

# Data Visualization with Python

July 29, 2023

```
[1]: import pandas as pd
import matplotlib.pyplot as plt

# reading the database
data = pd.read_csv("data/tips.csv")

# printing the top 10 rows
display(data.head(5))
```

|   | total_bill | tip  | sex    | smoker | day | time   | size |
|---|------------|------|--------|--------|-----|--------|------|
| 0 | 16.99      | 1.01 | Female | No     | Sun | Dinner | 2    |
| 1 | 10.34      | 1.66 | Male   | No     | Sun | Dinner | 3    |
| 2 | 21.01      | 3.50 | Male   | No     | Sun | Dinner | 3    |
| 3 | 23.68      | 3.31 | Male   | No     | Sun | Dinner | 2    |
| 4 | 24.59      | 3.61 | Female | No     | Sun | Dinner | 4    |

## 0.1 Scatter Plot

Scatter plots are used to observe relationships between variables and uses dots to represent the relationship between them.

**Purpose:** Displaying relationships between variables.

**matplotlib function:** `scatter(x, y)`

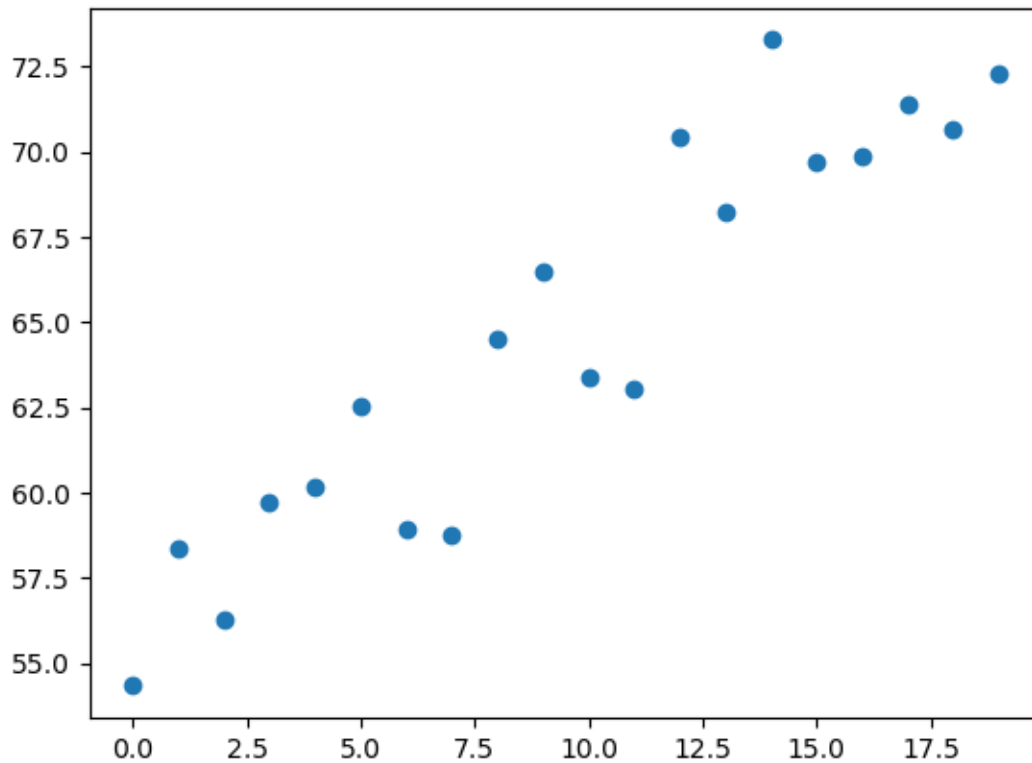
- `x, y`: The values for the two variables.

```
[2]: import numpy as np

# value gen
x = range(20)
y = np.arange(50, 70) + (np.random.random(20) * 10)

# plot
# adding figure
plt.figure()

plt.scatter(x, y)
plt.show()
```



#### Commonly used parameters:

- `c`: Set the color of the markers.
- `s`: Set the size of the markers.
- `marker`: Set the marker style, e.g., circles, triangles, or squares.
- `edgecolor`: Set the color of the lines on the edges of the markers.

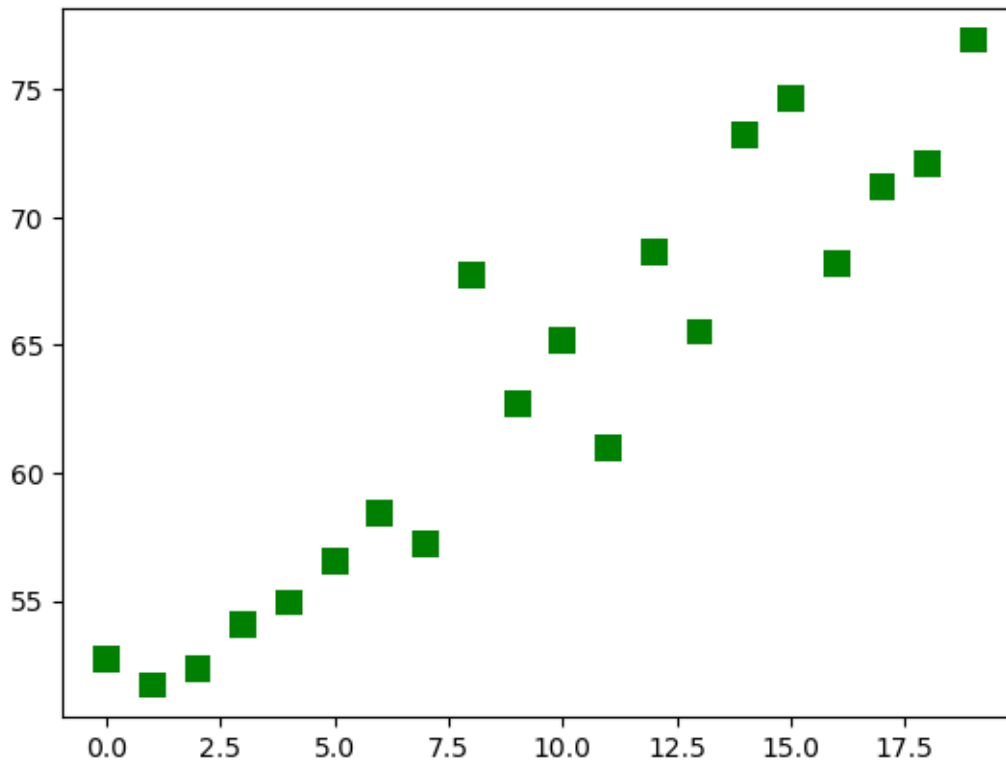
```
[3]: import matplotlib.pyplot as plt
import numpy as np

x = np.arange(20)
y = np.arange(50, 70) + (np.random.random(20) * 10.)

plt.figure()

plt.scatter(x,
            y,
            c='green',
            s=100,
            marker='s',
            edgecolor='none')
```

```
plt.show()
```



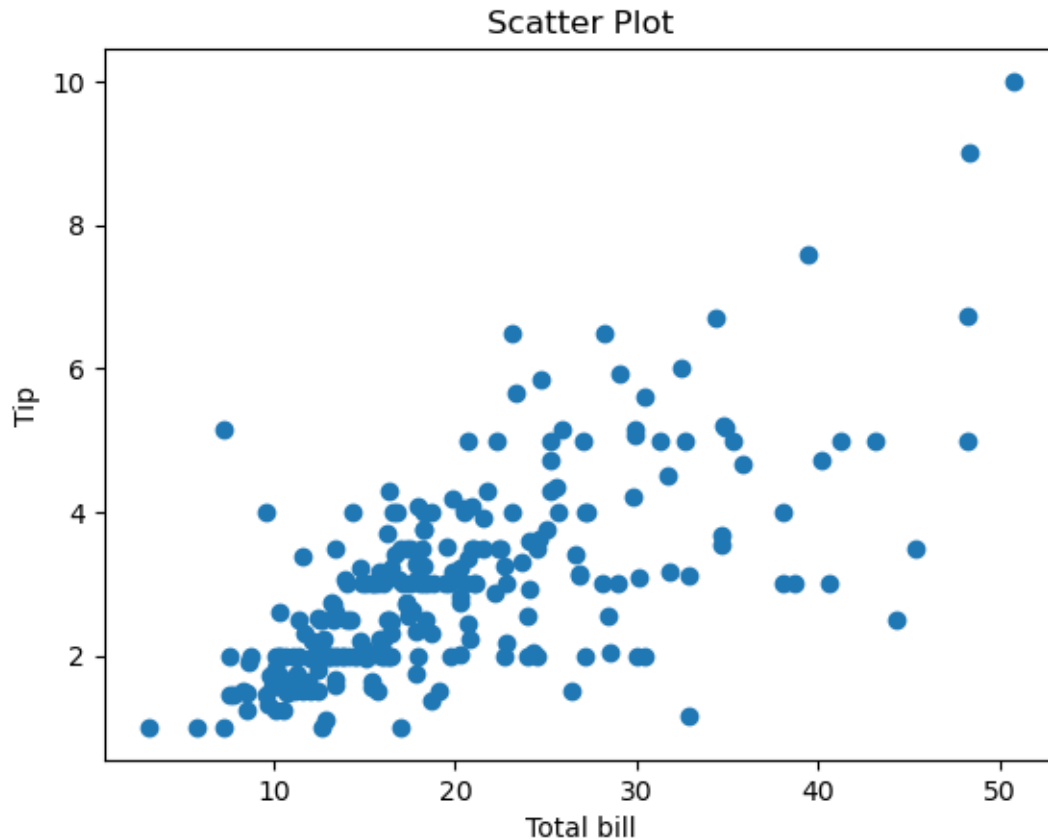
```
[4]: import matplotlib.pyplot as plt

plt.figure()
# Scatter plot with day against tip
plt.scatter(data['total_bill'], data['tip'])

# Adding Title to the Plot
plt.title("Scatter Plot")

# Setting the X and Y labels
plt.xlabel('Total bill')
plt.ylabel('Tip')

plt.show()
```



This graph can be more meaningful if we can add colors and also change the size of the points. We can do this by using the `c` and `s` parameter respectively of the scatter function. We can also show the color bar using the `colorbar()` method.

```
[5]: import pandas as pd
import matplotlib.pyplot as plt

# # reading the database
# data = pd.read_csv("data/tips.csv")

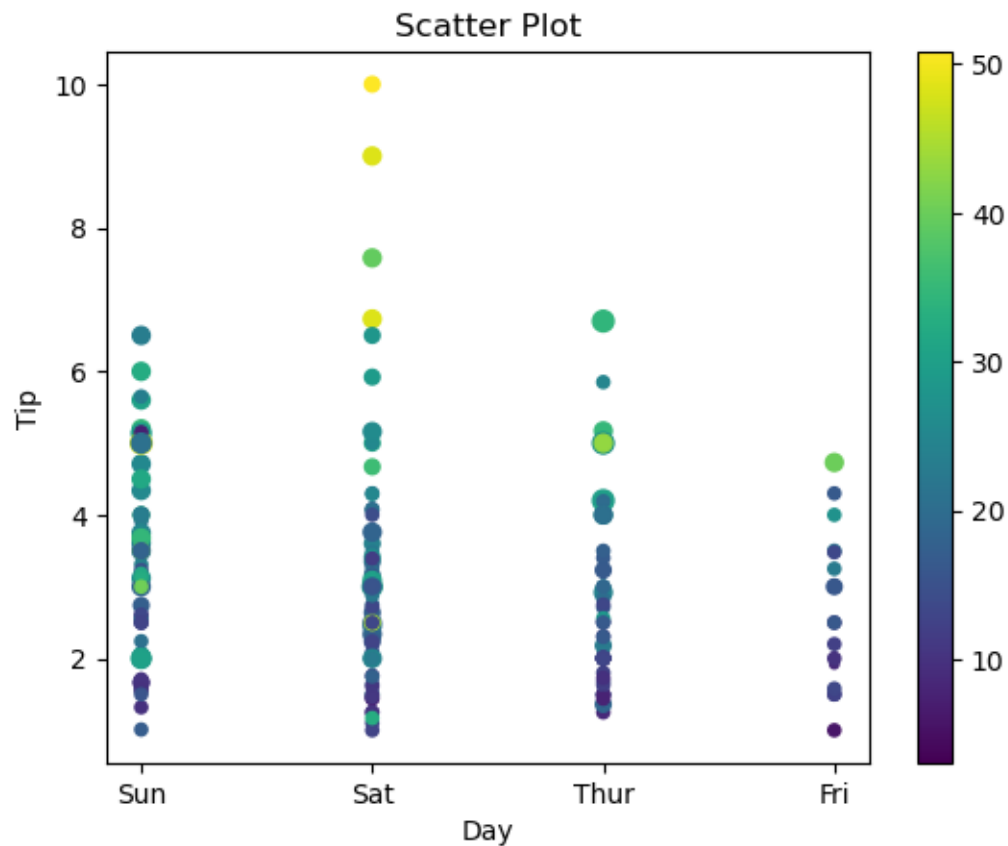
# Scatter plot with day against tip
plt.scatter(data['day'],
            data['tip'],
            s=data['size']*10,
            c=data['total_bill'])

# Adding Title to the Plot
plt.title("Scatter Plot")
```

```
# Setting the X and Y labels
plt.xlabel('Day')
plt.ylabel('Tip')

plt.colorbar()

plt.show()
```



