Lect 20 – Pivot Tables

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PDA Ch.8: tips.csv

Dataset about tipping on meals:

```
total_bill, tip, sex, smoker, day, time, size 16.99, 1.01, Female, No, Sun, Dinner, 2 10.34, 1.66, Male, No, Sun, Dinner, 3 21.01, 3.5, Male, No, Sun, Dinner, 3 23.68, 3.31, Male, No, Sun, Dinner, 2 24.59, 3.61, Female, No, Sun, Dinner, 4 25.29, 4.71, Male, No, Sun, Dinner, 4 8.77, 2.0, Male, No, Sun, Dinner, 2
```

You can download this dataset from:

https://raw.githubusercontent.com/pydata/pydatabook/master/ch08/tips.csv

Pivot Tables

- Pivot tables are a data summarization tool
- Common in spreadsheets and data analysis software
- Aggregates data based on one or more keys
- Puts results into a rectangle
 - Some of the grouped keys on the rows, some on cols
- DataFrames have a .pivot_table() method
 - Under the hood, it uses groupby, reshape, and hierarchical indexing

tips.csv data

First, load the tips.csv data:

```
In [17]: from pandas import Series, DataFrame
   ...: import pandas as pd
    ...: from numpy.random import randn
    ...: import numpy as np
   . . . :
In [18]: tips = pd.read csv('tips.csv')
In [19]: print tips[:10]
  total bill tip
                      sex smoker
                                 day time
                                             size
       16.99 1.01 Female
0
                             No
                                 Sun Dinner
       10.34 1.66 Male
1
                             No Sun Dinner
       21.01 3.50 Male
                             No Sun
                                      Dinner
       23.68 3.31
                    Male
                                 Sun
                                      Dinner
                             No
       24.59 3.61 Female
4
                             No
                                Sun Dinner
                                                4
       25.29 4.71
                    Male
                             No Sun
                                      Dinner
       8.77 2.00 Male
                             No Sun
                                     Dinner
       26.88 3.12 Male
                             No Sun Dinner
                                                4
       15.04 1.96
                   Male
                                 Sun
                                      Dinner
                             No
       14.78 3.23
                    Male
                             No
                                 Sun
                                      Dinner
```

Add a column for tip percentage

tip_pct = tip / total_bill

```
In [20]: tips['tip pct'] = tips['tip'] / tips['total bill']
In [21]: print tips[:10]
  total bill tip
                                  day time size
                      sex smoker
                                                    tip pct
       16.99 1.01
                                       Dinner
                                                    0.059447
0
                   Female
                              No
                                  Sun
1
       10.34 1.66
                     Male
                                       Dinner
                                                    0.160542
                                  Sun
                              No
2
       21.01 3.50
                                       Dinner
                                                    0.166587
                   Male
                              No
                                  Sun
3
       23.68 3.31
                     Male
                                       Dinner
                                                    0.139780
                                  Sun
                              No
4
       24.59 3.61
                                       Dinner
                   Female
                                  Sun
                                                    0.146808
                              No
5
       25.29 4.71
                     Male
                                  Sun
                                       Dinner
                                                    0.186240
                              No
6
                                       Dinner
       8.77 2.00
                                                  2 0.228050
                     Male
                                  Sun
                              No
7
                                       Dinner
       26.88 3.12
                     Male
                                  Sun
                                                    0.116071
                              No
       15.04 1.96
                                       Dinner
8
                     Male
                                                    0.130319
                              No
                                  Sun
                                       Dinner
9
       14.78 3.23
                     Male
                                  Sun
                                                    0.218539
                              No
```

Remember groupby

We could use groupby to analyze the data

```
In [22]: g = tips.groupby(['sex', 'smoker'])
In [23]: qpct = g['tip pct']
                                                   as index=False prevents
In [24]: type(gpct)
                                                   an index from being
Out [24]: pandas.core.groupby.SeriesGroupBy
                                                   created based on the
In [25]: print gpct.mean()
                                                   group key combinations;
       smoker
sex
                                                   a simple integer index is
Female No
            0.156921
                                                   created instead
       Yes 0.182150
Male
       No
               0.160669
                0.152771
       Yes
Name: tip pct, dtype: float64
In [26]: print tips.groupby(['sex','smoker'], as index=False).mean()
     sex smoker total bill tip
                                          size tip pct
                18.105185 2.773519 2.592593 0.156921
0 Female
             No
1 Female Yes 17.977879 2.931515 2.242424 0.182150
    Male No 19.791237 3.113402 2.711340 0.160669
   Male Yes 22.284500 3.051167 2.500000 0.152771
```

.pivot_table()

- DataFrames have a pivot_table() method
- Default aggregation is group mean (average)
- Can specify groups for rows and/or cols

2.500000

Yes

```
In [28]: print tips[:3]
  total bill tip
                      sex smoker
                                 day
                                     time
                                             size
                                                  tip pct
       16.99 1.01
                                                  0.059447
                  Female
                                 Sun
                                     Dinner
0
                             No
       10.34 1.66 Male
                                     Dinner
                                                  0.160542
1
                             No
                                 Sun
       21.01 3.50
                  Male
                                     Dinner
                                                  0.166587
                                 Sun
                             No
In [29]: print tips.pivot table(rows=['sex','smoker'])
                 size
                           tip
                                 tip pct total bill
      smoker
sex
Female No
             2.592593
                      2.773519 0.156921
                                          18.105185
                       2.931515 0.182150
             2.242424
                                          17.977879
      Yes
Male
      No
           2.711340 3.113402 0.160669
                                          19.791237
```

3.051167 0.152771

22.284500

.pivot_table()

- DataFrames have a pivot_table() method
- Default aggregation is group mean (average)
- Can specify groups for rows and/or cols

```
In [28]: print tips[:3]
   total bill
                tip
                         sex smoker
                                     day
                                             time
                                                   size
                                                          tip pct
0
                                           Dinner
        16.99
               1.01
                     Female
                                 No
                                      Sun
                                                         0.059447
        10.34
               1.66
                                           Dinner
                                                         0.160542
1
                       Male
                                      Sun
                                 No
        21.01 3.50
                                           Dinner
                                                         0.166587
                       Male
                                 No
                                     Sun
In [29]: print tips.pivot table(rows=['sex','smoker'])
                    size
                               tip
                                     tip pct
                                               total bill
       smoker
sex
Female No
               2.592593
                          2.773519
                                    0.156921
                                                18.105185
                                    0.182150
               2.242424
                          2.931515
                                                17.977879
       Yes
Male
       No
               2.711340
                          3.113402 0.160669
                                                19.791237
               2.500000
                                    0.152771
                          3.051167
                                                22.284500
       Yes
```

We could have done this just with groupby – next, pivot table magic!

Groups on rows and cols

- Aggregate stats on tip_pct and size
- Group by day & sex (rows), and smoker (cols)

```
In [31]: print tips[:3]
  total bill tip
                      sex smoker
                                day time
                                             size tip pct
       16.99 1.01 Female
0
                                Sun Dinner
                                                2 0.059447
                             No
       10.34 1.66 Male
                                Sun
                                     Dinner
                                             3 0.160542
                             No
       21.01 3.50 Male
                                     Dinner
                                               3 0.166587
                             No Sun
In [32]: print tips.pivot table(['tip pct', 'size'], rows=['sex', 'day'],
cols='smoker')
             tip pct
                                  size
smoker
                 No
                          Yes
                                    No
                                            Yes
sex
      dav
            0.165296 0.209129
Female Fri
                              2.500000
                                       2.000000
           0.147993 0.163817
                              2.307692
                                      2.200000
      Sat
           0.165710 0.237075
                              3.071429 2.500000
      Sun
           0.155971 0.163073
                              2.480000 2.428571
      Thur
      Fri
           0.138005 0.144730
                              2.000000 2.125000
Male
           0.162132 0.139067
                              2.656250 2.629630
      Sat
           0.158291 0.173964
                              2.883721 2.600000
      Sun
            0.165706 0.164417
                              2.500000
                                       2.300000
      Thur
```

Margins

Include partial total using margins=True

0.163196

All

0.159328

```
In [33]: print tips.pivot table(['tip pct', 'size'], rows=['sex', 'day'],
cols='smoker', margins=True)
                                              size
             tip pct
smoker
                  No
                           Yes
                                     All
                                               No
                                                                  All
                                                        Yes
sex
      day
Female Fri
                     0.209129
                                0.199388
                                         2.500000
                                                   2.000000
            0.165296
                                                             2.111111
       Sat
            0.147993 0.163817
                                0.156470 2.307692
                                                   2.200000
                                                             2.250000
            0.165710 0.237075
                                0.181569
                                         3.071429
                                                   2.500000
                                                             2.944444
       Sun
       Thur
            0.155971
                     0.163073
                                0.157525
                                         2.480000
                                                   2.428571
                                                             2.468750
            0.138005 0.144730
                                                             2.100000
Male
      Fri
                                0.143385
                                         2.000000
                                                   2.125000
       Sat
            0.162132 0.139067
                                0.151577 2.656250
                                                   2.629630
                                                             2.644068
                                0.162344 2.883721
                                                   2.600000
                                                             2.810345
            0.158291 0.173964
       Sun
       Thur
            0.165706 0.164417
                                0.165276 2.500000
                                                   2.300000
                                                             2.433333
```

0.160803

2.668874

2.408602

2.569672

aggfunc

Use a different aggregation function

```
In [35]: print tips[:3]
  total bill tip sex smoker day time size tip pct
      16.99 1.01 Female
                            Sun Dinner
                                        2 0.059447
0
                        No
     10.34 1.66 Male No
                            Sun Dinner 3 0.160542
1
     21.01 3.50 Male No Sun Dinner 3 0.166587
In [36]: print tips.pivot table('tip pct', rows=['sex', 'smoker'],
cols='day', aggfunc=len, margins=True)
dav
           Fri Sat Sun Thur All
sex smoker
                         25 54
Female No
             2 13 14
     Yes 7 15 4 7 33
         2 32 43 20 97
Male No
            8 27 15 10 60
     Yes
            19 87
                   76 62 244
All
```

Pivot Table Exercise (not to turn in)

 Create a DataFrame using the tips.csv dataset that looks like the one below:

sex		Female	Male	All
time	smoker			
Dinner	No	0.158347	0.166093	0.163919
	Yes	0.194904	0.156298	0.170480
Lunch	No	0.161637	0.172176	0.166455
	Yes	0.180075	0.159816	0.168346
All		0.173009	0.163311	0.167009