Data Retrieval

- · Install the following python modules
- html5lib xlrd openpyxl sqlalchemy pymysql pymongo lxml

CSV and Text files

• read_csv, read_table, to_csv

```
In [1]: import numpy as np
         import pandas as pd
In [2]: %cat read_write_data/file_01.csv
         white, red, blue, green, animal
         1,5,2,3,cat
         2,7,8,5,dog
         3,3,6,7,horse
         2,2,8,3,duck
         4,4,2,1,mouse
In [3]: df = pd.read_csv('read_write_data/file_01.csv')
         df
Out[3]:
            white red blue green animal
          0
                1
                    5
                         2
                               3
                                     cat
                    7
          1
                2
                         8
                               5
                                    dog
          2
                               7
                3
                    3
                         6
                                   horse
          3
                2
                    2
                         8
                               3
                                   duck
                4
                    4
                         2
                               1 mouse
In [4]: df.shape
Out[4]: (5, 5)
In [5]: pd.read_table('read_write_data/file_01.csv')
Out[5]:
            white,red,blue,green,animal
          0
                          1,5,2,3,cat
          1
                          2,7,8,5,dog
          2
                         3,3,6,7,horse
          3
                         2,2,8,3,duck
                        4,4,2,1,mouse
          4
```

```
In [6]: pd.read_table('read_write_data/file_01.csv', sep=',')
 Out[6]:
            white red blue green animal
          0
                1
                    5
                        2
                              3
                                   cat
          1
                2
                    7
                        8
                              5
                                   dog
          2
                3
                    3
                        6
                              7
                                 horse
          3
                2
                    2
                        8
                              3
                                  duck
                        2
                4
                              1 mouse
 In [7]: # header
          %cat read_write_data/file_02.csv
         1,5,2,3,cat
          2,7,8,5,dog
          3,3,6,7,horse
          2,2,8,3,duck
          4,4,2,1,mouse
 In [8]: pd.read_csv('read_write_data/file_02.csv')
 Out[8]:
            1 5 2 3 cat
          0 2 7 8 5
                        dog
          1 3 3 6 7 horse
          2 2 2 8 3
                        duck
          3 4 4 2 1 mouse
 In [9]: pd.read_csv('read_write_data/file_02.csv', header=None)
 Out[9]:
            0 1 2 3 4
          0 1 5 2 3
                         cat
          1 2 7 8 5
                        dog
          2 3 3 6 7
                       horse
          3 2 2 8 3
                        duck
          4 4 4 2 1 mouse
In [10]: pd.read_csv('read_write_data/file_02.csv',
                      names=['white','red','blue','green','animal'])
Out[10]:
            white red blue green animal
          0
                1
                    5
                        2
                              3
                                   cat
          1
                2
                    7
                        8
                              5
                                   dog
          2
                3
                    3
                        6
                              7
                                 horse
          3
                2
                    2
                        8
                              3
                                  duck
                              1 mouse
```

```
In [11]: # Hierarchical structure
           %cat read_write_data/file_03.csv
          color,status,item1,item2,item3
          black, up, 3, 4, 6
          black, down, 2, 6, 7
          white, up, 5, 5, 5
          white, down, 3, 3, 2
          white, left, 1, 2, 1
          red, up, 2, 2, 2
          red, down, 1, 1, 4
In [12]: df = pd.read csv('read write data/file 03.csv')
Out[12]:
              color status item1 item2 item3
                                    4
                                          6
           0 black
                              3
                       up
                              2
                                    6
                                          7
           1
              black
                     down
                                    5
                              5
                                          5
             white
                       up
              white
                     down
                              3
                                    3
                                          2
                                    2
              white
                      left
                              1
                                          1
                                    2
                                          2
           5
                red
                       up
                              2
           6
                              1
                                    1
                                          4
               red
                     down
In [13]: df = pd.read_csv('read_write_data/file_03.csv',
                               index_col=['color','status'])
           df
Out[13]:
                        item1 item2 item3
           color status
                           3
                                 4
                                       6
                    up
           black
                  down
                           2
                                 6
                                       7
                           5
                                 5
                                       5
                    up
           white
                  down
                                 3
                                       2
                    left
                                 2
                                       1
                           1
                    up
                           2
                                 2
                                       2
             red
                                       4
                           1
                                 1
                  down
In [14]: df.shape
Out[14]: (7, 3)
In [15]: df.loc['black']
Out[15]:
                  item1 item2 item3
           status
                      3
                            4
                                  6
              up
            down
                     2
                            6
                                  7
```

```
In [16]: df.loc['black', 'down']
Out[16]: item1
                   2
         item2
         item3
                   7
         Name: (black, down), dtype: int64
In [17]: # spaces or tabs in random order
         %cat read_write_data/file_04.txt
         white red
                      blue
                                  green
         1 5
                          2 3
         2 7
                  8
           3 3 6
                     7
In [18]: pd.read table('read write data/file 04.txt')
Out[18]:
                white red blue green
            15
                       NaN
                              23
            27
                        8 5
                             NaN
          3367
                       NaN
                            NaN
In [19]: # Use regular expression for separator
         pd.read_table('read_write_data/file_04.txt', sep='\s+',
                       engine='python')
Out[19]:
            white red blue green
          0
                   5
                        2
                             3
          1
               2
                   7
                        8
                             5
          2
                             7
               3
                   3
                        6
In [20]: | %cat read_write_data/file_05.txt
         000END123AAA122
         001END124BBB321
         002END125CCC333
In [21]: # Extract numerical parts
         pd.read_table('read_write_data/file_05.txt', sep='\D+',
                        header=None, engine='python')
Out[21]:
            0 1
                   2
          0 0 123 122
          1 1 124 321
          2 2 125 333
```

```
In [22]: | %cat read_write_data/file_06.txt
         ######## LOG FILE ###########
         This file has been generated by automatic system
         white, red, blue, green, animal
         12-Feb-2015: Counting of animals inside the house
          1,5,2,3,cat
          2,7,8,5,dog
          13-Feb-2015: Counting of animals outside the house
          3,3,6,7,horse
         2,2,8,3,duck
          4,4,2,1,mouse
In [23]: # Skip lines
         pd.read_table('read_write_data/file_06.txt', sep=',',
                         skiprows=[0,1,3,6])
Out[23]:
            white red blue green animal
          0
                1
                    5
                        2
                              3
                                   cat
          1
                2
                    7
                        8
                              5
                                   dog
          2
                3
                    3
                        6
                              7
                                 horse
          3
                2
                    2
                        8
                              3
                                  duck
                4
                    4
                        2
                              1 mouse
In [24]: pd.read_csv('read_write_data/file_06.txt',
                         skiprows=[0,1,3,6])
Out[24]:
            white red blue green animal
          0
                    5
                        2
                1
                              3
                                   cat
          1
                2
                    7
                        8
                              5
                                   dog
          2
                              7
                3
                    3
                        6
                                 horse
          3
                2
                    2
                        8
                              3
                                  duck
                4
                        2
                              1 mouse
In [25]: | %cat read_write_data/file_02.csv
          1,5,2,3,cat
          2,7,8,5,dog
         3,3,6,7,horse
```

