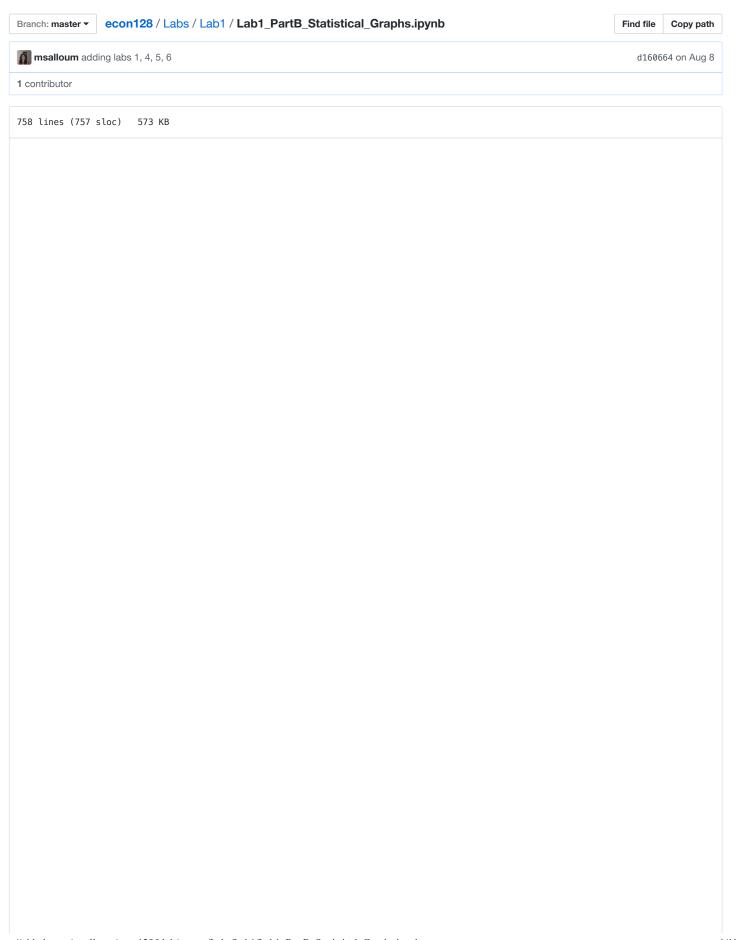
## msalloum / econ128



# A Gallery of Statistical Graphs in Matplotlib

Inspiration for these examples was taken from http://nbviewer.ipython.org/5357268 (http://nbviewer.ipython.org/5357268)

```
examples
                                                                                                          defaults
(http://nbviewer.ipython.org/urls/raw.github.com/cs109/content/master/lec 03 statistical graphs mpl default.ipynb)
 In [1]: #brewer2mpl makes it easier to use color tables from colorbrewer2.org in matplotlib
         !pip install brewer2mpl
         Requirement already satisfied (use --upgrade to upgrade): brewer2mpl in /Users/beaumont/anaconda/l
         ib/python2.7/site-packages
         Cleaning up...
 In [2]: %matplotlib inline
          from urllib import urlopen
          import brewer2mpl
          import pandas as pd
          import numpy as np
          import matplotlib.pyplot as plt
 In [3]: # Set up some better defaults for matplotlib
         from matplotlib import rcParams
          #colorbrewer2 Dark2 qualitative color table
         dark2_colors = brewer2mpl.get_map('Dark2', 'Qualitative', 7).mpl_colors
         rcParams['figure.figsize'] = (10, 6)
         rcParams['figure.dpi'] = 150
          rcParams['axes.color cycle'] = dark2 colors
         rcParams['lines.linewidth'] = 2
         rcParams['axes.facecolor'] = 'white'
          rcParams['font.size'] = 14
          rcParams['patch.edgecolor'] = 'white'
          rcParams['patch.facecolor'] = dark2_colors[0]
         rcParams['font.family'] = 'StixGeneral'
          def remove_border(axes=None, top=False, right=False, left=True, bottom=True):
              Minimize chartjunk by stripping out unnecesasry plot borders and axis ticks
              The top/right/left/bottom keywords toggle whether the corresponding plot border is drawn
              ax = axes or plt.gca()
              ax.spines['top'].set_visible(top)
              ax.spines['right'].set_visible(right)
              ax.spines['left'].set visible(left)
              ax.spines['bottom'].set_visible(bottom)
              #turn off all ticks
              ax.yaxis.set ticks position('none')
              ax.xaxis.set_ticks_position('none')
              #now re-enable visibles
              if top:
                  ax.xaxis.tick_top()
              if bottom:
                  ax.xaxis.tick bottom()
              if left:
                  ax.yaxis.tick left()
              if right:
```

