Pandas扩展知识

1. 加载数据

```
# https://gist.github.com/tijptjik/9408623 wine.csv
import pandas as pd
data = pd.read_csv("wine.csv")

#data
data.head()
```

```
.dataframe tbody tr th {
   vertical-align: top;
}
.dataframe thead th {
   text-align: right;
}
```

	Wine	Alcohol	Malic.acid	Ash	Acl	Mg	Phenols	Flavanoids	Nonflavanoid.phenols	Proanth	Color.int	Hue
0	1	14.23	1.71	2.43	15.6	127	2.80	3.06	0.28	2.29	5.64	1.04
1	1	13.20	1.78	2.14	11.2	100	2.65	2.76	0.26	1.28	4.38	1.05
2	1	13.16	2.36	2.67	18.6	101	2.80	3.24	0.30	2.81	5.68	1.03
3	1	14.37	1.95	2.50	16.8	113	3.85	3.49	0.24	2.18	7.80	0.86
4	1	13.24	2.59	2.87	21.0	118	2.80	2.69	0.39	1.82	4.32	1.04

```
print(data.head())
print(data.tail(3))
print(data.describe())
print("***")
print(data.columns)
```

```
Wine Alcohol Malic.acid Ash Acl Mg Phenols Flavanoids \
    1 14.23 1.71 2.43 15.6 127 2.80 3.06
              13.20
                                1.78 2.14 11.2 100
                                                                    2.65
                                                                                     2.76
1

    1.78
    2.14
    11.2
    100
    2.65

    2.36
    2.67
    18.6
    101
    2.80

    1.95
    2.50
    16.8
    113
    3.85

    2.59
    2.87
    21.0
    118
    2.80

       1 13.16
2
                                                                                     3.24
     1 14.37
                                                                                     3.49
             13.24
    Nonflavanoid.phenols Proanth Color.int Hue OD Proline

      0.28
      2.29
      5.64
      1.04
      3.92

      0.26
      1.28
      4.38
      1.05
      3.40

0
                          0.26 1.28
      0.30 2.81 5.68 1.03 3.17 1185
0.24 2.18 7.80 0.86 3.45 1480
0.39 1.82 4.32 1.04 2.93 735
Wine Alcohol Malic.acid Ash Acl Mg Phenols Flavanoids \
3
      3 13.27 4.28 2.26 20.0 120 1.59 0.69
3 13.17 2.59 2.37 20.0 120 1.65 0.68
3 14.13 4.10 2.74 24.5 96 2.05 0.76
176
177
      Nonflavanoid.phenols Proanth Color.int Hue OD Proline
                  0.43 1.35 10.2 0.59 1.56 835
                                                     9.3 0.60 1.62
9.2 0.61 1.60
176
                            0.53
                                        1.46
                                                                                      840
                                      1.35
                                                                                     560
177
                            0.56
                           Alcohol Malic.acid
                                                                 Ash
                                                                                   Acl
count 178.000000 178.000000 178.000000 178.000000 178.000000 178.000000
         1.938202 13.000618 2.336348 2.366517 19.494944 99.741573
mean

        0.775035
        0.811827
        1.117146
        0.274344
        3.339564
        14.282484

        1.000000
        11.030000
        0.740000
        1.360000
        10.600000
        70.000000

std
min
          1.000000 12.362500 1.602500 2.210000 17.200000 88.000000

    2.000000
    13.050000
    1.865000
    2.360000
    19.500000
    98.000000

    3.000000
    13.677500
    3.082500
    2.557500
    21.500000
    107.000000

50%
75%
         3.000000 14.830000 5.800000 3.230000 30.000000 162.000000
```

```
Phenols Flavanoids Nonflavanoid.phenols Proanth Color.int \
                                         178.000000 178.000000 178.000000
count 178.000000 178.000000
mean
        2.295112 2.029270
                                             0.361854 1.590899 5.058090
                                              0.124453 0.572359 2.318286
         0.625851 0.998859
std
        0.980000 0.340000
1.742500 1.205000
                                              0.130000 0.410000 1.280000
0.270000 1.250000 3.220000
min
25%
        2.355000 2.135000
2.800000 2.875000
                                              0.340000 1.555000 4.690000
0.437500 1.950000 6.200000
50%
75%
        3.880000 5.080000
                                              0.660000 3.580000 13.000000
max
                         OD
                                    Proline
              Hue
count 178.000000 178.000000 178.000000

    0.957449
    2.611685
    746.893258

    0.228572
    0.709990
    314.907474

mean
std
      0.480000 1.270000 278.000000
0.782500 1.937500 500.500000
0.965000 2.780000 673.500000
min
25%
50%
        1.120000 3.170000 985.000000
1.710000 4.000000 1680.000000
75%
max
Index(['Wine', 'Alcohol', 'Malic.acid', 'Ash', 'Acl', 'Mg', 'Phenols',
        'Flavanoids', 'Nonflavanoid.phenols', 'Proanth', 'Color.int', 'Hue',
       'OD', 'Proline'],
      dtype='object')
```

data.head()

```
.dataframe tbody tr th {
   vertical-align: top;
}
.dataframe thead th {
   text-align: right;
}
```

	Wine	Alcohol	Malic.acid	Ash	Acl	Mg	Phenols	Flavanoids	Nonflavanoid.phenols	Proanth	Color.int	Hue	OD	Proline
0	1	14.23	1.71	2.43	15.6	127	2.80	3.06	0.28	2.29	5.64	1.04	3.92	1065
1	1	13.20	1.78	2.14	11.2	100	2.65	2.76	0.26	1.28	4.38	1.05	3.40	1050
2	1	13.16	2.36	2.67	18.6	101	2.80	3.24	0.30	2.81	5.68	1.03	3.17	1185
3	1	14.37	1.95	2.50	16.8	113	3.85	3.49	0.24	2.18	7.80	0.86	3.45	1480
4	1	13.24	2.59	2.87	21.0	118	2.80	2.69	0.39	1.82	4.32	1.04	2.93	735

2. Pandas中的统计和汇总方法

我们可以加载自己的数据集到panda的DataFrame. 以此为例.

```
import pandas as pd
df = pd.read_csv("mydataset.csv")
print(df.head())
print(df.tail(3))
# 统计方法: describe() 针对Series和DataFrame的各列计算汇总统计
print(df.describe())
print("各列的最小值/最大值:")
print(df.min())
print(df.max())
# 求值的总和: 各列的总和
print(df.sum())
print("各列的平均值:")
print(df.mean())
print("各列的方差:")
print(df.var())
print("各列的标准差:")
print(df.std())
print("计算样本的累计和:")
print(df.iloc[:,1:].cumsum())
```

```
print("计算一阶差分:")
print(df.iloc[:,1:].diff())
# 上面遇到NaN,可以用fillna()填充缺失数据,也可以用dropna()丢弃含有缺失值的行
print("计算一阶差分:")
print(df.iloc[:,1:].diff().fillna(0))
print("计算一阶差分:")
print(df.iloc[:,1:].diff().fillna(method='bfill'))
print("计算一阶差分:")
print(df.iloc[:,1:].diff().dropna())
print("***")
print(df.columns)
```

```
Hight Weight score
 Name
              95
0 Gang
         91
                     93
  Shuan
          88
                88
  Yang
         69
                80
                      70
        78
              79
                    79
3
   Li
        55 88 78
4
   Shi
 Name
        Hight Weight score
       69 80 70
2 Yang
        78 79
55 88
                    79
78
3
   Li
4
   Shi
Hight Weight score count 5.000000 5.000000
mean 76.200000 86.000000 81.600000
std 14.686729 6.595453 9.016651
min
     55.000000 79.000000 70.000000
25%
    69.000000 80.000000 78.000000
50%
     78.000000 88.000000 79.000000
75% 88.000000 88.000000 88.000000
     91.000000 95.000000 93.000000
max
各列的最小值/最大值:
Name
     Gang
        55
Hight
         79
Weight
score
         70
dtype: object
     Yang
Name
         91
Hight
Weight
         95
         93
score
dtype: object
Name GangShuanYangLiShi
Hiaht
          381
Weight
                   430
                   408
score
dtype: object
各列的平均值:
Hight
      76.2
Weight
        86.0
       81.6
score
dtype: float64
各列的方差:
Hight 215.7
        43.5
Weight
score
        81.3
dtype: float64
各列的标准差:
Hight 14.686729
Weight
        6.595453
      9.016651
score
dtype: float64
计算样本的累计和:
 Hight Weight score
        95
               93
0
   91
1
   179
          183
               181
        263 251
2
  248
        342 330
430 408
   326
3
   381
4
计算一阶差分:
  Hight Weight score
  NaN
       NaN NaN
  -3.0
         -7.0
               -5.0
        -8.0 -18.0
2 -19.0
  9.0 -1.0 9.0
-23.0 9.0 -1.0
3
4 -23.0
计算一阶差分:
 Hight Weight score
0 0.0 0.0 0.0
```

```
1 -3.0 -7.0 -5.0
  2 -19.0 -8.0 -18.0
3 9.0 -1.0 9.0
4 -23.0 9.0 -1.0
  计算一阶差分:
    Hight Weight score
  0 -3.0 -7.0 -5.0
1 -3.0 -7.0 -5.0
  2 -19.0 -8.0 -18.0
     9.0 -1.0 9.0
-23.0 9.0 -1.0
  3
  4 -23.0
  计算一阶差分:
    Hight Weight score
  1 -3.0 -7.0 -5.0
  2 -19.0
             -8.0 -18.0
  3 9.0 -1.0 9.0
4 -23.0 9.0 -1.0
  Index(['Name ', 'Hight', 'Weight', 'score'], dtype='object')
```

