

lec10

September 20, 2021

```
[1]: from datascience import *  
import numpy as np  
  
%matplotlib inline  
import matplotlib.pyplot as plots  
plots.style.use('fivethirtyeight')
```

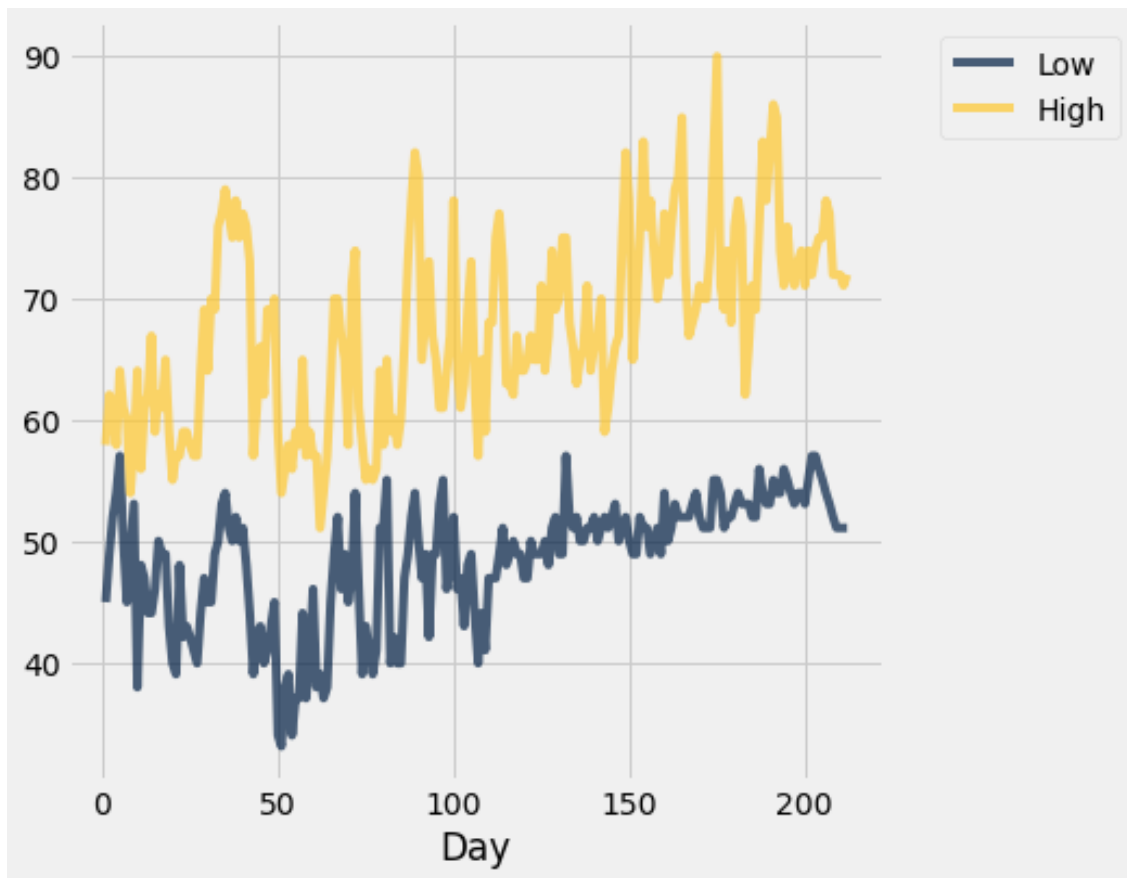
0.1 Lecture 10

0.2 Apply with Multiple Columns

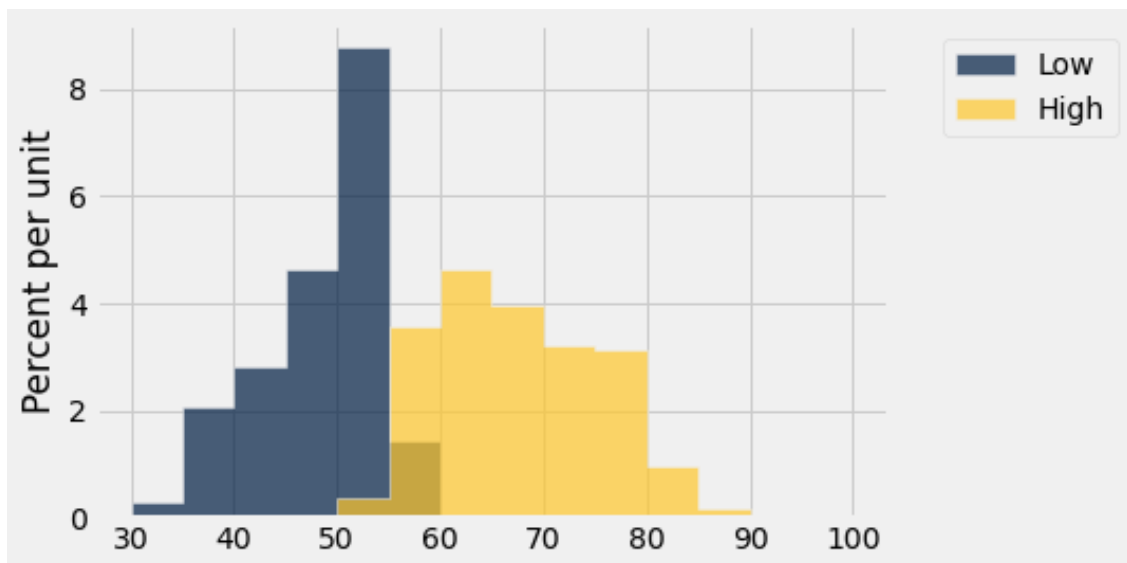
```
[2]: temperatures = Table.read_table('temperatures.csv')  
temperatures
```

```
[2]: Day | Low | High  
1 | 44.96 | 57.92  
2 | 48.92 | 62.06  
3 | 51.98 | 60.98  
4 | 53.96 | 57.92  
5 | 57.02 | 64.04  
6 | 50 | 60.98  
7 | 44.96 | 60.08  
8 | 48.92 | 53.96  
9 | 53.06 | 57.92  
10 | 37.94 | 64.04  
... (202 rows omitted)
```

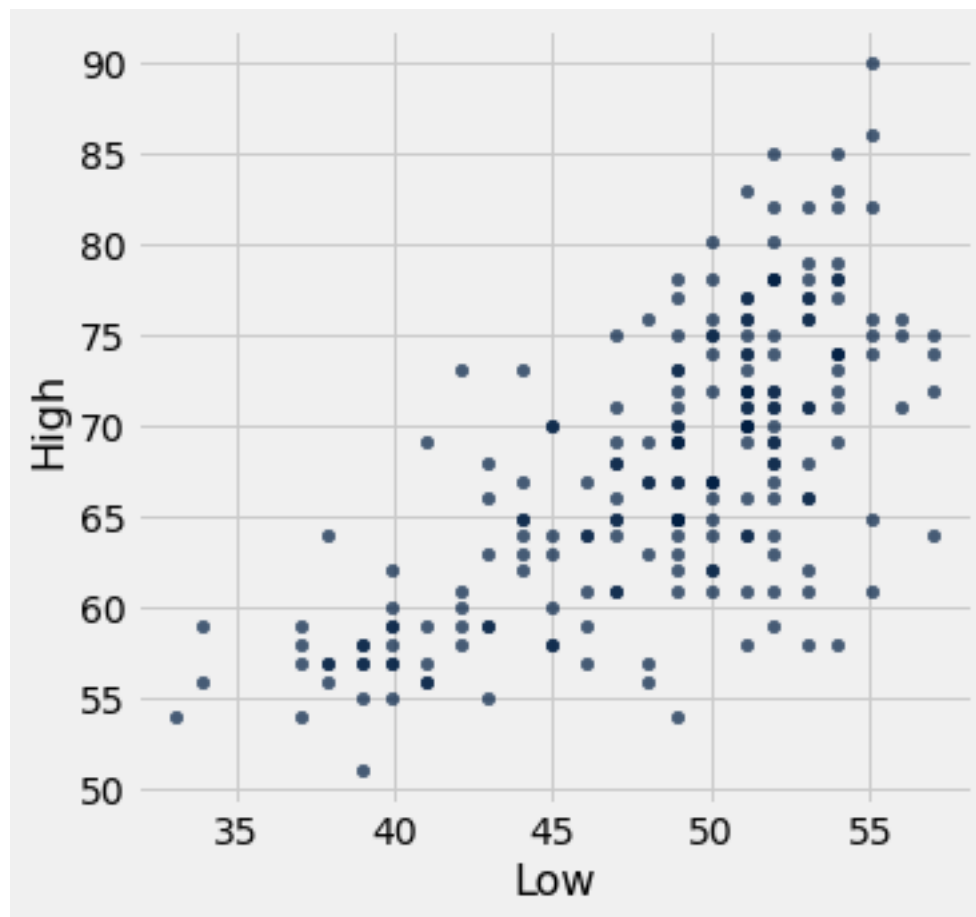
```
[3]: temperatures.plot('Day')
```



```
[4]: temperatures.select('Low', 'High').hist(bins=np.arange(30, 105, 5))
```



```
[5]: temperatures.scatter('Low', 'High')
```



```
[6]: # Difference between high temp and low temp
```

```
def difference(x, y):  
    return x-y
```

```
difference(65, 54)
```

```
[6]: 11
```

```
[7]: daily_spread = temperatures.apply(difference, 'High', 'Low')  
temperatures = temperatures.with_column('Spread', daily_spread)  
temperatures
```

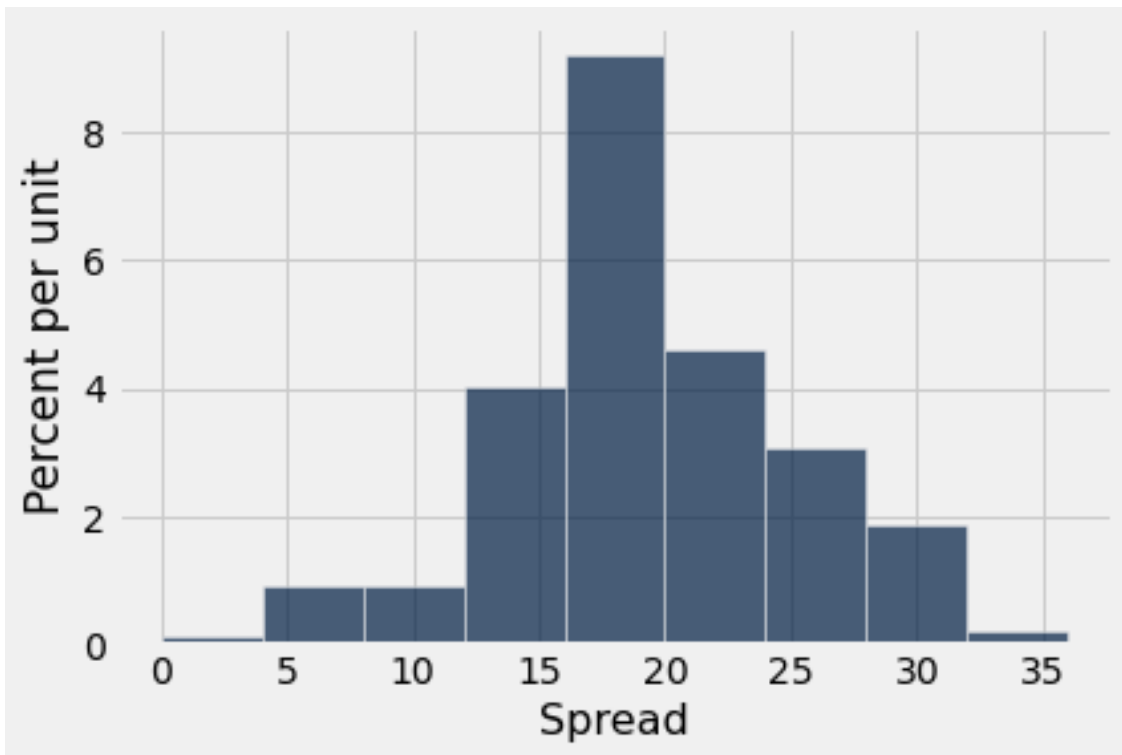
```
[7]: Day | Low | High | Spread  
1 | 44.96 | 57.92 | 12.96  
2 | 48.92 | 62.06 | 13.14  
3 | 51.98 | 60.98 | 9
```

```

4    | 53.96 | 57.92 | 3.96
5    | 57.02 | 64.04 | 7.02
6    | 50     | 60.98 | 10.98
7    | 44.96 | 60.08 | 15.12
8    | 48.92 | 53.96 | 5.04
9    | 53.06 | 57.92 | 4.86
10   | 37.94 | 64.04 | 26.1
... (202 rows omitted)

```

```
[8]: temperatures.hist('Spread', bins=np.arange(0, 40, 4))
```



```
[9]: temperatures.where('Spread', are.above(20)).num_rows / temperatures.num_rows
```

```
[9]: 0.3915094339622642
```

0.3 Function with Optional Arguments

```
[10]: def percents(s, places):
      return np.round(s/sum(s) * 100, places)
```

```
[11]: x = make_array(2, 5, 16)
      percents(x, 4)
```

```
[11]: array([ 8.6957, 21.7391, 69.5652])
```

```
[12]: def percents(s, places=2):  
       return np.round(s/sum(s) * 100, places)
```

```
[13]: percents(x)
```

```
[13]: array([ 8.7 , 21.74, 69.57])
```

0.4 Grouping by Category

```
[14]: all_cones = Table.read_table('cones.csv')  
all_cones
```

```
[14]: Flavor      | Color      | Price  
strawberry | pink       | 3.55  
chocolate  | light brown | 4.75  
chocolate  | dark brown | 5.25  
strawberry | pink       | 5.25  
chocolate  | dark brown | 5.25  
bubblegum  | pink       | 4.75
```

```
[15]: cones = all_cones.drop('Color').exclude(5)  
cones
```

```
[15]: Flavor      | Price  
strawberry | 3.55  
chocolate  | 4.75  
chocolate  | 5.25  
strawberry | 5.25  
chocolate  | 5.25
```

```
[16]: cones.group('Flavor')
```

```
[16]: Flavor      | count  
chocolate  | 3  
strawberry  | 2
```

```
[17]: cones.group('Flavor', min)
```

```
[17]: Flavor      | Price min  
chocolate  | 4.75  
strawberry  | 3.55
```

```
[18]: cones.group('Flavor', list)
```

```
C:\Users\schoend\Anaconda3\lib\site-packages\datascience\tables.py:920:
VisibleDeprecationWarning: Creating an ndarray from ragged nested sequences
(which is a list-or-tuple of lists-or-tuples-or ndarrays with different lengths
or shapes) is deprecated. If you meant to do this, you must specify
'dtype=object' when creating the ndarray
    values = np.array(tuple(values))
```

```
[18]: Flavor      | Price list
      chocolate | [4.75, 5.25, 5.25]
      strawberry | [3.55, 5.25]
```

```
[19]: cones.group('Flavor', np.average)
```

```
[19]: Flavor      | Price average
      chocolate | 5.08333
      strawberry | 4.4
```

```
[20]: cones.group('Flavor', min)
```

```
[20]: Flavor      | Price min
      chocolate | 4.75
      strawberry | 3.55
```

```
[21]: min(cones.where('Flavor', 'chocolate').column('Price'))
```

```
[21]: 4.75
```

```
[22]: def spread(arr):
      return max(arr) - min(arr)

      spread(make_array(7, 10, 2))
```

```
[22]: 8
```

```
[23]: cones.group('Flavor', spread)
```

```
[23]: Flavor      | Price spread
      chocolate | 0.5
      strawberry | 1.7
```

```
[24]: cones
```

```
[24]: Flavor      | Price
      strawberry | 3.55
      chocolate | 4.75
      chocolate | 5.25
      strawberry | 5.25
      chocolate | 5.25
```

```
[25]: all_cones
```

```
[25]: Flavor      | Color      | Price
strawberry | pink       | 3.55
chocolate  | light brown | 4.75
chocolate  | dark brown | 5.25
strawberry  | pink       | 5.25
chocolate  | dark brown | 5.25
bubblegum   | pink       | 4.75
```

```
[26]: all_cones.group(['Flavor', 'Color'])
```

```
[26]: Flavor      | Color      | count
bubblegum | pink       | 1
chocolate | dark brown | 2
chocolate | light brown | 1
strawberry | pink       | 2
```

```
[27]: all_cones.group(['Flavor', 'Color'], np.average)
```

```
[27]: Flavor      | Color      | Price average
bubblegum | pink       | 4.75
chocolate | dark brown | 5.25
chocolate | light brown | 4.75
strawberry | pink       | 4.4
```

0.5 Examples

```
[28]: nba = Table.read_table('nba_salaries.csv').relabelled(3, 'SALARY')
nba
```

```
[28]: PLAYER          | POSITION | TEAM          | SALARY
Paul Millsap       | PF      | Atlanta Hawks | 18.6717
Al Horford          | C       | Atlanta Hawks | 12
Tiago Splitter     | C       | Atlanta Hawks | 9.75625
Jeff Teague        | PG      | Atlanta Hawks | 8
Kyle Korver        | SG      | Atlanta Hawks | 5.74648
Thabo Sefolosha    | SF      | Atlanta Hawks | 4
Mike Scott         | PF      | Atlanta Hawks | 3.33333
Kent Bazemore      | SF      | Atlanta Hawks | 2
Dennis Schroder    | PG      | Atlanta Hawks | 1.7634
Tim Hardaway Jr.   | SG      | Atlanta Hawks | 1.30452
... (407 rows omitted)
```

```
[29]: # total salary paid by each team, highest first
```

```
nba.select('TEAM', 'SALARY').group('TEAM', sum).sort('SALARY sum',
↳descending=True)
```

```
[29]: TEAM | SALARY sum
Cleveland Cavaliers | 102.312
Oklahoma City Thunder | 96.8322
Golden State Warriors | 94.0851
Memphis Grizzlies | 93.7964
Washington Wizards | 90.0475
Houston Rockets | 85.2858
San Antonio Spurs | 84.6521
Charlotte Hornets | 84.1024
Miami Heat | 81.5287
New Orleans Pelicans | 80.5146
... (20 rows omitted)
```

```
[30]: nba.group('TEAM', sum)
```

```
[30]: TEAM | PLAYER sum | POSITION sum | SALARY sum
Atlanta Hawks | | | 69.5731
Boston Celtics | | | 50.2855
Brooklyn Nets | | | 57.307
Charlotte Hornets | | | 84.1024
Chicago Bulls | | | 78.8209
Cleveland Cavaliers | | | 102.312
Dallas Mavericks | | | 65.7626
Denver Nuggets | | | 62.4294
Detroit Pistons | | | 42.2118
Golden State Warriors | | | 94.0851
... (20 rows omitted)
```

```
[31]: # average salary paid for each position
```

```
nba.select('POSITION', 'SALARY').group('POSITION', np.average)
```

```
[31]: POSITION | SALARY average
C | 6.08291
PF | 4.95134
PG | 5.16549
SF | 5.53267
SG | 3.9882
```

```
[32]: # for each team, average salary paid for each position
```

```
nba.drop('PLAYER').group(['TEAM', 'POSITION'], np.average)
```



```
[32]: TEAM          | POSITION | SALARY average
Atlanta Hawks | C       | 7.58542
Atlanta Hawks | PF      | 11.0025
Atlanta Hawks | PG      | 4.8817
Atlanta Hawks | SF      | 3
Atlanta Hawks | SG      | 1.80969
Boston Celtics | C       | 2.45046
Boston Celtics | PF      | 3.08548
Boston Celtics | PG      | 4.97465
Boston Celtics | SF      | 4.41716
Boston Celtics | SG      | 2.00755
... (137 rows omitted)
```

0.6 Pivot Tables

```
[33]: all_cones
```

```
[33]: Flavor      | Color      | Price
strawberry | pink       | 3.55
chocolate  | light brown | 4.75
chocolate  | dark brown | 5.25
strawberry  | pink       | 5.25
chocolate  | dark brown | 5.25
bubblegum  | pink       | 4.75
```

```
[34]: all_cones.groupby(['Flavor', 'Color'])
```

```
[34]: Flavor      | Color      | count
bubblegum | pink       | 1
chocolate | dark brown | 2
chocolate | light brown | 1
strawberry | pink       | 2
```

```
[35]: all_cones.pivot('Flavor', 'Color')
```

```
[35]: Color      | bubblegum | chocolate | strawberry
dark brown | 0         | 2         | 0
light brown | 0         | 1         | 0
pink       | 1         | 0         | 2
```

```
[36]: all_cones.pivot('Flavor', 'Color', values='Price', collect=np.average)
```

```
[36]: Color      | bubblegum | chocolate | strawberry
dark brown | 0         | 5.25      | 0
light brown | 0         | 4.75      | 0
pink       | 4.75      | 0         | 4.4
```

0.7 Examples

```
[37]: survey = Table.read_table('welcome_survey.csv')
```

```
[38]: survey.show(3)
```

<IPython.core.display.HTML object>

```
[39]: survey.pivot('Pant leg order', 'Handedness')
```

```
[39]: Handedness | I don't know | Left leg in first | Right leg in first
Ambidextrous | 4 | 2 | 8
Left-handed | 15 | 46 | 62
Right-handed | 181 | 335 | 604
```

```
[40]: nba
```

```
[40]: PLAYER | POSITION | TEAM | SALARY
Paul Millsap | PF | Atlanta Hawks | 18.6717
Al Horford | C | Atlanta Hawks | 12
Tiago Splitter | C | Atlanta Hawks | 9.75625
Jeff Teague | PG | Atlanta Hawks | 8
Kyle Korver | SG | Atlanta Hawks | 5.74648
Thabo Sefolosha | SF | Atlanta Hawks | 4
Mike Scott | PF | Atlanta Hawks | 3.33333
Kent Bazemore | SF | Atlanta Hawks | 2
Dennis Schroder | PG | Atlanta Hawks | 1.7634
Tim Hardaway Jr. | SG | Atlanta Hawks | 1.30452
... (407 rows omitted)
```

```
[41]: # for each team, average salary paid for each position
```

```
nba.pivot('POSITION', 'TEAM', values = 'SALARY', collect = np.average)
```

```
[41]: TEAM | C | PF | PG | SF | SG
Atlanta Hawks | 7.58542 | 11.0025 | 4.8817 | 3 | 1.80969
Boston Celtics | 2.45046 | 3.08548 | 4.97465 | 4.41716 | 2.00755
Brooklyn Nets | 1.3629 | 4.45251 | 3.9 | 13.0403 | 1.74118
Charlotte Hornets | 6.77224 | 4.68577 | 4.4853 | 3.76642 | 4.04238
Chicago Bulls | 10.4244 | 3.46744 | 11.1715 | 1.95816 | 6.19447
Cleveland Cavaliers | 7.75234 | 19.689 | 6.55159 | 22.9705 | 8.98876
Dallas Mavericks | 3.23548 | 11.9135 | 4.41818 | 15.3615 | 1.21517
Denver Nuggets | 2.6163 | 7.02498 | 3.72362 | 7.19577 | 0.841949
Detroit Pistons | 4.0907 | 0 | 13.913 | 1.71622 | 4.58088
Golden State Warriors | 6.54125 | 7.18637 | 8.45726 | 4.49669 | 9.0005
... (20 rows omitted)
```

[42]: *# CHALLENGE QUESTION: for each team,
amount paid to "starter" (player earning the most) in each position*

[]: