

Python Matplotlib

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- Plotting library
- Huge number of examples for tackling unique problems

- `import matplotlib as mpl`
- `import matplotlib.pyplot as plt`
- `plt.plot(x_values, y_values, format_string [, x, y, format,])`

Matplotlib-plot function

- `import matplotlib as mpl`
- `import matplotlib.pyplot as plt`
- `plt.plot(x_values, y_values, format_string [, x, y, format,])`
- `x_values` and `y_values`: numpy arrays, if not, internal conversion to numpy array
- `format_string`: the color and line type of the plot
 - 'bs' blue squares
 - 'ro': red circles
- Line properties: Set them via keyword arguments to the plot function.
 - `label`, `linewidth`, `animated`, `color`, etc...

Matplotlib-plot function

```
■ import numpy as np
import matplotlib.pyplot as plt

# evenly sampled time at .2 intervals
t = np.arange(0., 5., 0.2)

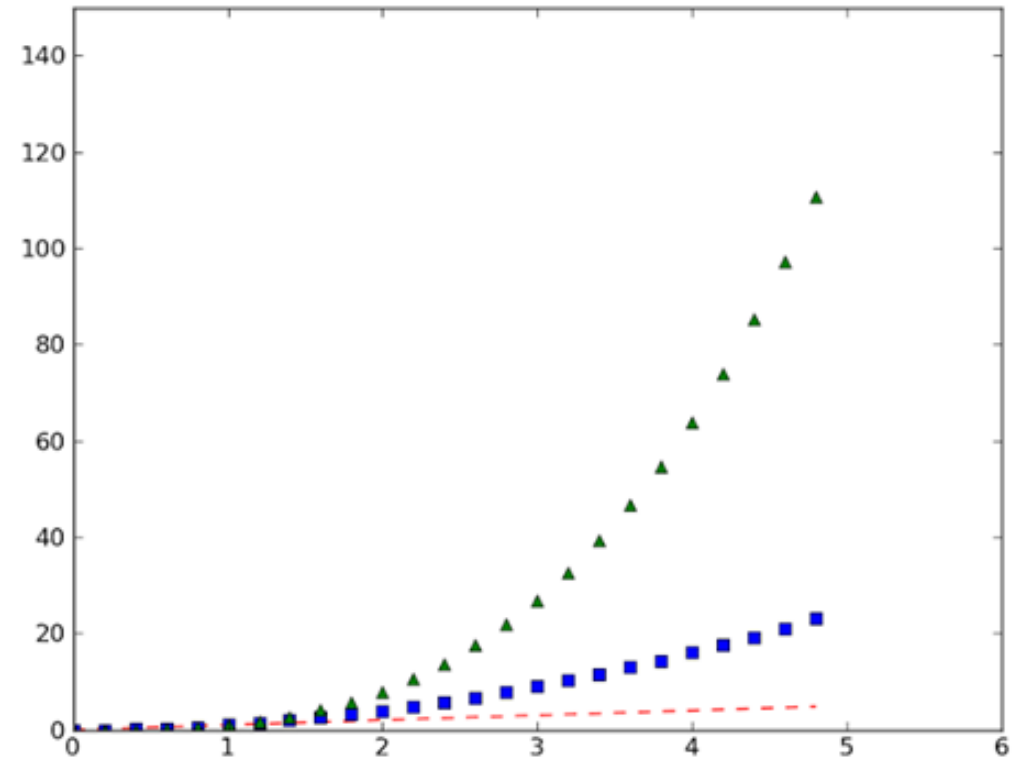
# red dashes, blue squares and green triangles
plt.plot(t, t, 'r--', t, t**2, 'bs', t, t**3, 'g^')
plt.axis([0, 6, 0, 150]) # x and y range of axis
plt.show()
```

Matplotlib-plot function

```
■ import numpy as np
import matplotlib.pyplot as plt

# evenly sampled time at .2 intervals
t = np.arange(0., 5., 0.2)

# red dashes, blue squares and green triangles
plt.axis([0, 6, 0, 150]) # x and y range of ax
plt.show()
```



Matplotlib-plot function

```
import numpy as np
import matplotlib.figure as figure

t = np.arange(0, 5, .2)

f = figure.Figure()
axes = f.add_subplot(111)
axes.plot(t, t, 'r--', t, t**2, 'bs', t, t**3, 'g^')
axes.axis([0, 6, 0, 150])
```

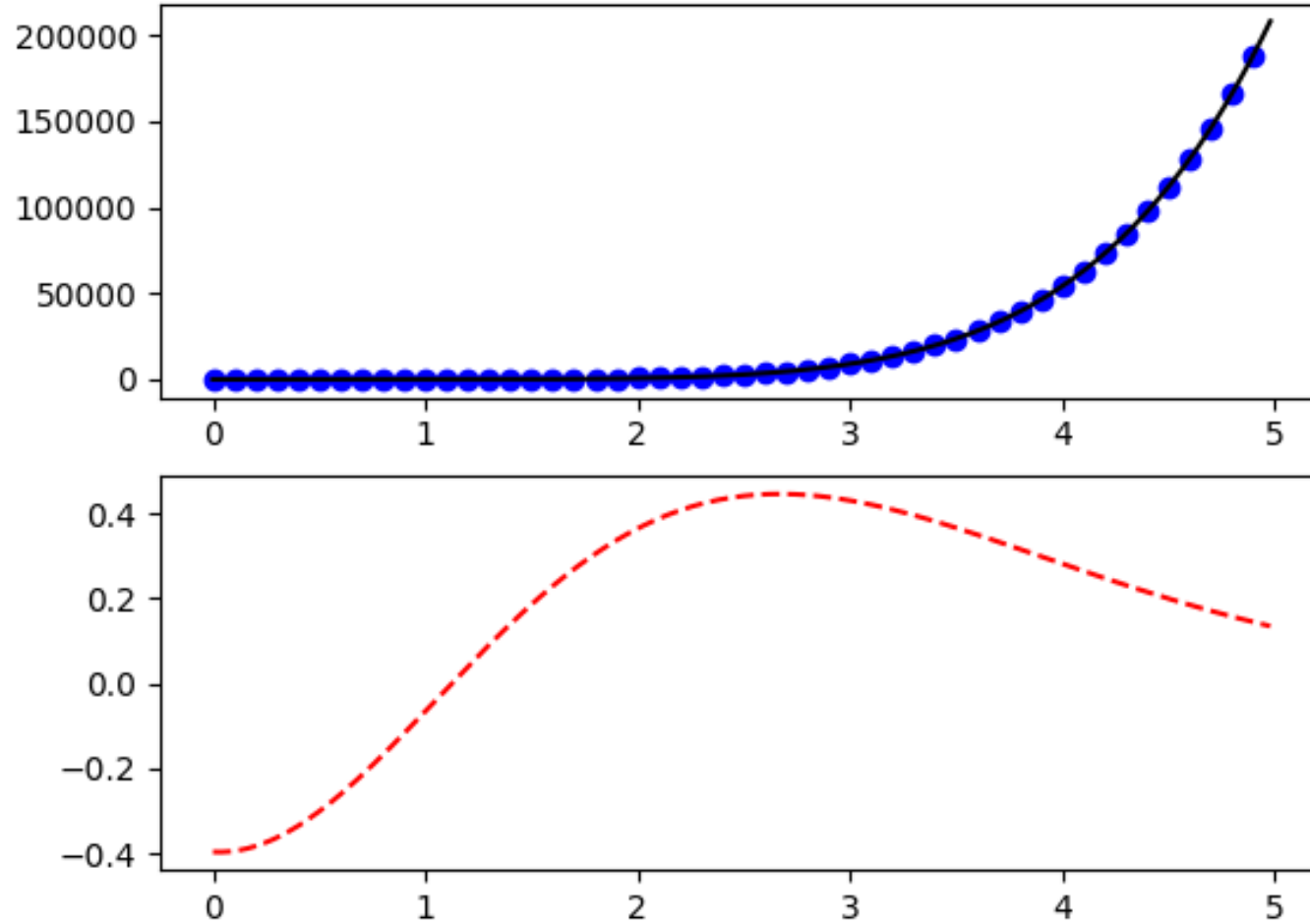
- A script can generate multiple figures, but typically you'll only have one.
- To create multiple plots within a figure, either use the `subplot()` function which manages the layout of the figure or use `add_axes()`.