3. 列索引

```
pwd
```

'C:\\Users\\huang\\algorithms_2nd_edition\\lec_research\\kNN_Classification'

```
import pandas as pd
import os
# 获取当前工作的文件夹名.(pwd)
# file = os.path.dirname(__file__)
#print(file)
file = 'C:\\Users\\huang\\algorithms_2nd_edition\\lec_research\\kNN_Classification'
# use read_csv to read data in the dataset as a data frame
#df = pd.read_csv(file+"/DATA/Module2/Datasets/direct_marketing.csv")
\label{thm:condition} $$ df = pd.read\_csv(r'c:\shap\algorithms\_2nd\_edition\ellec_research\knn\_classification\DATA\module2\Datasets\direct\_marketing.csv') $$ is a pd-read\_csv(r'c:\shapparents). $$ direct\_marketing.csv' is a pd-read\_csv' i
print(df.tail(2))
print("*****")
#print(df.recency)
print(df.recency.head(2))
print(df['recency'].head(2))
print("*****")
print(df.loc[:,'recency'].head(2))
#数值索引: pandas中的"iloc"通过数来选择行和列
print(df.iloc[:, 0].head(2))
```

```
recency history_segment history mens womens zip_code newbie \
        1 5) $500 - $750 552.94 1 0 Surburban 1
1 4) $350 - $500 472.82 0 1 Surburban 0
63998
63999
           channel
                         segment visit conversion spend DM_category
63998 Multichannel Womens E-Mail 0 0 0.0
63999 Web Mens E-Mail 0 0 0.0
0 10
Name: recency, dtype: int64
0 10
1
    6
Name: recency, dtype: int64
*****
0
    10
1
     6
Name: recency, dtype: int64
0
   10
```

Name: recency, dtype: int64

4. 行索引

```
# 当前工作的文件夹
file = 'C:\\Users\\huang\\algorithms_2nd_edition\\lec_research\\kNN_Classification'
# use read_csv to read data in the dataset as a data frame
df = pd.read_csv(file+"\\DATA\\Module2\\Datasets\\direct_marketing.csv")
# 行索引
print(df[0:3])
print("*****索引: 头两行,所有列***")
print(df.iloc[0:2, :])
print("*****索引: 头两行,头5列***")
print(df.iloc[0:2, :5])
print("*****索引: 头两行,自选3列***")
print(df.iloc[0:2, [0,1,3]])
  recency history_segment history mens womens zip_code newbie channel
     10 2) $100 - $200 142.44 1 0 Surburban
                                                       0 Phone
       6 3) $200 - $350 329.08
7 2) $100 - $200 180.65
                                 1
                                        1 Rural
1
                                0
                                                         1
                                                              web
2
                                        1 Surburban
                                                         1
                                                              weh
       segment visit conversion spend DM_category
0 Womens E-Mail
                0 0.0
                0
    No F-Mail
                            0.0
                                             11
2 Womens E-Mail
                  0
                            0
                                 0.0
                                              1
******索引: 头两行,所有列***
  recency history_segment history mens womens zip_code newbie channel \
    10 2) $100 - $200 142.44 1 0 Surburban
                                                      0 Phone
                                1
1
      6 3) $200 - $350 329.08
                                       1 Rural
      segment visit conversion spend DM_category
0 Womens E-Mail 0 0 0.0
1 No E-Mail 0 0 0.0
                                             11
******索引: 头两行,头5列***
  recency history_segment history mens womens
     10 2) $100 - $200 142.44 1
      6 3) $200 - $350 329.08
                                 1
******索引: 头两行,自选3列***
  recency history_segment mens
    10 2) $100 - $200
                          1
      6 3) $200 - $350
```

