229
                                     0.367080
                                               0.402366
                                                         1.250000
     2 0.447031 0.585445
                                               0.326051
                           0.161985
                                     0.520719
                                                         1.250000
     3 0.100000 0.836375 0.481343
                                     0.516502 0.383048
                                                         1.250000
     4 0.100000 0.559053 0.034450
                                     0.719930
                                               0.421004
                                                         1.250000
     5 0.100000 0.900274 0.669612 0.456069 0.289804 0.525819
[18]: fill_DF = DF_obj.fillna(method='ffill')
     fill DF
[18]:
                                   2
                                            3
                                                      4
                                                                5
                         1
        0.870124 0.582277
                            0.278839
                                     0.185911 0.411100
                                                         0.117376
     1 0.684969 0.437611 0.556229
                                     0.367080
                                               0.402366
                                                         0.117376
     2 0.447031 0.585445 0.161985
                                     0.520719 0.326051
                                                         0.117376
     3 0.447031 0.836375 0.481343
                                     0.516502 0.383048
                                                         0.117376
     4 0.447031 0.559053 0.034450 0.719930 0.421004 0.117376
     5 0.447031 0.900274 0.669612 0.456069 0.289804 0.525819
     2.1.3 Counting missing values
[19]: np.random.seed(25)
     DF_obj = DataFrame(np.random.rand(36).reshape(6,6))
     DF_obj.loc[3:5, 0] = missing
     DF_obj.loc[1:4, 5] = missing
     DF_obj
```

```
[19]:
                         1
        0.870124 0.582277
                            0.278839 0.185911
                                                0.411100 0.117376
        0.684969
                 0.437611
                            0.556229
                                      0.367080
                                                0.402366
                                                               NaN
        0.447031 0.585445
                            0.161985
                                      0.520719
                                                0.326051
                                                               NaN
     3
                  0.836375 0.481343
                                      0.516502 0.383048
             {\tt NaN}
                                                               NaN
     4
             {\tt NaN}
                  0.559053 0.034450
                                      0.719930
                                                0.421004
                                                               NaN
     5
             {\tt NaN}
                 0.900274 0.669612 0.456069 0.289804
                                                         0.525819
[20]: DF_obj.isnull().sum()
[20]: 0
          3
     1
          0
     2
          0
     3
     4
          0
     5
          4
     dtype: int64
[21]: DF_no_NaN = DF_obj.dropna()
     DF_no_NaN
[21]:
                                   2
     0 0.870124 0.582277 0.278839 0.185911 0.4111 0.117376
[22]: DF_no_NaN = DF_obj.dropna(axis=1)
     DF_no_NaN
[22]:
                                   3
     0 0.582277 0.278839 0.185911
                                     0.411100
     1 0.437611 0.556229 0.367080
                                      0.402366
     2 0.585445 0.161985 0.520719
                                      0.326051
     3 0.836375 0.481343 0.516502
                                      0.383048
     4 0.559053 0.034450 0.719930 0.421004
     5 0.900274 0.669612 0.456069 0.289804
     3
         Chapter 2 - Data Preparation Basics
     3.1 Segment 3 - Removing duplicates
     3.1.1 Removing duplicates
[23]: DF_obj= DataFrame({'column 1':[1,1,2,2,3,3,3],
                        'column 2':['a', 'a', 'b', 'b', 'c', 'c', 'c'],
                        'column 3':['A', 'A', 'B', 'B', 'C', 'C', 'C']})
     DF obj
[23]:
        column 1 column 2 column 3
```

1

a

```
2
                 2
                          b
                                    В
      3
                 2
                                    В
                          b
      4
                 3
                                    С
                          С
                                    С
      5
                 3
                          С
      6
                 3
                          С
                                    С
[24]: DF_obj.duplicated()
[24]: 0
           False
      1
            True
      2
           False
      3
            True
      4
           False
            True
      5
      6
            True
      dtype: bool
[25]: DF_obj.drop_duplicates()
[25]:
         column 1 column 2 column 3
                 1
                                    Α
      0
                          a
      2
                 2
                          b
                                    В
      4
                 3
                                    С
           Segment 4 - Concatenating and transforming data
[26]: DF_obj = pd.DataFrame(np.arange(36).reshape(6,6))
      DF_obj
[26]:
                               5
          0
                   2
                       3
                           4
                   2
                       3
                               5
              1
                           4
      1
          6
              7
                   8
                       9
                          10
                              11
         12
      2
             13
                  14
                      15
                          16
                              17
      3
         18
             19
                  20
                      21
                          22
                              23
      4
         24
             25
                  26
                      27
                          28
                              29
         30
             31
                 32
                      33
                          34
                              35
[27]: DF_obj_2 = pd.DataFrame(np.arange(15).reshape(5,3))
      DF_obj_2
[27]:
                   2
          0
              1
              1
                   2
          0
      1
          3
              4
                   5
      2
              7
          6
                   8
      3
          9
             10
                 11
         12
             13
                  14
```

Α

3.2.1 Concatenating data