#### **Example Data**

```
In [4]: file = urlopen('https://raw.githubusercontent.com/vincentarelbundock/Rdatasets/master/csv/ggplot2/
diamonds.csv')
diamonds = pd.read_csv(file)

file = urlopen('http://www.columbia.edu/~cjdl1/charles_dimaggio/DIRE/resources/R/titanic.csv')
titanic = pd.read_csv(file)
```

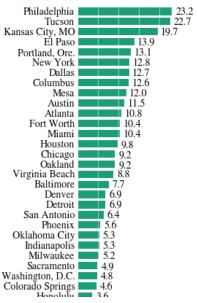
ax.yaxis.tick\_right()

```
In [5]: change = [23.2, 22.7, 19.7, 13.9, 13.1, 12.8, 12.7,
                  12.6, 12.0, 11.5, 10.8, 10.4, 10.4, 9.8, 9.2,
                  9.2, 8.8, 7.7, 6.9, 6.9, 6.4, 5.6, 5.3, 5.3, 5.2, 4.9,
                  4.8, 4.6, 3.6, 3.1, 0.7, -.3, -.7, -1.2, -1.5, -1.7,
                  -1.7, -1.8, -2, -2.3, -2.4, -3.6, -3.7,
                  -4.9, -6.5, -6.6, -11.6, -14.8, -17.6, -23.1]
         city = ['Philadelphia', 'Tucson', 'Kansas City, MO',
                  'El Paso', 'Portland, Ore.', 'New York', 'Dallas',
                  'Columbus', 'Mesa', 'Austin', 'Atlanta', 'Fort Worth',
                  'Miami', 'Houston', 'Chicago', 'Oakland', 'Virginia Beach',
                  'Baltimore', 'Denver', 'Detroit', 'San Antonio', 'Phoenix',
                  'Oklahoma City', 'Indianapolis', 'Milwaukee', 'Sacramento',
                  'Washington, D.C.', 'Colorado Springs', 'Honolulu', 'Nashville',
                  'Jacksonville', 'Louisville', 'Seattle', 'Memphis', 'Fresno', 'Boston', 'Mineappolis',
                  'San Jose', 'Tulsa', 'Charlotte', 'San Diego', 'Los Angeles',
                  'Long Beach', 'Cleveland', 'San Francisco', 'Albuquerque', 'Arlington, TX', 'Omaha', 'Wichita', 'Las Vegas']
         grad = pd.DataFrame({'change' : change, 'city': city})
```

#### **Bar Chart**

```
In [6]: plt.figure(figsize=(3, 8))
        change = grad.change[grad.change > 0]
        city = grad.city[grad.change > 0]
        pos = np.arange(len(change))
         plt.title('1995-2005 Change in HS graduation rate')
        plt.barh(pos, change)
         #add the numbers to the side of each bar
         for p, c, ch in zip(pos, city, change):
            plt.annotate(str(ch), xy=(ch + 1, p + .5), va='center')
         #cutomize ticks
         ticks = plt.yticks(pos + .5, city)
         xt = plt.xticks()[0]
        plt.xticks(xt, [' '] * len(xt))
         #minimize chartjunk
         remove_border(left=False, bottom=False)
        plt.grid(axis = 'x', color ='white', linestyle='-')
         #set plot limits
         plt.ylim(pos.max() + 1, pos.min() - 1)
        plt.xlim(0, 30)
Out[6]: (0, 30)
```

