review-introduction

January 26, 2019

Data Analysis with Python

Introduction

Welcome!

In this section, you will learn how to approach data acquisition in various ways, and obtain necessary insights from a dataset. By the end of this lab, you will successfully load the data into Jupyter Notebook, and gain some fundamental insights via Pandas Library.

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<a href="#data_acquisition">Data Acquisition</a>
<a href="#basic_insight">Basic Insight of Dataset</a>
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Estimated Time Needed: 10 min

Data Acquisition

There are various formats for a dataset, .csv, .json, .xlsx etc. The dataset can be stored in different places, on your local machine or sometimes online. In this section, you will learn how to load a dataset into our Jupyter Notebook. In our case, the Automobile Dataset is an online source, and it is in CSV (comma separated value) format. Let's use this dataset as an example to practice data reading.

```
data source: <a href="https://archive.ics.uci.edu/ml/machine-learning-databases/autos/import
<li>data type: csv
```

The Pandas Library is a useful tool that enables us to read various datasets into a data frame; our Jupyter notebook platforms have a built-in Pandas Library so that all we need to do is import Pandas without installing.

```
In [1]: # import pandas library
    import pandas as pd
```

Read Data

We use pandas.read_csv() function to read the csv file. In the bracket, we put the file path along with a quotation mark, so that pandas will read the file into a data frame from that address. The file path can be either an URL or your local file address. Because the data does not include headers, we can add an argument headers = None inside the read_csv() method, so that pandas will not automatically set the first row as a header. You can also assign the dataset to any variable you create.

```
In [2]: # Import pandas library
    import pandas as pd

# Read the online file by the URL provides above, and assign it to variable "df"
    other_path = "https://s3-api.us-geo.objectstorage.softlayer.net/cf-courses-data/Cognitiv
    df = pd.read_csv(other_path, header=None)
```

After reading the dataset, we can use the dataframe.head(n) method to check the top n rows of the dataframe; where n is an integer. Contrary to dataframe.head(n), dataframe.tail(n) will show you the bottom n rows of the dataframe.

The first 5 rows of the dataframe

```
Out [3]:
            0
                                2
                                      3
                                                                      7
                                                                                     9
                  1
                                           4
                                                  5
                                                                 6
                                                                              8
        0
             3
                      alfa-romero
                                          std
                                                      convertible
                                                                     rwd
                                                                           front
                                                                                   88.6
                                     gas
                                                 two
        1
                      alfa-romero
                                                      convertible
                                                                           front
                                                                                   88.6
                                     gas
                                          std
                                                 two
                                                                     rwd
                   ?
                      alfa-romero
                                     gas
                                          std
                                                 two
                                                         hatchback rwd
                                                                          front
                                                                                   94.5
                                                                     fwd front
        3
             2
                164
                              audi
                                     gas
                                          std
                                               four
                                                             sedan
                                                                                   99.8
        4
                164
                              audi
                                     gas
                                          std
                                               four
                                                             sedan
                                                                     4wd
                                                                          front
                                                                                   99.4
             16
                    17
                          18
                                 19
                                        20
                                              21
                                                    22
                                                         23
                                                             24
                                                                     25
            130
                        3.47
                               2.68
                                       9.0
                                            111
                                                  5000
                                                         21
                                                             27
        0
                 mpfi
                                                                  13495
        1
            130
                 mpfi
                        3.47
                               2.68
                                       9.0
                                            111
                                                  5000
                                                         21
                                                             27
                                                                  16500
            152
                        2.68
                               3.47
                                       9.0
                                            154
                                                  5000
                                                         19
                                                                  16500
                 mpfi
            109
                 mpfi
                        3.19
                               3.40
                                      10.0
                                            102
                                                  5500
                                                         24
                                                             30
                                                                  13950
            136
                 mpfi
                        3.19 3.40
                                       8.0
                                            115
                                                  5500
                                                         18
                                                             22
                                                                  17450
```

[5 rows x 26 columns]

Question #1:

check the bottom 10 rows of data frame "df".

```
Out[4]:
                          2
                                          4
                                                5
             0
                   1
                                   3
                                                        6
                                                             7
                                                                     8
                                                                            9
                                                                                        \
        195
             -1
                   74
                       volvo
                                         std four
                                                                 front
                                                                         104.3
                                  gas
                                                     wagon
                                                            rwd
        196
             -2
                 103
                       volvo
                                             four
                                                                         104.3
                                  gas
                                                     sedan
                                                            rwd
                                                                 front
        197
                   74
             -1
                       volvo
                                         std four
                                                     wagon
                                                            rwd
                                                                 front
                                                                         104.3
                                 gas
                                       turbo
        198
             -2
                 103
                       volvo
                                 gas
                                             four
                                                     sedan
                                                            rwd
                                                                 front
                                                                         104.3
        199
                                                                 front
             -1
                   74
                       volvo
                                  gas
                                       turbo four
                                                     wagon
                                                            rwd
                                                                         104.3
        200
             -1
                   95
                       volvo
                                         std four
                                                     sedan
                                                                         109.1
                                                            rwd
                                                                 front
                                  gas
        201
             -1
                   95
                                             four
                                                                         109.1
                       volvo
                                       turbo
                                                     sedan
                                                                front
                                  gas
                                                            rwd
        202
             -1
                   95
                                                                       109.1
                     volvo
                                         std four
                                                     sedan
                                                           rwd front
                                  gas
```

```
203
    -1
          95 volvo
                     diesel
                            turbo four
                                          sedan
                                                 rwd front
                                                             109.1
204
    -1
          95
             volvo
                             turbo four
                                          sedan
                                                 rwd
                                                      front
                                                             109.1 ...
                        gas
                                                 24
      16
            17
                  18
                        19
                              20
                                   21
                                         22
                                             23
                                                        25
    141
195
          mpfi
                3.78
                      3.15
                             9.5
                                  114
                                       5400
                                             23
                                                 28
                                                     13415
196
     141
          mpfi
                3.78
                      3.15
                             9.5
                                  114
                                       5400
                                             24
                                                 28
                                                     15985
197
     141
         mpfi
                3.78
                      3.15
                             9.5
                                  114
                                       5400
                                                 28
                                                     16515
198
    130
         mpfi
                3.62
                      3.15
                             7.5
                                  162
                                       5100
                                             17
                                                 22
                                                     18420
199
    130
         mpfi 3.62
                      3.15
                             7.5
                                  162 5100 17
                                                 22 18950
200
    141
         mpfi
              3.78
                     3.15
                             9.5
                                  114 5400
                                             23
                                                 28
                                                     16845
201
    141
          mpfi
                3.78
                      3.15
                             8.7
                                  160
                                       5300 19
                                                 25
                                                     19045
               3.58
                                  134
202
    173
          mpfi
                      2.87
                             8.8
                                       5500
                                            18
                                                 23
                                                     21485
                                  106
203
           idi
                3.01
                            23.0
                                       4800
                                             26
                                                 27
                                                     22470
    145
                      3.40
204
    141
          mpfi
               3.78 3.15
                             9.5
                                  114
                                       5400
                                             19
                                                 25
                                                     22625
```

[10 rows x 26 columns]

Question #1 Answer:

Run the code below for the solution!

Double-click here for the solution.

Add Headers

Take a look at our dataset; pandas automatically set the header by an integer from 0.

To better describe our data we can introduce a header, this information is available at: https://archive.ics.uci.edu/ml/datasets/Automobile

Thus, we have to add headers manually.

Firstly, we create a list "headers" that include all column names in order. Then, we use dataframe.columns = headers to replace the headers by the list we created.

headers

```
['symboling', 'normalized-losses', 'make', 'fuel-type', 'aspiration', 'num-of-doors', 'body-sty
```