2,2,8,3,duck 4,4,2,1,mouse

```
In [26]: # read only a portion of the file
         pd.read_csv('read_write_data/file_02.csv',
                       skiprows=2, header=None)
Out[26]:
            0 1 2 3 4
         0 3 3 6 7 horse
         1 2 2 8 3 duck
         2 4 4 2 1 mouse
In [27]: pd.read_csv('read_write_data/file_02.csv',
                       skiprows=2, nrows=1, header=None)
Out[27]:
            0 1 2 3 4
         0 3 3 6 7 horse
In [28]: %cat read_write_data/file_01.csv
         white, red, blue, green, animal
         1,5,2,3,cat
         2,7,8,5,dog
         3,3,6,7,horse
         2,2,8,3,duck
         4,4,2,1,mouse
In [29]: # read in chunks
         out = []
         pieces = pd.read_csv('read_write_data/file_01.csv',chunksize=2)
         for piece in pieces:
             print(piece, '\n')
             out.append(piece['red'].sum())
         print(out)
            white red blue green animal
              1
                     5
                          2
                                 3
                2
                     7
                                  5
                                       dog
            white red blue green animal
                3
                     3
                           6
                                  7 horse
         3
                2
                     2
                                  3
                                     duck
                           8
            white red blue green animal
                             1 mouse
             4
                       2
         [12, 5, 4]
```

```
In [30]: # Using List Comprehension
         pieces = pd.read_csv('read_write_data/file_01.csv',chunksize=2)
          [piece['red'].sum() for piece in pieces]
Out[30]: [12, 5, 4]
         Writing Data in CSV format
In [31]: frame = pd.DataFrame(
              np.arange(16).reshape((4,4)),
              index=['red', 'blue', 'yellow', 'white'],
              columns=['ball','pen','pencil','paper'])
          frame
Out[31]:
                ball pen pencil paper
            red
                  0
                      1
                            2
                                  3
           blue
                  4
                      5
                            6
                                  7
          yellow
                  8
                      9
                           10
                                 11
           white
                 12
                     13
                           14
                                 15
In [32]: frame.to csv('read write data/file 07.csv')
          %cat read_write_data/file_07.csv
          ,ball,pen,pencil,paper
         red,0,1,2,3
         blue, 4, 5, 6, 7
         yellow, 8, 9, 10, 11
         white, 12, 13, 14, 15
In [33]: frame.to_csv('read_write_data/file_07b.csv',
                      header=True, index=False)
          %cat read_write_data/file_07b.csv
         ball, pen, pencil, paper
         0,1,2,3
          4,5,6,7
         8,9,10,11
         12,13,14,15
In [34]: frame.to_csv('read_write_data/file_07c.csv',
                      header=False, index=False)
          %cat read write data/file 07c.csv
         0,1,2,3
```

4,5,6,7 8,9,10,11 12,13,14,15

Out[35]:

	ball	mug	paper	pen	pencil
blue	6	NaN	NaN	6.0	NaN
green	8	NaN	NaN	NaN	NaN
red	10	NaN	NaN	NaN	NaN
white	20	NaN	NaN	20.0	NaN
yellow	22	NaN	NaN	19.0	NaN

Out[37]:

	ball	mug	paper	pen	pencii
blue	6	NaN	NaN	6.0	NaN
green	8	NaN	NaN	NaN	NaN
red	10	NaN	NaN	NaN	NaN
white	20	NaN	NaN	20.0	NaN
yellow	22	NaN	NaN	19.0	NaN

```
In [38]:
          df.dropna(axis=1)
Out[38]:
                 ball
             blue
                   6
            green
                   8
                   10
             red
            white
                  20
                  22
           yellow
In [39]:
          frame3.to_csv('read_write_data/file_08b.csv', na_rep='Nan',
                        header=True, index=True)
           %cat read_write_data/file_08b.csv
           ,ball,mug,paper,pen,pencil
          blue, 6, Nan, Nan, 6.0, Nan
          green, 8, Nan, Nan, Nan, Nan
          red, 10, Nan, Nan, Nan, Nan
          white, 20, Nan, Nan, 20.0, Nan
          yellow, 22, Nan, Nan, 19.0, Nan
In [40]: | df = pd.read_csv('read_write_data/file_08b.csv', index_col=0)
           df
Out[40]:
                 ball mug paper pen
                                      pencil
             blue
                   6
                      Nan
                             Nan
                                  6.0
                                        Nan
            green
                   8
                      Nan
                             Nan
                                  Nan
                                        Nan
                   10
             red
                      Nan
                             Nan
                                  Nan
                                        Nan
                  20
            white
                                 20.0
                       Nan
                             Nan
                                        Nan
           yellow
                       Nan
                             Nan 19.0
                                        Nan
In [41]:
          df.dropna(axis=1)
Out[41]:
                 ball
                      mug paper pen
                                      pencil
             blue
                   6
                      Nan
                                  6.0
                                        Nan
                             Nan
            green
                   8
                      Nan
                             Nan
                                  Nan
                                        Nan
```

red

white

yellow

10

20

Nan

Nan

Nan

Nan

Nan

Nan

20.0

Nan 19.0

Nan

Nan

Nan

```
In [42]: df = pd.read_csv('read_write_data/file_08b.csv', index_col=0, na_values='Nan')
df
```

Out[42]:

		ball	mug	paper	pen	pencil
	blue	6	NaN	NaN	6.0	NaN
9	green	8	NaN	NaN	NaN	NaN
	red	10	NaN	NaN	NaN	NaN
	white	20	NaN	NaN	20.0	NaN
У	ellow	22	NaN	NaN	19.0	NaN

```
In [43]: df.dropna(axis=1)
```

