Ch6 Data Loading, Storage, and File Formats 数据载入、存储及文件格式 ¶

```
In [ ]: #https://wesmckinney.com/book/accessing-data.html
          #dataset: https://github.com/wesm/pydata-book/tree/3rd-edition/examples
In [103]: import pandas as pd
          import numpy as np
 In [33]: #3种pd.read读取csv文件方式:
 In [27]: file_path = r'C:\Users\miran\lpthw\ex1.csv'
          df = pd.read_csv(file_path)
          df
                     С
                         d
                             message
                  2 3
          # 0 1
                          4
                             hello
                 6 7
          # 1 5
                             world
                          8
          # 2 9
                 10 11 12 foo
 Out[27]:
             а
               b c
                      d message
                2
                   3
                            hello
           1 5
                  7
                            world
                6
           2 9 10 11 12
                             foo
 In [34]: | df = pd.read_csv('C:/Users/miran/lpthw/ex1.csv')
          df
              а
                  b
                    C
                          d
                             message
          # 0 1
                  2 3
                         4
                             hello
                  6 7
          # 1 5
                          8
                             world
          # 2 9
                  10 11 12 foo
 Out[34]:
                b
                      d message
                   С
            1
                2
                   3
                            hello
           1 5
                6
                  7
                      8
                            world
           2 9 10 11 12
                             foo
```



```
In [36]: #使用read table, 指定分隔符:
         pd.read_table('C:/Users/miran/lpthw/ex1.csv', sep = ',')
                            message
         # 0 1
                2
                    3
                            hello
                        4
         # 1 5
                    7
                        8
                            world
                6
         # 2 9
                10 11 12 foo
```

Out[36]:

```
а
     b
         С
            d message
0 1
     2
         3
                   hello
1 5
     6
        7
            8
                  world
2 9 10 11 12
                    foo
```

```
In [43]: #当文件不包含表头行。可以允许pandas分配默认列名0123
        pd.read csv('C:/Users/miran/lpthw/ex2.csv', header = None)
               1
                  2
                      3
                          4
               2
                   3
                      4
        # 0 1
                          hello
        # 1 5
                 7
                      8
                          world
               6
        # 2 9
               10 11 12 foo
        #也可以自己指定列名:
        pd.read_csv('C:/Users/miran/lpthw/ex2.csv', names = ['a','b','c','d','message'
                          message
                 c d
                          hello
        # 0 1
               2
                  3
                      4
        # 1 5
                 7
                      8
                          world
               6
        # 2 9
               10 11 12 foo
        #如想要某列成为返回data frame的索引,可以指定位置4的列为索引,或将某列传给参数index
        names = ['a','b','c','d','message']
        pd.read csv('C:/Users/miran/lpthw/ex2.csv', names = names, index col = 'messag
        # a b
               C
        # message
        # hello 1
                  2
                      3
                          4
        # world 5
                      7
                          8
                  6
        # foo 9
                  10 11 12
```

Out[43]:

b С

message

```
hello 1
         2
world 5
         6 7
 foo 9 10 11 12
```

```
In [52]: parsed = pd.read_csv('C:/Users/miran/lpthw/csv_mindex.csv',
                            index_col = ['key1','key2'])
         parsed
                 value1 value2
         # key1 key2
         # one
                 a 1
                         2
         # b 3
                 4
         # c 5
                 6
         # d 7
                 8
         # two
                 a 9
                         10
         # b 11
                12
         # c 13
                14
         # d 15 16
```

Out[52]:

va	lue1	val	lue2

key1	key2		
one	а	1	2
	b	3	4
	С	5	6
	d	7	8
two	а	9	10
	b	11	12
	С	13	14
	d	15	16

```
In [60]: #sep = '\s+', 可以用来分隔空格回车等
        #有时一张表或txt的分隔符并不是固定的,使用空白或其他方式来分割字段。
        list(open('C:/Users/miran/lpthw/ex3.txt'))
        #['
                 Α
                       В
                              C \setminus n',
          'aaa -0.26
                       -1.02
                               -0.61\n',
          'bbb 0.92
                       -0.30
                              -0.03\n'
          'ccc -0.26
                       -0.38
                               -0.21\n',
                       -0.34
          'ddd -0.87
                               1.10'7
        #当字段是以不同数量的空格分开时,可以想read_table传入一个正则表达式作为分隔符,如sep
        result = pd.read_table('C:/Users/miran/lpthw/ex3.txt', sep = '\s+')
        result
        # A B
               C
        # aaa
               -0.26
                    -1.02
                             -0.61
                            -0.03
        # bbb
               0.92
                     -0.30
        # ccc -0.26 -0.38
                             -0.21
        # ddd
               -0.87
                    -0.34
                             1.10
```

Out[60]:

```
С
        Α
             В
aaa -0.26 -1.02 -0.61
    0.92 -0.30 -0.03
bbb
ccc -0.26 -0.38 -0.21
ddd -0.87 -0.34 1.10
```

```
In [63]: #read csv('file pat', skip rows = [a,b])可以用来跳过a,b行
        pd.read csv('C:/Users/miran/lpthw/ex4.csv')
            XXX Unnamed: 1 Unnamed: 2 Unnamed: 3 Unnamed: 4
        # 0 a
                    c d
                           message
        # 1 YYYY
                    NaN NaN NaN NaN
        # 2 ZZZZ
                    NaN NaN NaN NaN
        # 3 1
                   3 4
                           hello
              2
        # 4 5
                6
                        8
                           world
        # 5 9
                10 11 12 foo
        pd.read_csv('C:/Users/miran/lpthw/ex4.csv', skiprows = [0, 2, 3])
        # a b
                       message
              c d
        # 0 1
                2
                  3
                       4
                           hello
        # 1 5
                6
                   7
                       8
                           world
        # 2 9 10 11 12 foo
```

Out[63]:

message	a	С	D	а	
hello	4	3	2	1	0
world	8	7	6	5	1
foo	12	11	10	9	2

```
In [83]: #缺失值或不显示,或用标识值。
        #pandas会使用标识: NA或Null
        result = pd.read csv('C:/Users/miran/lpthw/ex5.csv')
        result
        # something a b c d message
        # 0 one 1 2 3.0 4
                            NaN
        # 1 two 5 6 NaN 8 world
        # 2 three 9 10 11.0
                                12 foo
        pd.isnull(result)
        # something a b
                         c d
                                message
        # 0 False False False
                                False False
                                              True
        # 1 False False False
                                             False
                                True
                                       False
        # 2 False False False
                                              False
                                False
                                       False
        #na values可以传入一个列表或一组字符串来处理缺失值:
        result = pd.read_csv('C:/Users/miran/lpthw/ex5.csv', na_values= ['NULL'])
        result
        # something a b c
                            d
                                message
        # 0 one 1 2 3.0 4
                            NaN
        # 1 two 5
                            world
                  6 NaN 8
        # 2 three 9 10 11.0
                                12 foo
        #字典中,每列可以指定不同的缺失值标识:
        sentinels = {'message': ['foo', 'NA'], 'something': ['two']}
        pd.read_csv('C:/Users/miran/lpthw/ex5.csv', na_values = sentinels)
           something a b c d
                                   message
        # 0 one 1 2 3.0 4
                            NaN
        # 1 NaN 5 6 NaN 8
                            world
        # 2 three 9
                     10 11.0
                                12 NaN
```

Out[83]:

```
something a
                    С
                        d message
0
                   3.0
        one 1
               2
                              NaN
       NaN 5
               6 NaN
                             world
2
      three 9 10 11.0 12
                              NaN
```

```
In [84]: #pandas.read csv和pandas.read table常用选项:
       # path: 表名文件系统位置的字符串, URL或文件型对象
       # sep或delimiter: 分隔每行字段的字符序列或正则表达式
       # header: 用作列名的行号,默认是0 (第一行) ,如果没有列名则为None
       # index col: 行索引的列号或列名。
       # names: 结果列名列表,和header = None 一起用
       # skiprows: 文件开头处起, 需要跳过的行数或行号列表
       # na values: 需要用NA替换的值序列
       # comment: 在行结尾处分隔注释的字符
       # ...
```