5. 布尔型索引

```
# 布尔型索引 (boolean index)
print(df.recency < 7)

#feed back boolean series to regular df
print("feed back boolean series to regular dataframe")
print(df[df.recency<7])

# 将多个布尔型索引组合
print("combine multiple boolean indexing conditions")
print(df[(df.recency<7)&(df.newbie==0)])
```

```
False
1
         True
2
         False
         False
          True
          True
6
         False
7
         False
8
         False
9
         False
10
         False
11
          True
12
          True
13
          True
14
          True
15
          True
16
          True
17
         False
```

```
18 False
  19
                              True
  20
                              False
  21
                              False
  22
                                True
  23
                                True
  24
                               True
  25
  26
                              False
  27
                                True
  28
                              False
  29
                                True
  63970
                                True
  63971
                               True
  63972
                                True
  63973
                              False
  63974
                              False
  63975
                              False
  63976
                                True
  63977
                              False
  63978
                              False
  63979
                              False
  63980
                                 True
  63981
                                 True
  63982
                                 True
  63983
                                 True
  63984
                               True
  63985
                              False
  63986
                              False
  63987
                                True
  63988
                                True
  63989
                              False
  63990
  63991
                                True
  63992
                                True
  63993
                                True
  63994
                              False
  63995
                              False
  63996
                                True
  63997
                                True
  63998
                                 True
  63999
                              True
  Name: recency, Length: 64000, dtype: bool
  feed back boolean series to regular dataframe % \left( 1\right) =\left( 1\right) \left( 1\right) 
                       recency history_segment history mens womens
                                                                                                                                                                                       zip_code newbie \
                                                         3) $200 - $350
                                                                                                              329.08
                                                           1) $0 - $100
  4
                                                                                                                45.34
                                                                                                                                                                                                 Urban
  5
                                                         2) $100 - $200
                                                                                                                134.83
                                                                                                                                                                           1 Surburban
                                          6
                                                                                                                                                   0
                                                                                                                                                                                                                                         0
  11
                                          1
                                                        3) $200 - $350
                                                                                                                211.45
                                                                                                                                                   0
                                                                                                                                                                           1
                                                                                                                                                                                        Urban
                                                                                                                                                                                                                                         1
  12
                                          5 5) $500 - $750
                                                                                                                642.90
                                                                                                                                                                           1 Surburban
  13
                                                          2) $100 - $200
                                                                                                                101.64
                                                                                                                                                                           1 Urban
                                                      3) $200 - $350
                                                                                                                                                                         1
  14
                                          4
                                                                                                                241.42
                                                                                                                                                   0
                                                                                                                                                                                                  Rural
                                                                                                                                                                                                                                         1
                                                       1) $0 - $100
  15
                                          3
                                                                                                                  58.13
                                                                                                                                                                                                Urhan
                                                                                                                                                   1
                                                                                                                                                                         0
                                                                                                                                                                                                                                         1
  16
                                          5
                                                               1) $0 - $100
                                                                                                                  29.99
                                                                                                                                                   1
                                                                                                                                                                            0 Surburban
                                                                                                                                                                                                                                         0
                                                                                                                                                                            0 Surburban
  19
                                          5 6) $750 - $1,000
                                                                                                              828.42
  22
                                                       2) $100 - $200
                                                                                                                118.40
                                                                                                                                                                           0 Surburban
                                                                                                                                                                                                                                         0
                                                                                                                                                   1
                                                             1) $0 - $100
  23
                                          2
                                                                                                                 29.99
                                                                                                                                                   0
                                                                                                                                                                           1
                                                                                                                                                                                        Urban
                                                                                                                                                                                                                                         1
  24
                                          4
                                                             1) $0 - $100
                                                                                                                 78.24
                                                                                                                                                                           0 Surburban
                                                                                                                                                                                                                                         0
  25
                                          6
                                                          2) $100 - $200
                                                                                                                139.87
                                                                                                                                                   0
                                                                                                                                                                                               Rural
  27
                                                     2) $100 - $200
                                                                                                                162.98
                                                                                                                                                                           1 Surburban
                                                         3) $200 - $350
  29
                                                                                                                203.35
                                                                                                                                                                           0
                                          2
                                                                                                                                                                                         Rural