Out[43]:

	ball
blue	6
green	8
red	10
white	20
yellow	22

Writing Data to HTML

```
In [45]: print(frame.to_html())
```

```
<thead>
0
1
</thead>
0
10
11
1
12
13
```

Out[46]:

```
        white
        0.394032
        0.721311
        0.059766
        0.103326

        black
        0.960509
        0.693363
        0.454659
        0.499577

        red
        0.148201
        0.439648
        0.475753
        0.758542

        blue
        0.218904
        0.832922
        0.328875
        0.964803
```

```
In [47]: s = ['<HTML>']
s.append('<HEAD><TITLE>My DataFrame</TITLE></HEAD>')
s.append('<BODY>')
s.append(frame.to_html())
s.append('</BODY></HTML>')
html = ''.join(s)
```

```
In [48]:
    html file = open('read write data/myFrame.html','w')
    html_file.write(html)
    html_file.close()
    %cat read write data/myFrame.html
    <HTML><HEAD><TITLE>My DataFrame/HEAD><BODY>
    e">
     <thead>
       up
       down
       right
        left
       </thead>
     white
        0.394032
        0.721311
       0.059766
        0.103326
       black
        0.960509
        0.693363
        0.454659
        0.499577
       red
       0.148201
       0.439648
        0.475753
        0.758542
      blue
        0.218904
        0.832922
        0.328875
        0.964803
```

Reading from HTML

</BODY></HTML>

Out[49]:

```
        white
        0.394032
        0.721311
        0.059766
        0.103326

        black
        0.960509
        0.693363
        0.454659
        0.499577

        red
        0.148201
        0.439648
        0.475753
        0.758542

        blue
        0.218904
        0.832922
        0.328875
        0.964803
```

Out[50]: 1

In [51]: frames[0]

Out[51]:

	Bank Name	City	ST	ST CERT Acquiring Institution		Closing Date	Updated Date
0	The Enloe State Bank	Cooper	TX	10716	Legend Bank, N. A.	May 31, 2019	August 22, 2019
1	Washington Federal Bank for Savings	Chicago	IL	30570	Royal Savings Bank	December 15, 2017	July 24, 2019
2	The Farmers and Merchants State Bank of Argonia	Argonia	KS	17719	Conway Bank	October 13, 2017	August 12, 2019
3	Fayette County Bank	Saint Elmo	IL	1802	United Fidelity Bank, fsb	May 26, 2017	January 29, 2019
4	Guaranty Bank, (d/b/a BestBank in Georgia & Mi	Milwaukee	WI	30003	First-Citizens Bank & Trust Company	May 5, 2017	March 22, 2018
551	Superior Bank, FSB	Hinsdale	IL	32646	Superior Federal, FSB	July 27, 2001	August 19, 2014
552	Malta National Bank	Malta	ОН	6629	North Valley Bank	May 3, 2001	November 18, 2002
553	First Alliance Bank & Trust Co.	Manchester	NH	34264	Southern New Hampshire Bank & Trust	February 2, 2001	February 18, 2003
554	National State Bank of Metropolis	Metropolis	IL	3815	Banterra Bank of Marion	December 14, 2000	March 17, 2005
555	Bank of Honolulu	Honolulu	НІ	21029	Bank of the Orient	October 13, 2000	March 17, 2005

556 rows × 7 columns

In [53]: frames[0]

Out[53]:

	Unnamed: 0_level_0	Unnamed: 1_level_0	Unnamed: Unnamed: 2_level_0 3_level_0		Unnamed: 4_level_0		Team rating		
	Rank	1-week change	team	League	League country	off.	def.	spi	
0	1	NaN	Man. City	Premier League	England	3.3	0.2	95.6	
1	2	NaN	Bayern Munich	Bundesliga	Germany	3.2	0.4	92.9	
2	3	NaN	Liverpool	Premier League	England	2.9	0.3	92.9	
3	4	NaN	PSG	Ligue 1	France	2.8	0.4	89.8	
4	5	NaN	Barcelona	La Liga	Spain	2.8	0.4	89.5	
624	625	-1.0	Macclesfield	League Two	England	0.2	2.2	7.0	
625	626	1.0	Morecambe	League Two	England	0.3	2.5	6.8	
626	627	-2.0	Walsall	League Two	England	0.2	2.3	6.6	
627	628	-2.0	Port Vale	League Two	England	0.2	2.3	6.4	
628	629	-1.0	C.S. Switchbacks	USL Championship	USA	0.2	2.4	5.6	