6.1 文本格式的读写: Reading and Writing Data in Text Format

6.1.1 分块读入文本文件: Reading Text Files in Pieces

```
In [90]: #处理大型文件或找出正确的参数集来正确处理大文件时,需要读入文件的一个小片段,或者按小
       pd.options.display.max rows = 10
       result = pd.read_csv('C:/Users/miran/lpthw/ex6.csv')
       result
       # one
              two three four
                               kev
       # 0 0.467976 -0.038649 -0.295344
                                        -1.824726
       # 1 -0.358893 1.404453 0.704965
                                        -0.200638
       # 4 0.354628
                    -0.133116 0.283763
                                        -0.837063
       # ... ... ... ...
       # 9995 2.311896 -0.417070 -1.409599 -0.515821
       # 9996 -0.479893 -0.650419 0.745152 -0.646038
       # 9997 0.523331 0.787112 0.486066 1.093156
                                                      K
       # 9998 -0.362559 0.598894 -1.843201 0.887292
                                                      G
       # 9999 -0.096376 -1.012999 -0.657431 -0.573315
       # 10000 rows × 5 columns
       #如果只想读取一小部分行,可以指明nrows:
       #pd.read_csv('file_path', nrows = n)
       pd.read_csv('C:/Users/miran/lpthw/ex6.csv', nrows = 5)
       # one two three four key
       # 0 0.467976 -0.038649 -0.295344 -1.824726
       # 1 -0.358893 1.404453 0.704965 -0.200638
       # 2 -0.501840 0.659254
                              -0.421691
                                        -0.057688 G
       # 3 0.204886 1.074134 1.388361
                                        -0.982404 R
       # 4 0.354628 -0.133116 0.283763
                                        -0.837063
       #分块读入文件,可以指定chunksize座位每一块的行数:
       chunker = pd.read csv('C:/Users/miran/lpthw/ex6.csv', chunksize = 1000)
       tot = pd.Series([])
       for piece in chunker:
           tot = tot.add(piece['key'].value_counts(), fill_value = 0)
       tot = tot.sort values(ascending = False)
```

C:\Users\miran\AppData\Local\Temp\ipykernel 21400\3113304847.py:33: FutureWar ning: The default dtype for empty Series will be 'object' instead of 'float6 4' in a future version. Specify a dtype explicitly to silence this warning. tot = pd.Series([])

6.1.2 将数据写入文本格式: Writing Data to Text **Format**

```
In [107]: data = pd.read csv('C:/Users/miran/lpthw/ex5.csv')
         data
             something a b c d
                                      message
         # 0 one 1 2 3.0 4 NaN
         # 1 two 5 6 NaN 8 world
         # 2 three 9 10 11.0 12 foo
         #使用data frame的to csv方法,可以将数据导出为逗号分隔的文件:
         data.to csv('C:/Users/miran/lpthw/out.csv')
         #其他的分隔符也是可以的:
         import sys
         data.to csv(sys.stdout, sep = '|')
         # |something|a|b| c |d|message
         # 0|one|1|2|3.0|4|
         # 1/two/5/6//8/world
         # 2|three|9|10|11.0|12|foo
         #缺失值在输出时,以空字符串出现。可以用其他标示值,对缺失值进行标注:
         data.to csv(sys.stdout, na rep = 'NULL')
         # ,something,a,b, c ,d,message
         # 0, one, 1, 2, 3.0, 4, NULL
         # 1, two, 5, 6, NULL, 8, world
         # 2, three, 9, 10, 11.0, 12, foo
         #如果没有其他选项被指定,行和列都会被写入。不过二者也可以禁止写入:
         data.to_csv(sys.stdout, index = False, header = False)
         # one,1,2,3.0,4,
         # two,5,6,,8,world
         # three, 9, 10, 11.0, 12, foo
         #可以仅写入列的子集,按照选择的顺序写入:
         #data.to_csv(sys.stdout, index = False, columns = ['a', 'b', 'c'])
         #series也有to csv方法:
         dates = pd.date_range('1/1/2000', periods = 7)
         ts = pd.Series(np.arange(7), index = dates)
         ts.to csv('C:/Users/miran/lpthw/tseries.csv')
             0
         # 1/1/2000 0
         # 1/2/2000 1
         # 1/3/2000 2
         # 1/4/2000 3
         # 1/5/2000 4
         # 1/6/2000 5
         # 1/7/2000 6
```

|something|a|b| c |d|message 0|one|1|2|3.0|4| 1|two|5|6||8|world 2|three|9|10|11.0|12|foo ,something,a,b, c ,d,message 0, one, 1, 2, 3.0, 4, NULL 1, two, 5, 6, NULL, 8, world 2,three,9,10,11.0,12,foo one,1,2,3.0,4, two,5,6,,8,world three,9,10,11.0,12,foo

The syntax of the command is incorrect.