```
[28]: pd.concat([DF_obj, DF_obj_2], axis=1)
[28]:
           0
                1
                    2
                         3
                              4
                                  5
                                         0
                                                       2
                                                1
       0
           0
                1
                    2
                         3
                                              1.0
                                                     2.0
                              4
                                  5
                                       0.0
                7
       1
           6
                    8
                         9
                                              4.0
                                                     5.0
                            10
                                 11
                                       3.0
       2
          12
              13
                                 17
                                              7.0
                                                     8.0
                   14
                        15
                            16
                                       6.0
       3
          18
              19
                   20
                        21
                            22
                                 23
                                       9.0
                                             10.0
                                                    11.0
       4
          24
              25
                   26
                        27
                            28
                                 29
                                      12.0
                                             13.0
                                                    14.0
          30
              31
                   32
                        33
                                 35
       5
                            34
                                       NaN
                                              NaN
                                                     {\tt NaN}
      pd.concat([DF_obj, DF_obj_2])
[29]:
           0
                1
                    2
                           3
                                  4
                                         5
                    2
                         3.0
                                       5.0
       0
           0
                1
                                4.0
       1
           6
                7
                    8
                         9.0
                               10.0
                                      11.0
       2
          12
              13
                   14
                        15.0
                               16.0
                                      17.0
       3
          18
              19
                   20
                        21.0
                               22.0
                                      23.0
       4
          24
               25
                   26
                        27.0
                               28.0
                                      29.0
          30
              31
                   32
                        33.0
                               34.0
                                      35.0
       5
       0
           0
                1
                    2
                         NaN
                                NaN
                                       NaN
                4
                    5
       1
           3
                         NaN
                                NaN
                                       NaN
       2
           6
                7
                    8
                         {\tt NaN}
                                NaN
                                       NaN
       3
           9
              10
                   11
                         NaN
                                NaN
                                       NaN
          12
              13
                   14
                         {\tt NaN}
                                NaN
                                       NaN
      3.2.2 Transforming data
      Dropping data
[30]: DF_obj.drop([0, 2])
[30]:
           0
                1
                    2
                         3
                              4
                                  5
           6
                7
                         9
                    8
                            10
                                 11
       1
       3
          18
                                 23
              19
                   20
                        21
                            22
       4
          24
              25
                   26
                        27
                            28
                                 29
          30
              31
                   32
                        33
                            34
                                 35
[31]: DF_obj.drop([0, 2], axis=1)
[31]:
                         5
           1
                3
                    4
       0
           1
                3
                    4
                         5
       1
           7
                9
                   10
                        11
       2
          13
              15
                   16
                        17
              21
                   22
                        23
       3
          19
       4
          25
              27
                   28
                        29
       5
          31
              33
                   34
                        35
```

3.2.3 Adding data

```
[32]: series_obj = Series(np.arange(6))
      series_obj.name = "added_variable"
      series_obj
[32]: 0
           0
      1
           1
      2
           2
      3
      4
           4
      5
           5
      Name: added_variable, dtype: int32
[33]: variable_added = DataFrame.join(DF_obj, series_obj)
      variable_added
[33]:
          0
              1
                  2
                      3
                           4
                               5
                                  added_variable
      0
          0
              1
                  2
                      3
                           4
                               5
      1
              7
                  8
                      9
                                               1
          6
                         10
                              11
                                               2
      2
         12
             13
                 14
                     15
                         16
                              17
      3
         18
             19
                 20
                     21
                         22
                              23
                                               3
                                               4
      4
         24
             25
                 26
                     27
                         28
                              29
         30
             31
                 32 33 34
                              35
                                               5
[34]: added_datatable = variable_added.append(variable_added, ignore_index=False)
      added_datatable
[34]:
                      3
                           4
                               5
                                  added_variable
              1
                  2
                      3
                           4
                               5
      0
                                               0
                                               1
      1
          6
                  8
                      9
                         10
                              11
      2
         12
             13 14 15
                                               2
                         16
                              17
      3
         18
             19
                 20
                     21
                         22
                              23
                                               3
      4
         24
             25
                 26
                     27
                         28
                              29
                                               4
      5
         30
             31
                 32
                              35
                                               5
                     33
                         34
      0
          0
              1
                  2
                      3
                          4
                              5
                                               0
              7
      1
                      9
                         10
                             11
                                               1
          6
                  8
                                               2
        12 13
                 14
                     15
                         16
                              17
      3
        18
             19
                 20
                     21
                         22
                              23
                                               3
                                               4
         24
             25
                 26
                     27
                         28
                              29
         30
            31
                 32 33 34
                              35
[35]: added_datatable = variable_added.append(variable_added, ignore_index=True)
      added_datatable
[35]:
                                   added_variable
                   2
                       3
                            4
                                5
      0
           0
               1
                   2
                       3
                            4
                                5
                                                0
      1
           6
               7
                   8
                       9
                          10 11
                                                1
```