629 rows × 8 columns

In [54]: frames[0]['Team rating']

Out[54]:

off.	def.	spi
3.3	0.2	95.6
3.2	0.4	92.9
2.9	0.3	92.9
2.8	0.4	89.8
2.8	0.4	89.5
0.2	2.2	7.0
0.3	2.5	6.8
0.2	2.3	6.6
0.2	2.3	6.4
0.2	2.4	5.6
	3.3 3.2 2.9 2.8 0.2 0.3 0.2	3.3 0.2 3.2 0.4 2.9 0.3 2.8 0.4 2.8 0.4 0.2 2.2 0.3 2.5 0.2 2.3 0.2 2.3

629 rows \times 3 columns

```
In [55]: frames[0].xs("team", level=1, axis=1)
```

Out[55]:

Unnamed: 2_level_0	
Man. City	0
Bayern Munich	1
Liverpool	2
PSG	3
Barcelona	4
Macclesfield	624
Morecambe	625
Walsall	626
Port Vale	627
C.S. Switchbacks	628

629 rows × 1 columns

```
In [56]: idx = pd.IndexSlice
    idx

frames[0].loc[:, idx[:, 'team']]
```

Out[56]:

Unnamed: 2_level_0

1	
Man. City	0
Bayern Munich	1
Liverpool	2
PSG	3
Barcelona	4
Macclesfield	624
Morecambe	625
Walsall	626
Port Vale	627
C.S. Switchbacks	628

