```
In [1]: import pandas as pd
       import numpy as np
       import matplotlib.pyplot as plt
In [2]: # pd.set_option('display.max_rows', None)
In [3]: tips = pd.read_csv('tips.csv')
In [4]: tips['tip_pct'] = tips['tip'] / tips['total_bill']
In [5]: tips
Out[5]:
            total_bill tip
                            sex smoker day
                                                          tip_pct
               16.99 1.01 Female
                                                      2 0.059447
                                    No
                                        Sun Dinner
             10.34 1.66
                                    No Sun Dinner
                                                      3 0.160542
         2
               21.01 3.50
                           Male
                                    No Sun Dinner
                                                      3 0.166587
         3
               23.68 3.31
                           Male
                                    No
                                         Sun Dinner
                                                      2 0.139780
         4
               24.59 3.61 Female
                                    No Sun Dinner
                                                      4 0.146808
               29.03 5.92
                                    No Sat Dinner
                                                      3 0.203927
       239
                           Male
       240
               27.18 2.00 Female
                                    Yes
                                         Sat Dinner
                                                      2 0.073584
       241
               22.67 2.00
                                         Sat Dinner
                                                      2 0.088222
                                    Yes
               17.82 1.75
                           Male
                                    No
                                         Sat Dinner
                                                      2 0.098204
       243
               18.78 3.00 Female
                                    No Thur Dinner
                                                      2 0.159744
       244 rows × 8 columns
In [6]: df = tips.groupby(['day','smoker'])[['size','tip','tip_pct','total_bill']].mean()
                        size
                                 tip tip_pct total_bill
        day smoker
         Fri
                No 2,250000 2,812500 0,151650 18,420000
                Yes 2.066667 2.714000 0.174783 16.813333
                No 2.555556 3.102889 0.158048 19.661778
         Sat
                Yes 2.476190 2.875476 0.147906 21.276667
                No 2.929825 3.167895 0.160113 20.506667
        Sun
                Yes 2.578947 3.516842 0.187250 24.120000
                No 2.488889 2.673778 0.160298 17.113111
                Yes 2.352941 3.030000 0.163863 19.190588
       suppose you wanted to compute a table of group means (the default pivot_table aggregation type)
       arranged by day and smoker on the rows:
In [7]: def top(df, n=5, column='tip_pct'):
           return df.sort_values(by=column)[-n:]
       top(tips, n=10)
            total_bill tip
Out[7]:
                            sex smoker day
                                                          tip_pct
         51
               10.29 2.60 Female
                                                      2 0.252672
                                    No Sun Dinner
       221
               13.42 3.48 Female Yes Fri
                                                     2 0.259314
                                             Lunch
         93
               16.32 4.30 Female
                                         Fri Dinner
                                                      2 0.263480
```

```
149
        7.51 2.00
                    Male
                             No Thur
                                        Lunch
                                                2 0.266312
109
       14.31 4.00 Female
                             Yes
                                   Sat Dinner
                                                2 0.279525
183
       23.17 6.50
                    Male
                             Yes Sun Dinner
                                                4 0.280535
232
       11.61 3.39
                                                2 0.291990
                    Male
                             No
                                   Sat Dinner
67
        3.07 1.00 Female
                                                1 0.325733
                             Yes
                                   Sat Dinner
178
        9.60 4.00 Female
                              Yes Sun Dinner
                                                2 0.416667
                                                2 0.710345
        7.25 5.15
                             Yes Sun Dinner
                    Male
```

```
In [8]: # tips.drop(['sex'], axis=1,inplace=True)
In [9]: tips.pivot_table(['total_bill', 'tip', 'size', 'tip_pct'],index=['day', 'smoker'])
```

```
tip_pct
                                                    total_bill
          day smoker
           Fri
                   No 2250000 2812500 0151650 18420000
                   Yes 2.066667 2.714000 0.174783 16.813333
                   No 2.555556 3.102889 0.158048 19.661778
                   Yes 2.476190 2.875476 0.147906 21.276667
                   No 2.929825 3.167895 0.160113 20.506667
          Sun
                   Yes 2.578947 3.516842 0.187250 24.120000
                   No 2.488889 2.673778 0.160298 17.113111
                   Yes 2.352941 3.030000 0.163863 19.190588
In [10]: tips.pivot_table(['total_bill', 'tip', 'size', 'tip_pct'],index=['day', 'smoker'],aggfunc='sum')
Out[10]:
                                     tip_pct total_bill
                                tip
          day
               smoker
                             11.25 0.606602
                              40.71 2.621746
                                               252.20
                       115 139.63 7.112145
                                               884 78
                        104
                            120.77 6.212055
                                               893.62
          Sun
                   Nο
                        167
                            180.57 9.126438
                                              1168.88
                             66.82 3.557756
                                               458.28
                       112 120.32 7.213414
                                               770.09
         Thur
                   No
                        40
                            51.51 2.785676
                                               326.24
In [11]: tips.pivot_table(['tip_pct', 'size'], index=['time', 'day'],columns='smoker')
Out[11]:
                                      size
                                                       tip_pct
                 smoker
                              No
                                       Yes
                                                No
                                                          Yes
           time
                     Fri 2.000000 2.222222 0.139622 0.165347
         Dinner
                     Sat 2.555556 2.476190 0.158048 0.147906
                         2.929825 2.578947 0.160113 0.187250
                         2.000000
                                      NaN 0.159744
          Lunch
                     Fri 3.000000 1.833333 0.187735 0.188937
                   Thur 2.500000 2.352941 0.160311 0.163863
```