```
2
    12
         13
              14
                  15
                       16
                            17
                                                2
3
    18
         19
                   21
                       22
                            23
                                                3
              20
4
    24
         25
              26
                  27
                       28
                            29
                                                4
5
         31
              32
                   33
                                                5
    30
                       34
                            35
6
     0
          1
               2
                    3
                        4
                             5
                                                0
7
     6
          7
               8
                   9
                       10
                            11
                                                1
8
    12
         13
              14
                       16
                            17
                                                2
                  15
9
         19
                  21
                            23
                                                3
    18
              20
                       22
    24
         25
                  27
                       28
                            29
                                                4
10
              26
11
    30
         31
              32
                  33
                       34
                            35
                                                5
```

3.2.4 Sorting data

```
[36]: DF_sorted = DF_obj.sort_values(by=(5), ascending=[False])
DF_sorted
```

```
[36]:
                                   5
           0
                     2
                          3
                              4
                1
       5
          30
               31
                   32
                        33
                             34
                                  35
       4
          24
               25
                   26
                        27
                             28
                                  29
       3
          18
               19
                   20
                        21
                             22
                                  23
       2
          12
               13
                        15
                             16
                                  17
                   14
                7
       1
           6
                     8
                         9
                             10
                                  11
       0
           0
                1
                     2
                          3
                              4
                                   5
```

3.3 Segment 5 - Grouping and data aggregation

```
[37]:
                 car_names
                              mpg
                                   cyl
                                         disp
                                                hp drat
                                                              wt
                                                                   qsec
                                                                         ٧s
                                                                              am
                                                                                  gear
                 Mazda RX4 21.0
                                     6
                                        160.0 110
                                                     3.90
                                                           2.620
                                                                  16.46
                                                                               1
                                                                                     4
      0
                                                                           0
      1
             Mazda RX4 Wag
                            21.0
                                     6
                                        160.0 110
                                                     3.90
                                                           2.875
                                                                  17.02
                                                                               1
                                                                                     4
                                                                           0
      2
                Datsun 710
                            22.8
                                        108.0
                                                93
                                                     3.85
                                                           2.320
                                                                  18.61
                                                                               1
                                                                                     4
      3
            Hornet 4 Drive 21.4
                                     6
                                        258.0
                                               110
                                                     3.08
                                                           3.215
                                                                  19.44
                                                                           1
                                                                               0
                                                                                     3
                                        360.0
        Hornet Sportabout
                                                     3.15 3.440
                                                                  17.02
                                                                           0
                                                                               0
                                                                                     3
                            18.7
                                     8
                                               175
```

```
[38]: cars_groups = cars.groupby(cars['cyl'])
     cars_groups.mean()
[38]:
                mpg
                          disp
                                        hp
                                               drat
                                                           wt
                                                                    qsec \
     cyl
     4
          26.663636 105.136364 82.636364 4.070909 2.285727
                                                               19.137273
     6
          19.742857 183.314286 122.285714 3.585714 3.117143 17.977143
          15.100000 353.100000 209.214286 3.229286 3.999214 16.772143
     8
                                 gear
                                           carb
                ٧S
                         am
     cyl
     4
          0.909091 0.727273 4.090909 1.545455
     6
          0.571429  0.428571  3.857143  3.428571
     8
          0.000000 0.142857 3.285714 3.500000
[39]: cars_groups = cars.groupby(cars['am'])
     cars_groups.mean()
[39]:
                                                        drat
                                                                    wt \
                        cyl
                                   disp
                                                hp
               mpg
     am
     0
         17.147368 6.947368 290.378947 160.263158 3.286316 3.768895
         24.392308 5.076923 143.530769 126.846154 4.050000 2.411000
     1
              qsec
                                           carb
                         ٧s
                                 gear
     am
     0
         18.183158 0.368421 3.210526 2.736842
         17.360000 0.538462 4.384615 2.923077
 []:
```