6.1.3 使用分隔格式: Working with Delimited Formats

```
In [119]: #函数pandas.read table。对于任何带有单字符分隔符的文件,可以使用python内建csv模块,
         import csv
         f = open('C:/Users/miran/lpthw/ex7.csv')
         reader = csv.reader(f)
         #遍历文件,遍历reader,产生元组,元组的值,为了删除引号的字符:
         for line in reader:
             print(line)
         # ['a', 'b', 'c']
         # ['1', '2', '3']
# ['1', '2', '3']
         #将文件读取为行的列表:
         with open('C:/Users/miran/lpthw/ex7.csv') as f:
             lines = list(csv.reader(f))
         #将数据拆分为列名行和数据行:
         header, values = lines[0], lines[1:]
         #使用字典推导式和表达式zip(*values)生成一个包含数据列的字典,字典中行转置成列。
         data_dict = {h: v for h, v in zip(header, zip(*values))}
         data dict
         #{'a': ('1', '1'), 'b': ('2', '2'), 'c': ('3', '3')}
         #csv有多种不同风格,如需不同分隔符,字符串引用约定或行终止符定义一种新的格式,可以使用
         # class my dialect(csv.Dialect):
              lineterminator = '\n'
               delimiter = ';'
               quotechar = '"'
               quoting = csv.QUOTE MINIMAL
         # reader = csv.reader(f, dialect = my_dialect)
         # reader = csv.reader(f, delimiter = '|')
         ['a', 'b', 'c']
         ['1', '2', '3']
['1', '2', '3']
Out[119]: {'a': ('1', '1'), 'b': ('2', '2'), 'c': ('3', '3')}
 In [ ]: #csv方言选项:
         # delimiter: 分隔字符
         # lineterminator: 行终止符。
         # quotechar: 含有特殊字符的引号
         # quoting: 引用惯例
         # skipinitialspace: 忽略分隔符后的空白, 默认false
         # doublequote: 处理字段内部的引号。
```

```
In [120]: #对于更复杂或固定的多字符分隔符文件,无法使用csv模块,将要使用字符串split方法或正则表
           with open('mydata.csv', 'w') as f:
                writer = csv.writer(f, dialect = my_dialect)
                writer.writerow(('one','two','three'))
writer.writerow(('1','2','3'))
                writer.writerow(('4','5','6'))
writer.writerow(('7','8','9'))
```

6.1.4 JSON数据: JSON Data

```
In [129]: obj = """
          {"name":"Wes",
          "places_lived":["United States", "Spain", "Germany"],
          "pet": null,
          "siblings":[{"name":"Scott", "age": 30, "pets": ["Zeus", "Zuko"]},
                      {"name": "Katie", "age": 38,
                      "pets": ["Sixes", "Stache", "Cisco"]}]
          ....
          import json
          result = json.loads(obj)
          result
          # {'name': 'Wes',
          # 'places_lived': ['United States', 'Spain', 'Germany'],
            'pet': None,
          # 'siblings': [{'name': 'Scott', 'age': 30, 'pets': ['Zeus', 'Zuko']},
          # {'name': 'Katie', 'age': 38, 'pets': ['Sixes', 'Stache', 'Cisco']}]}
          #json.dumps可以将python对象,转换为Json:
          asjson = json.dumps(result)
          siblings = pd.DataFrame(result['siblings'], columns = ['name', 'age'])
          siblings
          # name age
          # 0 Scott
                      30
          # 1 Katie
                      38
          #pandas.read_json可以将json转换为series或data frame.
          data = pd.read json('C:/Users/miran/lpthw/example.json')
          data
          # a
                     С
          # 0 1
                 2 3
          # 1 4
                5 6
          # 2 7
          #从pandas将数据导出为JSON格式:
          print(data.to json())
          #{"a":{"0":1,"1":4,"2":7},"b":{"0":2,"1":5,"2":8},"c":{"0":3,"1":6,"2":9}}
          print(data.to_json(orient = 'records'))
          #[{"a":1,"b":2,"c":3},{"a":4,"b":5,"c":6},{"a":7,"b":8,"c":9}]
          {"a":{"0":1,"1":4,"2":7},"b":{"0":2,"1":5,"2":8},"c":{"0":3,"1":6,"2":9}}
```

6.1.5 XML和HTML: 网络抓取: XML and HTML: Web **Scraping**

In [130]: #Lxml, beautiful soup, html5lib的库,可以读取写入数据的库

In [137]: #conda install Lxml

#pip install beautifulsoup4 html5lib

#In command prompt:

#C:\Users\miran>pip install beautifulsoup4

#C:\Users\miran>pip install html5lib

```
In [148]: | #pandas.read_html函数,默认会搜索解析所有包含在table中的表格型数据,发挥的事data fr
         tables = pd.read html('C:/Users/miran/lpthw/fdic failed bank list.html')
         len(tables)
         failures = tables[0]
         failures.head()
                                 #前5行
         # Bank Name City ST CERT
                                    Acquiring Institution Closing Date
                                                                        Update
         # 0 Allied Bank Mulberry
                                 AR 91 Today's Bank September 23, 2016 Novemb
         # 1 The Woodbury Banking Company
                                        Woodbury GA 11297 United Bank August
         # 2 First CornerStone Bank King of Prussia PA 35312 First-Citizens Bank &
         # 3 Trust Company Bank Memphis TN 9956 The Bank of Fayette County April
         # 4 North Milwaukee State Bank Milwaukee WI 20364 First-Citizens Bank &
         #因为failures有很多列,pandas在行内插入了换行符。
         #现在开始数据清理分析,计算每年银行倒闭的数量:在'Closing Date'列中的不同年份在数据综
         #将failures数据框中的'Closing Date'列转换为日期时间类型,并将结果存储在close_times
         #通过pd.to datetime()函数,将日期字符串转换为Timestamp对象,便于后续的日期操作和分析
         close timestamps = pd.to datetime(failures['Closing Date'])
         #计算close timestamps中每个日期时间对象的年份,并使用value counts()函数统计每个年份
         #这将返回一个包含年份计数的Series对象,其中索引是年份,值是对应年份出现的次数。
         close_timestamps.dt.year.value_counts()
         # 2010
                 157
         # 2009
                 140
         # 2011
                  92
         # 2012
                  51
         # 2008
                  25
         # 2004
         # 2001
                   4
         # 2007
                   3
         # 2003
                   3
         # 2000
         # Name: Closing Date, Length: 15, dtype: int64
Out[148]: 2010
                157
         2009
                140
         2011
                92
         2012
                 51
         2008
                 25
         2004
         2001
                 4
         2007
                 3
         2003
                 3
         2000
         Name: Closing Date, Length: 15, dtype: int64
```

6.2 二进制格式: Binary Data Formats

```
In [160]: #使用python内建的pickle序列化模块进行二进制操作是存储数据最高效方便的方式。
        #读取csv文件
        frame = pd.read csv('C:/Users/miran/lpthw/ex1.csv')
         frame
         # a b
               c d message
               2 3
        # 0 1
                      4
                         hello
                         world
        #15 6 7
                      8
        # 2 9 10 11 12 foo
        #写入一个名为frame_pickle的文件
         frame.to_pickle('C:/Users/miran/lpthw/frame_pickle')
        #将其读取
        pd.read_pickle('C:/Users/miran/lpthw/frame_pickle')
                   d
                      message
         # 0 1
               2 3
                      4
                         hello
        # 1 5
               6 7
                         world
                      8
        # 2 9 10 11 12 foo
```

Out[160]:

message	d	С	b	а	
hello	4	3	2	1	0
world	8	7	6	5	1
foo	12	11	10	9	2

6.2.1 使用HDF5格式: Using HDF5 Format

```
#pandas提供高阶接口,简化series和data frame的存储。HDFStore类像字典一样:
In [181]:
          frame = pd.DataFrame({'a': np.random.randn(100)})
          store = pd.HDFStore('mydata.h5')
          store['obj1'] = frame
          store['obj1_col'] = frame['a']
          store
         # <class 'pandas.io.pytables.HDFStore'>
          # File path: mydata.h5
          store['obj1']
          # a
         # 0 0.985822
          # 1 1.518504
         # 2 -0.092633
         # 3 -2.556538
          # 4 1.333706
          # ...
          # 95 -0.202865
          # 96 0.428260
          # 97 2.223956
          # 98 0.983035
          # 99
                 -0.362057
          # 100 rows × 1 columns
          #HDFStore支持2中存储模式,fixed和table。
          store.put('obj2', frame, format = 'table')
          store.select('obj2', where = ['index >= 10 and index <= 15'])
          # a
          # 10
                 0.678830
          # 11
                 -1.783086
          # 12 -1.539850
          # 13
               1.939564
          # 14
                 -2.005488
          # 15
               1.499467
          #put是store['obj2'] = frame的显式版本,但允许其他选项,如存储格式。
          store.close()
          #pandas.read_hdf是快捷方法。
         # frame.to_hdf('mydata.h5', 'obj3', format = 'table')
          # pd.read_hdf('mydata.h5', 'obj3', where = ['index < 5'])</pre>
```

6.2.2 读取Excel文件: Reading Microsoft Excel Files

```
#pandas支持通过excelfile或pandas.read excel读取存储
In [189]:
        xlsx = pd.ExcelFile('C:/Users/miran/lpthw/ex1.xlsx')
        #存储在表中的数据,可以通过pandas.read excel读取到data frame中
        pd.read_excel(xlsx, 'Sheet1')
           Unnamed: 0 a b c d
                                  message
        #00 1 2 3 4 hello
             5 6 7 8 world
        # 1 1
        # 2 2
               9 10 11 12 foo
        #如果读取多个表的文件,可以更简洁地将文件名传入pandas.read_excel:
        frame = pd.read_excel('C:/Users/miran/lpthw/ex1.xlsx','Sheet1')
        frame
        # Unnamed: 0 a b c d
                                   message
        #00 1 2 3 4 hello
        #11 5 6 7 8 world
        # 2 2 9 10 11 12 foo
        #如需将pandas数据写入到excel格式中,可以先生成一个excelwriter,然后使用pandas对象的
        writer = pd.ExcelWriter('C:/Users/miran/lpthw/ex2.xlsx')
        frame.to excel(writer, 'Sheet1')
        writer.save()
        #也可以将文件路径传给to excel, 避免直接调用ExcelWriter
        frame.to excel('C:/Users/miran/lpthw/ex2.xlsx')
```

C:\Users\miran\AppData\Local\Temp\ipykernel_21400\807895415.py:21: FutureWarn ing: save is not part of the public API, usage can give unexpected results an d will be removed in a future version writer.save()

6.3 与web API交互: Interacting with Web **APIs**

```
In [197]: #很多网站有公开API,通过JSON或其他格式提供数据服务。有多种方式可以利用Python来访问AP
        #简单易用方式是使用requests包。
        import requests
        url = 'https://api.github.com/repos/pandas-dev/pandas/issues'
        resp = requests.get(url)
        resp
        #<Response [200]>
        #response对象的json方法,返回一个包含解析为本地python对象的JSON的字典:
        data = resp.json()
        data[0]['title']
        #'Split Multiple Header into CSV file'
        #data中的每个元素都是一个包含qithub问题页面上的所有数据的字典。
        #可以将data直接传给data frame,并提取感兴趣的字段:只要以下4个列
        issues = pd.DataFrame(data, columns = ['number', 'title',
                                         'labels','state'])
        issues
        # number
                  title labels state
        # 0 53433 Split Multiple Header into CSV file [{'id': 34444536, 'node_id':
        # 1 53432 DOC: Add release notes for pandas 2.0.3 [{'id': 134699, 'node_id':
        # 2 53431 TST: Add test for series str decode GH#22613
                                                          [] open
        # 4 53429 REF: Remove side effects from importing Styler 2
               53390 BUG: Reading fails when `dtype` is defined wit...
                                                                  [{'id': 76
        # 25
        # 26
               53387 PERF: RangeIndex cache is written when calling...
                                                                  [{'id': 28
               53385 TST: Add test for pandas on sys.getsizeof GH#2...
        # 27
                                                                  [{'id': 12
               53384 BLD: remove `pkg_resources` usage from `setup.py` [{'id': 12
        # 28
        # 29
               53379 MNT: Mark all `nogil` functions as `noexcept` [{'id': 490944
```

Out[197]:

	number	title	labels	state
0	53434	Bump pypa/cibuildwheel from 2.12.3 to 2.13.0	[{'id': 48070600, 'node_id': 'MDU6TGFiZWw0ODA3	open
1	53433	Split Multiple Header into CSV file	[{'id': 34444536, 'node_id': 'MDU6TGFiZWwzNDQ0	open
2	53432	DOC: Add release notes for pandas 2.0.3	[{'id': 134699, 'node_id': 'MDU6TGFiZWwxMzQ2OT	open
3	53431	TST: Add test for series str decode GH#22613	О	open
4	53430	RLS: 2.0.3	[{'id': 131473665, 'node_id': 'MDU6TGFiZWwxMzE	open
25	53391	BUG: read_csv with dtype=bool[pyarrow]	[{'id': 47229171, 'node_id': 'MDU6TGFiZWw0Nzly	open
26	53390	BUG: Reading fails when `dtype` is defined wit	[{'id': 76811, 'node_id': 'MDU6TGFiZWw3NjgxMQ=	open
27	53387	PERF: RangeIndex cache is written when calling	[{'id': 2822098, 'node_id': 'MDU6TGFiZWwyODIyM	open
28	53385	TST: Add test for pandas on sys.getsizeof GH#2	[{'id': 127685, 'node_id': 'MDU6TGFiZWwxMjc2OD	open
29	53384	BLD: remove `pkg_resources` usage from `setup.py`	[{'id': 129350, 'node_id': 'MDU6TGFiZWwxMjkzNT	open

30 rows × 4 columns

6.4 与数据库交互: Interacting with Databases

```
In [233]: import sqlite3
          # SQL中将数据读取为data frame容易,pandas有多个函数可以简化过程。
          query = """
          CREATE TABLE test
          (a VARCHAR(20), b VARCHAR(20),
          c REAL,
                  d INTEGER
          );"""
          con = sqlite3.connect('mydata.sqlite')
          con.execute(query)
          #<sqlite3.Cursor at 0x1eaff9a22c0>
          con.commit()
          #插入几行数据
          data = [('Atlanta', 'Georgia', 1.25, 6),
                ('Tallahassee', 'Florida', 2.6, 3),
                ('Sacramento', 'California', 1.7, 5)]
          stmt = 'INSERT INTO test VALUES(?, ?, ?, ?)'
          con.executemany(stmt, data)
          #<sqlite3.Cursor at 0x1eaffa0ce40>
          con.commit()
          #大部分python的sqL驱动,返回的是元组的列表:
          cursor = con.execute('select * from test')
          rows = cursor.fetchall()
          rows
          # [('Atlanta', 'Georgia', 1.25, 6),
          # ('Tallahassee', 'Florida', 2.6, 3),
          # ('Sacramento', 'California', 1.7, 5)]
          #可以将元组的列表传给data frame构造函数,但还需要包含在游标的description属性中的列名
          cursor.description
          # (('a', None, None, None, None, None, None),
          # ('b', None, None, None, None, None, None),
          # ('c', None, None, None, None, None, None),
          # ('d', None, None, None, None, None, None))
          pd.DataFrame(rows, columns = [x[0] for x in cursor.description])
          #abcd
         # 0 Atlanta Georgia 1.25
          # 1 Tallahassee Florida 2.60
          # 2 Sacramento California 1.70 5
```

Out[233]:

	а	b	С	d
0	Atlanta	Georgia	1.25	6
1	Tallahassee	Florida	2.60	3
2	Sacramento	California	1.70	5
3	Atlanta	Georgia	1.25	6
4	Tallahassee	Florida	2.60	3
22	Tallahassee	Florida	2.60	3
23	Sacramento	California	1.70	5
24	Atlanta	Georgia	1.25	6
25	Tallahassee	Florida	2.60	3
26	Sacramento	California	1.70	5

27 rows × 4 columns

In [236]: #SQLALchemy项目是个流行的python sql包。pandas有一个read_sql允许从sqlalchemy链接中 #sqlalchemy连接到相同的sqlite数据库,从之前的创建的表中读取数据。

```
import sqlalchemy as sqla
db = sqla.create_engine('sqlite://mydata.sqlite')
pd.read_sql('select * from test', db)
# a b c d
# 0 Atlanta Georgia 1.25 6
# 1 Tallahassee Florida 2.60 3
# 2 Sacramento California 1.70 5
```

Out[236]:

	а	b	С	d
0	Atlanta	Georgia	1.25	6
1	Tallahassee	Florida	2.60	3
2	Sacramento	California	1.70	5
3	Atlanta	Georgia	1.25	6
4	Tallahassee	Florida	2.60	3
22	Tallahassee	Florida	2.60	3
23	Sacramento	California	1.70	5
24	Atlanta	Georgia	1.25	6
25	Tallahassee	Florida	2.60	3
26	Sacramento	California	1.70	5

27 rows × 4 columns

6.5 小结: Conclusion