629 rows × 1 columns

JSON Data

```
In [57]: frame = pd.DataFrame(np.arange(16).reshape(4,4),
                               index=['white','black','red','blue'],
                               columns=['up','down','right','left'])
          frame
Out[57]:
                  down right left
                               3
           white
                 0
           black
                 4
                      5
                           6
                               7
                 8
                      9
                          10
            red
                              11
           blue 12
                     13
                          14
                              15
In [58]: frame.to json('read write data/frame1.json', orient='columns')
          %cat read_write_data/frame1.json
          {"up":{"white":0,"black":4,"red":8,"blue":12},"down":{"white":1,"black":5,"red":9,"blu
          e":13}, "right": {"white":2, "black":6, "red":10, "blue":14}, "left": {"white":3, "black":7, "r
         ed":11,"blue":15}}
In [59]: | pd.read_json('read_write_data/frame1.json', orient='columns')
Out[59]:
               up down right left
          white
                 0
                           2
                               3
                               7
          black
                           6
            red
                 8
                      9
                          10
                              11
           blue 12
                     13
                          14
                              15
In [60]: frame.to_json('read_write_data/frame2.json', orient="index")
          %cat read_write_data/frame2.json
          {"white":{"up":0,"down":1,"right":2,"left":3},"black":{"up":4,"down":5,"right":6,"lef
          t":7},"red":{"up":8,"down":9,"right":10,"left":11},"blue":{"up":12,"down":13,"right":1
          4,"left":15}}
In [61]: | pd.read json('read write data/frame2.json', orient="index")
Out[61]:
                down left right up
          black
                   5
                       7
                               4
           blue
                  13
                      15
                           14
                              12
                      11
                           10
                               8
            red
          white
                       3
                            2
                               0
In [62]: frame.to_json('read_write_data/frame3.json', orient="records")
          %cat read_write_data/frame3.json
```

```
[{"up":0,"down":1,"right":2,"left":3},{"up":4,"down":5,"right":6,"left":7},{"up":8,"down":9,"right":10,"left":11},{"up":12,"down":13,"right":14,"left":15}]
```

```
In [63]: frame.to json('read write data/frame4.json', orient="values")
         %cat read write data/frame4.json
         [[0,1,2,3],[4,5,6,7],[8,9,10,11],[12,13,14,15]]
In [64]: | frame.to json('read write data/frame5.json', orient="split")
         %cat read write data/frame5.json
         {"columns":["up","down","right","left"],"index":["white","black","red","blue"],"data":
         [[0,1,2,3],[4,5,6,7],[8,9,10,11],[12,13,14,15]]
In [65]: # more general json data
         %cat read write data/books.json
            {"writer": "Mark Ross",
             "nationality": "USA",
              "books": [
                   {"title": "XML Cookbook", "price": 23.56},
                   {"title": "Python Fundamentals", "price": 50.70},
                   {"title": "The NumPy library", "price": 12.30}
            },
            {"writer": "Barbara Bracket",
             "nationality": "UK",
              "books": [
                   {"title": "Java Enterprise", "price": 28.60},
                   {"title": "HTML5", "price": 31.35},
                   {"title": "Python for Dummies", "price": 28.00}
            }
           1
In [66]: from pandas.io.json import json normalize, loads
In [67]: file = open('read write data/books.json', 'r')
         text = file.read()
         text = loads(text)
         print(text)
         [{'writer': 'Mark Ross', 'nationality': 'USA', 'books': [{'title': 'XML Cookbook', 'pr
         ice': 23.56}, {'title': 'Python Fundamentals', 'price': 50.7}, {'title': 'The NumPy li
         brary', 'price': 12.3}]}, {'writer': 'Barbara Bracket', 'nationality': 'UK', 'books':
         [{'title': 'Java Enterprise', 'price': 28.6}, {'title': 'HTML5', 'price': 31.35}, {'ti
         tle': 'Python for Dummies', 'price': 28.0}]}]
In [68]: json normalize(text, 'books')
Out[68]:
            title
                             price
          0
                XML Cookbook 23.56
          1 Python Fundamentals 50.70
          2
               The NumPy library 12.30
          3
                 Java Enterprise 28.60
          4
                      HTML5 31.35
             Python for Dummies 28.00
```

```
json normalize(text, 'books', 'writer')
In [69]:
Out[69]:
               title
                                  price writer
            0
                    XML Cookbook
                                  23.56
                                             Mark Ross
               Python Fundamentals
                                  50.70
                                             Mark Ross
            1
            2
                  The NumPy library 12.30
                                             Mark Ross
            3
                    Java Enterprise 28.60 Barbara Bracket
            4
                           HTML5 31.35
                                         Barbara Bracket
            5
                Python for Dummies 28.00 Barbara Bracket
           frame = json_normalize(text, 'books', ['nationality', 'writer'])
In [70]:
            frame
Out[70]:
               title
                                        nationality writer
                                  price
            0
                    XML Cookbook 23.56
                                              USA
                                                        Mark Ross
                                              USA
            1
               Python Fundamentals 50.70
                                                        Mark Ross
            2
                  The NumPy library 12.30
                                              USA
                                                        Mark Ross
            3
                    Java Enterprise 28.60
                                               UK Barbara Bracket
                           HTML5 31.35
                                                    Barbara Bracket
            4
            5
                Python for Dummies 28.00
                                               UK Barbara Bracket
           frame.set_index(['writer', 'nationality'])
In [71]:
Out[71]:
                                      title
                                                         price
            writer
                           nationality
                                 USA
                                           XML Cookbook
                 Mark Ross
                                     Python Fundamentals 50.70
                                 USA
                                 USA
                                         The NumPy library 12.30
                                  UK
                                           Java Enterprise
                                                         28.60
            Barbara Bracket
                                  UK
                                                         31.35
                                                  HTML5
                                  UK
                                       Python for Dummies 28.00
```

