## KEY\_Lesson12\_Pandas-Subsetting

July 16, 2019

## 1 Subsetting Pandas DataFrames

You now know how to read external datasets into pandas. Let's put those skills to use and read in the tips dataset again:

```
[0]: # mount Google Drive
from google.colab import drive
drive.mount('/content/gdrive')
path = '/content/gdrive/My Drive/SummerExperience-master/'
```

Drive already mounted at /content/gdrive; to attempt to forcibly remount, call drive.mount("/content/gdrive", force\_remount=True).

```
[0]: # import the pandas package
import pandas as pd
# load tips
tips = pd.read_csv(path + 'SampleData/tips.csv')
```

Take a look again at the beginning of the tips DataFrame:

```
[0]: # view the beginning of tips tips.head()
```

```
[0]:
      total_bill
                   tip
                           sex smoker
                                     day
                                             time size
           16.99
                  1.01 Female
                                  No
                                      Sun
                                           Dinner
   1
           10.34 1.66
                         Male
                                  No Sun
                                           Dinner
                                                      3
   2
           21.01 3.50
                         Male
                                  No Sun Dinner
                                                      3
   3
                                                      2
           23.68 3.31
                         Male
                                  No Sun Dinner
           24.59
                 3.61
                      Female
                                  No
                                      Sun
                                           Dinner
```

What if we decided we didn't want to keep all of the data recorded in this dataset? To do that, we need to learn how to subset DataFrames. Subsetting means taking a dataset and pulling out a small portion of it that we're interested in.

First, we'll look at a single column (you can use head to keep the printed result short):

```
[0]: tips['day'].head(10)
```

- [0]: 0 Sun
  - 1 Sun
  - 2 Sun
  - 3 Sun

```
4 Sun
5 Sun
6 Sun
7 Sun
8 Sun
9 Sun
Name: day, dtype: object
```

We use the square brackets [] after the name of the DataFrame to tell pandas that we want to look at one of the columns. We put the name of the column in quotes to tell pandas exactly which column we want to look at. Try subsetting the total\_bill column:

```
[0]: # subset the total_bill column
    tips['total_bill'].head(10)
[0]: 0
         16.99
    1
         10.34
    2
         21.01
    3
         23.68
    4
         24.59
    5
         25.29
    6
          8.77
    7
         26.88
    8
         15.04
    9
         14.78
    Name: total_bill, dtype: float64
```

pandas simply showed us the result of subsetting the column, but it didn't save the result anywhere. Try saving the total\_bill column to a new variable, bills:

```
[0]: # save the total_bill column to a variable bills = tips['total_bill']
```

We can also pull out multiple columns at a time to create a new DataFrame. If we were only interested in the total\_bill and tip, we can subset them like this:

```
[0]: tips[['total_bill', 'tip']].head(10)
[0]:
       total_bill
                     tip
    0
            16.99
                   1.01
    1
            10.34
                   1.66
    2
            21.01
                   3.50
    3
            23.68 3.31
    4
            24.59
                   3.61
    5
            25.29 4.71
             8.77
    6
                   2.00
    7
            26.88 3.12
    8
            15.04
                   1.96
            14.78 3.23
```

Does that look familiar? Instead of putting a single string between the square brackets, we put a whole list of strings -- you can tell it's a list by the second set of square brackets. Now you try: subset the columns total\_bill, tip, and time and save the result to a variable called

tips\_subset:

```
[0]: # subset three columns and save to a new variable
  tips_subset = tips[['total_bill', 'tip', 'time']]

# take a look at the beginning of the new DataFrame
  tips_subset.head()
```

```
[0]:
       total_bill
                      tip
                              time
                     1.01
    0
             16.99
                           Dinner
    1
             10.34
                     1.66
                           Dinner
    2
             21.01
                     3.50
                            Dinner
    3
             23.68
                     3.31
                            Dinner
    4
             24.59
                     3.61
                            Dinner
```