## 1 ## Line Chart

**Purpose:** Showing trends in data – usually time series data with many time points.

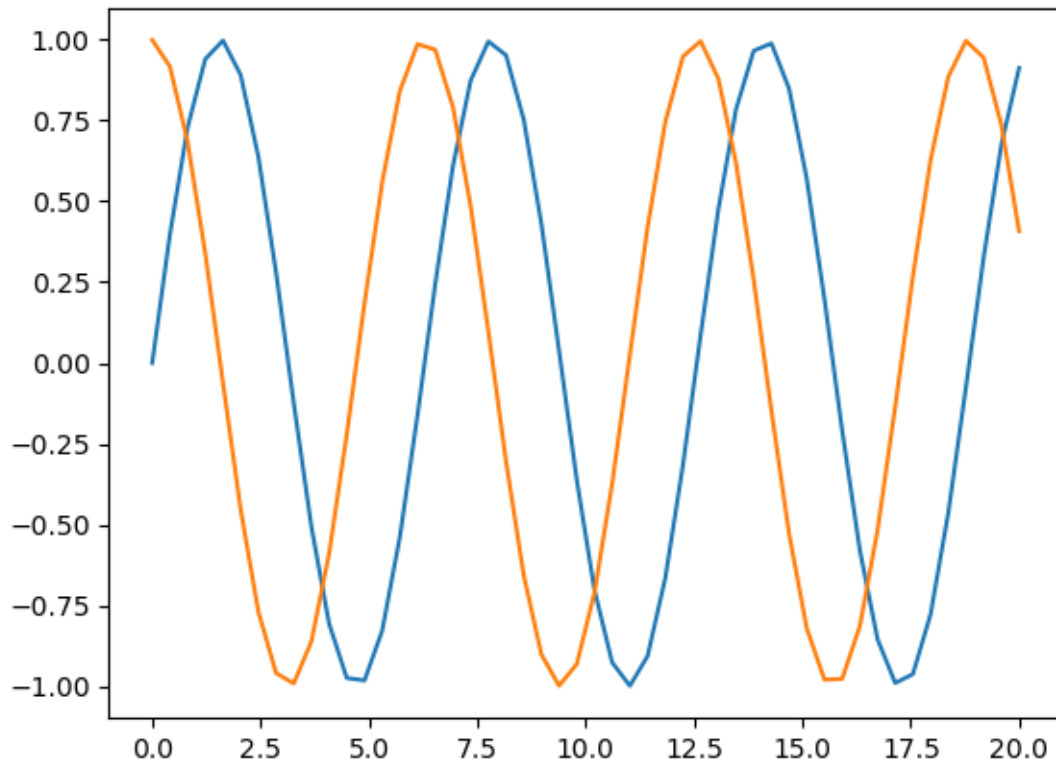
**matplotlib function:** `plot(x, y)`

- x: The x-coordinates of the lines or markers.
- y: The y-coordinates of the lines or markers.

```
[6]: import numpy as np
# data gen
x = np.linspace(0, 20)
```

```
y1 = np.sin(x)
y2 = np.cos(x)

# plot
plt.figure()
# line chart
plt.plot(x, y1)
plt.plot(x, y2)
plt.show()
```



**Commonly used parameters:**

- **color:** Set the color of the line.
- **linestyle:** Set the line style, e.g., solid, dashed, or none.
- **linewidth:** Set the line thickness.
- **marker:** Set the marker style, e.g., circles, triangles, or none.
- **markersize:** Set the marker size.
- **label:** Set the label for the line that will show up in the legend.

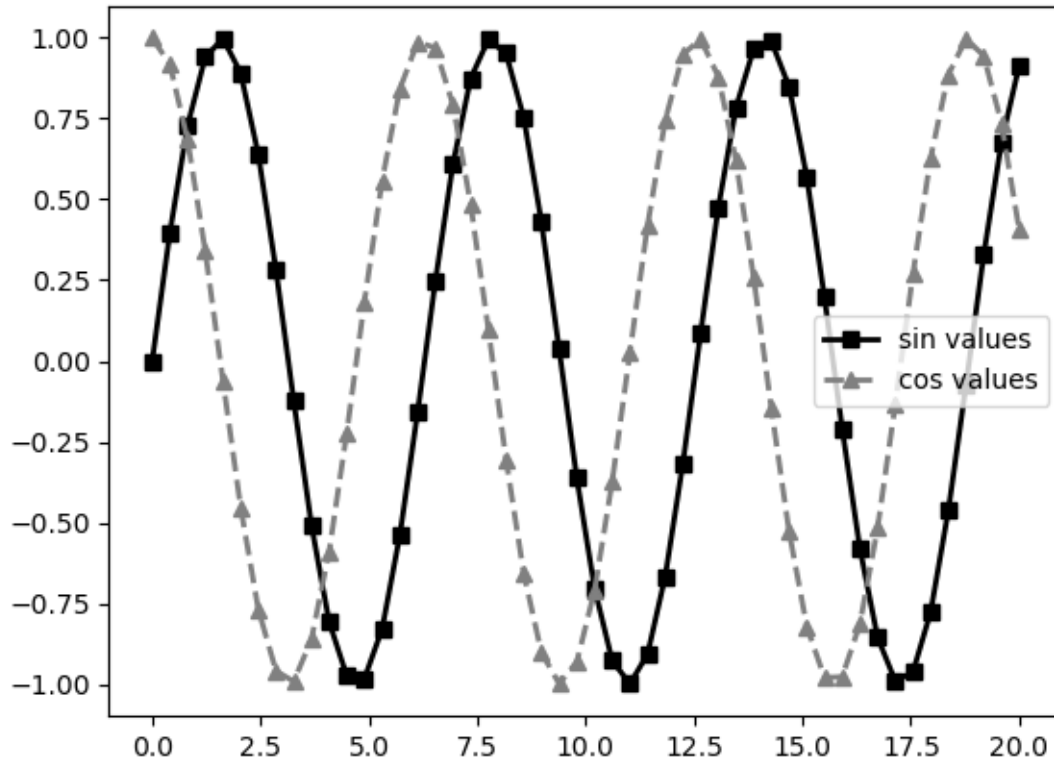
```
[7]: # data gen.
x = np.linspace(0, 20)
y1 = np.sin(x)
y2 = np.cos(x)

# plot
plt.figure()

plt.plot(x, y1,
         color='black',
         linestyle='-',
         linewidth=2,
         marker='s',
         markersize=6,
         label='sin values')

plt.plot(x, y2,
         color='gray',
         linestyle='--',
         linewidth=2,
         marker='^',
         markersize=6,
         label='cos values')

plt.legend()
plt.show()
```



```
[8]: import pandas as pd
import matplotlib.pyplot as plt

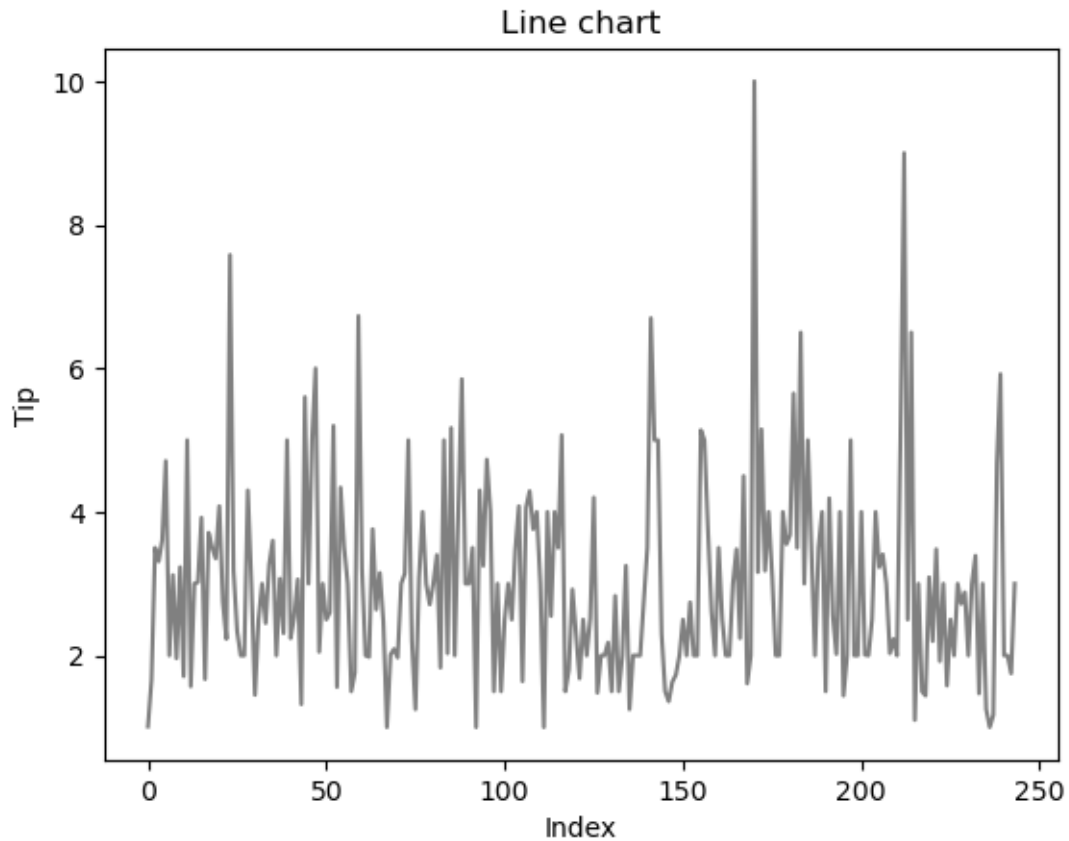
# # reading the database
# data = pd.read_csv("data/tips.csv")
plt.figure()
# Line plot with day against tip
plt.plot(data['tip'], color='gray')

# Adding Title to the Plot
plt.title("Line chart")

# Setting the X and Y labels
plt.xlabel('Index')
plt.ylabel('Tip')

plt.show()
```





## 1.1 Bar Chart

**Purpose:** Comparing categories **OR** showing temporal trends in data with few ( $< 4$ ) time points.

**matplotlib function:** `bar(left, height)`

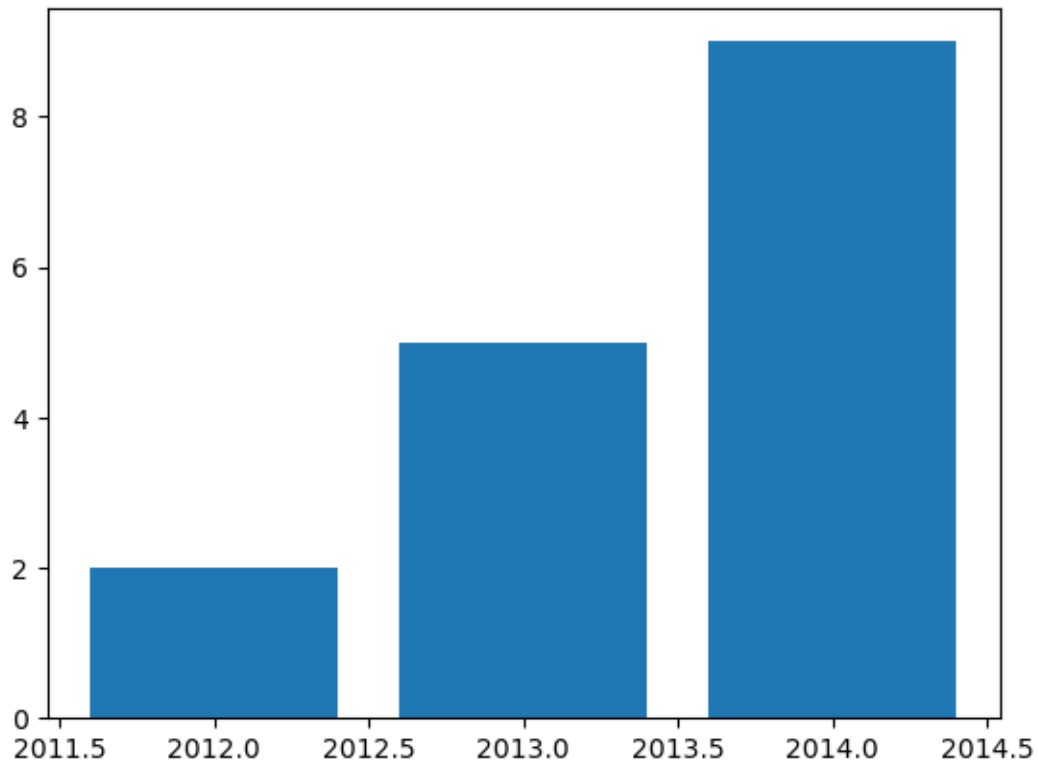
- `left`: The x coordinate(s) of the left sides of the bars.
- `height`: The height(s) of the bars.

```
[9]: years = np.arange(2012, 2015)
values = [2, 5, 9]

plt.figure()

plt.bar(years, values)

plt.show()
```



**Commonly used parameters:**

- **color:** Set the color of the bars.
- **edgecolor:** Set the color of the lines on the edges of the bars.
- **width:** Set the width of the bars.
- **align:** Set the alignment of the bars, e.g., center them on the x coordinate(s).
- **label:** Set the label for the bar that will show up in the legend.

```
[10]: years = np.arange(2012, 2015)
category1_values = [2, 5, 9]
category2_values = [7, 6, 3]

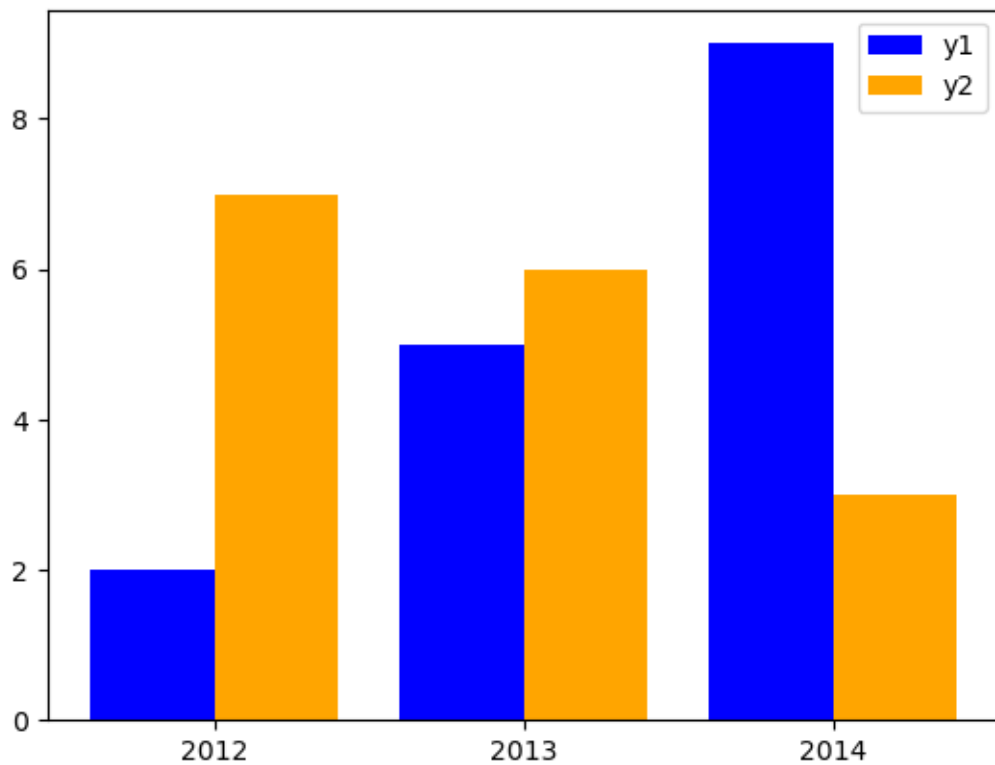
plt.figure()

plt.bar(years - 0.2,
        category1_values,
        color='blue',
        edgecolor='none',
        width=0.4,
        align='center',
        label='y1')
```

```
plt.bar(years + 0.2,
        category2_values,
        color='orange',
        edgecolor='none',
        width=0.4,
        align='center',
        label='y2')

plt.xticks(years, [str(year) for year in years])

plt.legend()
plt.show()
```



**Purpose:** Comparing categories.

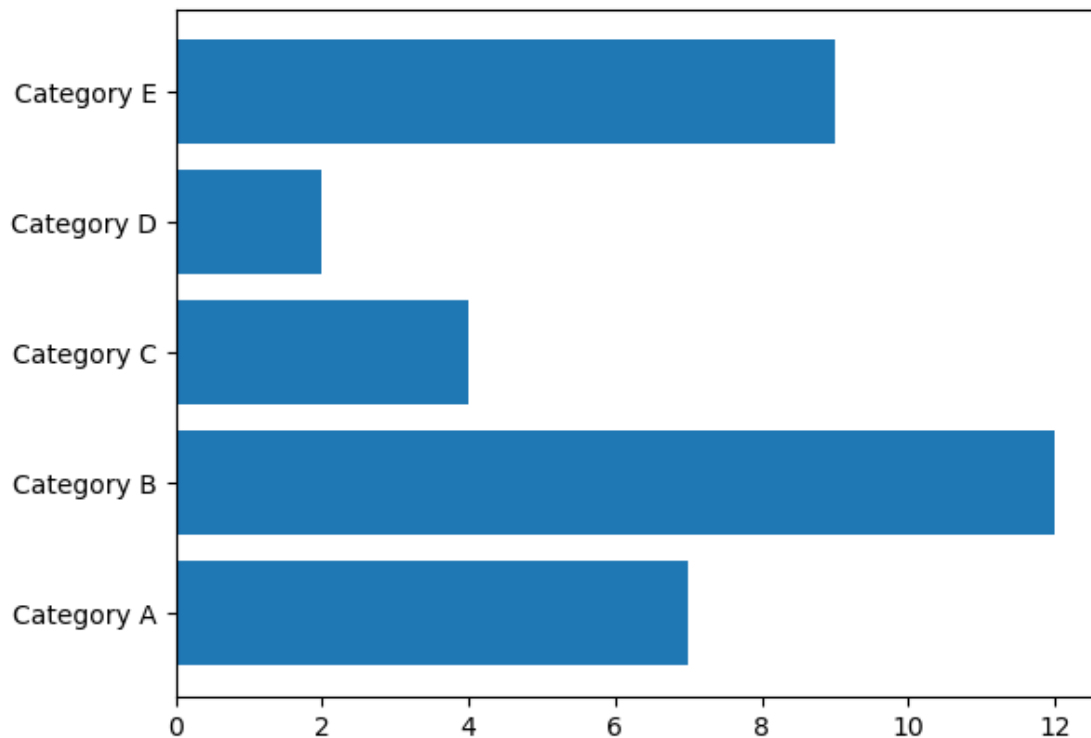
**matplotlib function:** `barh(bottom, width)`

- **bottom:** The y coordinate(s) of the bars.
- **width:** The width(s) of the bars.

```
[11]: categories = ['A', 'B', 'C', 'D', 'E']
      values = [7, 12, 4, 2, 9]

      # print(np.arange(len(categories)))
      plt.figure()
      plt.barh(np.arange(len(categories)), values)

      plt.yticks(np.arange(len(categories)),
                  [f'Category {x}' for x in categories])
      plt.show()
```



#### Commonly used parameters:

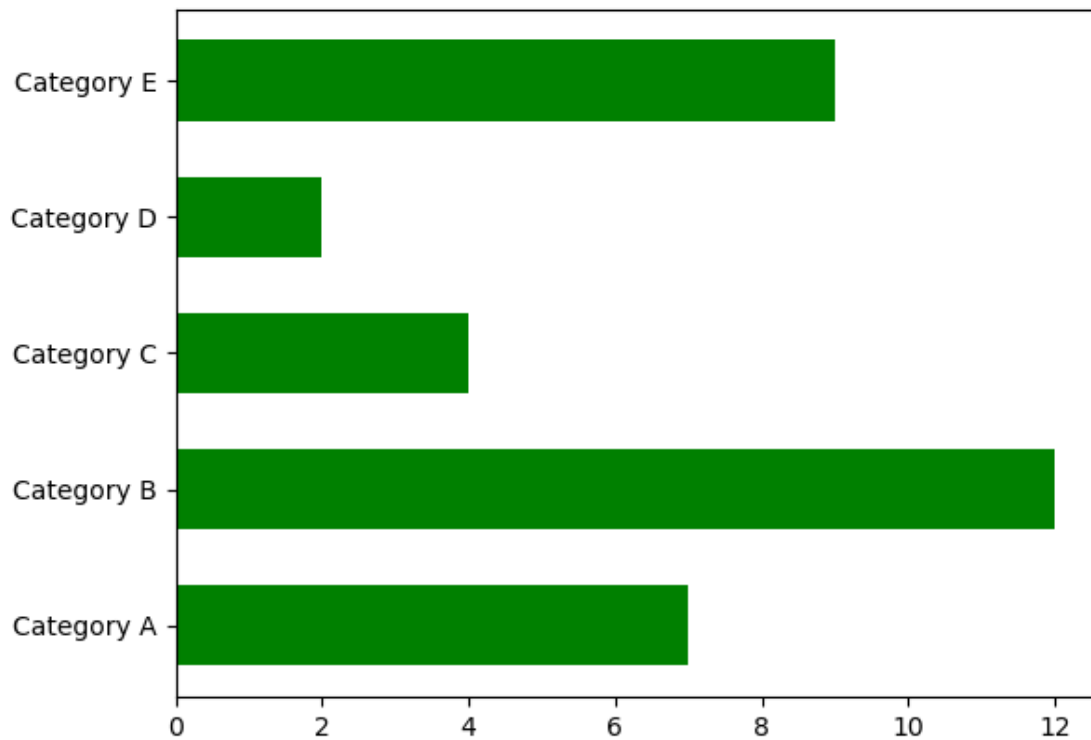
- **color:** Set the color of the bars.
- **edgecolor:** Set the color of the lines on the edges of the bars.
- **height:** Set the height of the bars.
- **align:** Set the alignment of the bars, e.g., center them on the y coordinate(s).

```
[12]: categories = ['A', 'B', 'C', 'D', 'E']
      values = [7, 12, 4, 2, 9]

      plt.figure()
```

```
plt.barh(np.arange(len(categories)),
         values,
         color='green',
         edgecolor='none',
         height=0.6,
         align='center')

plt.yticks(np.arange(len(categories)),
          ['Category {}'.format(x) for x in categories])
plt.show()
```



```
[13]: import pandas as pd

categories = ['A', 'B', 'C', 'D', 'E']
values = [7, 12, 4, 2, 9]

# convert to dataframe
category_values = pd.DataFrame({'categories': categories,
                              'values': values})

# category values wise sorted
```

```

category_values.sort_values(by='values', ascending=True, inplace=True)

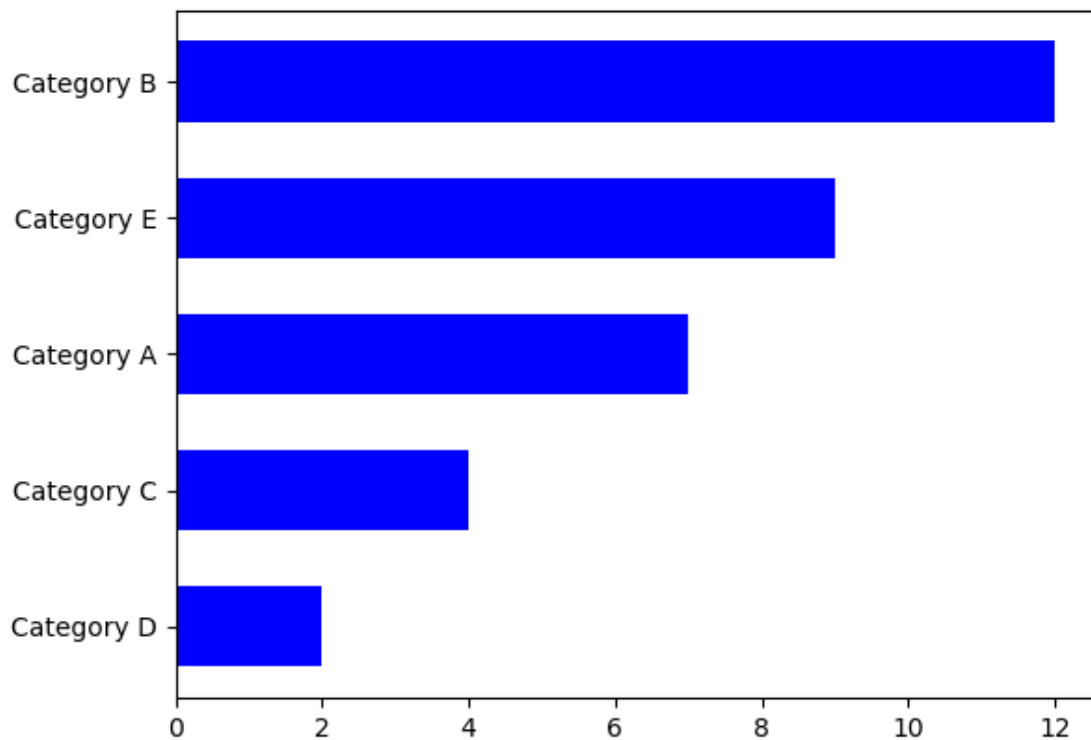
categories = category_values['categories'].values
values = category_values['values'].values

# plot
plt.figure()

plt.barh(np.arange(len(categories)),
         values,
         color='blue',
         edgecolor='none',
         height=0.6,
         align='center')

plt.yticks(np.arange(len(categories)),
          ['Category {}'.format(x) for x in categories])
plt.show()

```



```

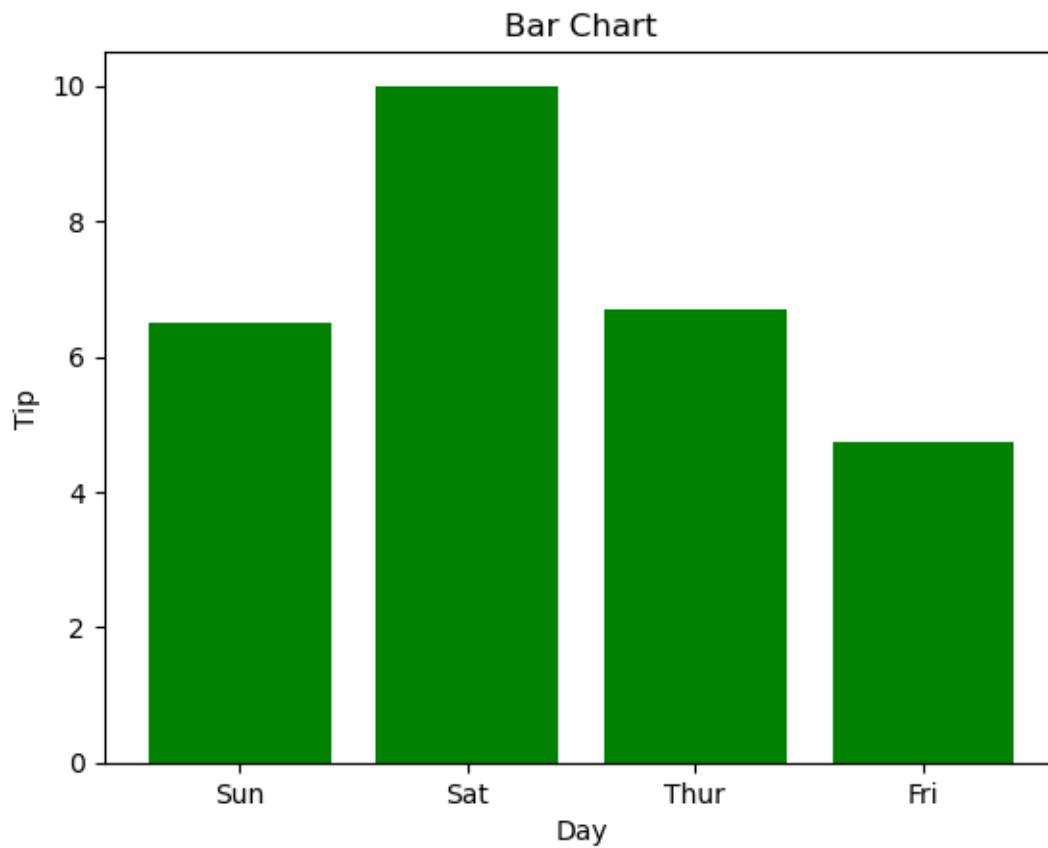
[14]: # Bar chart with day against tip
plt.bar(data['day'], data['tip'], color='green')

```

```
plt.title("Bar Chart")

# Setting the X and Y labels
plt.xlabel('Day')
plt.ylabel('Tip')

plt.show()
```



## 2 Pie charts

**Purpose:** Displaying a simple proportion.

**matplotlib function:** `pie(sizes)`

- **sizes:** The size of the wedges as either a fraction or number.

```
[15]: counts = [17, 14]

plt.figure(figsize=(4, 4))
```

```
plt.pie(counts)
plt.show()
```



#### Commonly used parameters:

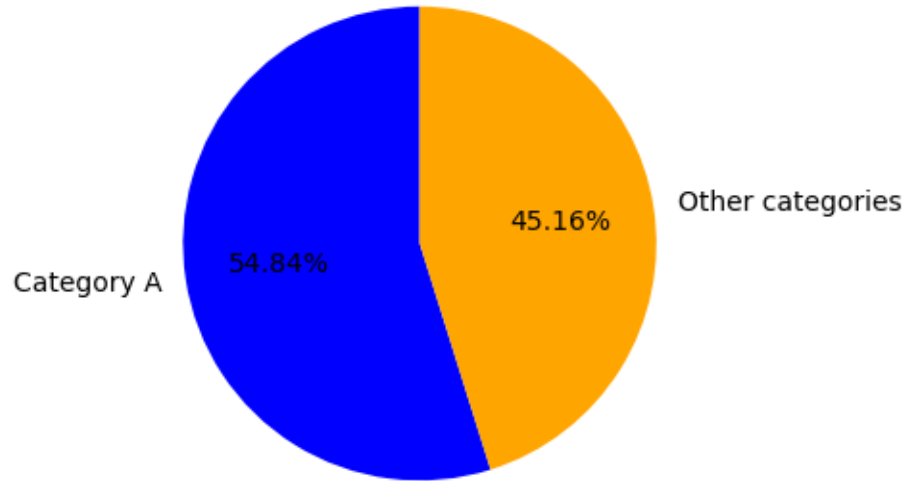
- **colors**: Set the colors of the wedges.
- **labels**: Set the labels of the wedges.
- **startangle**: Set the angle that the wedges start at.
- **autopct**: Set the percentage display format of the wedges.

```
[16]: counts = [17, 14]

plt.figure(figsize=(4, 4))

plt.pie(counts,
        colors=['blue', 'orange'],
        labels=['Category A', 'Other categories'],
        startangle=90,
        autopct='%1.2f%%')
plt.show()
```

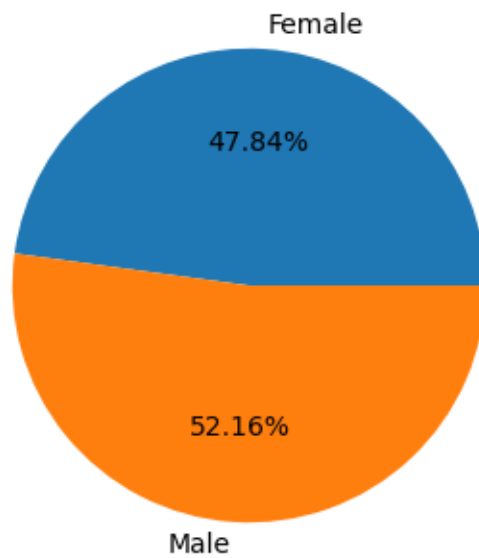




```
[17]: grp_data = data.groupby('sex').tip.mean().reset_index()
      print(grp_data)
      plt.figure(figsize=(4, 4))

      plt.pie(grp_data.tip, labels=grp_data.sex, autopct='%1.2f%%')
      plt.show()
```

|   | sex    | tip      |
|---|--------|----------|
| 0 | Female | 2.833448 |
| 1 | Male   | 3.089618 |



## 2.1 Histogram

**Purpose:** Showing the spread of a data column.

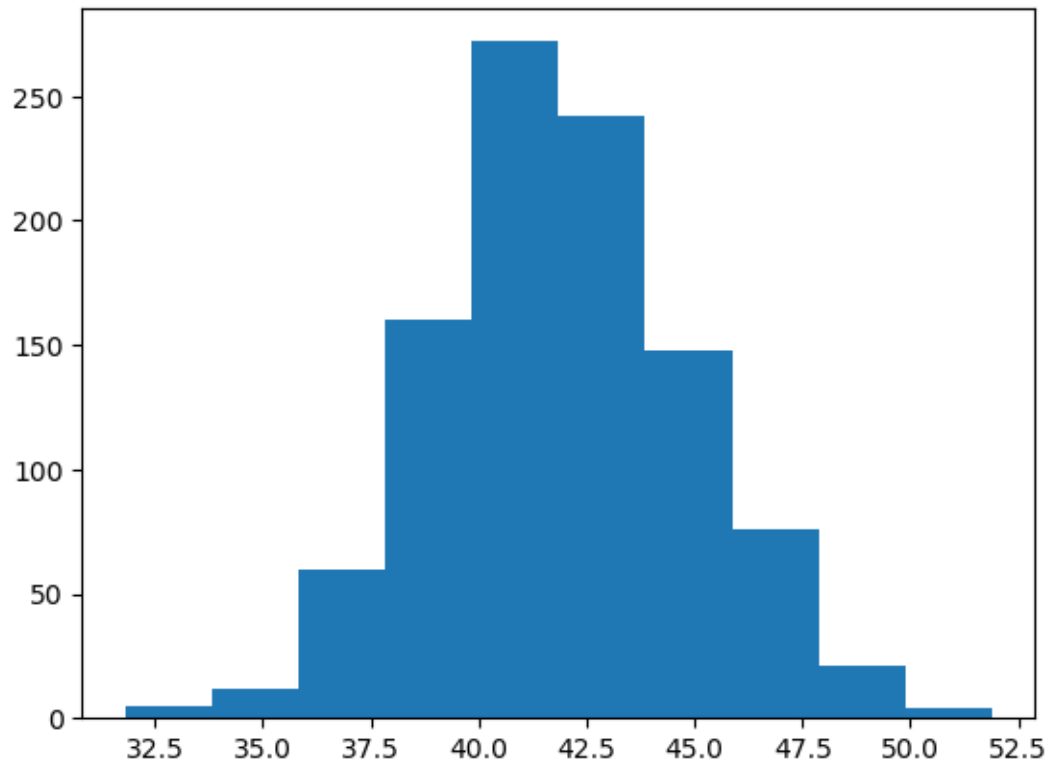
**matplotlib function:** `hist(x)`

- `x`: List of values to display the distribution of.

```
[18]: column_data = np.random.normal(42, 3, 1000)

plt.figure()

plt.hist(column_data)
plt.show()
```



**Commonly used parameters:**

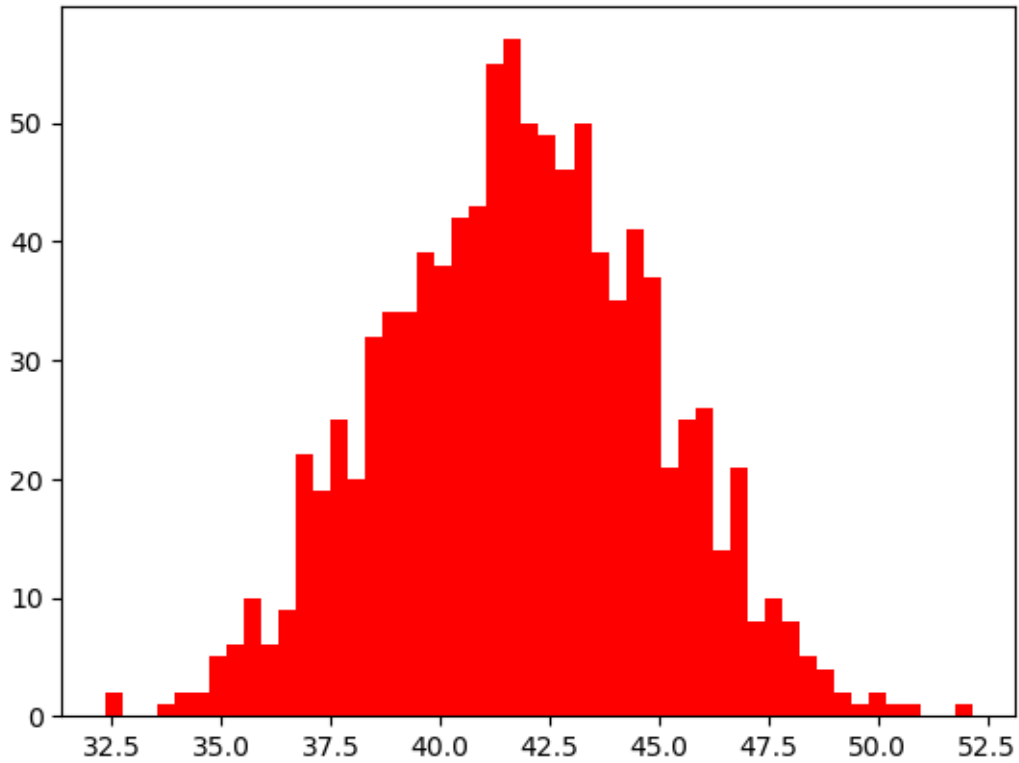
- `color`: Set the color of the bars in the histogram.
- `bins`: Set the number of bins to display in the histogram, or specify specific bins.

```
[19]: column_data = np.random.normal(42, 3, 1000)

plt.figure()

plt.hist(column_data,
         color='red',
         bins=50)

plt.show()
```



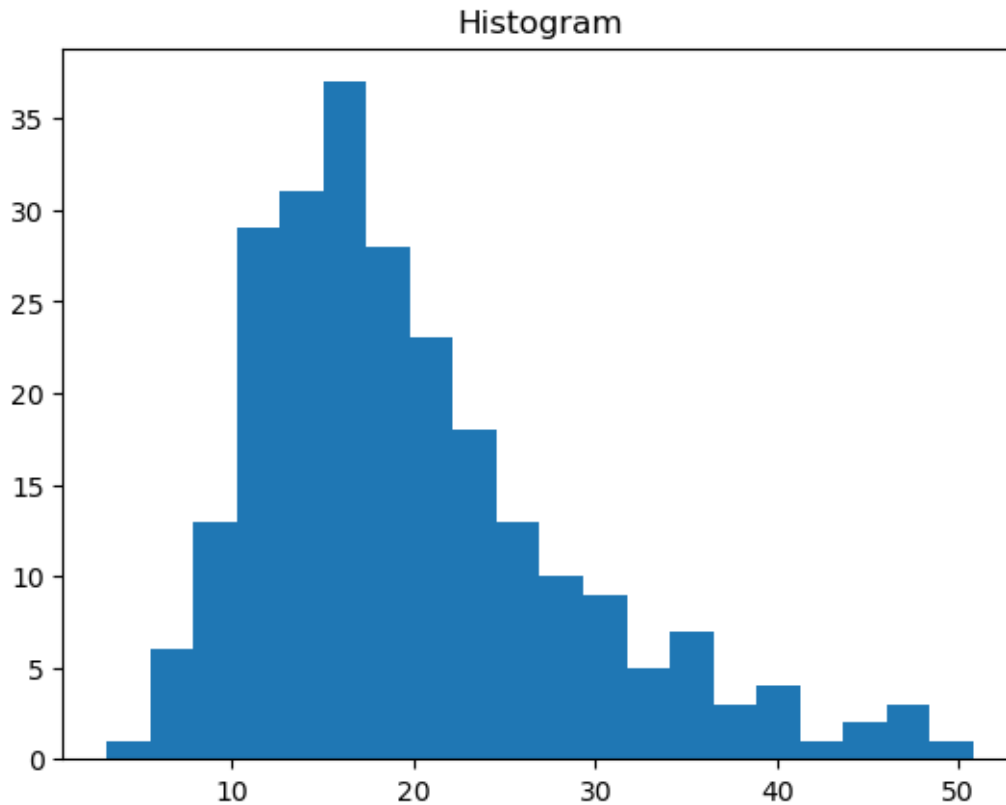
```
[20]: import pandas as pd
import matplotlib.pyplot as plt

# # reading the database
# data = pd.read_csv("tips.csv")

# histogram of total_bills
plt.hist(data['total_bill'], bins=20)

plt.title("Histogram")

# Adding the legends
plt.show()
```



### 3 Subplots

**Purpose:** Allows you to place multiple charts in a figure.

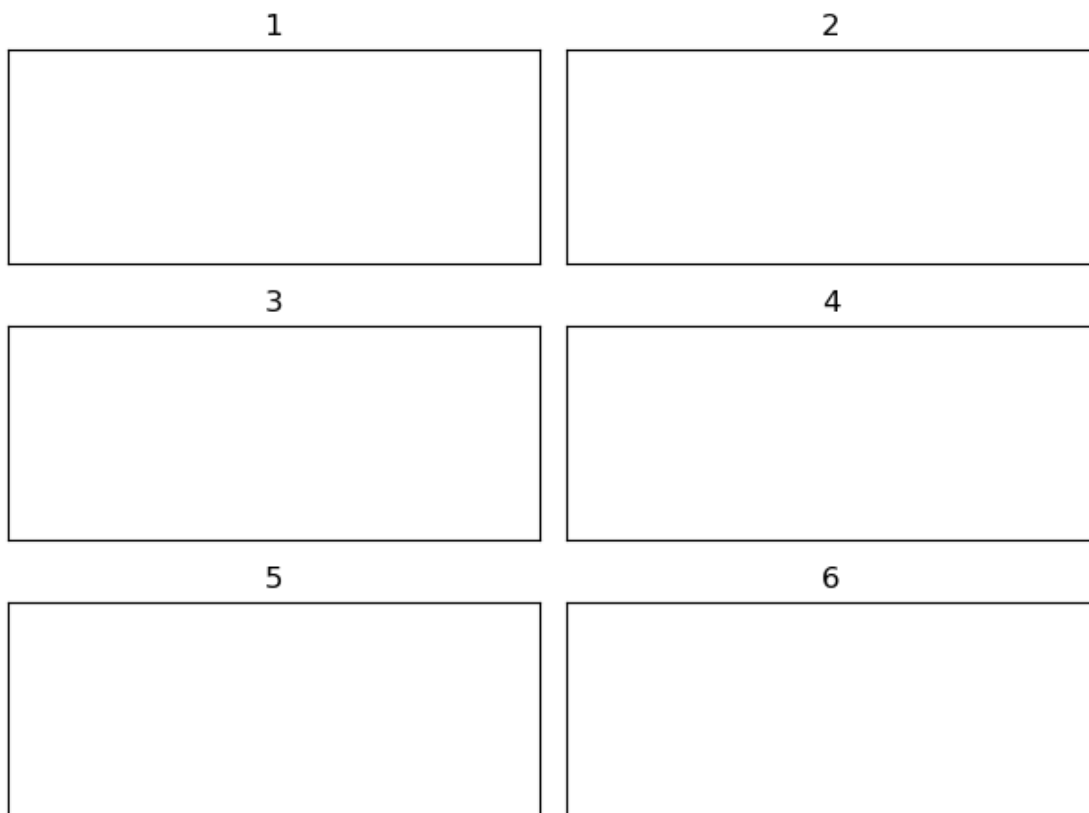
**matplotlib function:** `subplot(nrows, ncols, plot_number)`

- `nrows`: The number of rows in the figure.
- `ncols`: The number of columns in the figure.
- `plot_number`: The placement of the chart (starts at 1).

```
[21]: plt.figure()

for i in range(1, 7):
    plt.subplot(3, 2, i)
    plt.title(i)
    plt.xticks([])
    plt.yticks([])

plt.tight_layout()
```



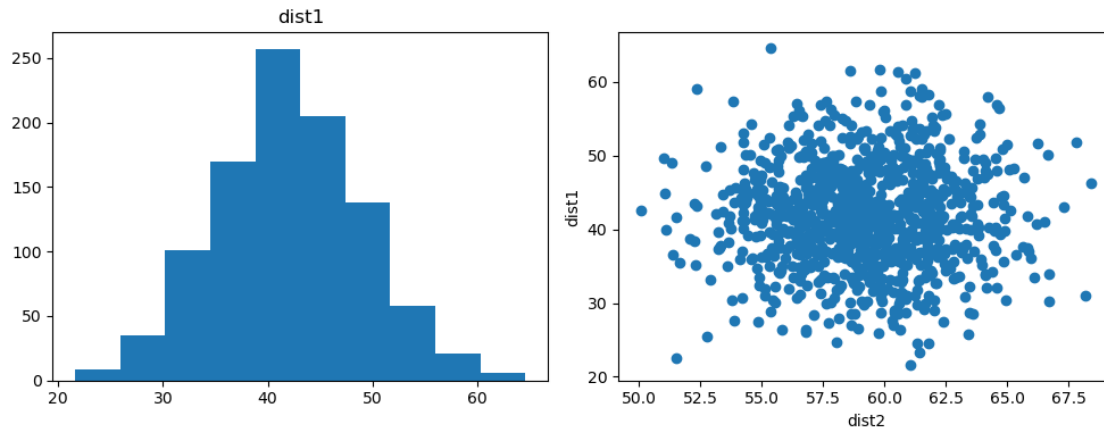
```
[22]: dist1 = np.random.normal(42, 7, 1000)
      dist2 = np.random.normal(59, 3, 1000)

      plt.figure(figsize=(10, 4))

      plt.subplot(1, 2, 1)
      plt.hist(dist1)
      plt.title('dist1')

      plt.subplot(1, 2, 2)
      plt.scatter(dist2, dist1)
      plt.xlabel('dist2')
      plt.ylabel('dist1')

      plt.tight_layout()
```

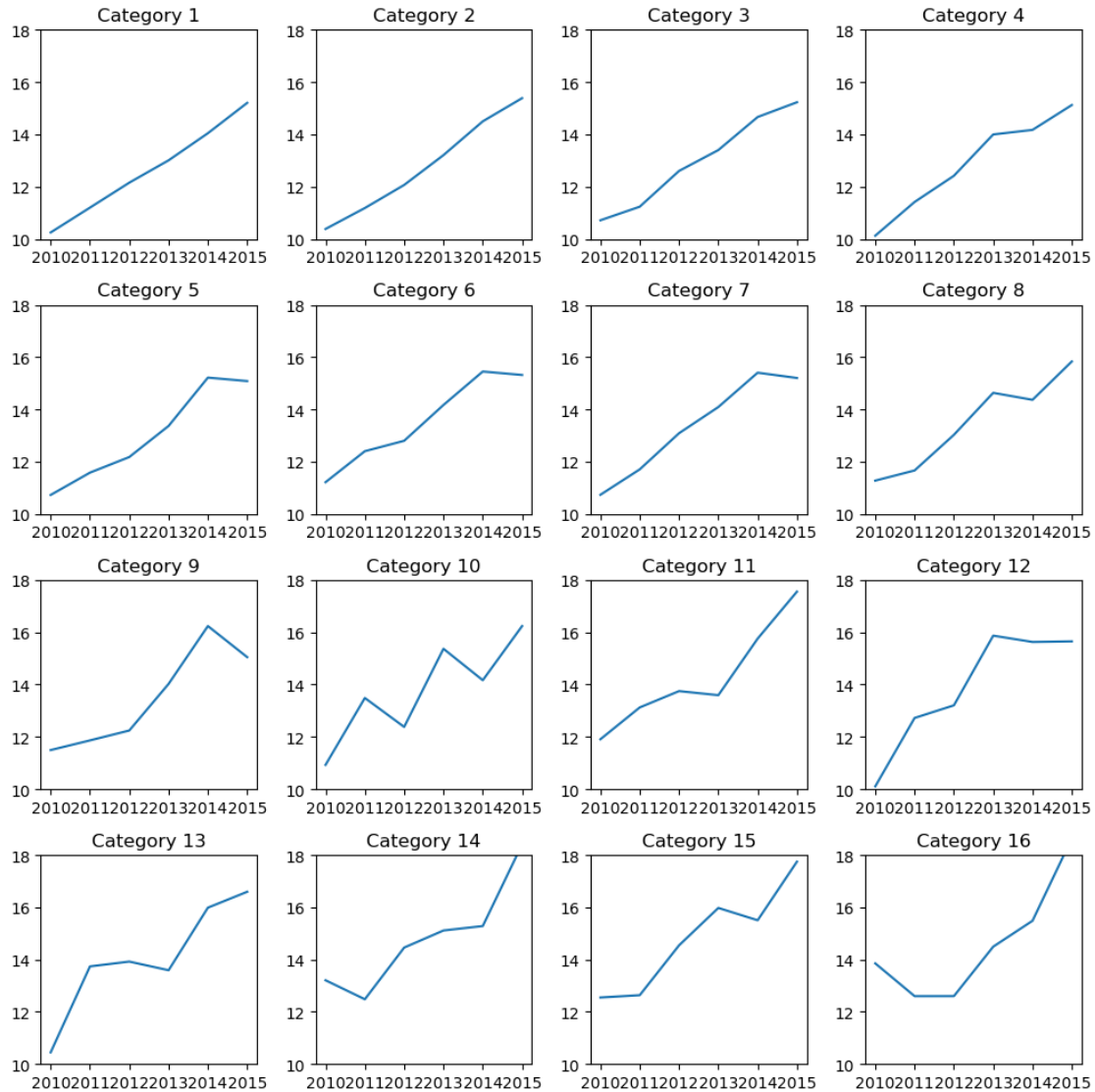


```
[23]: years = np.arange(2010, 2016)

plt.figure(figsize=(10, 10))

for category_num in range(1, 17):
    plt.subplot(4, 4, category_num)
    y_vals = np.arange(10, 16) + (np.random.random(6) * category_num / 4.)
    plt.plot(years, y_vals)
    plt.ylim(10, 18)
    plt.xticks(years, [str(year) for year in years])
    plt.title('Category {}'.format(category_num))

plt.tight_layout()
```



### 3.1 Styles

```
[24]: import matplotlib.pyplot as plt
# data
x1_values = [2012, 2013, 2014, 2015]
y1_values = [4.3, 2.5, 3.5, 4.5]

x2_values = [2012, 2013, 2014, 2015]
y2_values = [2.4, 4.4, 1.8, 2.8]

x3_values = [2012, 2013, 2014, 2015]
y3_values = [2, 2, 3, 5]
```



```

# plot
plt.figure()
plt.plot(x1_values, y1_values, label='Python')
plt.plot(x2_values, y2_values, label='JavaScript')
plt.plot(x3_values, y3_values, label='R')

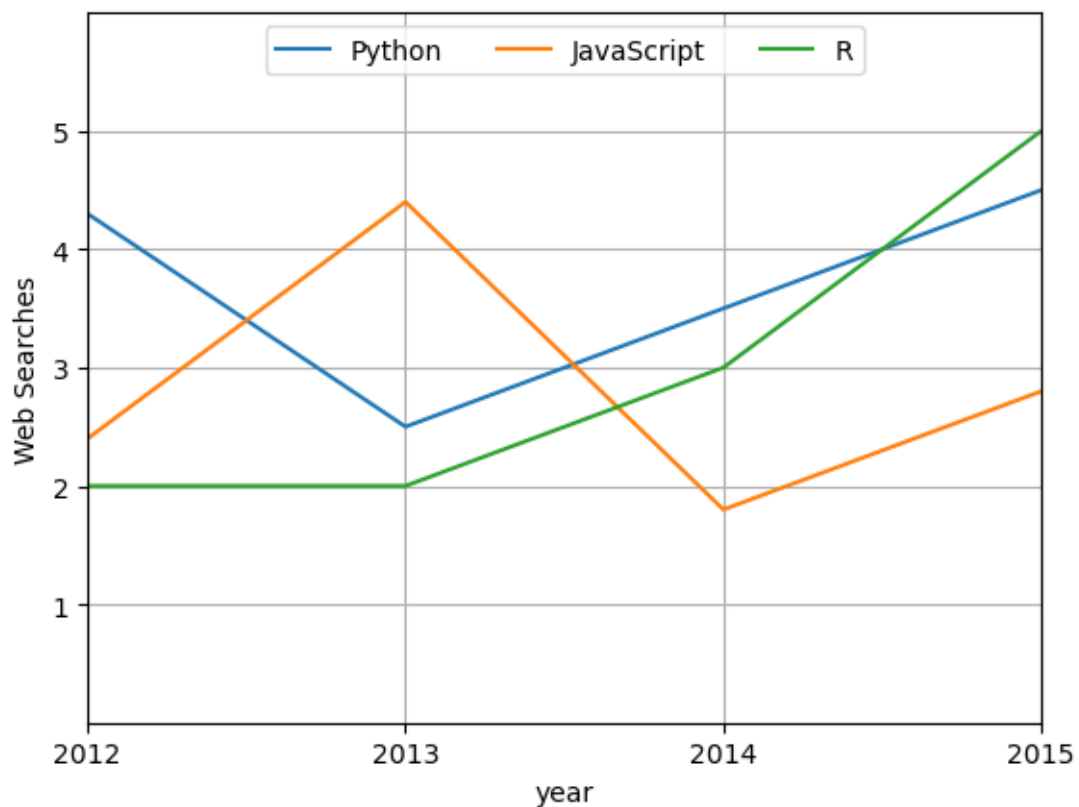
plt.xlim(2012, 2015)
plt.ylim(0, 6)
plt.xticks([2012, 2013, 2014, 2015], ['2012', '2013', '2014', '2015'])
plt.yticks([1, 2, 3, 4, 5])

plt.xlabel('year')
plt.ylabel('Web Searches')

plt.legend(loc='upper center', ncol=3)
plt.grid(True)

plt.savefig('web-searches.png', dpi=150)

```



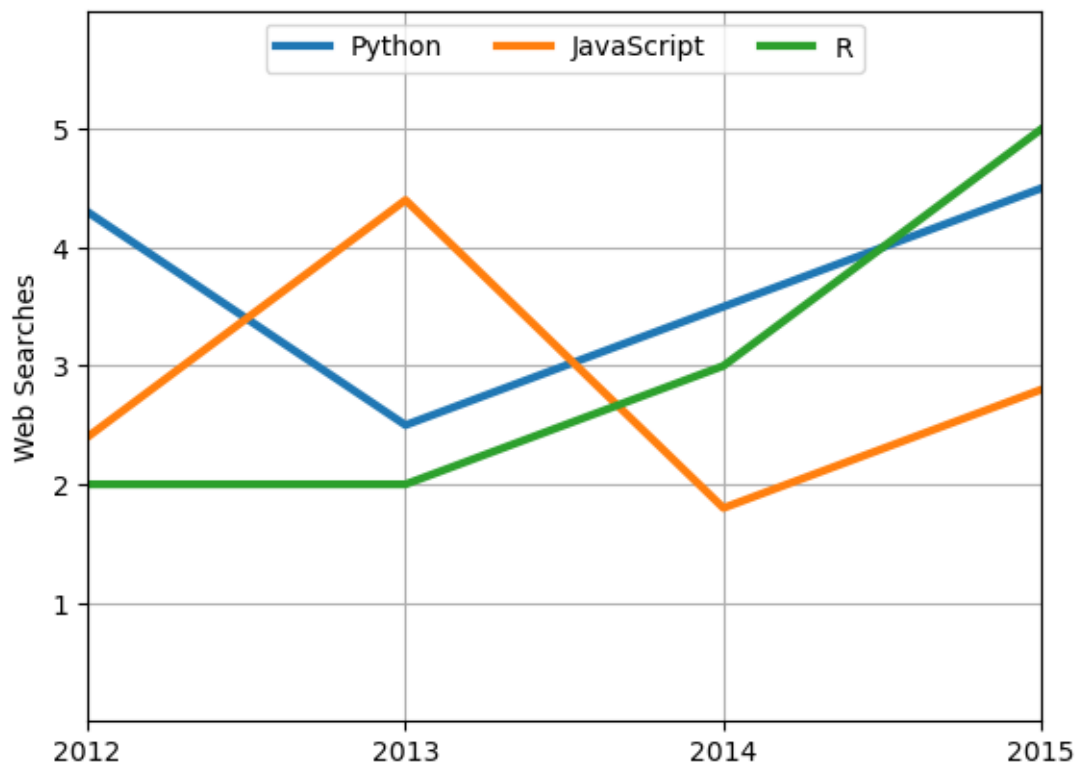
```
[25]: plt.figure()
plt.plot(x1_values, y1_values, label='Python', lw=3, color='#1f77b4')
plt.plot(x2_values, y2_values, label='JavaScript', lw=3, color='#ff7f0e')
plt.plot(x3_values, y3_values, label='R', lw=3, color='#2ca02c')

plt.xlim(2012, 2015)
plt.ylim(0, 6)
plt.xticks([2012, 2013, 2014, 2015], ['2012', '2013', '2014', '2015'])
plt.yticks([1, 2, 3, 4, 5])

plt.xlabel('')
plt.ylabel('Web Searches')

plt.legend(loc='upper center', ncol=3)
# plt.legend(loc='lower center', ncol=3)
plt.grid(True)

plt.savefig('web-searches.png', dpi=150)
```



## 4 Advanced Visualization

```
[26]: import pandas as pd
      from matplotlib import pyplot as plt
      import seaborn as sns
```

```
[27]: df = pd.read_csv('data/tips.csv')
      df
```

```
[27]:
```

|     | total_bill | tip  | sex    | smoker | day  | time   | size |
|-----|------------|------|--------|--------|------|--------|------|
| 0   | 16.99      | 1.01 | Female | No     | Sun  | Dinner | 2    |
| 1   | 10.34      | 1.66 | Male   | No     | Sun  | Dinner | 3    |
| 2   | 21.01      | 3.50 | Male   | No     | Sun  | Dinner | 3    |
| 3   | 23.68      | 3.31 | Male   | No     | Sun  | Dinner | 2    |
| 4   | 24.59      | 3.61 | Female | No     | Sun  | Dinner | 4    |
| ..  | ...        | ...  | ...    | ...    | ...  | ...    | ...  |
| 239 | 29.03      | 5.92 | Male   | No     | Sat  | Dinner | 3    |
| 240 | 27.18      | 2.00 | Female | Yes    | Sat  | Dinner | 2    |
| 241 | 22.67      | 2.00 | Male   | Yes    | Sat  | Dinner | 2    |
| 242 | 17.82      | 1.75 | Male   | No     | Sat  | Dinner | 2    |
| 243 | 18.78      | 3.00 | Female | No     | Thur | Dinner | 2    |

[244 rows x 7 columns]

```
[28]: import numpy as np

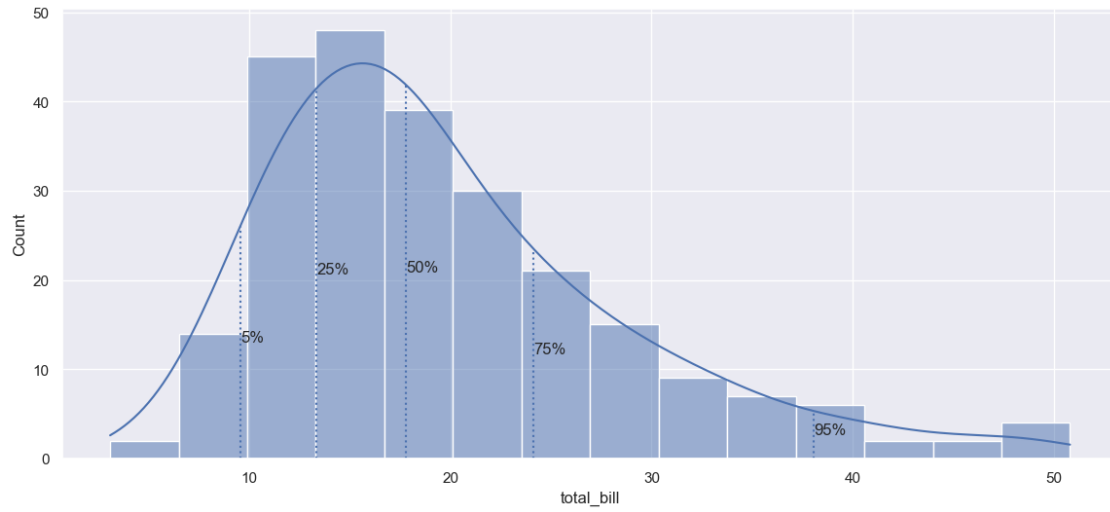
sns.set(rc = {'figure.figsize':(14, 6)})
ax = sns.histplot(x = data['total_bill'], kde=True)

quant_5 = data['total_bill'].quantile(0.05)
quant_25 = data['total_bill'].quantile(0.25)
quant_50 = data['total_bill'].quantile(0.5)
quant_75 = data['total_bill'].quantile(0.75)
quant_95 = data['total_bill'].quantile(0.95)
quant_dict = {'5%': quant_5, '25%': quant_25, '50%': quant_50, '75%': quant_75,
              '95%': quant_95}

kdeline = ax.lines[0]
xs = kdeline.get_xdata()
ys = kdeline.get_ydata()

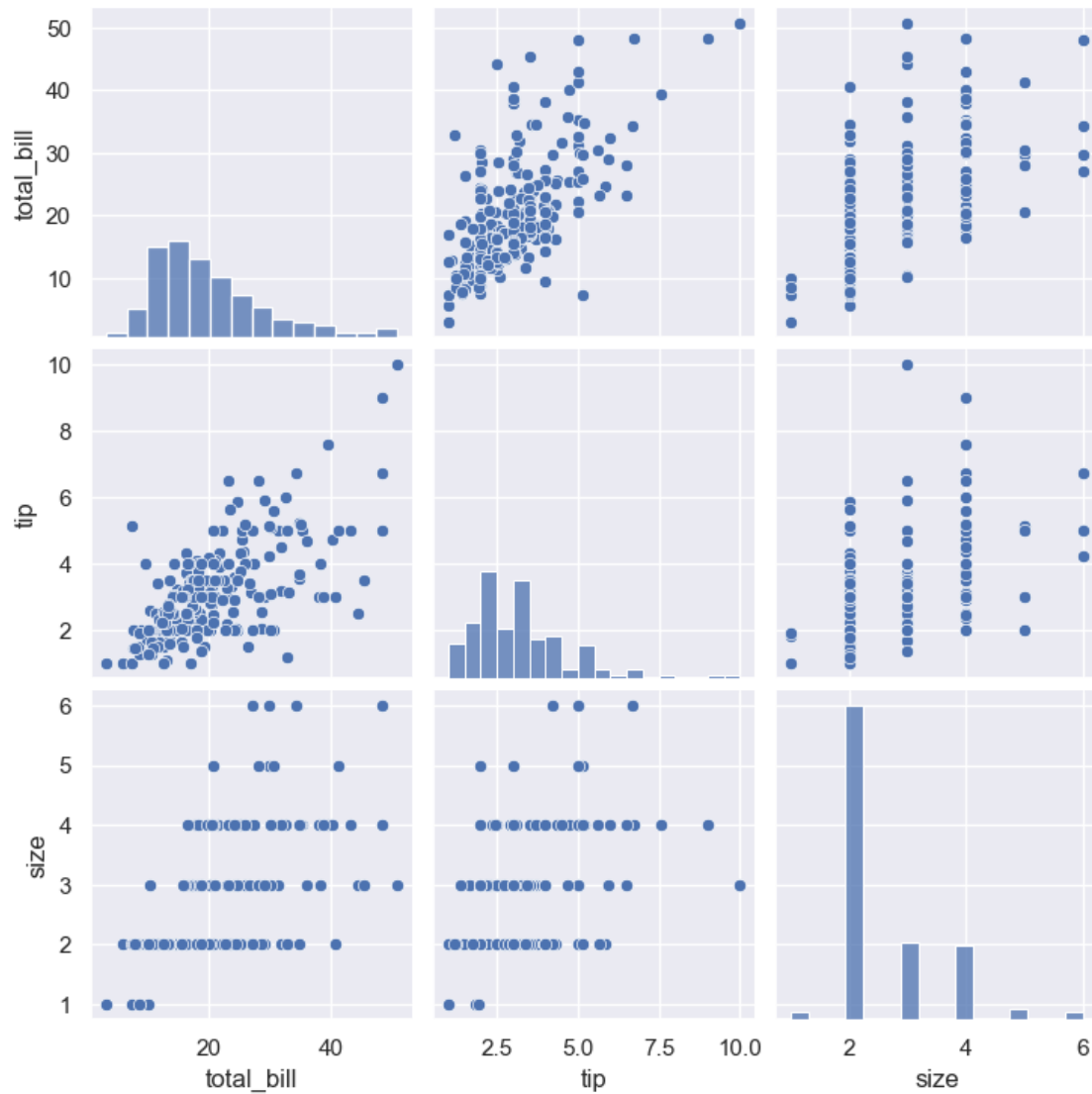
for key, value in quant_dict.items():
    height = np.interp(value, xs, ys)
    ax.vlines(value, 0, height, ls=':')
    ax.text(value, height * 0.5, key, rotation=0)

plt.show()
```



#### 4.0.1 Pairplot

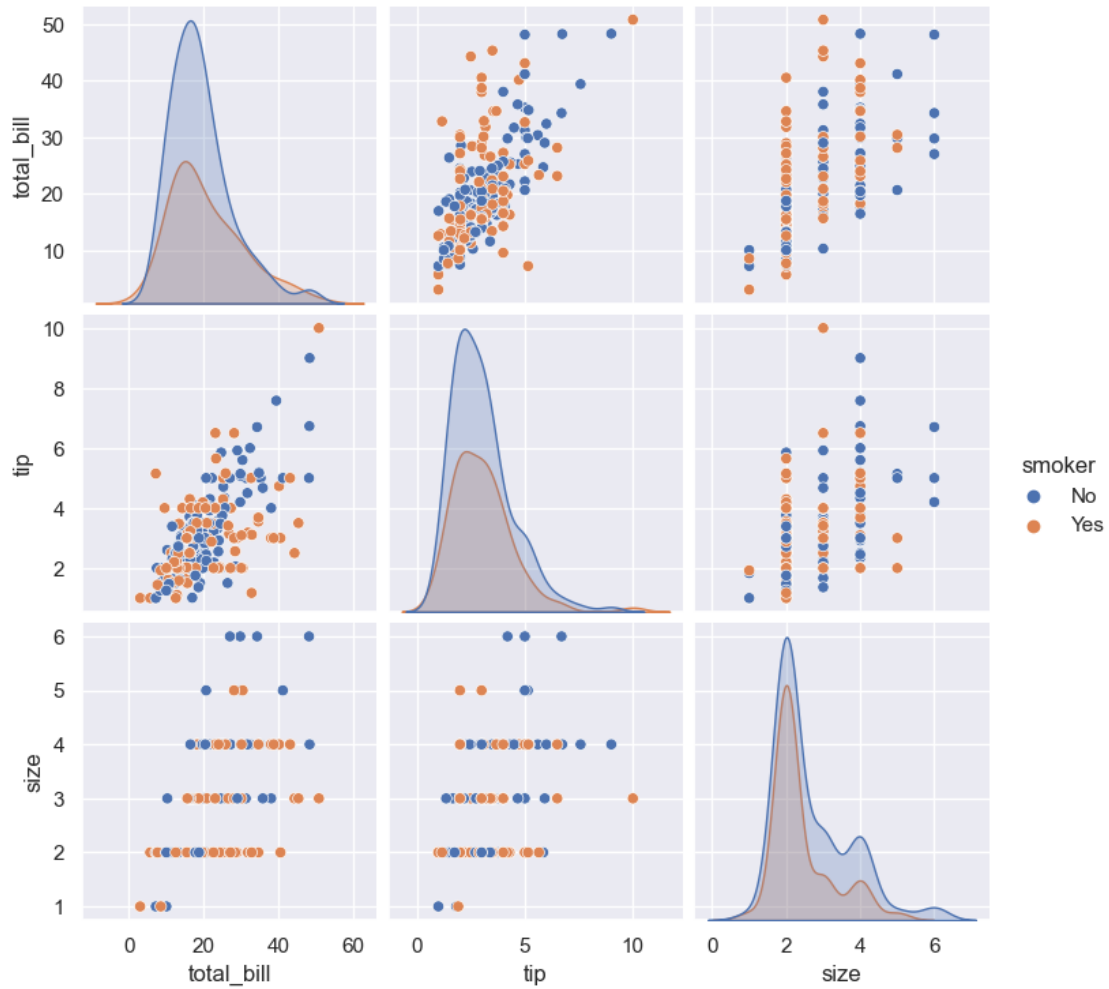
```
[29]: sns.pairplot(df)  
plt.show()
```



```
[30]: df.value_counts('smoker')
```

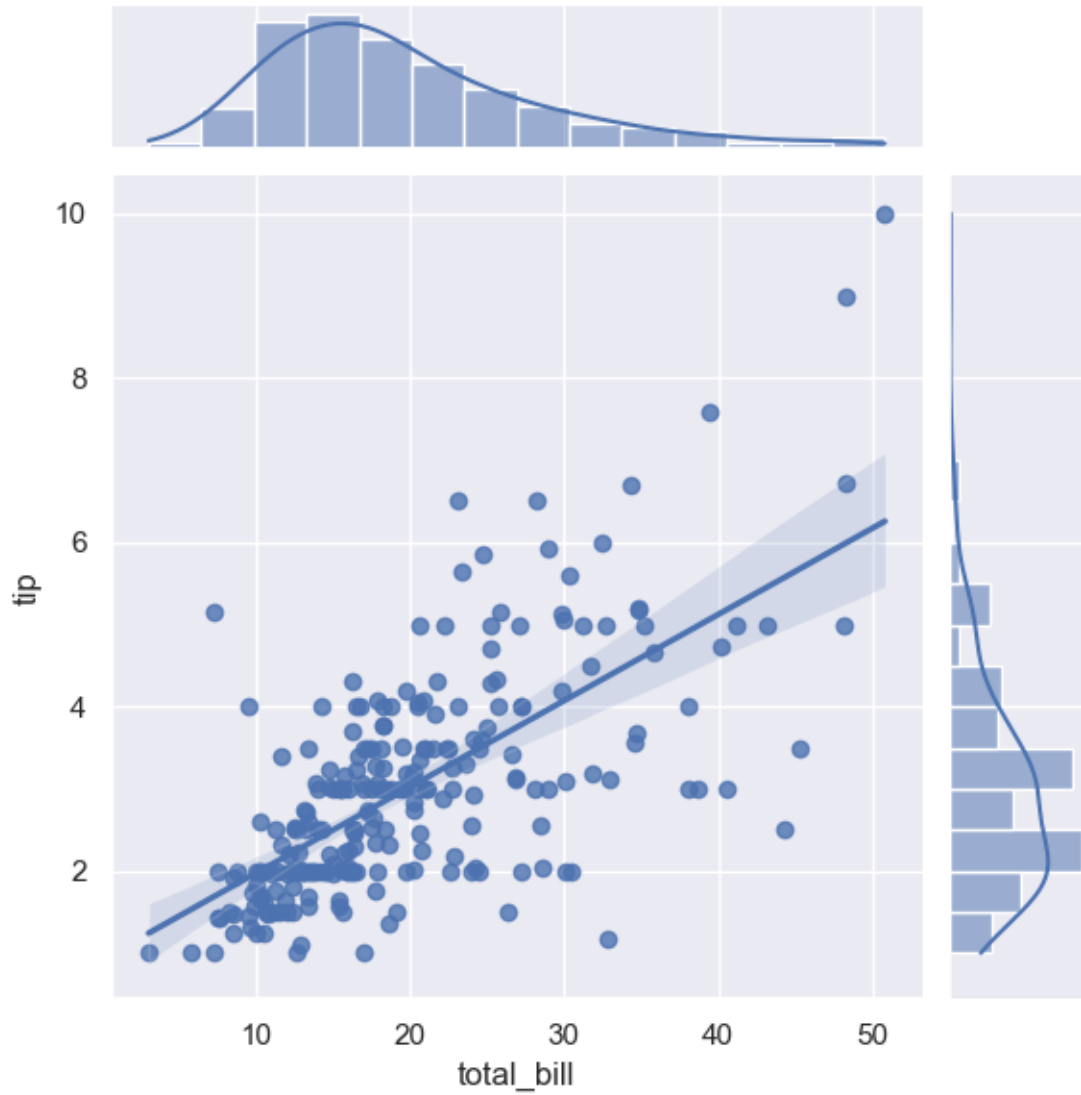
```
[30]: smoker
No    151
Yes    93
dtype: int64
```

```
[31]: sns.pairplot(df, hue='smoker')
plt.show()
```



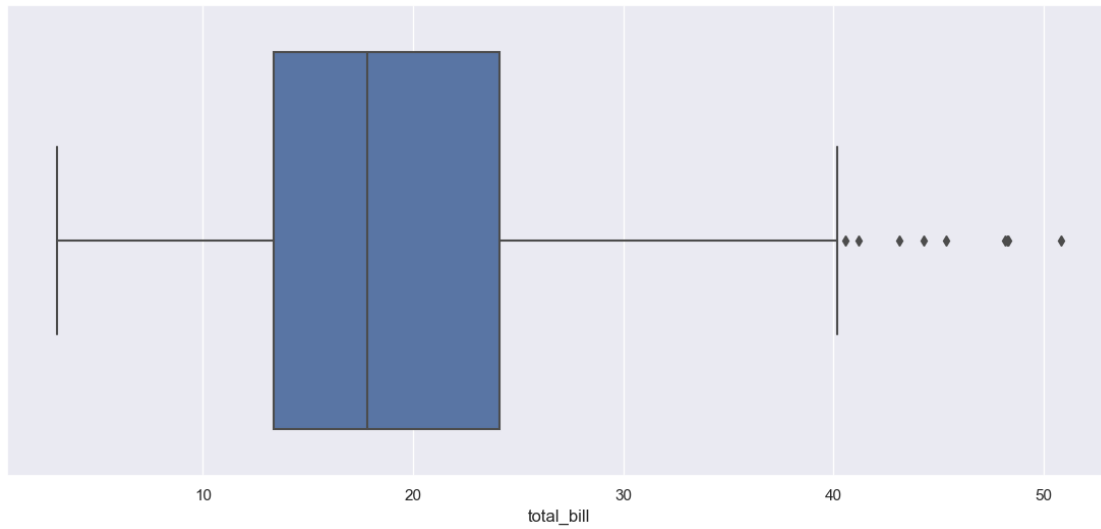
#### 4.0.2 Linear regression with distributions

```
[32]: sns.jointplot(x="total_bill", y="tip", data=df, kind="reg")
plt.show()
```

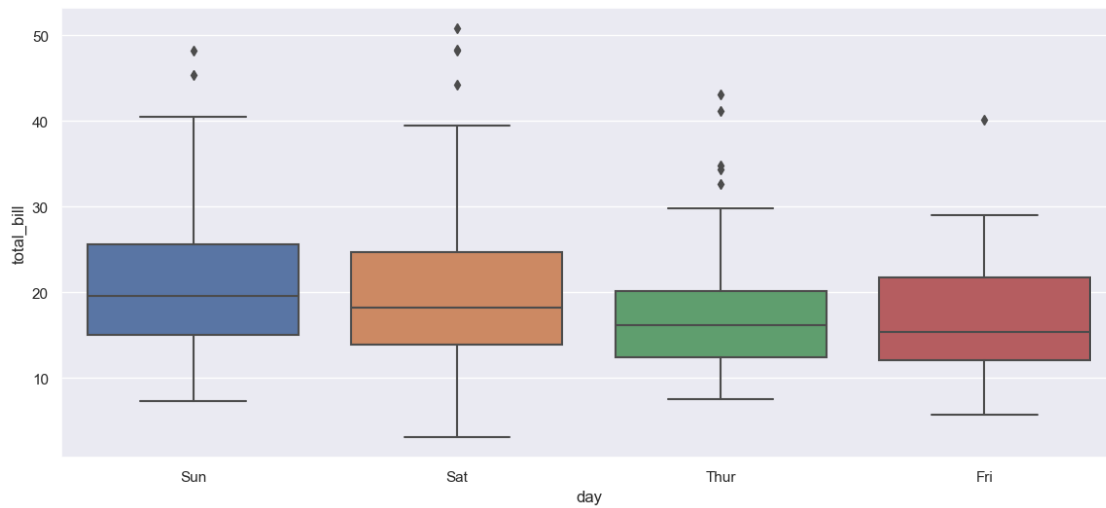


#### 4.0.3 Box Plot

```
[33]: sns.boxplot(x=df["total_bill"])  
plt.show()
```



```
[34]: sns.boxplot(x="day", y="total_bill", data=df)
plt.show()
```



#### 4.0.4 Heatmap

```
[35]: # Load the example flights dataset and convert to long-form
flights_long = sns.load_dataset("flights")
flights_long
```

```
[35]:   year month passengers
0   1949   Jan        112
```



|     |      |     |     |
|-----|------|-----|-----|
| 1   | 1949 | Feb | 118 |
| 2   | 1949 | Mar | 132 |
| 3   | 1949 | Apr | 129 |
| 4   | 1949 | May | 121 |
| ..  | ...  | ... | ... |
| 139 | 1960 | Aug | 606 |
| 140 | 1960 | Sep | 508 |
| 141 | 1960 | Oct | 461 |
| 142 | 1960 | Nov | 390 |
| 143 | 1960 | Dec | 432 |

[144 rows x 3 columns]

```
[36]: flights = flights_long.pivot("month", "year", "passengers")
      flights
```

C:\Users\88019\AppData\Local\Temp\ipykernel\_7132\254108779.py:1: FutureWarning:  
In a future version of pandas all arguments of DataFrame.pivot will be keyword-  
only.

```
      flights = flights_long.pivot("month", "year", "passengers")
```

```
[36]: year    1949    1950    1951    1952    1953    1954    1955    1956    1957    1958    1959    1960
      month
      Jan      112      115      145      171      196      204      242      284      315      340      360      417
      Feb      118      126      150      180      196      188      233      277      301      318      342      391
      Mar      132      141      178      193      236      235      267      317      356      362      406      419
      Apr      129      135      163      181      235      227      269      313      348      348      396      461
      May      121      125      172      183      229      234      270      318      355      363      420      472
      Jun      135      149      178      218      243      264      315      374      422      435      472      535
      Jul      148      170      199      230      264      302      364      413      465      491      548      622
      Aug      148      170      199      242      272      293      347      405      467      505      559      606
      Sep      136      158      184      209      237      259      312      355      404      404      463      508
      Oct      119      133      162      191      211      229      274      306      347      359      407      461
      Nov      104      114      146      172      180      203      237      271      305      310      362      390
      Dec      118      140      166      194      201      229      278      306      336      337      405      432
```

```
[37]: # Draw a heatmap with the numeric values in each cell
      f, ax = plt.subplots(figsize=(16, 8))
      sns.heatmap(flights, annot=True, fmt=".0f")
      plt.show()
```



Visit this page to learn more -> <https://seaborn.pydata.org/examples/index.html>