XML Data

```
In [72]: %cat read write data/books.xml
         <?xml version="1.0"?>
         <Catalog>
            <Book id="ISBN9872122367564">
               <Author>Ross, Mark</Author>
               <Title>XML Cookbook</Title>
               <Genre>Computer</Genre>
               <Price>23.56</Price>
               <PublishDate>2014-22-01</PublishDate>
            </Book>
            <Book id="ISBN9872122367564">
               <Author>Bracket, Barbara</Author>
               <Title>XML for Dummies</Title>
               <Genre>Computer</Genre>
               <Price>35.95</Price>
               <PublishDate>2014-12-16</PublishDate>
            </Book>
         </Catalog>
In [73]: from lxml import objectify
In [74]: xml = objectify.parse('read write data/books.xml')
         xml
Out[74]: <lrml.etree. ElementTree at 0x110b582c8>
In [75]: root = xml.getroot()
         root
Out[75]: <Element Catalog at 0x1134155c8>
In [76]: root.Book
Out[76]: <Element Book at 0x113415fc8>
In [77]: root.Book.Author
Out[77]: 'Ross, Mark'
In [78]: root.getchildren()
Out[78]: [<Element Book at 0x113415fc8>, <Element Book at 0x1133ffec8>]
In [79]: [book.Author for book in root.getchildren()]
Out[79]: ['Ross, Mark', 'Bracket, Barbara']
In [80]: [child.tag for child in root.Book.getchildren()]
Out[80]: ['Author', 'Title', 'Genre', 'Price', 'PublishDate']
In [81]: [child.text for child in root.Book.getchildren()]
Out[81]: ['Ross, Mark', 'XML Cookbook', 'Computer', '23.56', '2014-22-01']
In [82]: root.Book.attrib.keys()
Out[82]: ['id']
```

In [84]: | etree2df(root)

Out[84]:

id		Author	Title	Genre Price		PublishDate	
0	ISBN9872122367564	Ross, Mark	XML Cookbook	Computer	23.56	2014-22-01	
1	ISBN9872122367564	Bracket, Barbara	XML for Dummies	Computer	35.95	2014-12-16	

Excel Data

In [85]: pd.read_excel('read_write_data/file01_data.xlsx', index_col=0)

Out[85]:

	wnite	rea	green	ыаск
а	12	23	17	18
b	22	16	19	18
С	14	23	22	21

In [86]: pd.read_excel('read_write_data/file01_data.xlsx', 'Sheet2', index_col=0)

Out[86]:

	yellow	purple	blue	orange
Α	11	16	44	22
В	20	22	23	44
С	30	31	37	32

```
In [87]: # use index - 0, 1, ...
          pd.read_excel('read_write_data/file01_data.xlsx', 1, index_col=0)
Out[87]:
             yellow purple blue orange
          Α
                11
                      16
                           44
                                  22
          В
                20
                      22
                           23
                                  44
           С
                30
                      31
In [88]: | frame = pd.DataFrame(np.arange(16).reshape(4,4),
                                index=['white','black','red','blue'],
                               columns=['up','down','right','left'])
          frame
Out[88]:
                   down right left
           white
                 0
                               3
                               7
                 4
                      5
                           6
          black
            red
                 8
                      9
                           10
                              11
           blue 12
                      13
                          14 15
In [89]: frame.to_excel('read_write_data/file02_data.xlsx')
In [90]: pd.read_excel('read_write_data/file02_data.xlsx', index_col=0)
Out[90]:
                up down right left
           white
                 0
                               3
          black
                 4
                      5
                           6
                               7
                 8
                      9
                           10
                              11
            red
           blue
                      13
                           14
                              15
          Pickle - Python Object Serialization
In [91]: frame = pd.DataFrame(np.arange(16).reshape(4,4),
                                index=['up','down','left','right'])
          frame
Out[91]:
                   1 2 3
            up
          down
                    5
                       6
                         7
            left
                8
                    9 10 11
           right 12 13 14 15
In [92]: frame.to_pickle('read_write_data/frame.pkl')
```

```
Out[93]:
               0 1 2 3
                       2
          down
                    5 6 7
                   9 10 11
            left
                8
           right 12 13 14 15
          Databases
In [94]: from sqlalchemy import create engine
          from pandas.io import sql
In [95]: engine = create engine('sqlite:///foo.db')
In [96]: frame = pd.DataFrame(
              np.arange(20).reshape(4,5),
              columns=['white','red','blue','black','green'])
          frame
Out[96]:
            white red blue black green
          0
                0
                    1
                        2
                              3
                                    4
                        7
          1
                5
                    6
                              8
                                   9
          2
               10
                             13
                                   14
                  11
                       12
               15
                  16
                       17
                             18
                                   19
In [97]: sql.execute('DROP TABLE IF EXISTS colors', engine)
          frame.to_sql('colors',engine, index=False)
In [98]: pd.read_sql('colors', engine)
Out[98]:
            white red blue black green
          0
                0
                    1
                        2
                              3
          1
                5
                    6
                        7
                              8
                                   9
          2
               10
                   11
                        12
                             13
                                   14
          3
               15
                  16
                       17
                             18
                                   19
```