Now we've learned how to subset columns. How do we subset rows? We use a method of DataFrame called iloc. When you see iloc, think "index location" -- because we want to get the location where the row is a certain index. Let's try it:

```
[0]: tips.loc[1]
```

```
[0]: total_bill 10.34
tip 1.66
sex Male
smoker No
day Sun
time Dinner
size 3
Name: 1, dtype: object
```

That showed us the row with an index of 1. Similarly to subsetting columns, we can also subset multiple rows:

```
[0]: tips.iloc[[0,1,2]]
```

```
[0]:
       total_bill
                                                      time
                       tip
                                sex smoker
                                              day
                                                             size
                                                                2
    0
             16.99
                     1.01
                            Female
                                              Sun
                                         No
                                                   Dinner
    1
             10.34
                     1.66
                                                                3
                               Male
                                         No
                                              Sun
                                                   Dinner
    2
                     3.50
                                                                3
             21.01
                               Male
                                              Sun
                                                   Dinner
                                         No
```

That gave us a smaller DataFrame where the rows have an index of 0, 1, or 2. We can do the same thing with slicing syntax:

```
[0]: tips.iloc[0:3]
```

```
[0]:
       total_bill
                      tip
                                             day
                                                     time
                                                            size
                               sex smoker
             16.99
                                                                2
    0
                     1.01
                            Female
                                             Sun
                                                   Dinner
                                        No
    1
             10.34
                     1.66
                              Male
                                        No
                                             Sun
                                                   Dinner
                                                                3
    2
             21.01
                     3.50
                                                                3
                              Male
                                        No
                                             Sun
                                                   Dinner
```

Notice that this does the same thing as calling head with a value of 3:

```
[0]: tips.head(3)
```

```
[0]:
       total bill
                                                            size
                      tip
                               sex smoker
                                             day
                                                     time
    0
             16.99
                     1.01
                            Female
                                             Sun
                                                   Dinner
                                                               2
                                        No
             10.34
                     1.66
                                                                3
    1
                              Male
                                             Sun
                                                   Dinner
                                        No
    2
             21.01
                     3.50
                                                               3
                              Male
                                        No
                                             Sun
                                                   Dinner
```

What if we want to grab some rows in the middle of the DataFrame? Try subsetting rows 100 through 105:

```
[0]: # subset rows 100 through 105
tips.iloc[100:106]
```

```
[0]:
          total_bill
                        tip
                                 sex smoker
                                               day
                                                       time
                                                              size
    100
                                                                 2
               11.35
                       2.50
                              Female
                                         Yes
                                               Fri
                                                     Dinner
    101
                                                                 2
               15.38
                       3.00
                              Female
                                         Yes
                                               Fri
                                                     Dinner
    102
               44.30
                       2.50
                                                                 3
                              Female
                                         Yes
                                               Sat
                                                     Dinner
    103
               22.42
                       3.48
                              Female
                                         Yes
                                               Sat
                                                    Dinner
                                                                 2
    104
               20.92 4.08
                                                                 2
                              Female
                                          No
                                               Sat
                                                    Dinner
    105
               15.36
                      1.64
                                Male
                                               Sat
                                                    Dinner
                                                                 2
                                         Yes
```

We can even subset rows and columns in the same line of code. What do you think the following cell will do?

```
[0]: tips.loc[5:10][['total_bill', 'day', 'time']]
[0]:
        total_bill
                     day
                             time
                           Dinner
    5
              25.29
                     Sun
    6
               8.77
                     Sun
                           Dinner
    7
              26.88
                     Sun
                           Dinner
    8
              15.04
                     Sun
                           Dinner
    9
              14.78
                           Dinner
                     Sun
    10
              10.27
                     Sun
                           Dinner
```

Now you try! Subset rows 11 and 12 and columns total\_bill and tip:

```
[0]: # subset rows and columns tips.loc[5:10][['total_bill', 'day', 'time']]
```

```
[0]:
        total_bill
                      day
                              time
    5
              25.29
                      Sun
                           Dinner
    6
               8.77
                      Sun
                           Dinner
    7
              26.88
                           Dinner
                      Sun
    8
              15.04
                      Sun
                           Dinner
    9
              14.78
                      Sun
                           Dinner
    10
              10.27
                      Sun
                           Dinner
```