1995-2005 Change in HS graduation rate



```
Nashville 3.1
             Jacksonville | 0.7
In [7]: change = grad.change[grad.change < 0].values</pre>
        city = grad.city[grad.change < 0].values</pre>
         pos = np.arange(len(change))
        red = (0.78, 0.22, 0.18) # RGB triplet
        plt.figure(figsize=(3, 6), dpi=200)
        plt.barh(pos, change, color=red)
        plt.yticks(pos + .5, city)
         #add the numbers to the side of each bar
         for p, c, ch in zip(pos, city, change):
            plt.annotate(str(ch), xy=(ch - 1, p + .5), va='center', ha='right')
         #cutomize ticks
        plt.gca().yaxis.tick_right()
        ticks = plt.yticks(pos + .5, city)
         xt = plt.xticks()[0]
        plt.xticks(xt, [' '] * len(xt))
         #Remove chartjunk
         remove_border(left=False, bottom=False)
        plt.grid(axis = 'x', color ='white', linestyle='-')
        plt.ylim(pos.max() + 1, pos.min()- .5)
        plt.xlim(-30, 0)
        plt.title('1995-2005 Change in HS graduation rate')
```

#### Out[7]: <matplotlib.text.Text at 0x10b3b9290>

#### 1995-2005 Change in HS graduation rate

```
-0.7 Seattle
                -1.2 Memphis
               -1.5 Fresno
               -1.7 Boston
               -1.7 ■ Mineappolis
               -1.8 San Jose
-2.0 Tulsa
               -2.3 Charlotte
              -2.4 San Diego
             -3.6 Los Angeles
-3.7 Long Beach
           4.9 Cleveland
-6.5 San Francisco
           -6.6
                    Albuquerque
     -11.6
                    Arlington, TX
  -14.8
                    Omaha
-17.6
                    Wichita
                    Las Vegas
```

-0.3 Louisville

```
In [8]: years = np.arange(2004, 2009)
    heights = np.random.random(years.shape) * 7000 + 3000

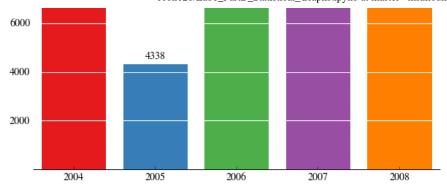
box_colors = brewer2mpl.get_map('Set1', 'qualitative', 5).mpl_colors

plt.bar(years - .4, heights, color=box_colors)
    plt.grid(axis='y', color='white', linestyle='-', lw=1)
    plt.yticks([2000, 4000, 6000, 8000])

fmt = plt.ScalarFormatter(useOffset=False)
    plt.gca().xaxis.set_major_formatter(fmt)
    plt.xlim(2003.5, 2008.5)
    remove_border(left=False)

for x, y in zip(years, heights):
    plt.annotate("%i" % y, (x, y + 200), ha='center')
```





### **Dot Plots**

## **Scatterplots**

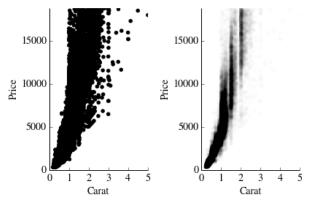
```
In [9]: plt.figure(tight_layout=True, figsize=(6, 4))
    plt.subplot(121)
    plt.scatter(diamonds.carat, diamonds.price, color='k')
    plt.ylim(0, diamonds.price.max())
    plt.xlim(0, 5)
    plt.xlabel("Carat")
    plt.ylabel("Price")
    remove_border()

plt.subplot(122)
    plt.scatter(diamonds.carat, diamonds.price, color='k', alpha=.01)
    plt.ylim(0, diamonds.price.max())
    plt.xlim(0, 5)

plt.xlabel("Carat")
    plt.ylabel("Price")
    remove_border()
```

/Users/beaumont/anaconda/lib/python2.7/site-packages/matplotlib/figure.py:1595: UserWarning: This figure includes Axes that are not compatible with tight\_layout, so its results might be incorrect.

warnings.warn("This figure includes Axes that are not "



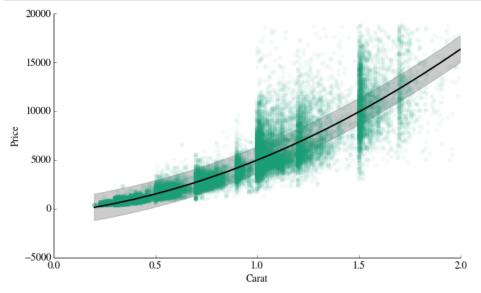
## **Trend Lines**

```
In [10]: # the raw data
    x = diamonds.carat[diamonds.carat < 2]
    y = diamonds.price[diamonds.carat < 2]
    plt.plot(x, y, 'o', mec='none', alpha=.05)

#fit and overplot a 2nd order polynomial
    params = np.polyfit(x, y, 2)
    xp = np.linspace(x.min(), 2, 20)
    yp = np.polyval(params, xp)
    plt.plot(xp, yp, 'k')

#overplot an error band
sig = np.std(y - np.polyval(params, x))
    plt fill between(xp, yp, - sig, yp, + s
```

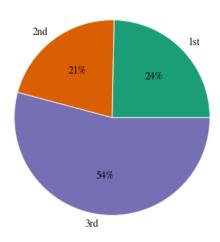
```
plt.xlabel("Carat")
plt.ylabel("Price")
plt.xlim(0, 2)
remove_border()
```



## **Bubble Charts**

## **Pie Charts**

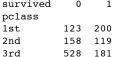
#### Passenger Class on the Titanic

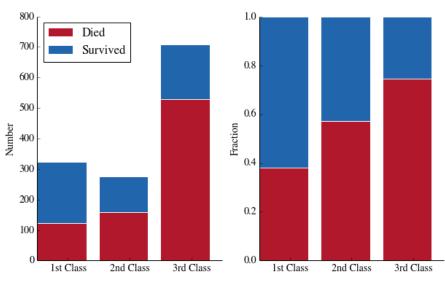


## **Donut Charts**

#### Stacked Bar Chart

```
In [12]: | tclass = titanic.groupby(['pclass', 'survived']).size().unstack()
         print tclass
         red, blue = '#B2182B', '#2166AC'
         plt.subplot(121)
         plt.bar([0, 1, 2], tclass[0], color=red, label='Died')
         plt.bar([0, 1, 2], tclass[1], bottom=tclass[0], color=blue, label='Survived')
         plt.xticks([0.5, 1.5, 2.5], ['1st Class', '2nd Class', '3rd Class'], rotation='horizontal')
         plt.ylabel("Number")
         plt.xlabel("")
         plt.legend(loc='upper left')
         remove_border()
         #normalize each row by transposing, normalizing each column, and un-transposing
         tclass = (1. * tclass.T / tclass.T.sum()).T
         plt.subplot(122)
         plt.bar([0, 1, 2], tclass[0], color=red, label='Died')
         plt.bar([0, 1, 2], tclass[1], bottom=tclass[0], color=blue, label='Survived')
         plt.xticks([0.5, 1.5, 2.5], ['1st Class', '2nd Class', '3rd Class'], rotation='horizontal')
         plt.ylabel("Fraction")
         plt.xlabel("")
         remove_border()
         plt.show()
         survived
                     0
                          1
         pclass
                   123
                        200
         1st
         2nd
                   158
                        119
```





## **Small Multiples**

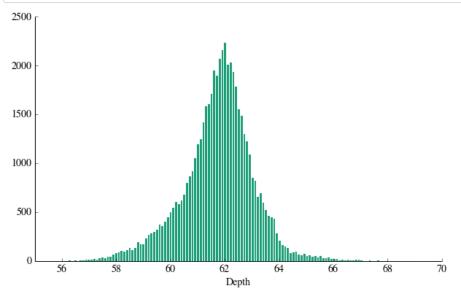
#### Waterfall Chart

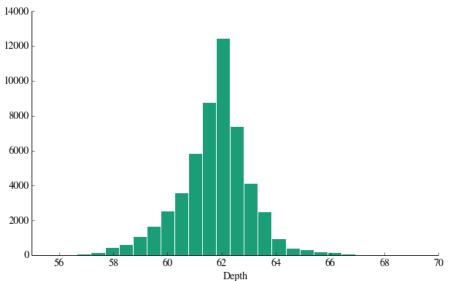
### Stacked Area Chart

#### **Histogram**

```
In [13]: | plt.hist(diamonds.depth, bins=np.linspace(50, 70, 200))
          plt.xlabel("Depth")
          remove_border()
          plt.xlim(55, 70)
         plt.show()
```

```
plt.hist(diamonds.depth, bins=np.linspace(50, 70, 40))
plt.xlabel("Depth")
remove_border()
plt.xlim(55, 70)
plt.show()
```





## **Density Plots**

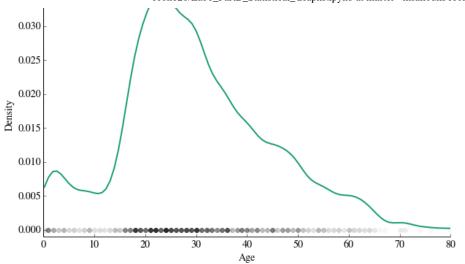
```
In [14]: #KernelDensity objects estimate the (log of the) density of points
    #see http://scikit-learn.org/stable/modules/density.html
    from sklearn.neighbors.kde import KernelDensity

age = titanic.age.dropna().values # drop missing values, turn to normal numpy array
age = age.reshape(-1, 1) # scikit-learn expects data matrices of shape [ndata, ndim]

kde = KernelDensity(bandwidth=2).fit(age)
    x = np.linspace(age.min(), age.max(), 100).reshape(-1, 1)
    density = np.exp(kde.score_samples(x))

plt.plot(x, density)
    plt.plot(age, age * 0, 'ok', alpha=.03)
    plt.ylim(-.001, .035)

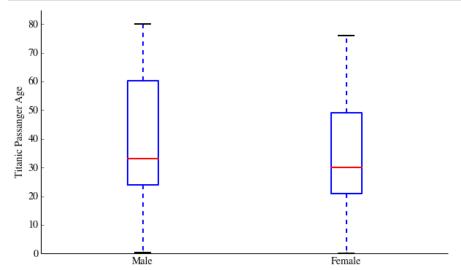
plt.xlabel("Age")
    plt.ylabel("Density")
    remove_border()
```



## **Box and Whisker Plots**

```
In [15]: male_age = titanic.age[titanic.sex == 'male']
    female_age = titanic.age[titanic.sex == 'female']

plt.boxplot([male_age, female_age])
    plt.ylabel("Titanic Passanger Age")
    plt.xticks([1, 2], ["Male", "Female"])
    plt.ylim(0, 85)
    remove_border()
```



# **Heat Maps (2D Density Plots)**

```
In [16]: from sklearn.datasets import make blobs
          from matplotlib.colors import LogNorm
         X, _ = make_blobs(n_samples=20000, centers=3, random_state=42, cluster_std=2)
         plt.scatter(X[:, 0], X[:, 1], 2, color='k')
         plt.title("Points")
         plt.xlim(-15, 15)
         plt.ylim(-15, 15)
         plt.gca().set_position([.125, .125, .62, .775])
         plt.show()
         plt.hist2d(X[:, 0], X[:, 1], bins=40, cmap='Greens', norm=LogNorm())
         ax = plt.gca()
         plt.title("Heatmap")
         plt.colorbar()
         plt.xlim(-15, 15)
         plt.ylim(-15, 15)
         nl+ chow()
```