We could augment this table to include partial totals by passing margins=True. This has the effect of adding All row and column labels, with corresponding values being the group statistics for all the data within a single tier:

```
In [12]: tips.pivot_table(['tip_pct', 'size'], index=['time', 'day'],columns='smoker', margins=True)
Out[12]:
                                                size
                                                                         tip pct
                                                 ΑII
                 smoker
                              No
                                        Yes
                                                                             ΑII
                     Fri 2.000000 2.222222 2.166667 0.139622 0.165347 0.158916
                         2.555556 2.476190 2.517241 0.158048 0.147906 0.153152
                         2.929825 2.578947 2.842105 0.160113 0.187250 0.166897
                         2.000000
                                      NaN 2.000000 0.159744
          Lunch
                     Fri 3.000000 1.833333 2.000000 0.187735 0.188937 0.188765
                   Thur 2.500000 2.352941 2.459016 0.160311 0.163863 0.161301
                          2.668874 2.408602 2.569672 0.159328 0.163196 0.160803
             ΑII
```

To use a different aggregation function, pass it to aggfunc. For example, 'count' or len will give you a cross-tabulation (count or frequency) of group sizes:

```
      Tim [13]:
      tips.pivot_table('tip_pct', index=['time', 'smoker'], columns='day', aggfunc=len, margins=True)

      Out[13]:
      day
      Fri
      Sat
      Sun
      Thur

      Dinner
      No
      3.0
      45.0
      57.0
      1.0
      106

      Yes
      9.0
      42.0
      19.0
      NaN
      70

      Lunch
      No
      1.0
      NaN
      NaN
      44.0
      45

      Yes
      6.0
      NaN
      NaN
      17.0
      23

      All
      19.0
      87.0
      76.0
      62.0
      244
```

If some combinations are empty (or otherwise NA), you may wish to pass a fill_value:

```
In [14]: tips.pivot_table('tip_pct', index=['time', 'size', 'smoker'],columns='day', aggfunc='mean', fill_value=0)
Out[14]:
                                  Fri
                         dav
                                           Sat
                                                   Sun
                                                           Thur
           time size smoker
                         No 0.000000 0.137931 0.000000 0.000000
         Dinner
                         Yes 0.000000 0.325733 0.000000 0.000000
                         No 0.139622 0.162705 0.168859 0.159744
                         Yes 0.171297 0.148668 0.207893 0.000000
                         No 0.000000 0.154661 0.152663 0.000000
                         Yes 0.000000 0.144995 0.152660 0.000000
                         No 0.000000 0.150096 0.148143 0.000000
                         Yes 0.117750 0.124515 0.193370 0.000000
                         No 0.000000 0.000000 0.206928 0.000000
                         Yes 0.000000 0.106572 0.065660 0.000000
                         No 0.000000 0.000000 0.103799 0.000000
                         No 0.000000 0.000000 0.000000 0.181728
          Lunch
                         Yes 0.223776 0.000000 0.000000 0.000000
                         No 0.000000 0.000000 0.000000 0.166005
                         Yes 0.181969 0.000000 0.000000 0.158843
                         No 0.187735 0.000000 0.000000 0.084246
                         Yes 0.000000 0.000000 0.000000 0.204952
                         No 0.000000 0.000000 0.000000 0.138919
                         Ves 0.000000 0.000000 0.000000 0.155410
                         No 0.000000 0.000000 0.000000 0.121389
                         No 0.000000 0.000000 0.000000 0.173706
```

Cross-Tabulations: Crosstab

A cross-tabulation (or crosstab for short) is a special case of a pivot table that computes group frequencies. Here is an example:

```
In [15]: pd.crosstab([tips.time, tips.day], tips.smoker, margins=True)
              smoker No Yes All
         time
        Dinner
                 Fri
                     3 9 12
                 Sat 45 42 87
                     57 19 76
                Sun
                Thur
                     1 0 1
                 Fri
        Lunch
                      1
                          6
                Thur 44 17 61
          ΑII
                   151 93 244
In [ ]:
```