We replace headers and recheck our data frame

```
symboling normalized-losses
                                          make fuel-type aspiration num-of-doors
            3
                                  alfa-romero
0
                                                                  std
                                                      gas
                                                                                two
1
            3
                                  alfa-romero
                                                                  std
                                                      gas
                                                                                two
2
            1
                               ?
                                  alfa-romero
                                                      gas
                                                                  std
                                                                                two
3
            2
                             164
                                                                  std
                                                                               four
                                          audi
                                                      gas
```

```
4
             2
                               164
                                                                                     four
                                             audi
                                                                       std
                                                          gas
5
             2
                                             audi
                                                          gas
                                                                       std
                                                                                      two
6
             1
                               158
                                                                                     four
                                             audi
                                                                       std
                                                          gas
7
             1
                                  ?
                                             audi
                                                                                     four
                                                          gas
                                                                       std
8
             1
                               158
                                             audi
                                                                     turbo
                                                                                     four
                                                          gas
9
             0
                                  ?
                                             audi
                                                                     turbo
                                                                                      two
                                                          gas
    body-style drive-wheels engine-location
                                                    wheel-base
                                                                           engine-size
                                                                   . . .
   convertible
                                                           88.6
                                                                                    130
0
                            rwd
                                            front
   convertible
                                                           88.6
                                                                                    130
1
                            rwd
                                            front
                                                                   . . .
2
                                                           94.5
     hatchback
                            rwd
                                            front
                                                                                    152
3
          sedan
                            fwd
                                            front
                                                           99.8
                                                                                    109
4
          sedan
                                                           99.4
                                                                                    136
                            4wd
                                            front
5
                                                           99.8
          sedan
                            fwd
                                            front
                                                                                    136
                                                                   . . .
6
          sedan
                            fwd
                                            front
                                                          105.8
                                                                                    136
                                                                   . . .
7
                                                          105.8
                                                                                    136
          wagon
                            fwd
                                            front
8
          sedan
                            fwd
                                            front
                                                          105.8
                                                                                    131
                                                                   . . .
9
     hatchback
                            4wd
                                            front
                                                           99.5
                                                                                    131
   fuel-system
                         stroke compression-ratio horsepower
                                                                    peak-rpm city-mpg
                  bore
0
           mpfi
                  3.47
                            2.68
                                                  9.0
                                                               111
                                                                          5000
                                                                                      21
1
                                                  9.0
                                                                                      21
           mpfi
                  3.47
                            2.68
                                                               111
                                                                         5000
2
           mpfi
                  2.68
                            3.47
                                                  9.0
                                                               154
                                                                         5000
                                                                                      19
3
           mpfi
                  3.19
                            3.40
                                                 10.0
                                                               102
                                                                         5500
                                                                                      24
4
           mpfi
                  3.19
                            3.40
                                                  8.0
                                                               115
                                                                         5500
                                                                                      18
5
                            3.40
           mpfi
                  3.19
                                                  8.5
                                                               110
                                                                                      19
                                                                         5500
6
                  3.19
                            3.40
           mpfi
                                                  8.5
                                                               110
                                                                         5500
                                                                                      19
7
                            3.40
           mpfi
                  3.19
                                                  8.5
                                                               110
                                                                         5500
                                                                                      19
8
                  3.13
                            3.40
                                                  8.3
                                                                                      17
           mpfi
                                                               140
                                                                         5500
9
           mpfi
                  3.13
                            3.40
                                                  7.0
                                                               160
                                                                         5500
                                                                                      16
  highway-mpg
                 price
0
             27
                 13495
1
             27
                 16500
2
             26
                 16500
3
             30
                 13950
4
             22
                 17450
5
             25
                 15250
6
             25
                 17710
7
                 18920
             25
8
             20
                 23875
                      ?
9
             22
```

[10 rows x 26 columns]

we can drop missing values along the column "price" as follows

```
In [7]: df.dropna(subset=["price"], axis=0)
```

Out[7]:		-	normalized-losses			aspiration	\
	0	3	?	alfa-romero	gas	std	
	1	3	?	alfa-romero	gas	std	
	2	1	?	alfa-romero	gas	std	
	3	2	164	audi	gas	std	
	4	2	164	audi	gas	std	
	5	2	?	audi	gas	std	
	6	1	158	audi	gas	std	
	7	1	?	audi	gas	std	
	8	1	158	audi	gas	turbo	
	9	0	?	audi	gas	turbo	
	10	2	192	bmw	gas	std	
	11	0	192	bmw	gas	std	
	12	0	188	bmw	gas	std	
	13	0	188	bmw	gas	std	
	14	1	?	bmw	gas	std	
	15	0	?	bmw	gas	std	
	16	0	?	bmw -	gas	std	
	17	0	?	bmw	gas	std	
	18	2	121	chevrolet	gas	std	
	19	1	98	chevrolet	gas	std	
	20	0	81	chevrolet	gas	std	
	21	1	118	dodge	gas	std	
	22	1	118	dodge	gas	std	
	23	1	118	dodge	gas	turbo	
	24	1	148	dodge	gas	std	
	25	1	148	dodge	gas	std	
	26	1	148	dodge	gas	std	
	27	1	148	dodge	gas	turbo	
	28 29	-1 3	110	dodge	gas	std	
			145	dodge	gas	turbo	
	 175	-1	65	toyota	gas	std	
	176	-1	65	toyota	gas	std	
	177	-1	65	toyota	gas	std	
	178	3	197	toyota	gas	std	
	179	3	197	toyota	gas	std	
	180	-1	90	toyota	gas	std	
	181	-1	?	toyota	gas	std	
	182	2	122	volkswagen	diesel	std	
	183	2	122	volkswagen	gas	std	
	184	2	94	volkswagen	diesel	std	
	185	2	94	volkswagen	gas	std	
	186	2	94	volkswagen	gas	std	
	187	2	94	volkswagen	diesel	turbo	
	188	2	94	volkswagen	gas	std	
	189	3	?	volkswagen	gas	std	
	190	3	256	volkswagen	gas	std	