                                                                                                                                                                                                                                         0
                                                                                                                                                   1
  30
                                          2
                                                         3) $200 - $350
                                                                                                                237.53
                                                                                                                                                   0
                                                                                                                                                                           1 Surburban
                                                                                                                                                                                                                                         0
  32
                                          6 2) $100 - $200
                                                                                                                128.01
                                                                                                                                                                                        Urban
  34
                                                              1) $0 - $100
                                                                                                                  29.99
                                                                                                                                                                            0
                                                                                                                                                                                                   Rural
                                                          3) $200 - $350
                                                                                                                218.72
  35
                                          4
                                                                                                                                                   0
                                                                                                                                                                           1
                                                                                                                                                                                                Urban
                                                                                                                                                                                                                                         0
                                                                                                                                                                           1 Surburban
                                                        5) $500 - $750
                                                                                                                514.52
  36
                                          1
                                                                                                                                                   0
                                                                                                                                                                                                                                         1
  37
                                          4 6) $750 - $1,000
                                                                                                                766.47
                                                                                                                                                   1
                                                                                                                                                                           1
                                                                                                                                                                                            Urban
                                                                                                                                                                                                                                         1
  41
                                          3
                                                             1) $0 - $100
                                                                                                                  99.23
                                                                                                                                                                                                  Rural
  43
                                                         4) $350 - $500
                                                                                                                492.02
                                                                                                                                                   1
                                                                                                                                                                            0 Surburban
                                                                                                                                                                                                                                         0
  44
                                                             1) $0 - $100
                                                                                                                 48.32
                                          1
                                                                                                                                                   0
                                                                                                                                                                           1
                                                                                                                                                                                        Urban
                                                                                                                                                                                                                                         0
  46
                                          2
                                                          4) $350 - $500
                                                                                                                391.33
                                                                                                                                                                         0 Surburban
                                                                                                                                                                                                                                         0
  47
                                          1
                                                          5) $500 - $750
                                                                                                                 729.70
                                                                                                                                                                            1 Surburban
                                                          2) $100 - $200
  48
                                          3
                                                                                                                134.59
                                                                                                                                                                         0 Urban
                                                                                                                                                                                                                                         1
                                                         3) $200 - $350
  50
                                          3
                                                                                                                203.30
                                                                                                                                                   0
                                                                                                                                                                           1 Surburban
                                                                                                                                                                                                                                         0
                                                             1) $0 - $100
  55
                                          6
                                                                                                                 42.66
                                                                                                                                                  1
                                                                                                                                                                            0 Surburban
                                                                                                                                                                                                                                         0
                                                              1) $0 - $100
  63949
                                       5
                                                                                                                  86.79
                                                                                                                                               1
                                                                                                                                                                          0
                                                                                                                                                                                                                                        0
                                                                                                                                                                                                   Rural
                                                           1) $0 - $100
  63950
                                                                                                                 45.67
                                                                                                                                                   0
                                                                                                                                                                                                                                        1
                                          1
                                                                                                                                                                           1 Surburban
  63953
                                                          2) $100 - $200
                                                                                                               166.24
                                                                                                                                                                                                Urhan
                                                                                                                                                   0
                                                                                                                                                                                                                                         0
```

62054	2	1) 60	¢100	02.07	1	0	11,-1	
63954	2	1) \$0 -		93.97	1	0	Urban	
63955	1 1 2	1) \$0 -		29.99	1		Surburban	
63960 63961) \$200 -) \$200 -		221.89 337.36	0 1	1	Surburban Urban	
63964		\$750 - \$		772.99	1		Surburban	
63966) \$100 -		170.03	1		Surburban	
63967	5	1) \$0 -		77.73	0	1	Urban	
63969	3	1) \$0 -		67.78	0		Surburban	
63970	4 2) \$100 -		191.15	0		Surburban	
63971) \$500 -		549.87	0		Surburban	
63972) \$500 -		554.97	0		Surburban	
63976	1 5) \$500 -	\$750	710.72	1	1	Urban	1
63980	3 4) \$350 -	\$500	487.10	0	1	Surburban	1
63981) \$100 -	\$200	125.53	0	1	Rural	
63982	5	1) \$0 -	\$100	29.99	1	0	Urban	
63983	2	1) \$0 -		83.03	0	1	Urban	
63984) \$200 -		209.51	0	1	Urban	
63987	1	1) \$0 -		79.70	1		Surburban	
63988	6	1) \$0 -		32.98	1		Surburban	
63990	6	1) \$0 -	\$100	80.02	0	1	Surburbar	0
63991	1 3) \$200 -	\$350	306.10	1	0	Surburban	1
63992	1 5) \$500 -	\$750	519.69	1	1	Urban	1
63993	4 4) \$350 -	\$500	374.07	0	1	Surburban	0
63996	5	1) \$0 -	\$100	38.91	0	1	Urban	1
63997	6	1) \$0 -	\$100	29.99	1	0	Urban	1
63998	1 5) \$500 -		552.94	1	0	Surburbar	1
63999) \$350 -		472.82	0	1	Surburbar	0
	channel		segment	visit	conversion	sp	end DM_c	ategory
1	Web	No	E-Mail	0	0		0.0	11
4	Web	Womens	E-Mail	0	0		0.0	4
5	Phone	Womens	E-Mail	1	0		0.0	1
11	Phone		E-Mail	0	0		0.0	1
12	Multichannel	Womens	E-Mail	0	0		0.0	1
13	Web	Mens	E-Mail	1	0		0.0	3
14	Multichannel	No	E-Mail	0	0		0.0	5
15	Web	No	E-Mail	1	0		0.0	6
16	Phone		E-Mail	0	0		0.0	2
19	Multichannel		E-Mail	0	0		0.0	2
22	Web		E-Mail	1	0		0.0	2
23	Phone		E-Mail	0	0		0.0	5
24	Web		E-Mail	0	0		0.0	6
25	web		E-Mail	0	0		0.0	3
27	web		E-Mail	0	0		0.0	3
29	web		E-Mail	0	0		0.0	6
30	Phone		E-Mail	0	0		0.0	1
32	web		E-Mail	0	0		0.0	3
34	web		E-Mail	0	0		0.0	4
35	Multichannel		E-Mail	0	0		0.0	1
36	Web		E-Mail	0	0		0.0	3
37	Multichannel		E-Mail	0	0		0.0	5
41	Web		E-Mail	1	0		0.0	2
41	Phone		E-Mail	0	0		0.0	6
43	Web		E-Mail	0	0		0.0	5
44	web			0	0		0.0	6
			E-Mail	0				5
47	Web		E-Mail		0		0.0	
48	Phone		E-Mail	1	0		0.0	4
50	Web		E-Mail	0	0		0.0	5
55	Web		E-Mail	0	0		0.0	6
	Dhama		 - usil					
63949	Phone		E-Mail	0	0		0.0	6
63950	Web		E-Mail	0	0		0.0	3
63953	Phone		E-Mail	0	0		0.0	5
63954	. Web		E-Mail	1	0		0.0	6
63955	Phone		E-Mail	0	0		0.0	2
63960			E-Mail	0	0		0.0	5
63961	Web		E-Mail	1	0		0.0	2
63964	Web		E-Mail	0	0		0.0	5
63966	Web		E-Mail	0	0		0.0	4
63967	Phone		E-Mail	0	0		0.0	5
63969	Web		E-Mail	0	0		0.0	1
63970	Web	Womens	E-Mail	0	0		0.0	1
63971	Phone	Womens	E-Mail	0	0		0.0	1
63972	Web	No	E-Mail	0	0		0.0	5
63976	Phone	No	E-Mail	0	0		0.0	11
63980	Phone	No	E-Mail	0	0		0.0	5
63981	Phone		E-Mail	0	0		0.0	5
	Phone		E-Mail	0	0		0.0	2
63982								
63982 63983	Phone	No	E-Mail	0	0		0.0	5
		No Womens		0	0		0.0	5 1

```
63987
      Web
                   No E-Mail 0
                                        0 0.0
63988
              web
                     Mens E-Mail
                                    Ω
                                               Λ
                                                    0.0
                                                                  2
63990
             Phone
                     No E-Mail
                                                0
                                                    0.0
                                                                  5
                                    0
63991
            Phone Womens E-Mail
                                                    0.0
63992
            Phone
                    Mens E-Mail
                                    0
                                               0
                                                    0.0
                                                                  5
63993
            Phone
                   Womens E-Mail
                                    0
                                               0
                                                    0.0
                                                                  1
63996
            Phone
                    Mens E-Mail
                                    Ω
                                               0
                                                    0.0
                                                                  3
63997
            Phone
                     Mens E-Mail
                                    0
                                                0
                                                    0.0
                                                                  2
63998 Multichannel Womens E-Mail
                                    0
                                                0
                                                    0.0
                                               0
63999
              Weh
                    Mens E-Mail
                                    Ω
                                                    0.0
                                                                  3
[36585 rows x 13 columns]
combine multiple boolean indexing conditions
                                                  zip_code newbie
     recency history segment history mens womens
                                      1
4
           2 1) $0 - $100
                              45.34
                                              0
                                                    Urhan
                                                                 0
5
            6 2) $100 - $200
                              134.83
                                        0
                                               1
                                                  Surburban
                                                                 0
                                                   Urban
13
           2 2) $100 - $200
                              101.64
                              29.99
               1) $0 - $100
16
                                               0 Surburban
                                                                 0
           2 2) $100 - $200
22
                              118.40
                                        1
                                               0 Surburban
                                                                 0
24
           4
               1) $0 - $100
                              78.24
                                               0 Surburban
                                                                 Λ
                                               1 Surburban
27
           6 2) $100 - $200
                              162.98
                                                                 0
29
           2 3) $200 - $350
                              203.35
                                               0 Rural
                                                                 0
           2 3) $200 - $350
30
                              237.53
                                        0
                                               1 Surburban
                                                                 0
32
           6 2) $100 - $200
                              128.01
                                        0
                                               1
                                                   Urban
                                                                 0
34
               1) $0 - $100
                              29.99
           3
                                                      Rural
35
           4 3) $200 - $350
                              218.72
                                                      Urban
41
           3
               1) $0 - $100
                              99.23
                                               0
                                        1
                                                     Rural
                                                                 0
43
           2 4) $350 - $500
                              492.02
                                               0 Surburban
                                                                 0
44
           1
                1) $0 - $100
                              48.32
                                               1
                                                   Urban
                                                                 0
46
           2 4) $350 - $500
                              391.33
                                               0 Surburban
50
           3 3) $200 - $350
                              203.30
                                        0
                                               1 Surburban
                                                                 0
55
           6
               1) $0 - $100
                              42.66
                                        1
                                               0 Surburban
                                                                 0
59
           3 2) $100 - $200
                              143.93
                                               1 Surburban
                                                                 0