Matplotlib-plot function

```
import numpy as np
import matplotlib.pyplot as plt
import scipy.special

def Legendre(t,n):
    p=scipy.special.legendre(n)
    return p(t)
def Bessel(t,n):
    return scipy.special.jv(t,n)
t1 = np.arange(0.0, 5.0, 0.1) #50
t2 = np.arange(0.0, 5.0, 0.02) #250
plt.figure(1)
n=6
plt.subplot(211) # 2 rows, 1 column, 1st plot
plt.plot(t1, Legendre(t1,n), 'bo', t2, Legendre(t2,n), 'k')
plt.subplot(212) # 2 rows, 1 column, 2nd plot
plt.plot(t2, Bessel(t2,4), 'r--')
plt.show()
```

Matplotlib-plot function

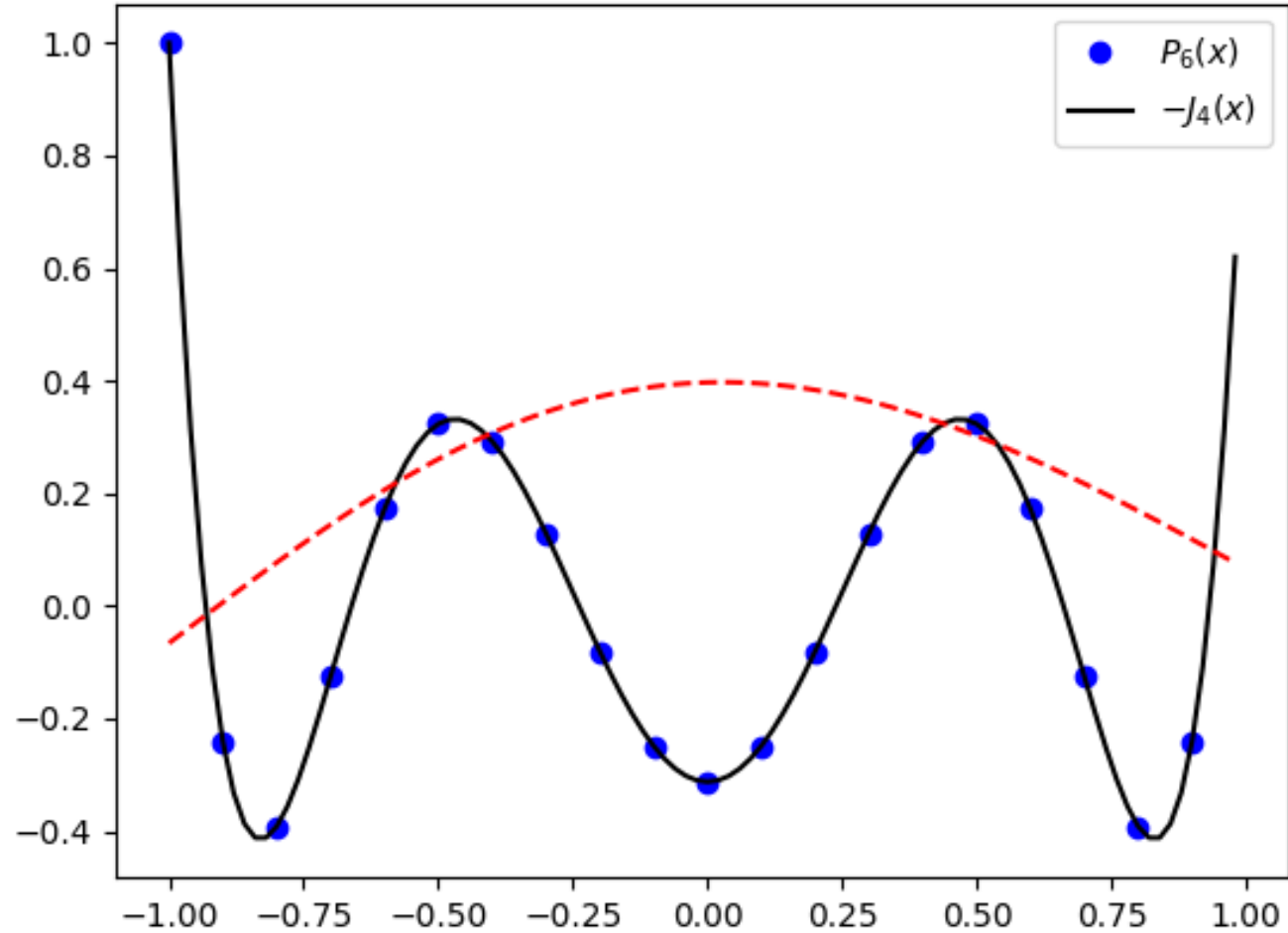


Matplotlib-plot function

```
import numpy as np
import matplotlib.pyplot as plt
import scipy.special

def Legendre(t,n):
    p=scipy.special.legendre(n)
    return p(t)
def Bessel(t,n):
    return scipy.special.jv(t,n)
t1 = np.arange(-1.0, 1.0, 0.1)
t2 = np.arange(-1.0, 1.0, 0.02)
plt.figure(1)
n=6
plt.plot(t1, Legendre(t1,n), 'bo', t2, Legendre(t2,n), 'k')
plt.plot(t2, -Bessel(t2,4), 'r--')
plt.legend(['$P_6(x)$', '$-J_4(x)$'])
plt.show()
```