Sometimes we don't know exactly which row(s) we want to subset ahead of time. What if we want to subset rows that have a certain value in the time column? We don't want to scroll through hundreds of rows to find them. The good news is: we don't have to! Let's use the method called query. Inside the parentheses of query we'll enclose a statement in quotes with the name of the column and an expression.

```
[0]: tips.query('time == "Lunch"')
```

[0]:	total_bill	tip	sex	smoker	day	time	size
77	27.20	-	Male	No	Thur		4
78	22.76	3.00	Male	No	Thur	Lunch	2
79	17.29	2.71	Male	No	Thur	Lunch	2
80	19.44	3.00	Male	Yes	Thur	Lunch	2
81	16.66	3.40	Male	No	Thur	Lunch	2
82	10.07	1.83	Female	No	Thur	Lunch	1
83	32.68	5.00	Male	Yes	Thur	Lunch	2
84	15.98		Male	No	Thur	Lunch	2
85	34.83		Female	No	Thur	Lunch	4
86	13.03		Male	No	Thur		2
87	18.28		Male	No	Thur		2
88	24.71		Male	No	Thur		2
89	21.16	3.00	Male	No	Thur	Lunch	2
117				No	Thur	Lunch	2 2
118 119			Female	No No	Thur Thur	Lunch Lunch	4
120			Male	No	Thur	Lunch	2
121			Female	No	Thur		2
122			Male	No	Thur		2
123			Male	No	Thur		2
124				No	Thur	Lunch	2
125				No	Thur	Lunch	6
126	8.52	1.48	Male	No	Thur	Lunch	2
127	14.52	2.00	Female	No	Thur	Lunch	2
128	11.38	2.00	Female	No	Thur	Lunch	2
129			Male	No	Thur		3
130			Male	No	Thur		2
131			Female	No	Thur	Lunch	2
132			Female	No	Thur	Lunch	2
133	12.26	2.00	Female	No	Thur		2
140		···	 М-Л-	 N -	тъ	 T ala	
142 143		5.00	Male Female			Lunch Lunch	5 6
144		2.30				Lunch	2
145		1.50				Lunch	2
146						Lunch	3
147		1.63				Lunch	2
148			Male			Lunch	2
149	7.51	2.00	Male	No	Thur	Lunch	2
191	19.81	4.19	Female	Yes	Thur	Lunch	2
192	28.44	2.56	Male	Yes	Thur	Lunch	2
193			Male		Thur	Lunch	2
194			Male		Thur		2
195			Male		Thur		2
196		2.00			Thur		2
197	43.11	5.00	Female	Yes	Thur	Lunch	4

```
198
           13.00 2.00
                        Female
                                         Thur
                                                Lunch
                                                           2
                                    Yes
                                                           2
199
           13.51
                  2.00
                                         Thur
                           Male
                                    Yes
                                                Lunch
200
           18.71
                  4.00
                           Male
                                    Yes
                                         Thur
                                                Lunch
                                                           3
201
           12.74
                  2.01
                         Female
                                         Thur
                                                Lunch
                                                           2
                                    Yes
202
           13.00
                 2.00
                                                           2
                         Female
                                    Yes
                                         Thur
                                                Lunch
203
           16.40
                  2.50
                         Female
                                         Thur
                                                           2
                                    Yes
                                                Lunch
204
           20.53
                  4.00
                           Male
                                    Yes
                                         Thur
                                                Lunch
                                                           4
205
           16.47
                  3.23
                         Female
                                    Yes
                                         Thur
                                                Lunch
                                                           3
                                                           2
220
           12.16
                  2.20
                           Male
                                    Yes
                                          Fri
                                                Lunch
           13.42
                  3.48
                                                Lunch
221
                         Female
                                    Yes
                                          Fri
                                                           2
222
           8.58
                  1.92
                           Male
                                    Yes
                                          Fri
                                                Lunch
                                                           1
223
           15.98 3.00
                        Female
                                                           3
                                     No
                                          Fri
                                               Lunch
224
           13.42
                 1.58
                           Male
                                    Yes
                                          Fri
                                                Lunch
                                                           2
225
           16.27
                  2.50
                         Female
                                    Yes
                                          Fri
                                                Lunch
                                                           2
226
           10.09 2.00
                         Female
                                          Fri
                                                Lunch
                                                           2
                                    Yes
```

[68 rows x 7 columns]

The above cell showed us all the rows where time is equal to "Lunch". We had to enclose "Lunch" in quotes above because it's not the name of a column, but a value within the time column.

Now you try: subset the rows where the waitress is female and save it to a variable, female:

```
[0]: # subset rows with a female waitress and save it to a variable
female = tips.query('sex == "Female"')

# take a look at the beginning
female.head()
```

```
[0]:
        total_bill
                      tip
                                sex smoker
                                             day
                                                     time
                                                           size
    0
              16.99
                     1.01
                                                               2
                            Female
                                        No
                                             Sun
                                                  Dinner
    4
              24.59
                     3.61
                            Female
                                        No
                                             Sun
                                                  Dinner
                                                               4
              35.26
    11
                     5.00
                            Female
                                        No
                                             Sun
                                                  Dinner
                                                               4
                                                               2
    14
              14.83
                     3.02
                            Female
                                        No
                                             Sun
                                                  Dinner
    16
              10.33
                     1.67
                            Female
                                        No
                                             Sun
                                                  Dinner
                                                               3
```

Now lets do the same for males. Subset the male waiter data and save it to a variable, male:

```
[0]: # subset the male waiters and save it
male = tips.query('sex == "Male"')

# look at the beginning
male.head()
```

```
[0]:
       total_bill
                      tip
                             sex smoker
                                          day
                                                  time
                                                         size
             10.34
                     1.66
                                                            3
    1
                           Male
                                      No
                                          Sun
                                                Dinner
    2
             21.01
                                                            3
                     3.50
                           Male
                                      No
                                          Sun
                                                Dinner
    3
             23.68
                     3.31
                                                            2
                           Male
                                      No
                                          Sun
                                                Dinner
    5
             25.29
                     4.71
                           Male
                                      No
                                          Sun
                                                Dinner
                                                            4
              8.77
                     2.00
                           Male
                                          Sun
                                                Dinner
                                                             2
                                      No
```

How would you determine the number of male waiters in this DataFrame? Think back to the

last lesson when we used the len function.

```
[0]: # number of males len(male)
```

[0]: 157

How about the number of female waitreses?

```
[0]: # number of females
len(female)
```