61
                1) $0 - $100
                               96.91
                                                  Surburban
                                                                 0
65
           5 3) $200 - $350
                              222.07
                                               1 Surburban
70
           2 3) $200 - $350
                              278.80
                                        1
                                               0
                                                      Rural
                                                                 0
72
           2 4) $350 - $500
                              428.74
                                               0
                                                      Rural
                                                                 0
76
           4 2) $100 - $200
                              194.11
                                                      Urban
79
                1) $0 - $100
                               29.99
                                               1 Surburban
81
                1) $0 - $100
                               95.33
                                               1 Surburban
                                        0
                                                                 0
86
           2
                1) $0 - $100
                              82.59
                                        1
                                               0 Surburban
                                                                 0
87
           6 2) $100 - $200
                              165.77
                                        0
                                               1
                                                      Urban
                                                                 0
           3 2) $100 - $200
                              133.51
                                                      Urban
97
               1) $0 - $100
                              47.44
                                       0
                                               1
                                                     Urban
                                                                 0
           1
63890
           2 3) $200 - $350
                              229.79
                                              1
                                                      Urban
                                                                 Λ
63891
           4
                1) $0 - $100
                               65.23
                                               1
                                                                 0
                                                      Urban
63893
             3) $200 - $350
                              288.30
                                               1 Surburban
63901
           4 2) $100 - $200
                              158.91
                                               0 Surburban
                                                                 0
63902
           3 3) $200 - $350
                              309.39
                                               1
                                                   Urban
                                                                 0
63904
           1
             1) $0 - $100
                              29.99
                                               1 Surburban
63906
            4 3) $200 - $350
                              311.63
                                                     Urban
63910
           6 1) $0 - $100
                              29.99
                                        1
                                               0 Surburban
                                                                 0
63911
           5 4) $350 - $500
                              373.13
                                        Ω
                                               1
                                                   Urhan
                                                                 0
63915
           4 3) $200 - $350
                              300.90
                                        1
                                                0 Surburban
                                                                 0
            6 1) $0 - $100
63916
                              34.50
                                                   Urban
63918
                1) $0 - $100
                               29.99
                                               0 Surburban
           3
                                                                 0
63919
           3 2) $100 - $200
                              149.96
                                               0
                                                   Urban
                                                                 0
63924
           4 2) $100 - $200
                              101.40
                                               1
                                                      Urban
                                                                 0
63931
                1) $0 - $100
                               29.99
                                                0 Surburban
                                                                 0
63932
           1 4) $350 - $500
                              426.36
                                               1 Surburban
63935
           4 4) $350 - $500
                              353.47
                                                      Urban
                                                                 0
                                               1
63941
           2 2) $100 - $200
                              130.96
                                               0
                                                      Urban
                                                                 0
63949
           5
               1) $0 - $100
                              86.79
                                               0
                                                      Rural
63953
             2) $100 - $200
                              166.24
                                                      Urban
           2 1) $0 - $100
63954
                              93.97
                                               0
                                                      Urban
                                                                 0
63955
                1) $0 - $100
           1
                               29.99
                                               0 Surburban
                                                                 0
63961
           4 3) $200 - $350
                              337.36
                                               0
                                                   Urban
                                                                 0
           4 2) $100 - $200
                              170.03
63966
63969
                1) $0 - $100
                               67.78
                                               1 Surburban
                                                                 0
                                        0
                1) $0 - $100
63983
                               83.03
                                        0
                                               1
                                                   Urban
                                                                 0
63988
           6
                1) $0 - $100
                               32.98
                                               0 Surburban
                                                                 0
63990
                1) $0 - $100
                               80.02
            6
                                               1
                                                  Surburban
                                                                 0
           4 4) $350 - $500
63993
                              374.07
                                        0
                                               1 Surburban
63999
           1 4) $350 - $500
                             472.82
                                       0
                                               1 Surburban
                                                                 0
           channel
                        segment visit conversion
                                                  spend DM_category
4
              Web Womens E-Mail
                                 0
                                               0
                                                    0.0
            Phone Womens E-Mail
                                                0
                                                                  1
5
                                    1
                                                    0.0
```