In [93]: pd.read pickle('read write data/frame.pkl')

```
In [99]: pd.read sql query('SELECT white, blue FROM colors', engine)
 Out[99]:
             white blue
           0
                 0
                     2
           1
                 5
                     7
                    12
                10
                15
                    17
In [100]: pd.read sql query('SELECT name FROM sqlite master WHERE type="table";', engine)
Out[100]:
             name
           0 colors
```

MongoDB database

```
In [106]: list(collection.find())[:10]
Out[106]: [{'_id': '01012',
             'city': 'CHESTERFIELD',
             'loc': [-72.833309, 42.38167],
             'pop': 177,
             'state': 'MA'},
            {'_id': '01010',
             'city': 'BRIMFIELD',
             'loc': [-72.188455, 42.116543],
             'pop': 3706,
             'state': 'MA'},
            {'_id': '01020',
             'city': 'CHICOPEE',
             'loc': [-72.576142, 42.176443],
             'pop': 31495,
             'state': 'MA'},
            {'_id': '01013',
             'city': 'CHICOPEE',
             'loc': [-72.607962, 42.162046],
             'pop': 23396,
             'state': 'MA'},
            {'_id': '01007',
             'city': 'BELCHERTOWN',
             'loc': [-72.410953, 42.275103],
             'pop': 10579,
             'state': 'MA'},
            {'_id': '01011',
             'city': 'CHESTER',
             'loc': [-72.988761, 42.279421],
             'pop': 1688,
             'state': 'MA'},
            {'_id': '01026',
             'city': 'CUMMINGTON',
             'loc': [-72.905767, 42.435296],
             'pop': 1484,
             'state': 'MA'},
            {'_id': '01028',
             'city': 'EAST LONGMEADOW',
             'loc': [-72.505565, 42.067203],
             'pop': 13367,
             'state': 'MA'},
            {'_id': '01027',
             'city': 'MOUNT TOM',
             'loc': [-72.679921, 42.264319],
             'pop': 16864,
             'state': 'MA'},
            {'_id': '01022',
             city': 'WESTOVER AFB',
             'loc': [-72.558657, 42.196672],
             'pop': 1764,
             'state': 'MA'}]
```

pop

Out[107]:

city			
BOSTON	02108	[-71.068432, 42.357603]	3697
BOSTON	02109	[-71.053386, 42.362963]	3926
BOSTON	02111	[-71.0629, 42.350348]	3759
BOSTON	02115	[-71.092215, 42.342706]	25597
BOSTON	02110	[-71.051417, 42.357636]	957
BOSTON	02113	[-71.055958, 42.365656]	6698
BOSTON	02114	[-71.06823, 42.361111]	10246
BOSTON	02116	[-71.076798, 42.349201]	17459
BOSTON	02199	[-71.082543, 42.347873]	886
BOSTON	02210	[-71.046511, 42.348921]	308
BOSTON	02215	[-71.102689, 42.347088]	17769

```
In [108]: zipcodes.loc[('MA','BOSTON')]
```

_id

_id

/Library/Frameworks/Python.framework/Versions/3.7/lib/python3.7/site-packages/ipykerne l_launcher.py:1: PerformanceWarning: indexing past lexsort depth may impact performance.

pop

"""Entry point for launching an IPython kernel.

Out[108]:

state	city			
	BOSTON	02108	[-71.068432, 42.357603]	3697
	BOSTON	02109	[-71.053386, 42.362963]	3926
	BOSTON	02111	[-71.0629, 42.350348]	3759
	BOSTON	02115	[-71.092215, 42.342706]	25597
	BOSTON	02110	[-71.051417, 42.357636]	957
MA	BOSTON	02113	[-71.055958, 42.365656]	6698
	BOSTON	02114	[-71.06823, 42.361111]	10246
	BOSTON	02116	[-71.076798, 42.349201]	17459
	BOSTON	02199	[-71.082543, 42.347873]	886
	BOSTON	02210	[-71.046511, 42.348921]	308
	BOSTON	02215	[-71.102689, 42.347088]	17769

loc