[0]: 87

We can use query on multiple columns at a time. Let's find out how many tables were served by a female waitress on a Sunday.

```
[0]: tips.query('sex == "Female" and day == "Sun"')
[0]:
          total_bill
                                                             size
                        tip
                                 sex smoker
                                              day
                                                      time
    0
               16.99
                                                                 2
                       1.01
                              Female
                                          No
                                              Sun
                                                    Dinner
    4
               24.59
                       3.61
                             Female
                                          No
                                              Sun
                                                    Dinner
                                                                 4
    11
               35.26
                      5.00
                             Female
                                              Sun
                                                    Dinner
                                                                 4
                                          No
    14
               14.83
                       3.02
                              Female
                                                                2
                                          No
                                              Sun
                                                    Dinner
    16
               10.33
                       1.67
                             Female
                                          No
                                              Sun
                                                    Dinner
                                                                3
    18
               16.97
                       3.50
                             Female
                                              Sun Dinner
                                                                3
                                          No
    51
               10.29
                       2.60
                             Female
                                          No
                                              Sun
                                                    Dinner
                                                                 2
    52
               34.81
                      5.20
                             Female
                                              Sun
                                                    Dinner
                                                                4
                                          No
    114
               25.71
                      4.00
                             Female
                                                    Dinner
                                                                3
                                          No
                                              Sun
                       3.50
                                                                 2
    115
               17.31
                             Female
                                          No
                                              Sun
                                                    Dinner
    155
               29.85
                       5.14
                              Female
                                                    Dinner
                                                                 5
                                          No
                                              Sun
    157
               25.00
                       3.75
                              Female
                                          No
                                              Sun
                                                    Dinner
                                                                4
    158
               13.39
                       2.61
                             Female
                                              Sun
                                                    Dinner
                                                                 2
                                          No
    162
               16.21
                       2.00
                                                                 3
                              Female
                                          No
                                              Sun
                                                    Dinner
    164
               17.51
                       3.00
                             Female
                                         Yes
                                              Sun
                                                    Dinner
                                                                 2
    178
                9.60
                       4.00
                              Female
                                              Sun
                                                                 2
                                         Yes
                                                    Dinner
    186
               20.90
                       3.50
                                              Sun
                                                                 3
                             Female
                                         Yes
                                                    Dinner
                       3.50
    188
               18.15
                             Female
                                         Yes
                                              Sun
                                                    Dinner
                                                                 3
```

We used the ampersand symbol (&) or the keyword and to chain together two statements inside the query function. Both statements have to be true for a row to be included.

Besides checking whether values are equal using ==, we can also use greater than, less than, greater than or equal, etc. Try subsetting the rows where the bill is greater than \$15 and the tip is less than \$2:

```
[0]: # subset by bill and tip
    tips.query('total_bill > 15 & tip < 2')</pre>
[0]:
          total_bill
                                                               size
                        tip
                                  sex smoker
                                                 day
                                                         time
                       1.01
                                                                   2
    0
               16.99
                              Female
                                           No
                                                Sun
                                                      Dinner
    8
               15.04
                       1.96
                                Male
                                                      Dinner
                                                                   2
                                           No
                                                Sun
    12
               15.42
                                                                   2
                       1.57
                                Male
                                           No
                                                Sun
                                                      Dinner
    57
               26.41
                       1.50
                              Female
                                           No
                                                 Sat
                                                      Dinner
                                                                   2
                                                                   2
    105
               15.36
                      1.64
                                 Male
                                          Yes
                                                 Sat
                                                      Dinner
```

```
130
          19.08 1.50
                                                           2
                           Male
                                    No
                                         Thur
                                                Lunch
146
          18.64
                 1.36
                                         Thur
                                                Lunch
                                                           3
                        Female
                                    No
                                                           2
190
                  1.50
          15.69
                           Male
                                   Yes
                                          Sun
                                               Dinner
                                                           2
237
          32.83
                 1.17
                           Male
                                   Yes
                                          Sat
                                               Dinner
242
          17.82 1.75
                           Male
                                    No
                                          Sat
                                               Dinner
                                                           2
```

Instead of the ampersand (&) we can use the pipe (|) or the keyword or to represent a query where *one* of the two conditions must be fulfilled. Try subsetting where the bill is greater than \$15 or the tip is greater than \$5:

```
[0]: # subset by bill or tip
tips.query('total_bill > 15 | tip > 5')
```