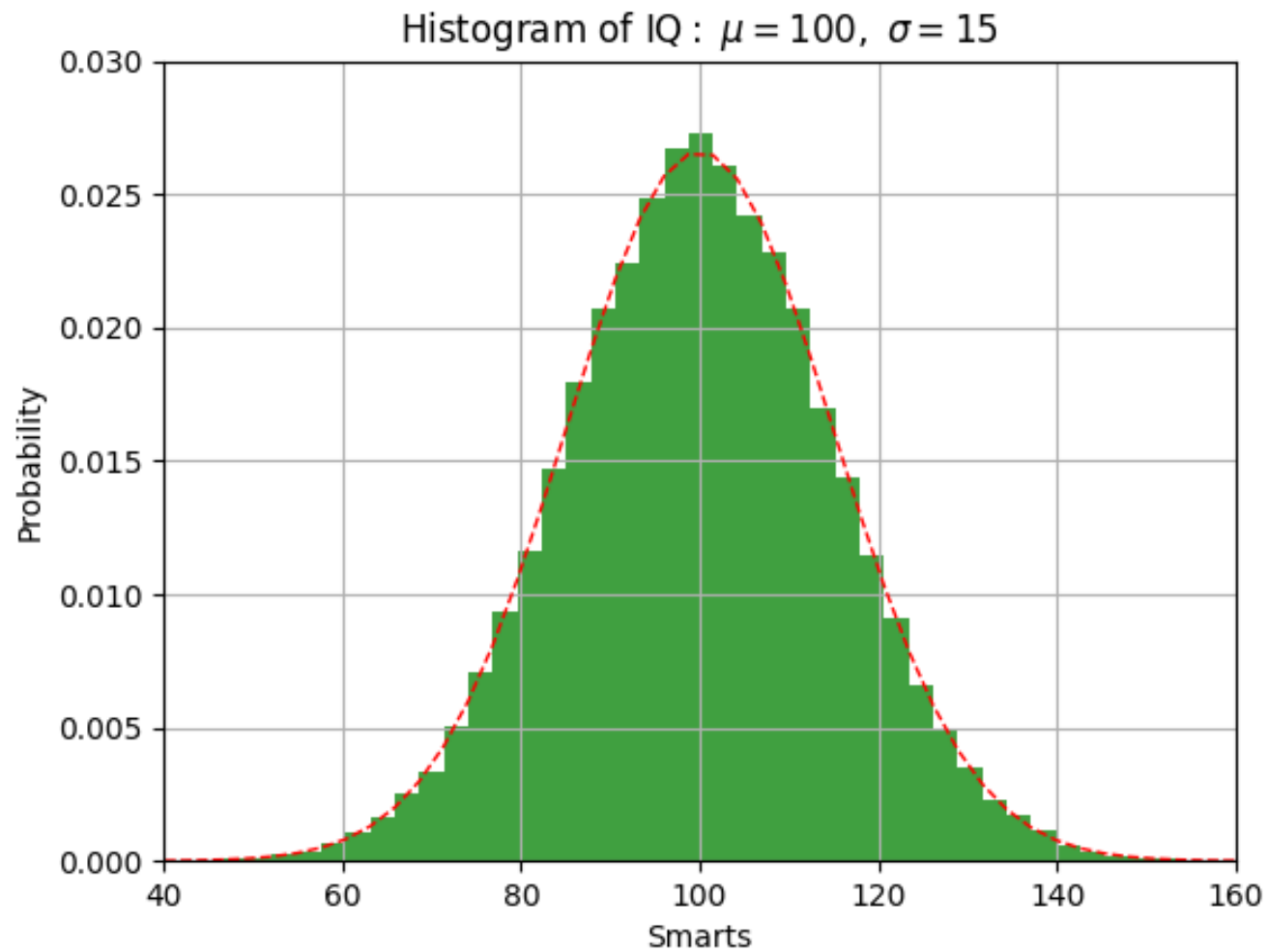
Matplotlib-plot function



- `text()` : to add text in an arbitrary location
- `xlabel()`, `ylabel()`, `title()`, **axes labels and title**
- `clear()` removes all plots from the axes.

Matplotlib-plot function

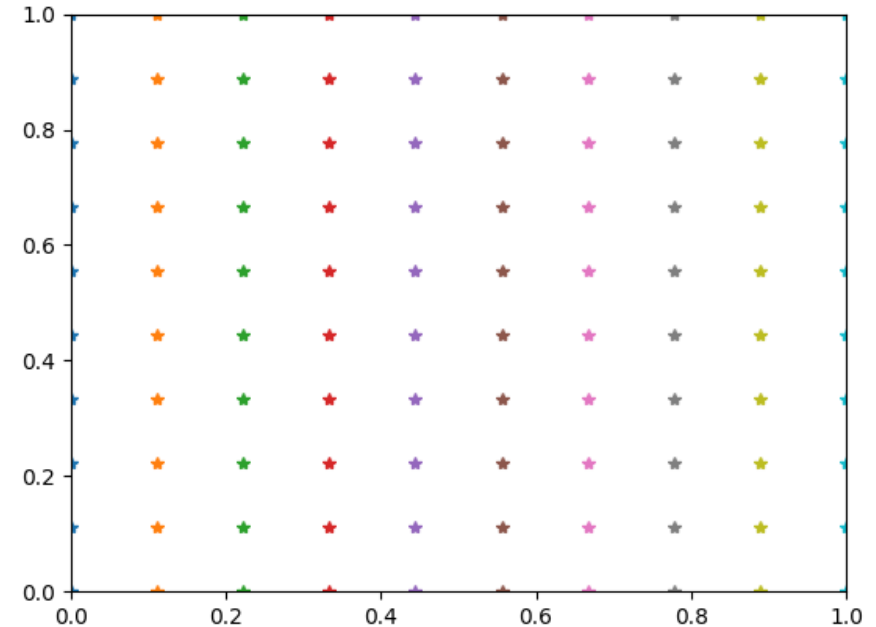
```
import numpy as np
from scipy.stats import norm
import matplotlib.pyplot as plt
mu, sigma = 100, 15
x = mu + sigma*np.random.randn(100000)
# the histogram of the data
n, bins, patches = plt.hist(x, 50, density=True, facecolor='green', alpha=0.75)
# add a 'best fit' line
y = norm.pdf(bins, mu, sigma)
l = plt.plot(bins, y, 'r--', linewidth=1)
plt.xlabel('Smarts')
plt.ylabel('Probability')
plt.title(r'$\mathrm{Histogram\ of\ IQ:}\ \mu=100,\ \sigma=15$')
plt.axis([40, 160, 0, 0.03])
plt.grid(True)
plt.show()
```



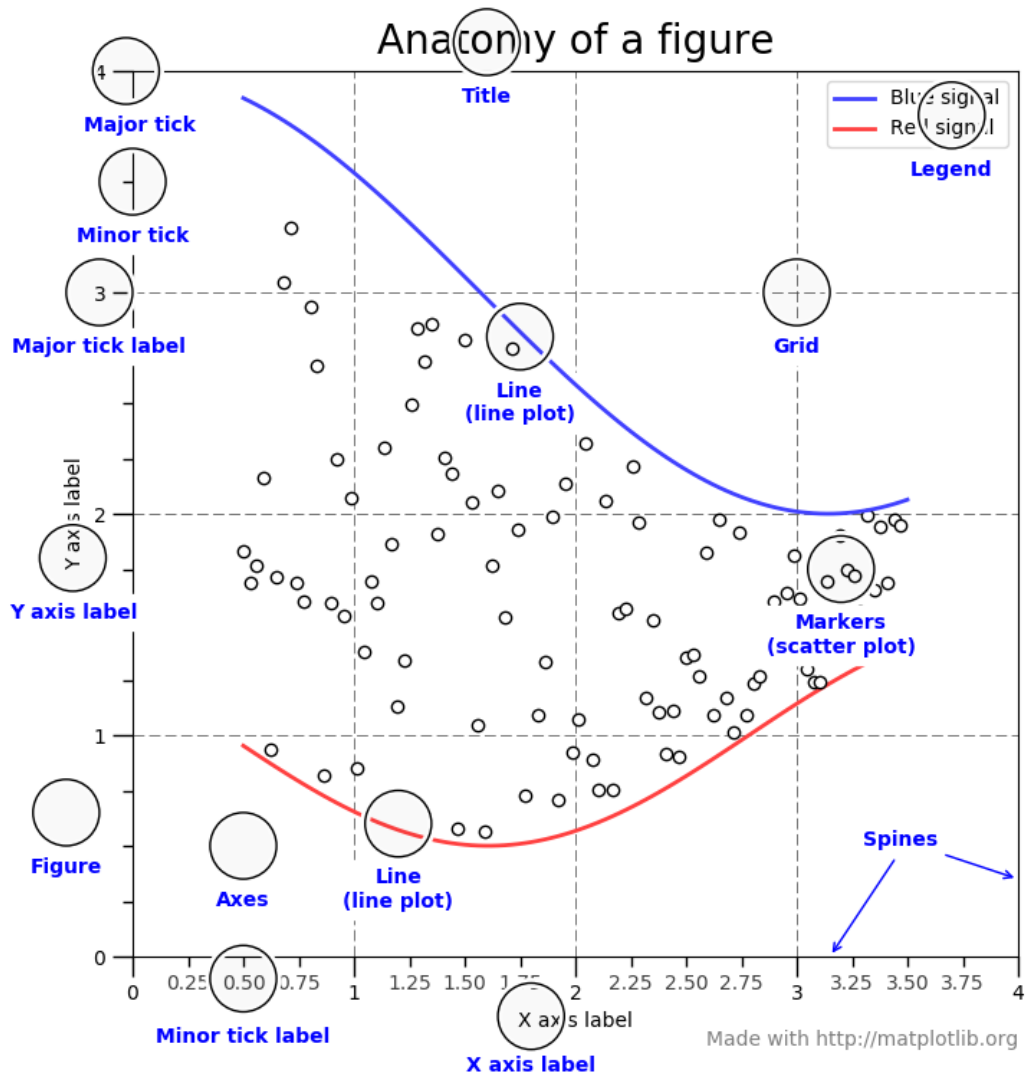
Matplotlib-plot function

#FDM Discretization

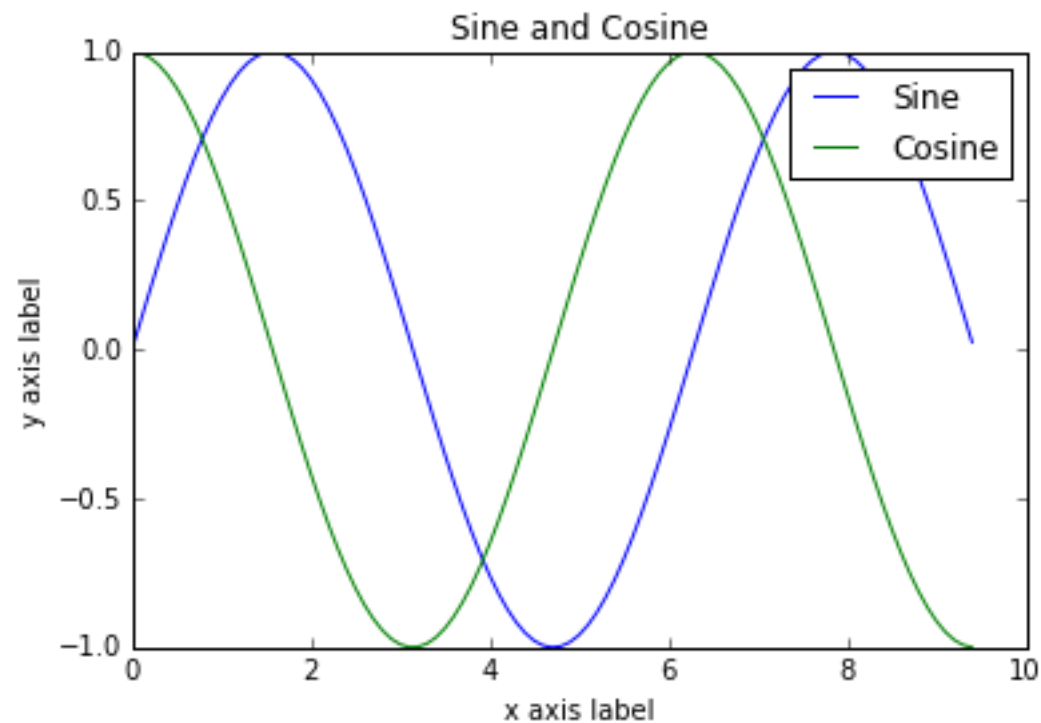
```
import numpy as np
x=np.linspace(0,1,num=10,endpoint=True)
y=np.linspace(0,1,num=10,endpoint=True)
X,Y=np.meshgrid(x,y)
import matplotlib.pyplot as plt
plt.plot(X,Y,'*')
plt.axis([0,1,0,1])
plt.show()
```



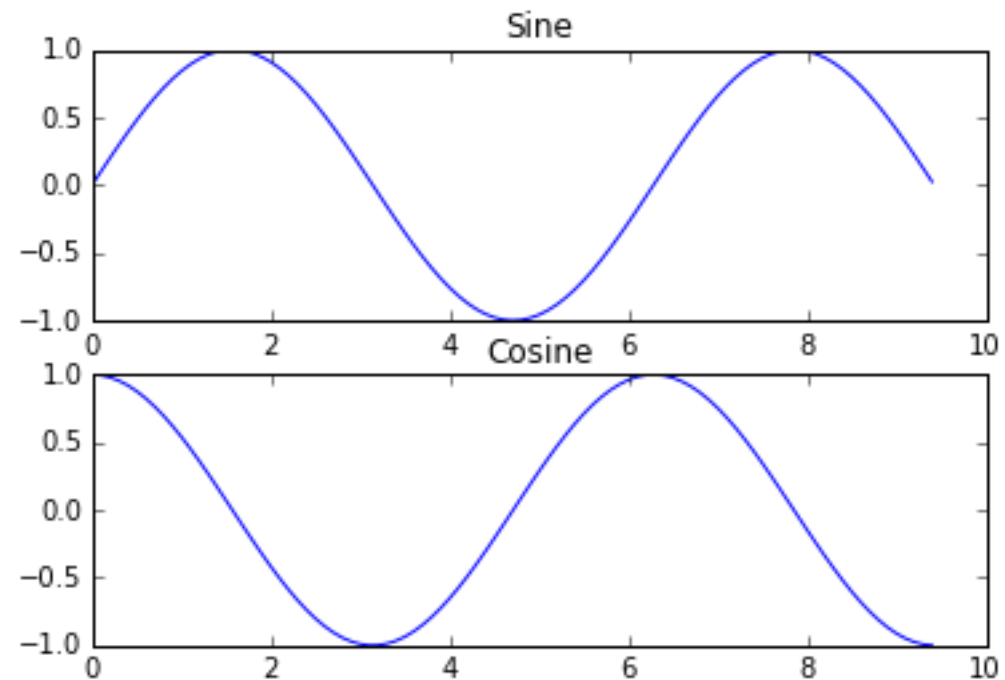
Matplotlib-plot function



Produce the following Graph using Matplotlib



Produce the following Graph using Matplotlib



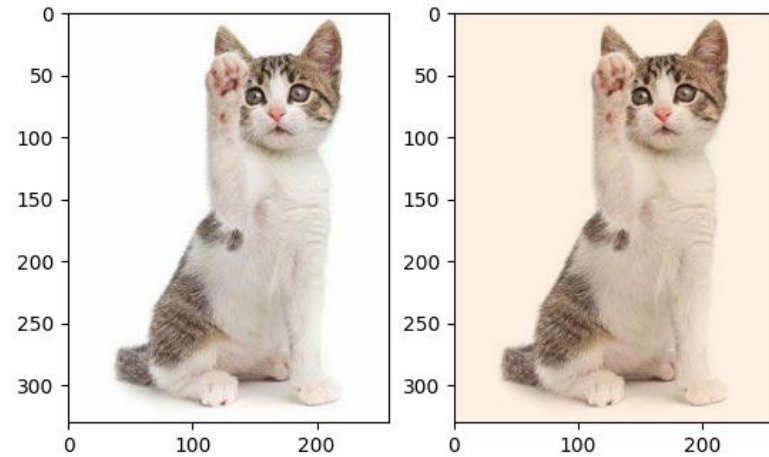
Matplotlib-plot function

```
import numpy as np
from matplotlib.pyplot import imread
import matplotlib.pyplot as plt

img = imread('cat.jpg')
img_tinted = img * [1, 0.95, 0.9]

plt.subplot(1, 2, 1)
plt.imshow(img)

plt.subplot(1, 2, 2)
plt.imshow(np.uint8(img_tinted))
plt.show()
```

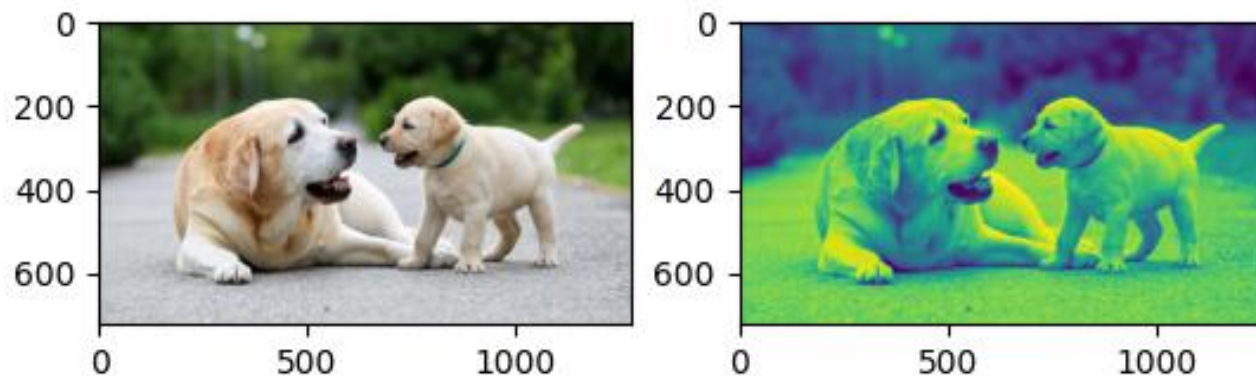


Matplotlib-plot function

```
##Dog
import numpy as np
from matplotlib.pyplot import imread
import matplotlib.pyplot as plt

def rgb2gray(rgb):
    r, g, b = rgb[:, :, 0], rgb[:, :, 1], rgb[:, :, 2]
    return 0.2989 * r + 0.5870 * g + 0.1140 * b

img = imread('dog.jpg')
grayscale=rgb2gray(img)
print(grayscale.shape)
plt.subplot(1, 2, 1)
plt.imshow(img)
plt.subplot(1, 2, 2)
plt.imshow(grayscale)
plt.show()
```

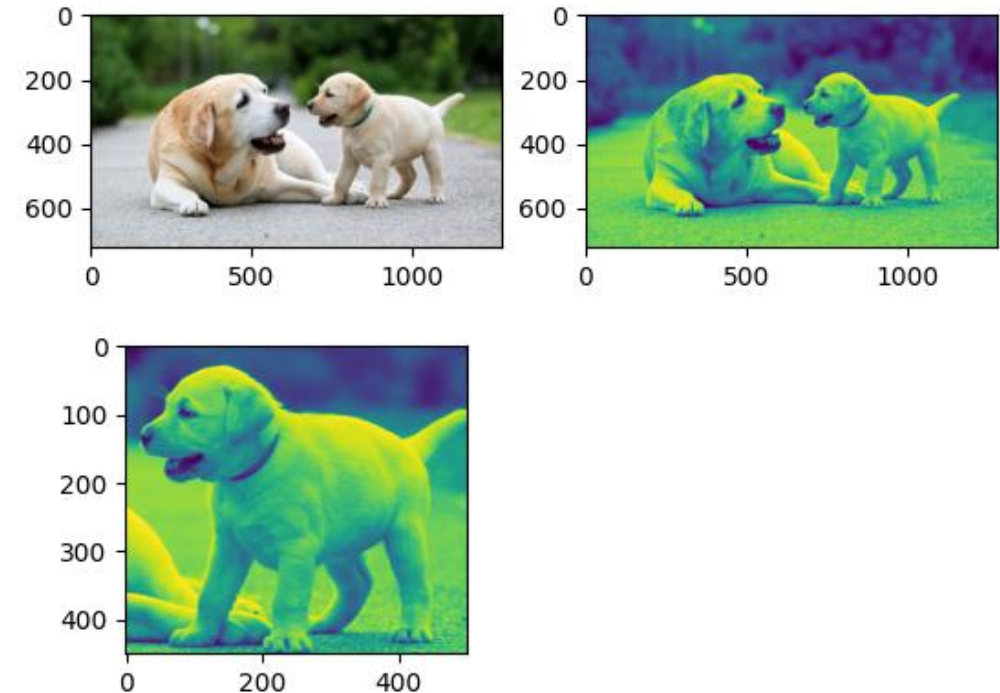


Matplotlib-plot Slicing

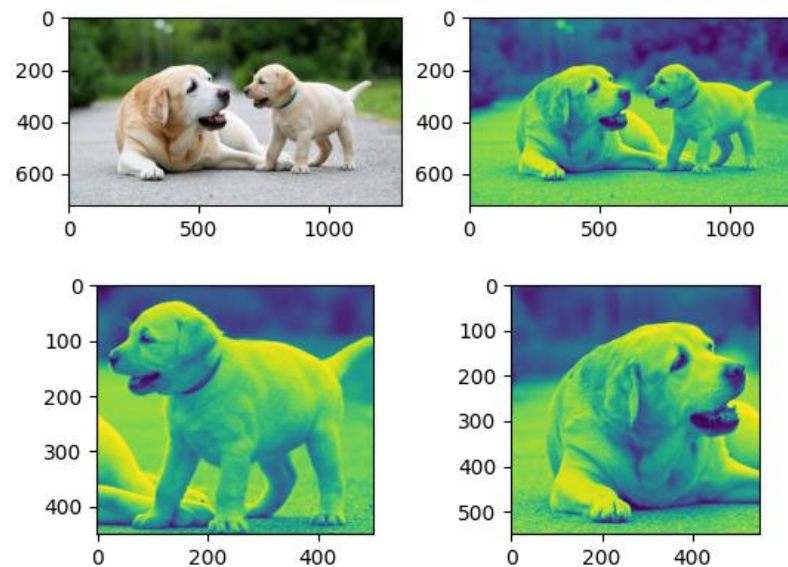
```
plt.subplot(2, 2, 1)  
plt.imshow(img)
```

```
plt.subplot(2, 2, 2)  
plt.imshow( grayscale )
```

```
plt.subplot(2, 2, 3)  
plt.imshow( grayscale[150:600, 650:1150] )  
plt.show()
```



Produce the following Graph using Matplotlib



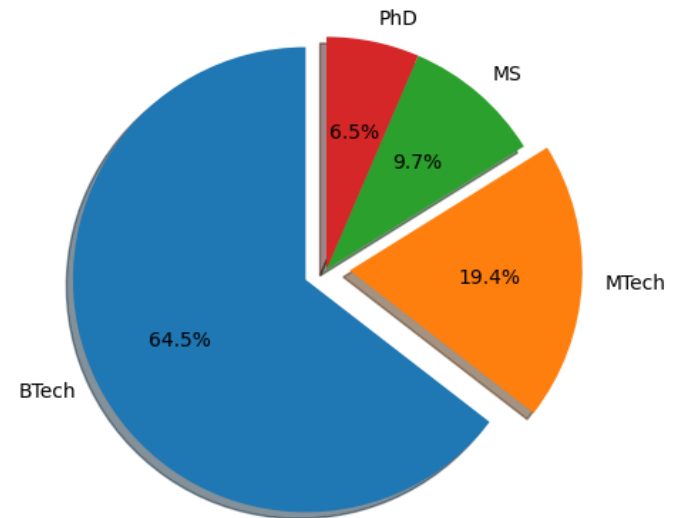
Matplotlib-plot function

```
import matplotlib.pyplot as plt

labels = 'BTech', 'MTech', 'MS', 'PhD'
sizes = [100, 30, 15, 10]
explode = (0.1, 0.1, 0, 0) # only "explode"

fig1, ax1 = plt.subplots()
ax1.pie(sizes, explode=explode,
        labels=labels, autopct='%1.1f%%',
        shadow=True, startangle=90)
ax1.axis('equal')

plt.show()
```

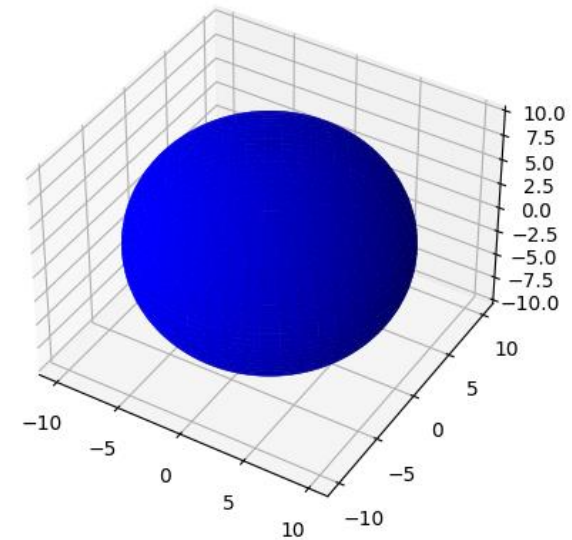


Matplotlib-plot function

```
import matplotlib.pyplot as plt
import numpy as np
fig = plt.figure()
ax = fig.add_subplot(111, projection='3d')

# Make data
u = np.linspace(0, 2 * np.pi, 100)
v = np.linspace(0, np.pi, 100)
x = 10 * np.outer(np.cos(u), np.sin(v))
y = 10 * np.outer(np.sin(u), np.sin(v))
z = 10 * np.outer(np.ones(np.size(u)),
np.cos(v))

# Plot the surface
ax.plot_surface(x, y, z, color='b')
plt.show()
```

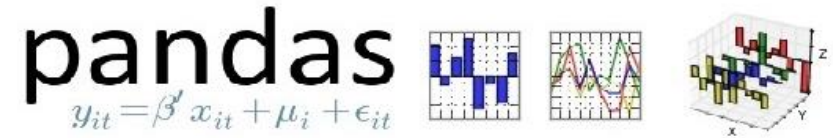




End of Python Matplotlib



IP[y]:
IPython



Python Pandas

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- A Python Library – Working with datasets
- Manipulating Tables
- Built on top of Numpy
- Easy to visualize using matplotlib
- Data Structures – Series and DataFrame

- Analyze Data
- Clean Data
- Explore Data
- Manipulate Data
- Pandas – Panel Data, Python Data Analysis
- Created by McKinney (2008)

- Analyze Big Data
- Make Conclusions based on Statistical Theories
- Clean Messy Datasets, make it readable and relevant so that useful in data science

- `import numpy as np`
- `import pandas as pd`

Basic Data Structures in Pandas

- **Series**: A one-dimensional labelled array holding data of any type
 - Integers, string, python objects etc
- `s=pd.Series([1,3,5,np.nan,6,9])`
- `print(s)`
- **DataFrame**: A two-dimensional data structure that holds data like two-dimensional array or a table with rows and columns
 - `d={'col1':[1,2],'col2':[3,4]}`
 - `df=pd.DataFrame(data=d)`
 - `Print(df)`

Basic Data Structures in Pandas

```
import pandas as pd
import numpy as np
dates = pd.date_range("20240201", periods=8)
df = pd.DataFrame(np.random.randn(8, 6), index=dates,
columns=list("ABCDEF"))
print(df)
```

Basic Data Structures in Pandas

```
mydata={
    "Roll Number": ["MA24M001", "MA24M002", "MA24M004", "MA24M005"],
    "Name": ["ABHAY", "ABLIPSA", "DEBASISH P", "DEV UTTAM"],
    "MA508L": [85, 75, 95, 45],
    "MA509L": [65, 35, 85, 65],
    "MA510L": [82, 72, 52, 55],
    "MA511L": [81, 71, 65, 75],
    "MA632L": [55, 61, 45, 25],
    "MA601L": [52, 75, 62, 95],
    "MA522M": [85, 71, 65, 75],
}
df=pd.DataFrame(data=mydata)
print(df)
```

Basic Data Structures in Pandas

```
df = pd.DataFrame(  
    {  
        "Roll Number": ["MA24M001", "MA24M002", "MA24M004", "MA24M005"],  
        "Name": ["ABHAY", "ABLIPSA", "DEBASISH P", "DEV UTTAM"],  
        "MA508L": [85, 75, 95, 45],  
        "MA509L": [65, 35, 85, 65],  
        "MA510L": [82, 72, 52, 55],  
        "MA511L": [81, 71, 65, 75],  
        "MA632L": [55, 61, 45, 25],  
        "MA601L": [52, 75, 62, 95],  
        "MA522M": [85, 71, 65, 75],  
    }  
)  
print(df)
```

Data from Numpy Array

```
df2 = pd.DataFrame(np.array([[1, 2, 3], [4, 5, 6], [7, 8, 9]]),  
                   columns=['a', 'b', 'c'])  
  
print(df2)
```

Syntax:

```
pd.DataFrame(data=None, index=None, columns=None, dtype=None, copy=None)
```

Syntax:

```
pd.DataFrame(data=None, index=None, columns=None, dtype=None, copy=None)
```

- ❑ Data: ndarray (homogenous or structure, iterable, dict or DataFrame)
 - Dict: Series, arrays, constants, dataclass or list-like objects.
 - Column order follows insertion-order.
 - Series which have an index defined, it is aligned by its index.
 - This alignment also occurs if data is a Series or a DataFrame itself.
 - Alignment is done on Series/DataFrame inputs.
 - dicts, column order follows insertion-order.
- ❑ Index:
 - Rangeindex if no indexing provided
- ❑ Columns:
 - Default rangeindex, otherwise column labels

```
df.head(2) #To view the top 2 rows
df.tail(3) #To view the bottom 3 rows
df.index   #To display the index labels of the DataFrame (default 0,1,2)
#RangeIndex(start=0, stop=4, step=1)
df.columns #To display the column name
#Index(['Roll Number', 'Name', 'MA508L', 'MA509L', 'MA510L', 'MA511L',
'MA632L', 'MA601L', 'MA522M'],
df.to_numpy() #converts data to numpy array.
```

Note: Numpy arrays have one dtype for the entire array while pandas DataFrames have one dtype per column

```
df.ndim      #To number of dimension (2 for above case)
df.size      #number of elements in the object (36)
df.sum(axis=1) #To compute column sum
df.sum(axis=0) #To compute row sum
df.T # Transpose of your data
```

```
df.to_numpy() #converts data to numpy array.
```

Note: Numpy arrays have one dtype for the entire array while pandas DataFrames have one dtype per column

Quick Statistic Summary of your Data

```
df.describe()
```

This command shows a quick statistics summary of your data

```
count    MA508L    MA509L    MA510L    MA511L    MA632L    MA601L    \
count    4.000000    4.000000    4.000000    4.000000    4.000000    4.000000
mean     75.000000    62.500000    65.250000    73.000000    46.500000    71.000000
std      21.602469    20.615528    14.221463     6.733003    15.779734    18.565200
min      45.000000    35.000000    52.000000    65.000000    25.000000    52.000000
25%      67.500000    57.500000    54.250000    69.500000    40.000000    59.500000
50%      80.000000    65.000000    63.500000    73.000000    50.000000    68.500000
75%      87.500000    70.000000    74.500000    76.500000    56.500000    80.000000
max      95.000000    85.000000    82.000000    81.000000    61.000000    95.000000

count    MA522M
mean     74.000000
std      8.406347
min      65.000000
25%      69.500000
50%      73.000000
75%      77.500000
max      85.000000
```

Count the number of null observations

Max/min/mean/std:

max/min/mean/std values in the object

25%/50%/75%: respective percentiles


```
df.mean() #mean
df.mean(axis=1) #mean in axis=1
df.max(axis=0) #max in axis=0
df.std(axis=0) #standard deviations
df.sum(axis=0) #sum of the values over the requested axis
df.skew(axis=0) #unbiased skew over requested axis
df.sem(axis=0) #unbiased standard error of the mean over requested axis
df.kurt(axis=0) #unbiased kurtosis
df.kurtosis(axis=0) #unbiased kurtosis using Fisher's definition
df.corr(method='pearson') #correlation of columns
#method: pearson. Kendall, spearman
df.corrwith(other,axis=0) #compute pairwise correlation
```

```
df.sort_index(axis=1, ascending=False)  
#axis 0 for row, 1 for column, default 0
```

Syntax:

```
df.sort_index(*, axis=0, level=None, ascending=True, inplace=False,  
kind='quicksort', na_position='last', sort_remaining=True,  
ignore_index=False, key=None) [source]
```

Kind: quicksort, mergesort, heapsort, stable, default: quicksort

```
df = pd.DataFrame({"a": [1, 2, 3, 4]}, index=['A', 'b', 'C', 'd'])
```

```
df.sort_index(key=lambda x: x.str.lower())
```

```
df.sort_values(by= "MA508L") #Sort by values along either axis
```

Syntax

```
df.sort_values(by, *, axis=0, ascending=True, inplace=False, kind='quicksort', na_position='last', ignore_index=False, key=None)
```

Kind: quicksort, mergesort, heapsort, stable, default: quicksort

```
df["MA508L"] #To get the column corresponds to MA508L
df.MA508L    #To get the column corresponds to MA508L
df[1:3]     #slice matching rows

df.loc[0]    #selecting a row matching the label
df.loc[:, ["MA508L", "MA509L"]] #multiple columns

df.iloc[2]   #select by position of the passed integers
df.iloc[3:5, 0:2] #select slices similar to numpy
df.iloc[[1, 2, 4], [0, 2]] #Lists of integer position locations

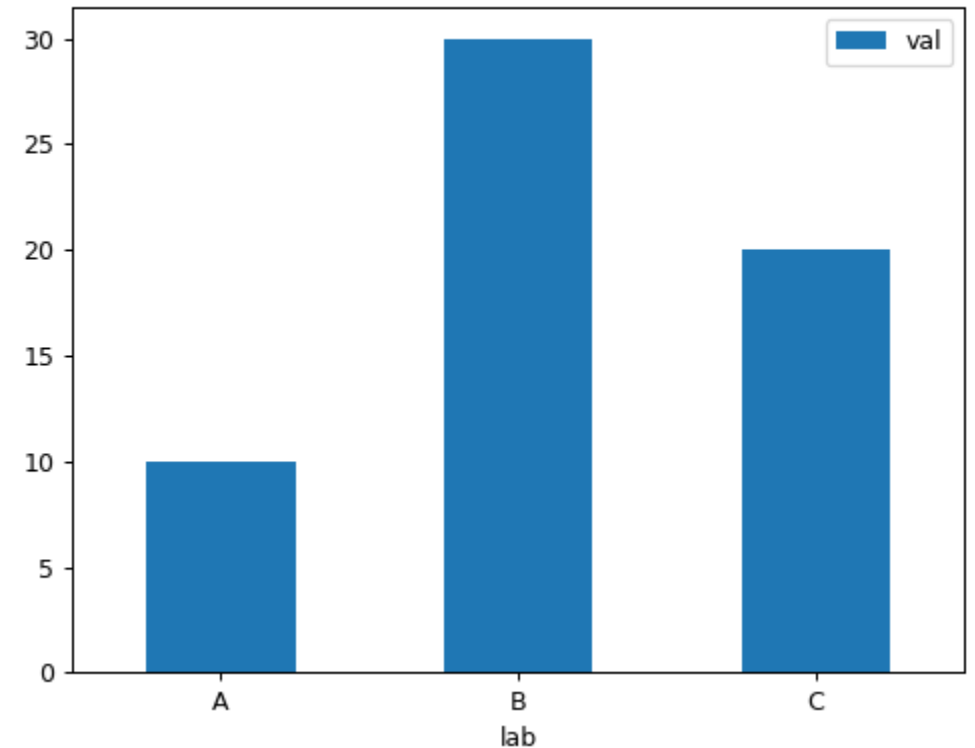
df[df["MA508L"] > 75] #select rows where df.MA508L is greater than 75
```

```
df.insert(1,"Age",[21,22,20,22]) #insert a new column
df.insert(1,"Age",[21,22,20,22],allow_duplicates=True)
#insert a new if already same column name exists
newdata={'Roll
Number':'MA24M006','Age':24,'Name':'Krishna','MA508L':75,'MA509L':55,'MA51
0L':98,'MA511L':87,'MA632L':75,'MA601L':82,'MA522M':63}
df=df.append(newdata,ignore_index=True)
newdata=pd.DataFrame({'Roll
Number':'MA24M011','Age':24,'Name':'Sandeep','MA508L':75,'MA509L':55,'MA51
0L':98,'MA511L':87,'MA632L':75,'MA601L':82,'MA522M':63},index=[0])
df2=pd.concat([newdata,df.loc[:]]).reset_index(drop=True)
print(df2)
```

```
■ import pandas as pd
df = pd.read_csv('data.csv')
print(df.to_string())
print(pd.options.display.max_rows)
```

```
■ import pandas as pd  
df = pd.read_json('data.json')  
print(df.to_string())
```

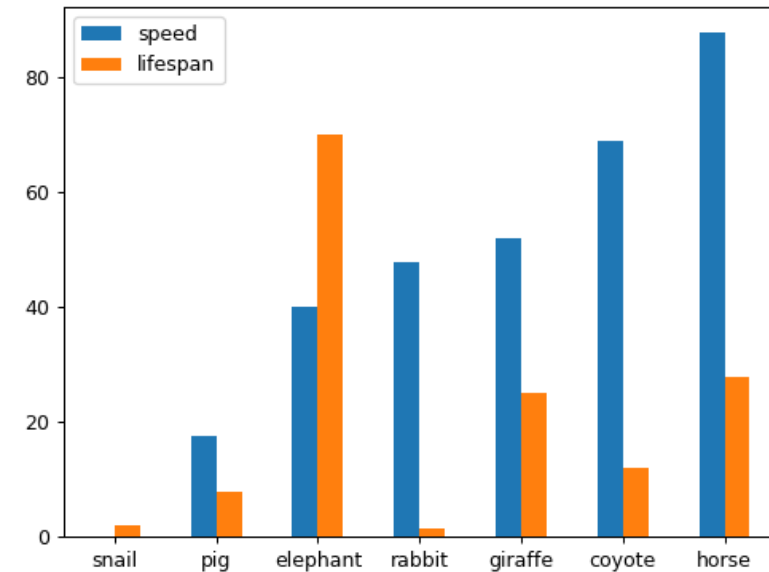
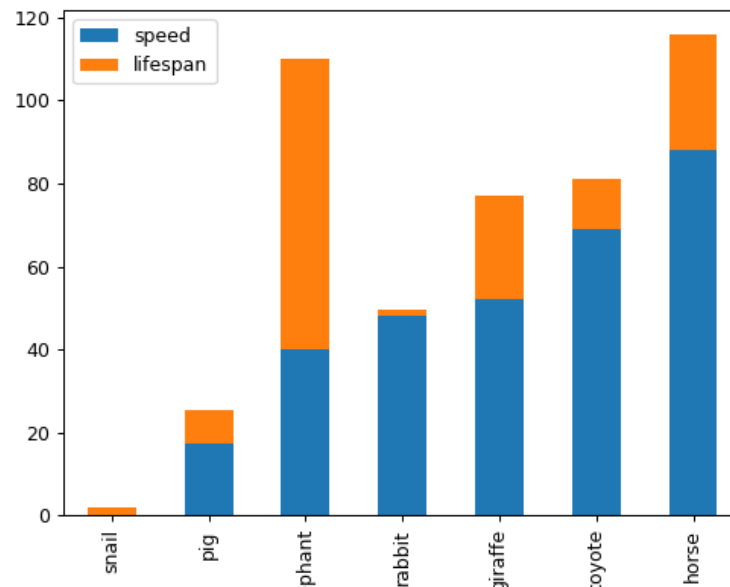
```
df = pd.DataFrame({'lab':['A', 'B', 'C'], 'val':[10, 30, 20]})  
ax = df.plot.bar(x='lab', y='val', rot=0)
```



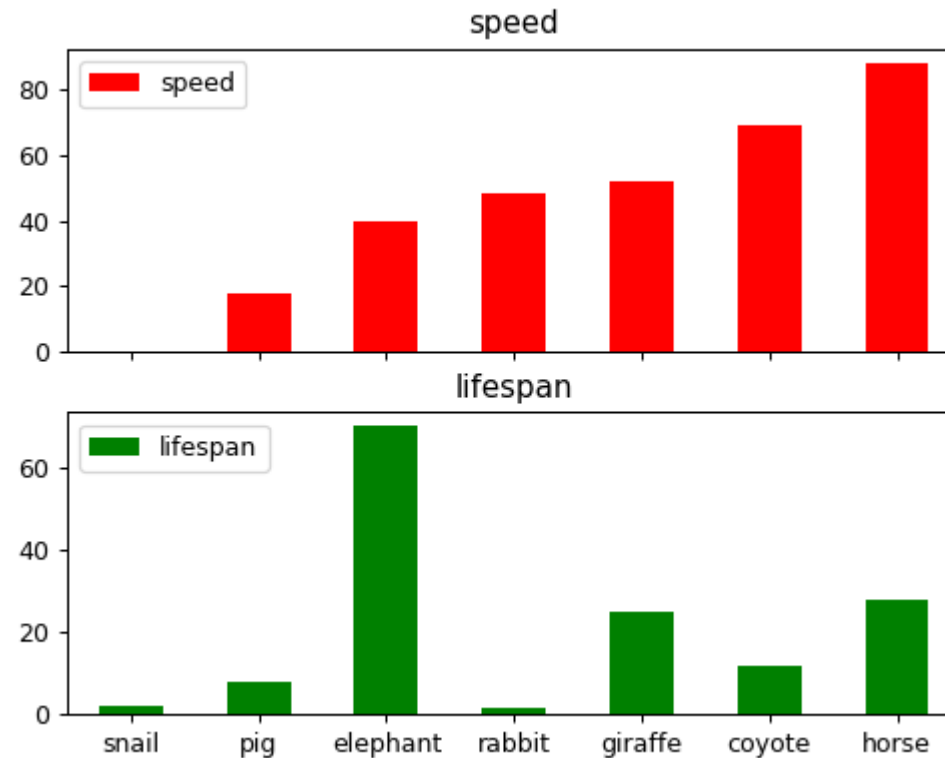
Bar Plotting

```
speed = [0.1, 17.5, 40, 48, 52, 69, 88]
lifespan = [2, 8, 70, 1.5, 25, 12, 28]
index = ['snail', 'pig', 'elephant', 'rabbit', 'giraffe', 'coyote', 'horse']
df = pd.DataFrame({'speed': speed, 'lifespan': lifespan}, index=index)
ax = df.plot.bar(rot=0)
```

```
ax = df.plot.bar(stacked=True)
```

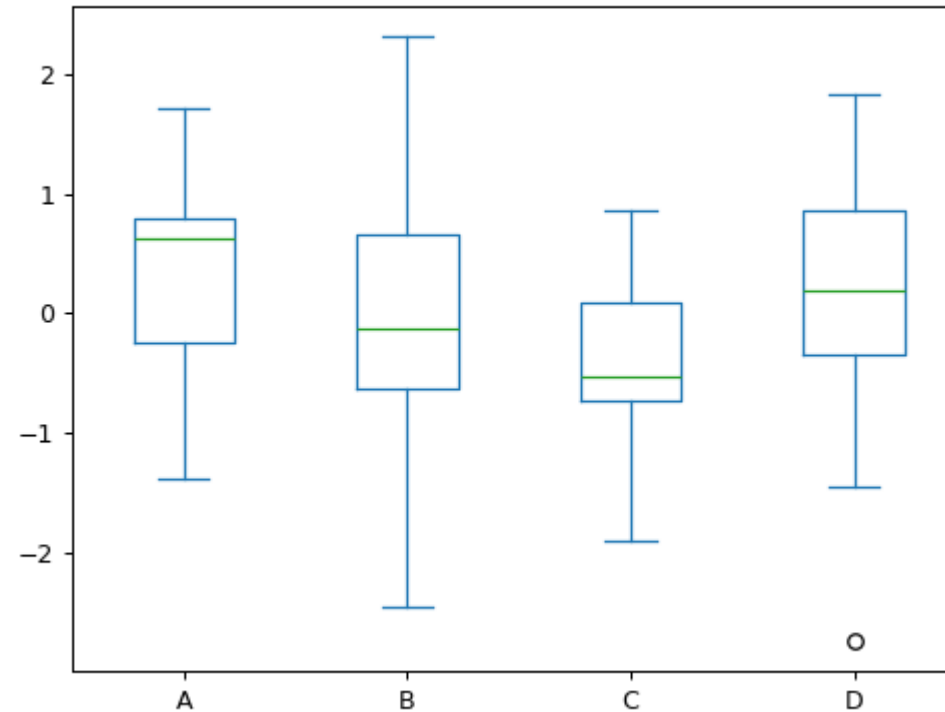


```
axes = df.plot.bar( ... rot=0, subplots=True,  
                  color={"speed": "red", "lifespan": "green"} ... )  
axes[1].legend(loc=2)
```

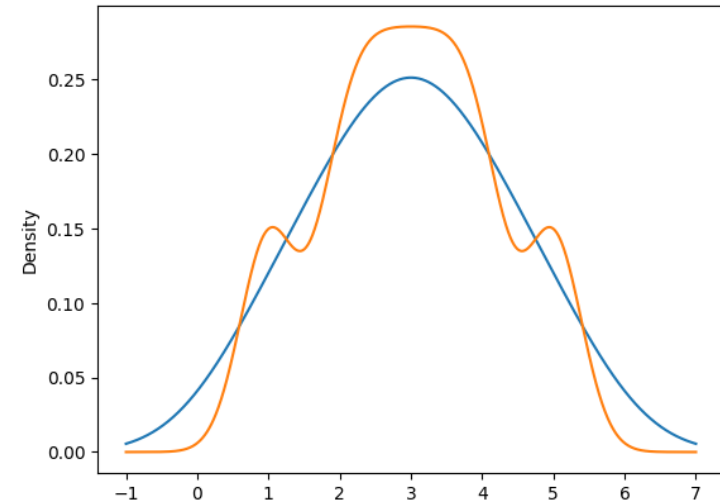


Box Plotting

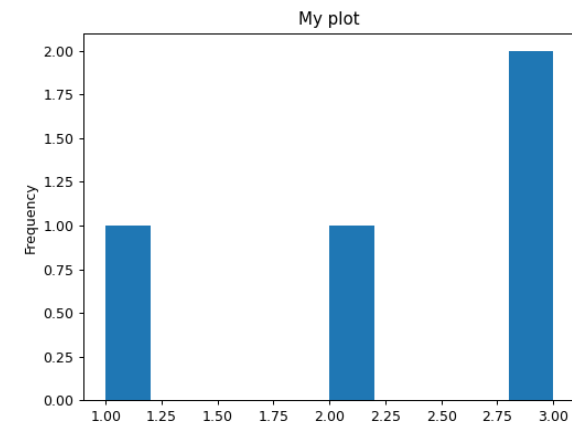
```
data = np.random.randn(25, 4)
df = pd.DataFrame(data, columns=list('ABCD'))
ax = df.plot.box()
```



```
s = pd.Series([1, 2, 2.5, 3, 3.5, 4, 5])  
ax = s.plot.kde()  
ax = s.plot.kde(bw_method=0.3)
```

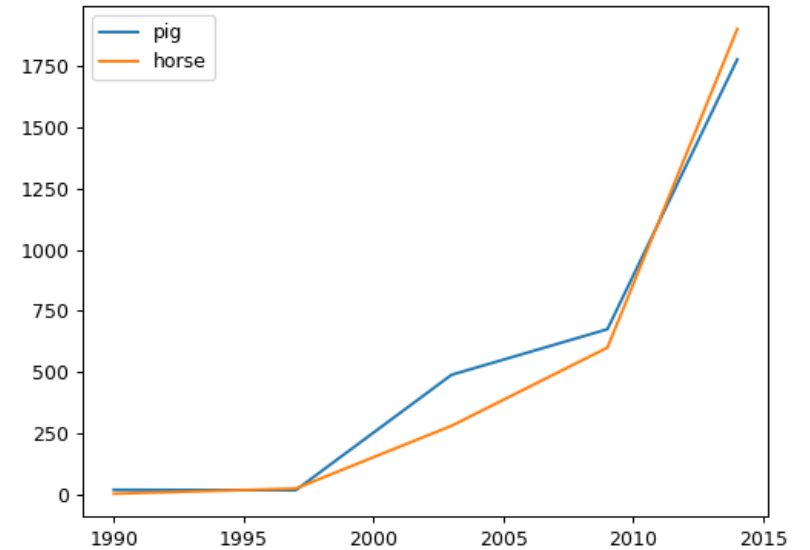


```
ser = pd.Series([1, 2, 3, 3])  
plot = ser.plot(kind='hist', title="My plot")
```

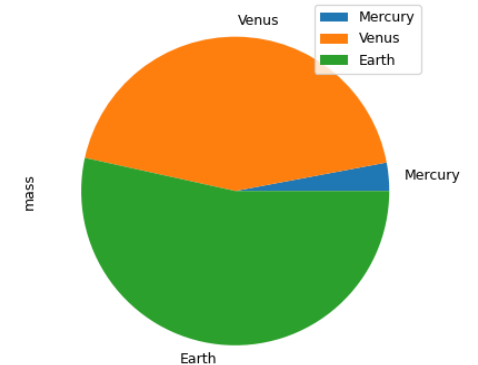


Line and Pie Plotting

```
df = pd.DataFrame({
    'pig': [20, 18, 489, 675, 1776],
    'horse': [4, 25, 281, 600, 1900]
}, index=[1990, 1997, 2003, 2009, 2014])
lines = df.plot.line()
```



```
df = pd.DataFrame({'mass': [0.330, 4.87, 5.97],
                  'radius': [2439.7, 6051.8, 6378.1]},
                  index=['Mercury', 'Venus', 'Earth'])
plot = df.plot.pie(y='mass', figsize=(5, 5))
```





End of Python Pandas



IP[y]:
IPython



pandas
 $y_{it} = \beta' x_{it} + \mu_i + \epsilon_{it}$