191	0	?	olkswagen volkswagen	gas	std		
192	0	?	? volkswagen	diesel	turbo		
193	0	?	olkswagen volkswagen	gas	std		
194	-2	103	3 volvo	gas	std		
195	-1	74	ł volvo	gas	std		
196	-2	103	B volvo	gas	std		
197	-1	74		gas	std		
198	-2	103		gas	turbo		
199	-1	74		gas	turbo		
200	-1	95		gas	std		
201	-1	95		gas	turbo		
202	-1	95		gas	std		
203	-1	95		diesel	turbo		
204	-1	95		gas	turbo		
	_	-		8	3 4 2 3 3		
	num-of-doors	bodv-stvle dr	rive-wheels engi	ne-location	wheel-base		\
0	two	convertible	rwd	front	88.6		•
1	two	convertible	rwd	front	88.6		
2	two	hatchback	rwd	front	94.5		
3	four	sedan	fwd	front	99.8		
4	four	sedan	4wd	front	99.4		
5	two	sedan	fwd	front	99.8		
6	four	sedan	fwd	front	105.8		
7	four	wagon	fwd	front	105.8		
8	four	sedan	fwd	front	105.8		
9	two	hatchback	4wd	front	99.5		
10	two	sedan	rwd	front	101.2	• • •	
11	four	sedan	rwd	front	101.2		
12	two	sedan	rwd	front	101.2		
13	four	sedan	rwd	front	101.2		
14	four	sedan	rwd	front	103.5		
15	four	sedan	rwd	front	103.5		
16	two	sedan	rwd	front	103.5		
17	four	sedan	rwd	front	110.0		
18	two	hatchback	fwd	front	88.4		
19	two	hatchback	fwd	front	94.5		
20	four	sedan	fwd	front	94.5		
21	two	hatchback	fwd	front	93.7		
22	two	hatchback	fwd	front	93.7		
23	two	hatchback	fwd	front	93.7		
24	four	hatchback	fwd	front	93.7		
25	four	sedan	fwd	front	93.7		
26	four	sedan	fwd	front	93.7		
27	?	sedan	fwd	front	93.7		
28	four	wagon	fwd	front	103.3		
29	two	hatchback	fwd	front	95.9		
		···					
175	four	hatchback	fwd	front	102.4		
5	1041		± c.	110110	102.1		

176	four	sedan		fwd	front	102.4 .	
177	four	hatchback		fwd	front	102.4 .	
178	two	hatchback		rwd	front	102.9 .	
179	two	hatchback		rwd	front	102.9 .	
180	four	sedan		rwd	front	104.5 .	
181	four	wagon		rwd	front	104.5 .	
182	two	sedan		fwd	front	97.3 .	
183	two	sedan		fwd	front	97.3 .	
184	four	sedan		fwd	front	97.3 .	
185	four	sedan		fwd	front	97.3 .	
186	four	sedan		fwd	front	97.3 .	
187	four	sedan		fwd	front	97.3 .	
188	four	sedan		fwd	front	97.3 .	
189	two	convertible		fwd	front	94.5 .	
190	two	hatchback		fwd	front	94.5 .	
191	four	sedan		fwd	front	100.4 .	
192	four	sedan		fwd	front	100.4 .	
193	four	wagon		fwd	front	100.4 .	
194	four	sedan		rwd	front	104.3 .	
195	four	wagon		rwd	front	104.3 .	
196	four	sedan		rwd	front	104.3 .	
197	four	wagon		rwd	front	104.3 .	
198	four	sedan		rwd	front	104.3 .	
199	four	wagon		rwd	front	104.3 .	
200	four	sedan		rwd	front	109.1 .	
201	four	sedan		rwd	front	109.1 .	
202	four	sedan		rwd	front	109.1 .	
203	four	sedan		rwd	front	109.1 .	
204	four	sedan		rwd	front	109.1 .	
	engine-size	fuel-system	bore		compression-ratio	-	/
0	130	mpfi	3.47	2.68	9.00	111	
1	130	mpfi	3.47	2.68	9.00	111	
2	152	mpfi	2.68	3.47	9.00	154	
3	109	mpfi	3.19	3.40	10.00	102	
4	136	mpfi	3.19	3.40	8.00	115	
5	136	mpfi	3.19	3.40	8.50	110	
6	136	mpfi	3.19	3.40	8.50	110	
7	136	mpfi	3.19	3.40	8.50	110	
8	131	mpfi	3.13	3.40	8.30	140	
9	131	mpfi	3.13	3.40	7.00	160	
10	108	mpfi	3.50	2.80	8.80	101	
11	108	mpfi	3.50	2.80	8.80	101	
12	164	mpfi	3.31	3.19	9.00	121	
13	164	mpfi	3.31	3.19	9.00	121	
14	164	mpfi	3.31	3.19	9.00	121	
15	209	mpfi	3.62	3.39	8.00	182	
16	209	mpfi	3.62	3.39	8.00	182	

17	209	mpfi	3.62	3.39	8.00	182
18	61	2bbl	2.91	3.03	9.50	48
19	90	2bbl	3.03	3.11	9.60	70
20	90	2bbl	3.03	3.11	9.60	70
21	90	2bbl	2.97	3.23	9.41	68
22	90	2bbl	2.97	3.23	9.40	68
23	98	mpfi	3.03	3.39	7.60	102
24	90	2bbl	2.97	3.23	9.40	68
25	90	2bbl	2.97	3.23	9.40	68
26	90	2bbl	2.97	3.23	9.40	68
27	98	mpfi	3.03	3.39	7.60	102
28	122	2bbl	3.34	3.46	8.50	88
29	156	mfi	3.60	3.90	7.00	145
 175	 122	mpfi	3.31	3.54	8.70	92
176	122	mpfi	3.31	3.54	8.70	92
177	122	mpfi	3.31	3.54	8.70	92
178	171	mpfi	3.27	3.35	9.30	161
179	171	mpfi	3.27	3.35	9.30	161
180	171	mpfi	3.27	3.35	9.20	156
181	161	mpfi	3.27	3.35	9.20	156
182	97	idi	3.01	3.40	23.00	52
183	109	mpfi	3.19	3.40	9.00	85
184	97	idi	3.01	3.40	23.00	52
185	109	mpfi	3.19	3.40	9.00	85
186	109	mpfi	3.19	3.40	9.00	85
187	97	idi	3.01	3.40	23.00	68
188	109	mpfi	3.19	3.40	10.00	100
189	109	mpfi	3.19	3.40	8.50	90
190	109	mpfi	3.19	3.40	8.50	90
191	136	mpfi	3.19	3.40	8.50	110
192	97	idi	3.01	3.40	23.00	68
193	109	mpfi	3.19	3.40	9.00	88
194	141	mpfi	3.78	3.15	9.50	114
195	141	mpfi	3.78	3.15	9.50	114
196	141	mpfi	3.78	3.15	9.50	114
197	141	mpfi	3.78	3.15	9.50	114
198	130	mpfi	3.62	3.15	7.50	162
199	130	mpfi	3.62	3.15	7.50	162
200	141	mpfi	3.78	3.15	9.50	114
201	141	mpfi	3.78	3.15	8.70	160
202	173	mpfi	3.58	2.87	8.80	134
203	145	idi	3.01	3.40	23.00	106
204	141	mpfi	3.78	3.15	9.50	114

	peak-rpm	city-mpg	highway-mpg	price
0	5000	21	27	13495
1	5000	21	27	16500

2	5000	19	26	16500
3	5500	24	30	13950
4	5500	18	22	17450
5	5500	19	25	15250
6	5500	19	25	17710
7	5500	19	25	18920
8	5500	17	20	23875
9	5500	16	22	?
10	5800	23	29	16430
11	5800			16925
		23	29	
12	4250	21	28	20970
13	4250	21	28	21105
14	4250	20	25	24565
15	5400	16	22	30760
16	5400	16	22	41315
17	5400	15	20	36880
18	5100	47	53	5151
19	5400	38	43	6295
20	5400	38	43	6575
21	5500	37	41	5572
22	5500	31	38	6377
23	5500	24	30	7957
24	5500	31	38	6229
25	5500	31	38	6692
26	5500	31	38	7609
27	5500	24	30	8558
28	5000	24	30	8921
29	5000	19	24	12964
	4000			
175	4200	27	32	9988
176	4200	27	32	10898
177	4200	27	32	11248
178	5200	20	24	16558
179	5200	19	24	15998
180	5200	20	24	15690
181	5200	19	24	15750
182	4800	37	46	7775
183	5250	27	34	7975
184	4800	37	46	7995
185	5250	27	34	8195
186	5250	27	34	8495
187	4500	37	42	9495
188	5500	26	32	9995
189	5500	24	29	11595
190	5500	24	29	9980
191	5500	19	24	13295
192	4500	33	38	13845
192	5500	25	31	12290
100	3000	20	91	12230