13

Weh

Mens E-Mail

0

0.0

```
16
           Phone Mens E-Mail 0 0 0.0
22
            Weh
                 Mens E-Mail
                               1
                                        0
                                             0.0
                                                         2
24
            web
                   No E-Mail
                                         0
                                             0.0
                                                         6
27
            web
                  Mens E-Mail
29
                                         0
            web
                  No E-Mail
                               0
                                             0.0
                                                         6
                                        0 0.0
           Phone Womens E-Mail
30
                               0
                                                         1
32
            web
                 Mens E-Mail
                               0
                                        0.0
                                                         3
34
            Web Womens E-Mail
                               0
                                         0
                                             0.0
                                                         4
     Multichannel Womens E-Mail
                                        0.0
35
                               0
                                                         1
                                        0 0.0
0 0.0
                 Mens F-Mail
41
            Weh
                               1
                                                         2
43
           Phone
                   No E-Mail
                               0
                                                         6
44
           Web
                   No E-Mail
                               0
                                        0.0
46
            web
                   No E-Mail
                               0
                                         0
                                             0.0
                                                         6
                                        0 0.0
                   No E-Mail
50
            web
                               0
                                                         5
55
            Weh
                   No E-Mail
                               0
                                        0 0.0
0 0.0
                                                         6
59
           Phone Womens E-Mail
                               0
                                                         1
61
           Phone Womens E-Mail
65
          Phone Womens E-Mail
                                        0
                                             0.0
                                                         1
                               0
                                        0 0.0
70
            web
                 Mens E-Mail
                               0
                                                         2
72
           Phone
                  Mens E-Mail
                               0
                                        0.0
                                                         2
76
           Phone
                   No E-Mail
                               0
                                         0
                                             0.0
79
         Phone
                 Mens E-Mail
                                        0.0
                               0
                                                         3
                                        0 0.0
0 0.0
81
                  No F-Mail
            Weh
                               1
                                                         5
86
           Phone Womens E-Mail
                               0
                                                         4
87
           Web Womens E-Mail
                                        0 0.0
95
            web
                 Mens E-Mail
                               0
                                        0
                                             0.0
                                                         2
                             0
                                        0 0.0
97
           Phone Womens E-Mail
                                                         1
                                           0.0
63890
           Phone
                  Mens E-Mail
                                        0
                                      0 0.0
63891
           Phone Womens E-Mail
63893
           Phone Womens E-Mail
                                        0
                                             0.0
                               0
                                                         5
                                        0 0.0
63901
           web
                 No E-Mail
                               0
                                                         6
                             0
63902
           Phone Womens E-Mail
                                       0.0
63904
            Web Womens E-Mail
                                         0
                                             0.0
                                        0 0.0
63906 Multichannel
                 No E-Mail
                                        0 0.0
0 0.0
                 Mens E-Mail
63910
           Phone
                               0
                                                         2
63911
           Phone Womens E-Mail
                               0
                                                         1
63915
           Phone
                  No E-Mail
                               0
                                       0 0.0
63916
           Phone Womens E-Mail
                               0
                                         0
                                             0.0
                                        0 0.0
63918
                 No E-Mail
                               0
                                                         6
            web
                                        0 0.0
0 0.0
63919
            Web Womens E-Mail
                               0
                                                         4
63924
            web
                 No E-Mail
                               0
                                                         5
63931
            web
                   No E-Mail
63932 Multichannel
                 Mens E-Mail
                                        0
                                             0.0
                               1
                                        0 0.0
                 Mens E-Mail
63935 Multichannel
                               0
                                                         5
63941
           Phone
                 Mens E-Mail
                               0
                                        0.0
                                                         2
63949
           Phone
                   No E-Mail
                               0
                                         0
                                             0.0
                                       0 0.0
63953
           Phone
                   No E-Mail
                                       0
63954
                   No E-Mail
                                            0.0
           web
                                                         6
                               1
                                        0 0.0
63955
           Phone
                 Mens E-Mail
                               0
                                                         2
63961
           web
                 Mens E-Mail
                                        0.0
63966
            Web Womens E-Mail
                                        0
                                             0.0
                                        0 0.0
63969
            Web Womens E-Mail
                               0
                                                         1
63983
           Phone
                  No F-Mail
                               0
                                        0
                                             0.0
                                                         5
63988
            web
                  Mens E-Mail
                               0
                                         0
                                             0.0
                                                         2
63990
           Phone
                  No E-Mail
                                        0
                                             0.0
63993
           Phone Womens E-Mail
                                         0
                               0
                                             0.0
                                                         1
                             0
                                       0
63999
            web
                 Mens E-Mail
                                             0.0
[17551 rows x 13 columns]
```

```
# df can take in a list of parameters
print(df[['recency']].head(3)) # we will get back a dataframe
print(df.loc[:,['recency']].head(3)) # we will get back a dataframe
print(df.iloc[:, [0]].head(3)) # we will get back a dataframe.
```

```
recency
  10
0
    6
1
   7
2
 10
    6
1
  7
2
  10
0
    6
1
2
   7
```

6. 编码方法

```
print(df)
 vertebrates
0
       fish
       human
       bird
2
3
        dog
  vertebrates_bird vertebrates_dog vertebrates_fish vertebrates_human
               0
                                0
                                                                   0
1
                0
                                0
                                                 0
                                                                   1
2
                                0
                                                 0
                                                                   0
                1
3
                0
                                1
                                                 0
                                                                   0
```

```
\# for nominal features: option 1 -- fast and dirty coding method
# 对名义上的特征: 可选方法1: 不那么好但快速的编码方法
df = pd.DataFrame({'vertebrates':[
'Bird',
'Bird',
'Mammal',
'Amphibian',
'Reptile'.
'Mammal']})
df['vertebrates'] = df.vertebrates.astype("category").cat.codes
print("不那么好但很快的编码方法:\n",df)
# 可选方法2: 更精确的编码方法
# more accurate coding method
df = pd.get_dummies(df,columns=['vertebrates'])
print('With more accurate method:')
print(df)
```

```
不那么好但很快的编码方法:
  vertebrates
0
       1
1
         1
         3
         2
3
         0
4
5
         4
         3
With more accurate method:
 vertebrates_0 vertebrates_1 vertebrates_2 vertebrates_3 vertebrates_4
    0 1 0
0 1 0
0 0 0 0
0 0 0 1
1 0 0
                                      0
                                                          0
                                                          0
                                                          0
                                            0
3
                                                         0
4
                                             0
                                                         0
5
           0
                      0
                                  0
                                              0
                                                          1
```

扩展阅读

Pandas: http://pandas.pydata.org/pandas-docs/stable/cookbook.html

df = pd.get_dummies(df, columns=["vertebrates"])

数据处理技术: https://chrisalbon.com/#Python

处理缺失数据: http://pandas.pydata.org/pandas-docs/stable/missing data.html

Scikit模块家族: https://scikits.appspot.com/scikits

提取特征的技术:-关于词袋模型更多介绍 http://scikit-learn.org/stable/modules/feature_extraction.html#the-bag-of-words-representation

可视化 http://pandas.pydata.org/pandas-docs/stable/visualization.html