		1 5	_	·	1	-			
[0]:		total_bill	tip	sex	smoker	day	time	size	
	0	16.99	1.01	Female	No	Sun	Dinner	2	
	2	21.01	3.50	Male	No	Sun	Dinner	3	
	3	23.68	3.31	Male	No	Sun	Dinner	2	
	4	24.59	3.61	Female	No	Sun	Dinner	4	
	5	25.29	4.71	Male	No	Sun	Dinner	4	
	7	26.88	3.12	Male	No	Sun	Dinner	4	
	8	15.04	1.96	Male	No	Sun	Dinner	2	
	11	35.26	5.00	Female	No	Sun	Dinner	4	
	12	15.42	1.57	Male	No	Sun	Dinner	2	
	13	18.43	3.00	Male	No	Sun	Dinner	4	
	15	21.58	3.92	Male	No	Sun	Dinner	2	
	17	16.29	3.71	Male	No	Sun	Dinner	3	
	18	16.97	3.50	Female	No	Sun	Dinner	3	
	19	20.65	3.35	Male	No	Sat	Dinner	3	
	20	17.92	4.08	Male	No	Sat	Dinner	2	
	21	20.29	2.75	Female	No	Sat	Dinner	2	
	22	15.77	2.23	Female	No	Sat	Dinner	2	
	23	39.42	7.58	Male	No	Sat	Dinner	4	
	24	19.82	3.18	Male	No	Sat	Dinner	2	
	25	17.81	2.34	Male	No	Sat	Dinner	4	
	28	21.70	4.30	Male	No	Sat	Dinner	2	
	29	19.65	3.00	Female	No	Sat	Dinner	2	
	31	18.35	2.50	Male	No	Sat	Dinner	4	
	32	15.06	3.00	Female	No	Sat	Dinner	2	
	33	20.69	2.45	Female	No	Sat	Dinner	4	
	34	17.78	3.27	Male	No	Sat	Dinner	2	
	35	24.06	3.60	Male	No	Sat	Dinner	3	
	36	16.31	2.00	Male	No	Sat	Dinner	3	
	37	16.93	3.07	Female	No	Sat	Dinner	3	
	38	18.69	2.31	Male	No	Sat	Dinner	3	
		• • •					• • •		
	193	15.48	2.02	Male	Yes	Thur	Lunch	2	
	194	16.58	4.00	Male	Yes	Thur	Lunch	2	
	197	43.11	5.00	Female	Yes	Thur	Lunch	4	
	200	18.71	4.00	Male	Yes	Thur	Lunch	3	

203	16.40	2.50	Female	Yes	Thur	Lunch	2
204	20.53	4.00	Male	Yes	Thur	Lunch	4
205	16.47	3.23	Female	Yes	Thur	Lunch	3
206	26.59	3.41	Male	Yes	Sat	Dinner	3
207	38.73	3.00	Male	Yes	Sat	Dinner	4
208	24.27	2.03	Male	Yes	Sat	Dinner	2
210	30.06	2.00	Male	Yes	Sat	Dinner	3
211	25.89	5.16	Male	Yes	Sat	Dinner	4
212	48.33	9.00	Male	No	Sat	Dinner	4
214	28.17	6.50	Female	Yes	Sat	Dinner	3
216	28.15	3.00	Male	Yes	Sat	Dinner	5
219	30.14	3.09	Female	Yes	Sat	Dinner	4
223	15.98	3.00	Female	No	Fri	Lunch	3
225	16.27	2.50	Female	Yes	Fri	Lunch	2
227	20.45	3.00	Male	No	Sat	Dinner	4
229	22.12	2.88	Female	Yes	Sat	Dinner	2
230	24.01	2.00	Male	Yes	Sat	Dinner	4
231	15.69	3.00	Male	Yes	Sat	Dinner	3
234	15.53	3.00	Male	Yes	Sat	Dinner	2
237	32.83	1.17	Male	Yes	Sat	Dinner	2
238	35.83	4.67	Female	No	Sat	Dinner	3
239	29.03	5.92	Male	No	Sat	Dinner	3
240	27.18	2.00	Female	Yes	Sat	Dinner	2
241	22.67	2.00	Male	Yes	Sat	Dinner	2
242	17.82	1.75	Male	No	Sat	Dinner	2
243	18.78	3.00	Female	No	Thur	Dinner	2

[165 rows x 7 columns]

Congrats on making it to the end of this lesson -- we learned a lot!

- How to use square brackets to subset columns.
- How to use iloc to subset rows.
- How to use iloc and square brackets at the same time.
- How to use query to find rows where the column has a certain value.

[0]: