数据规整

| 分层索引 | stack , unstack |
|-------------------|-------------------------|
| 重排列和层级排序 | swaplevel , sort_index |
| 按层级进行汇总统计 | group by |
| 使用DataFrame的列进行索引 | set_index , reset_index |
| merge | |
| concat | |
| combine_first | |

• 分层索引

```
data = pd.Series(np.arange(1,10),index = [['a','a','a','b','b','c','c','d','d'],
                                 [1,2,3,1,3,1,2,2,3]])
data
Out[4]:
a 1 1
  2 2
 3 3
b 1 4
 3 5
c 1 6
  2 7
d 2 8
  3
    9
dtype: int32
#部分索引选择子集
data.loc[['b','c']]
Out[6]:
b 1 4
 3 5
c 1 6
 2 7
dtype: int32
data.loc[:,2]
Out[8]:
a 2
```

```
c 7
d 8
dtype: int32
#使用unstack方法重新排列数据
data.unstack()
Out[11]:
       2 3
    1
a 1.0 2.0 3.0
b 4.0 NaN 5.0
c 6.0 7.0 NaN
d NaN 8.0 9.0
#stack: unstack的反操作
data.unstack().stack()
Out[12]:
a 1 1.0
  2
      2.0
  3
      3.0
b 1 4.0
  3
      5.0
c 1 6.0
  2
      7.0
d 2 8.0
  3
       9.0
dtype: float64
#DataFrame
df = pd.DataFrame(np.arange(12).reshape((4,3)),
                index = [['a', 'a', 'b', 'b'], [1,2,1,2]],
                columns = [['Ohio','Ohio','Colorado'],['Green','Red','Green']])
df
Out[17]:
   Ohio Colorado
   Green Red
              Green
                2
a 1
     0 1
 2
     3 4
                  5
                  8
b 1
     6 7
 2
     9 10
                11
#给层级加上名称
df.index.names = ['key1', 'key2']
df.columns.names = ['State','Color']
df
Out[21]:
State
         Ohio
                 Colorado
Color
        Green Red
                    Green
key1 key2
a 1
           0 1
                        2
    2
            3
               4
                        5
  1
           6 7
                       8
    2
            9 10
                       11
```

• 重排列和层级排序

```
#重新排列轴顺序 swaplevel()
df.swaplevel(i = 'key1',j = 'key2')
Out[23]:
State Ohio Colorado
Color Green Red Green
key2 key1
1 a
         0 1 2
2 a
         3 4
                  5
         6 7
1 b 2 b
                  8
        9 10
                 11
#按照层级进行字典排序 sort_index()
df.sort_index(level = 'key2')
Out[28]:
       Ohio Colorado
State
Color Green Red Green
key1 key2
a 1
        0 1
                  2
        6 7
  1
                   8
a 2
         3 4
                  5
b 2 9 10 11
df.swaplevel('key1','key2').sort_index(level = 'key2')
Out[30]:
       Ohio Colorado
State
Color
      Green Red Green
key2 key1
      0 1
               2
1 a
         6 7
   b
                  8
         3 4
2 a
                  5
                  11
         9 10
   b
```

• 按层级进行汇总统计

```
df
Out[39]:
State
      Ohio Colorado
Color Green Red Green
key1 key2
        0 1
a 1
                  2
        3 4
                 5
  2
     6 7 8
9 10 11
b
 1
   2
```

```
df.sum(level = 'key2')
Out[38]:
State Ohio Colorado
Color Green Red Green
key2
1 6 8 10
     12 14
               16
df.sum(level = 'State',axis=1)
Out[41]:
State Ohio Colorado
key1 key2
a 1 1 2
2 7 5
b 1 13
2 19
                 8
                11
```

• 使用DataFrame的列进行索引

```
df = pd.DataFrame({'a':range(7), 'b':range(7,0,-1), 'c':
              ['one','one','two','two','two','two'],'d':[0,1,2,0,1,2,3]})
df
Out[45]:
  ab cd
0 0 7 one 0
1 \quad 1 \quad 6 \quad \text{one} \quad 1
2 2 5 one 2
3 3 4 two 0
4 4 3 two 1
5 5 2 two 2
6 6 1 two 3
#将df中的列作为索引,set_index
df.set_index(['c','d'])
Out[46]:
  a b
c d
one 0 0 7
  1 1 6
  2 2 5
two 0 3 4
  1 4 3
   2 5 2
   3 6 1
#若要保留列,则传入drop = False
df.set_index(['c','d'],drop = False)
Out[48]:
   ab cd
c d
one 0 0 7 one 0
1 1 6 one 1
```

```
2 2 5 one 2
two 0 3 4 two 0
   1 4 3 two 1
   2 5 2 two 2
   3 6 1 two 3
#reset_index : set_index的反操作
df.set_index(['c','d']).reset_index()
Out[49]:
   c d a b
0 one 0 0 7
1 one 1 1 6
2 one 2 2 5
3 two 0 3 4
4 two 1 4 3
5 two 2 5 2
6 two 3 6 1
```

• merge联合

```
pd.merge(['right', "how='inner'", 'on=None', 'left_on=None', 'right_on=None',
      'left_index=False', 'right_index=False', 'sort=False', "suffixes=('_x', '_y')",
    'copy=True', 'indicator=False', 'validate=None'])
#on: 指定连接键,没有指定时会将同名键作为连接键。
df1 = pd.DataFrame({'key':['b','b','a','c','a','a','b'],'data1':range(7)})
df1
Out[53]:
 key data1
        0
0 b
1
  b
        1
2 a
        2
3 c
        3
4 a
        4
        5
5 a
         6
df2 = pd.DataFrame({'key':['a','b','d'],'data2':range(3)})
df2
Out[56]:
 key data2
0
  a
         0
         1
1
  b
2 d
        2
pd.merge(df1,df2,on = 'key')
Out[57]:
 key data1 data2
0
  b
        0
               1
         1
                1
1
  b
2
  b
        6
               1
3
         2
                0
  a
         4
4
```

```
5 a 5 0
#left_on, right_on : 为每个连接对象指定连接键
df3 = pd.DataFrame({'lkey':['b','b','a','c','a','a','b'],'data1':range(7)})
df3
Out[59]:
 1key data1
    b
0
           0
           1
1
    b
2
           2
    a
3
           3
    С
4
           4
    a
5
    a
           5
           6
    b
df4 = pd.DataFrame({'rkey':['a','b','d'],'data2':range(3)})
df4
Out[61]:
 rkey data2
    a
           0
1
    b
           1
2
    d
           2
pd.merge(df3,df4,left_on = 'lkey',right_on = 'rkey')
Out[67]:
  1key data1 rkey data2
    b
0
           0
               b
                      1
1
           1
                b
                      1
    b
2
           6
               b
                      1
    b
3
           2
               a
    a
                      0
4
    a
           4
                a
5
           5
                      0
    a
               a
#how 连接方式 'inner', 'left', 'right', 'outer',默认为 'inner'
pd.merge(df3,df4,left_on = 'lkey',right_on = 'rkey',how = 'left')
Out[74]:
  1key data1 rkey data2
    b
                    1.0
0
          0
               b
1
    b
           1
               b
                    1.0
2
           2 a
                    0.0
    a
3
    C
           3 NaN
                    NaN
4
                    0.0
    a
           4
             a
                    0.0
5
           5
    a
               a
6
    b
           6 b
                    1.0
pd.merge(df3,df4,left_on = 'lkey',right_on = 'rkey',how = 'right')
Out[75]:
  1key data1 rkey data2
         0.0
0
    b
               b
                      1
1
    b
         1.0
                b
                      1
2
    b
         6.0
                      1
                b
3
    a
         2.0
               a
                      0
         4.0
                      0
4
    a
                a
5
         5.0
                      0
    a
                a
```

```
6 NaN NaN d 2
pd.merge(df3,df4,left_on = 'lkey',right_on = 'rkey',how = 'outer')
Out[76]:
 1key data1 rkey data2
   b
       0.0 b
                 1.0
1
        1.0
                 1.0
2
        6.0 b
                 1.0
    b
3 a 2.0 a 0.0
4 a
       4.0 a 0.0
5
       5.0 a 0.0
  a
6 c 3.0 NaN NaN
7 NaN
       nan d
                 2.0
#left_index, right_index, 无公共键时, 可指定行索引作为连接键
left
Out[79]:
 key value
1
 b
        1
2 a
       2
3 a
       3
4
        4
5 c
right
Out[80]:
  group_val
      3.5
a
       7.0
pd.merge(left,right,left_on = 'key',right_index = True)
Out[83]:
 key value group_val
      0
0
  a
           3.5
2
       2
               3.5
 a
3
  a
       3
               3.5
       1
               7.0
1 b
               7.0
 b
       4
#两边的索引作为连接键
left1
Out[86]:
  Ohio Nevada
   1 2
    3
C
          4
    5
e
right1
Out[87]:
  Missouri Alabama
      7
              8
b
       9
              10
С
d
       11
              12
pd.merge(left1,right1,how = 'outer',left_index = True,right_index = True)
OR left1.join(right1,how = 'outer')
```

```
Out[88]:
  Ohio Nevada Missouri Alabama
a
  1.0
         2.0
                 NaN
                        NaN
                 7.0
                        8.0
         NaN
h
  NaN
c 3.0
       4.0
                9.0
                      10.0
                11.0
                      12.0
d
  NaN
         NaN
e 5.0
       6.0
               13.0
                      14.0
```

• concat 沿轴向连接

```
pd.concat(['objs', 'axis=0', "join='outer'", 'join_axes=None', 'ignore_index=False',
        'keys=None', 'levels=None', 'names=None', 'verify_integrity=False',
      'sort=None', 'copy=True'])
#Series
s1 = pd.Series([0,1],index = ['a','b'])
s2 = pd.Series([2,3,4],index = ['c','d','e'])
s3 = pd.Series([5,6],index = ['f','g'])
pd.concat([s1,s2,s3])
Out[96]:
    0
a
b
    1
c 2
d 3
e 4
f 5
    6
dtype: int64
#axis,控制轴
pd.concat([s1,s2,s3],axis = 1,sort = True)
Out[98]:
    0 1
           2
a 0.0 NaN NaN
b 1.0 Nan Nan
c NaN 2.0 NaN
d nan 3.0 nan
e NaN 4.0 NaN
f NaN NaN 5.0
g NaN NaN 6.0
#join_axes : 指定顺序
pd.concat([s1,s2,s3],axis = 1,join\_axes = [['g','f','e','d','c','b','a']])
Out[104]:
    0
        1
           2
g NaN NaN 6.0
f Nan Nan 5.0
e NaN 4.0 NaN
d NaN 3.0 NaN
c NaN 2.0
           Nan
b 1.0 NaN NaN
a 0.0 NaN NaN
```

```
#keys:在连接轴上创建一个多层索引
pd.concat([s1,s2,s3],keys = ['one','two','three'])
Out[105]:
        0
one a
     b 1
    c 2
two
     d 3
       4
     e
three f 5
        6
     g
dtype: int64
#当axis = 1时, keys则成为了列头
pd.concat([s1,s2,s3],axis = 1,keys = ['one','two','three'],sort = True)
Out[107]:
  one two three
a 0.0 NaN
            NaN
b 1.0 NaN
            NaN
          Nan
c NaN 2.0
d NaN 3.0
          Nan
e NaN 4.0
            NaN
f NaN NaN
          5.0
g NaN NaN
          6.0
#DataFrame
df1
Out[113]:
  one two
a 0 1
b 2 3
c 4 5
df2
Out[114]:
 three four
a 5
С
    7
         8
pd.concat([df1,df2],axis = 1,keys = ['level1','level2'],
                names = ['upper','lower'],sort = True)
Out[117]:
upper level1 level2
lower one two three four
       0 1 5.0 6.0
       2 3 NaN NaN
b
       4 5 7.0 8.0
c
```

• 联合重塑数据

```
a
Out[122]:
f NaN
```

```
e 2.5
d
    0.0
c 3.5
b 4.5
    Nan
dtype: float64
Out[123]:
a 0.0
b
    NaN
С
    2.0
d nan
    NaN
f
    5.0
dtype: float64
np.where(pd.isnull(a),b,a)
Out[125]: array([0. , 2.5, 0. , 3.5, 4.5, 5. ])
#使用combine_first
b.combine_first(a)
Out[126]:
a 0.0
b 4.5
c 2.0
d 0.0
e 2.5
f 5.0
dtype: float64
```