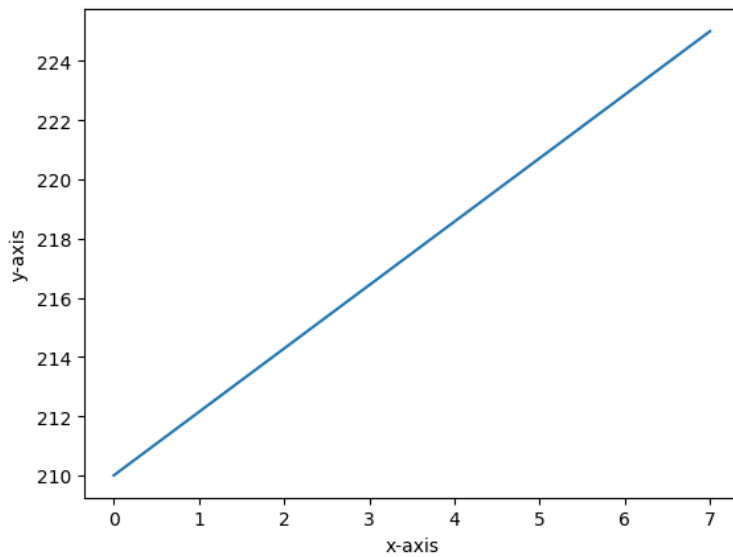
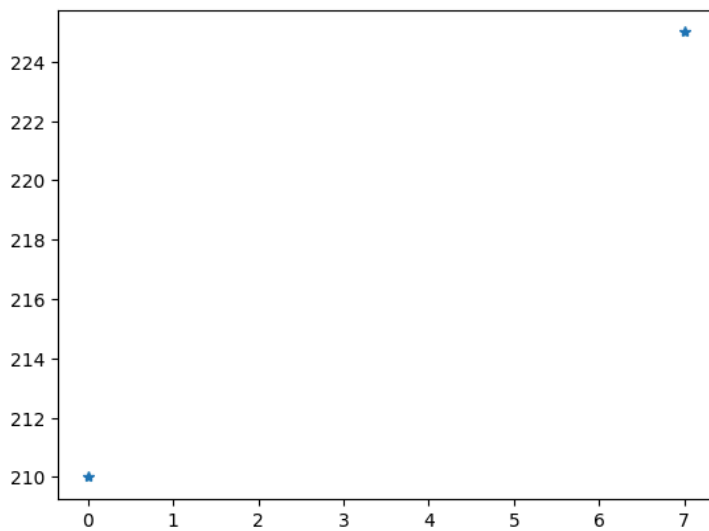


```
#draw a line in a diagram from position (0,0) to position (6,250):  
import matplotlib.pyplot as plt  
import numpy as np  
x = np.array([0,7])  
y = np.array([210,225])  
plt.xlabel('x-axis')  
plt.ylabel('y-axis')  
plt.plot(x,y)  
plt.show()
```

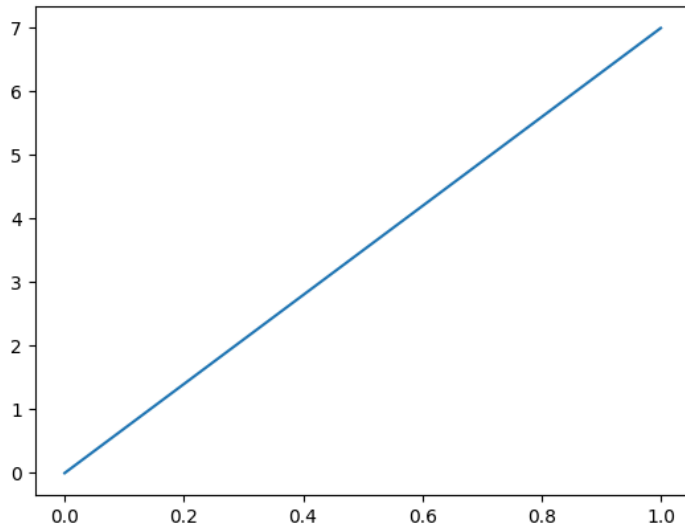


```
plt.plot(x,y, '*')  
plt.show()
```



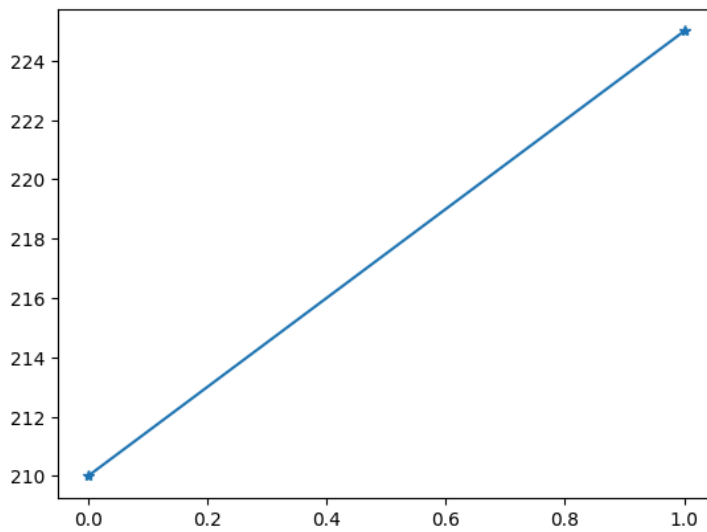
```
plt.plot(x)
```

```
[<matplotlib.lines.Line2D at 0x7d54151bdcf0>]
```



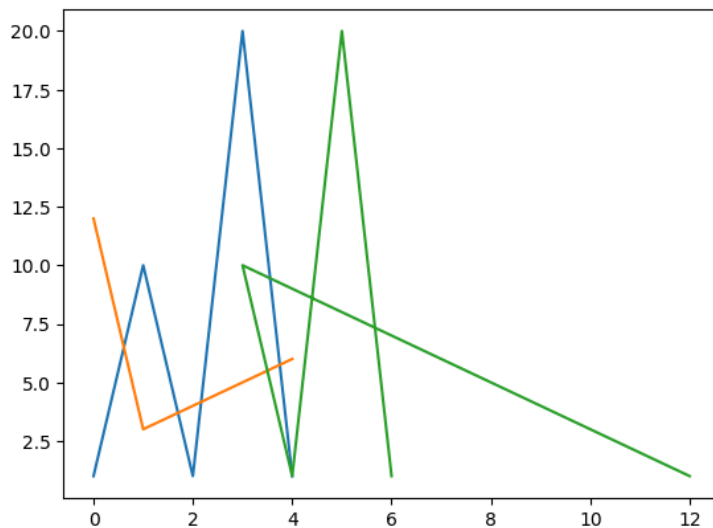
```
plt.plot(y,marker='*')
```

```
[<matplotlib.lines.Line2D at 0x7d54146be6b0>]
```



```
x = np.array([12,3,4,5,6])  
y = np.array([1,10,1,20,1])  
plt.plot(y)  
plt.plot(x)  
plt.plot(x,y)
```

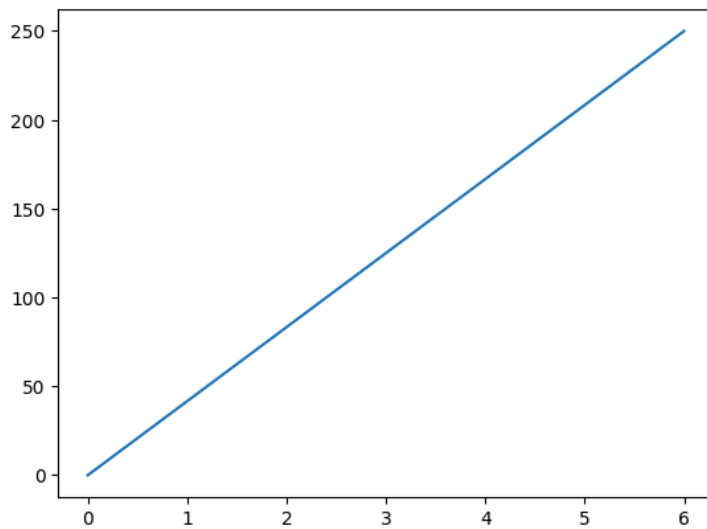
```
[<matplotlib.lines.Line2D at 0x7d54147d3400>]
```



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

xpoints = np.array([0, 6])
ypoints = np.array([0, 250])

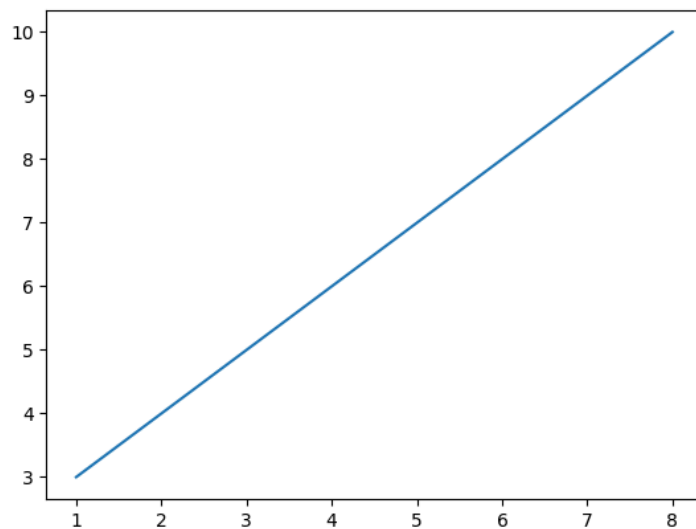
plt.plot(xpoints, ypoints)
plt.show()
```



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

xpoints = np.array([1, 8])
ypoints = np.array([3, 10])

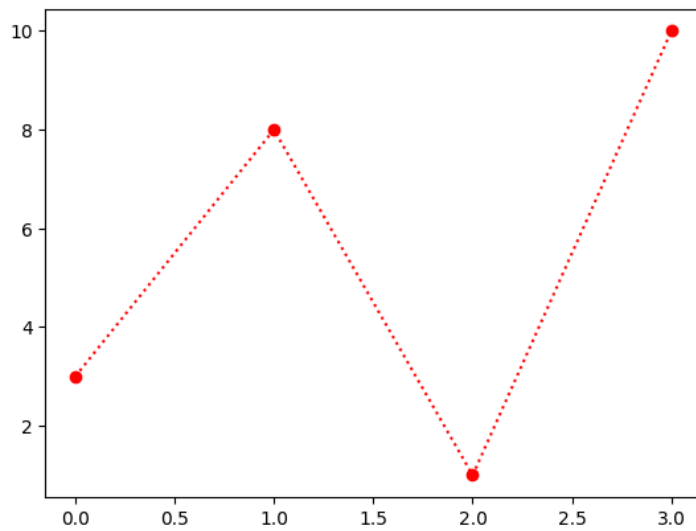
plt.plot(xpoints, ypoints)
plt.show()
```



```
import numpy as np

ypoints = np.array([3, 8, 1, 10])

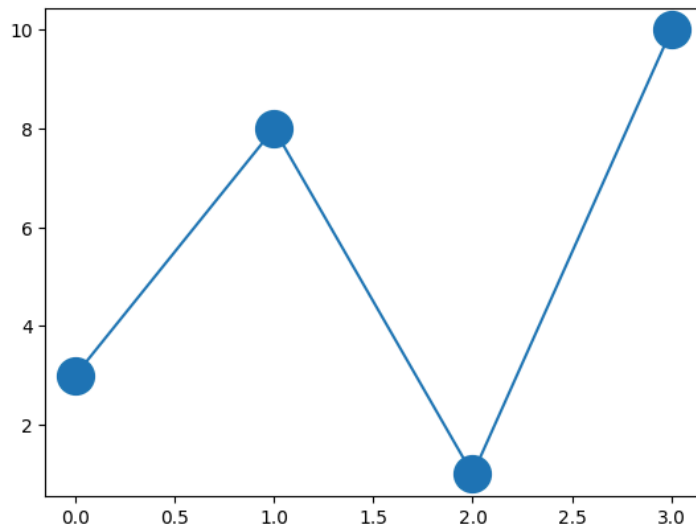
plt.plot(ypoints, 'o:r')
plt.show()
```



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

ypoints = np.array([3, 8, 1, 10])

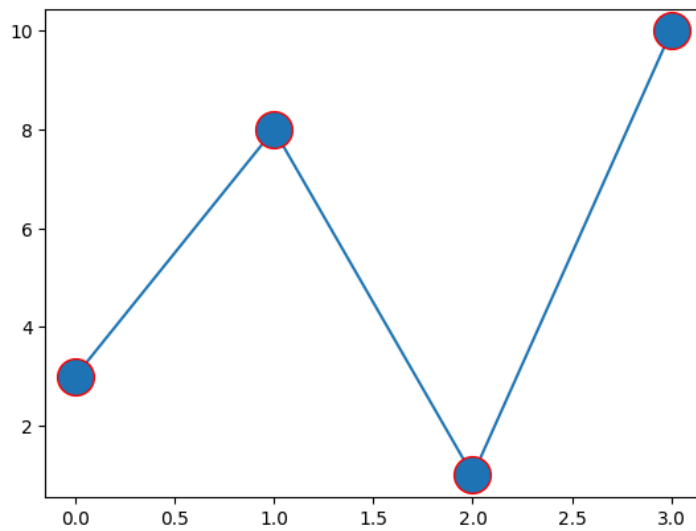
plt.plot(ypoints, marker = 'o', ms = 20)
plt.show()
```



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

ypoints = np.array([3, 8, 1, 10])

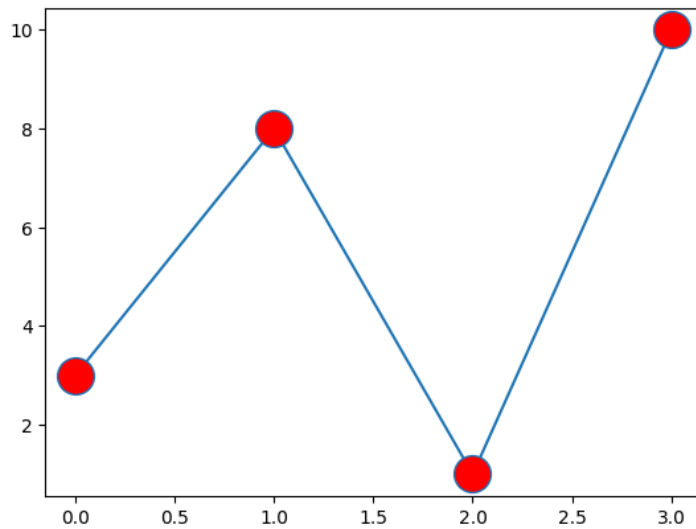
plt.plot(ypoints, marker = 'o', ms = 20, mec = 'r')
plt.show()
```



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

ypoints = np.array([3, 8, 1, 10])

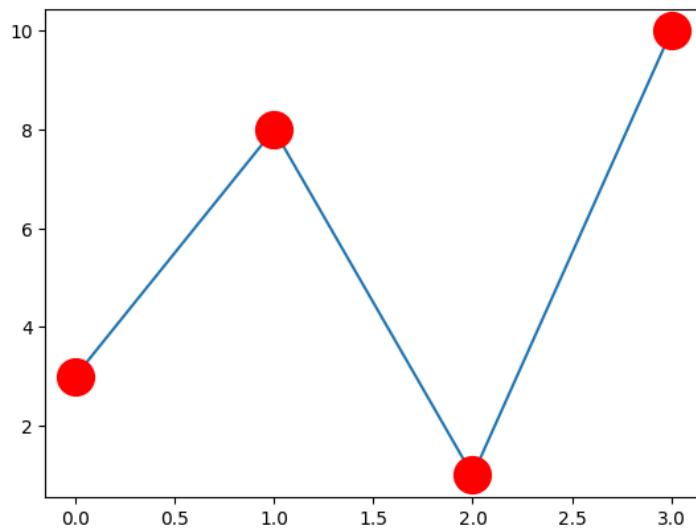
plt.plot(ypoints, marker = 'o', ms = 20, mfc = 'r')
plt.show()
```



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

ypoints = np.array([3, 8, 1, 10])

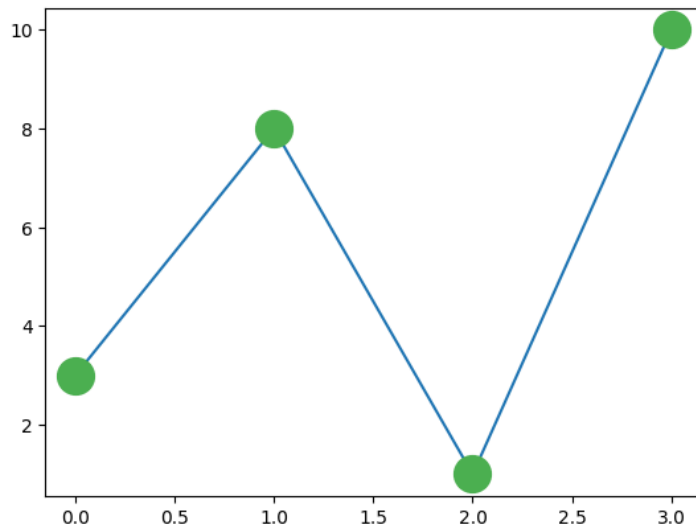
plt.plot(ypoints, marker = 'o', ms = 20, mec = 'r', mfc = 'r')
plt.show()
```



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

ypoints = np.array([3, 8, 1, 10])

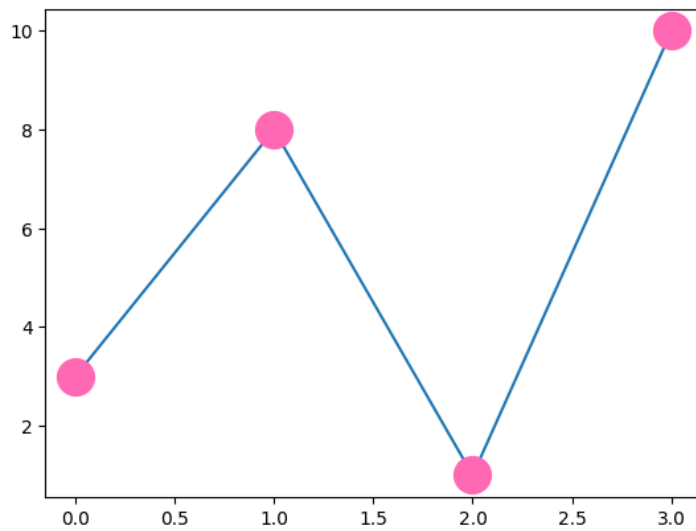
plt.plot(ypoints, marker = 'o', ms = 20, mec = '#4CAF50', mfc = '#4CAF50')
plt.show()
```



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

ypoints = np.array([3, 8, 1, 10])

plt.plot(ypoints, marker = 'o', ms = 20, mec = 'hotpink', mfc = 'hotpink')
plt.show()
```

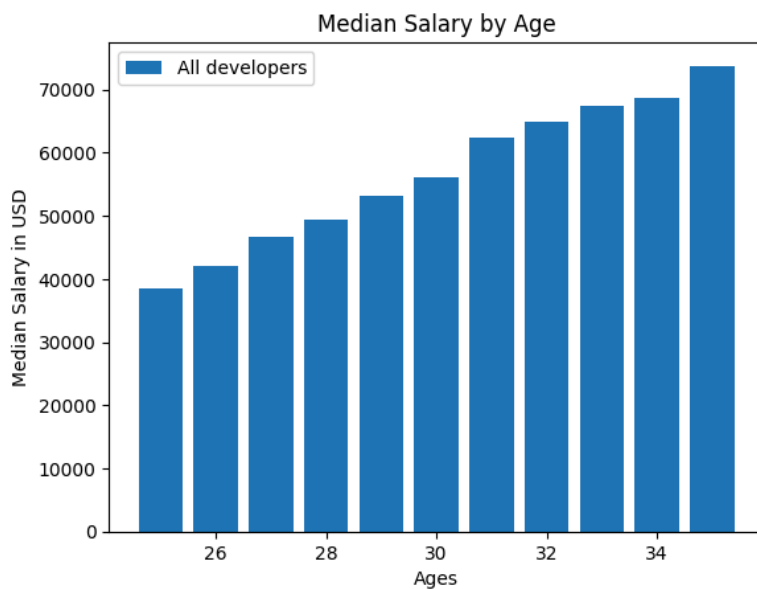


✓ Bar_Charts

```
import pandas as pd
import matplotlib.pyplot as plt
x = [25, 26, 27, 28, 29, 30, 31, 32, 33, 34, 35]
devs_y = [38496, 42000, 46752, 49320, 53200, 56000, 62316, 64928, 67317, 68748, 73752]
```

✓ Plotting the bar plot

```
plt.bar(x, devs_y, label="All developers")
plt.xlabel("Ages")
plt.ylabel("Median Salary in USD")
plt.title("Median Salary by Age")
plt.legend()
plt.show()
```

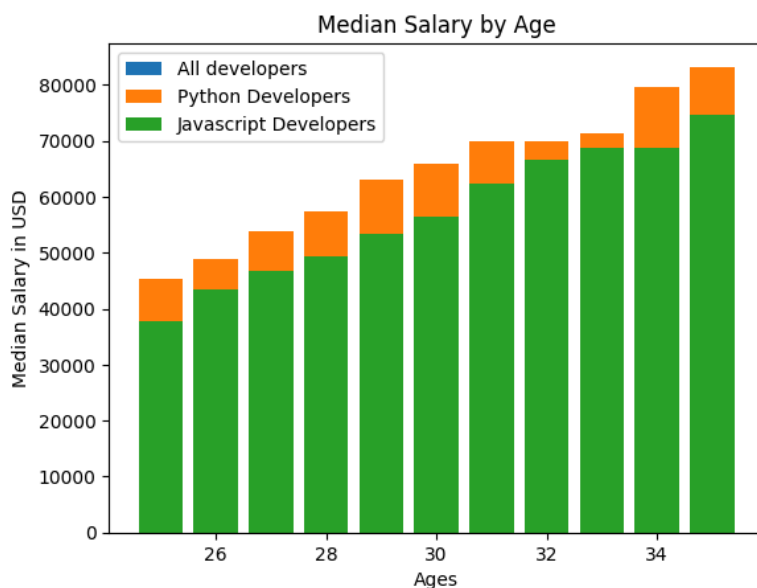


✓ 2. Adding more bars to the same plot

```
py_devs_y = [45372, 48876, 53850, 57287, 63016, 65998, 70003, 70000, 71418, 79674, 83238]
```

```
js_devs_y = [37810, 43515, 46823, 49293, 53437, 56373, 62375, 66674, 68745, 68746, 74583]
```

```
plt.bar(x, devs_y, label="All developers")
plt.bar(x, py_devs_y, label="Python Developers")
plt.bar(x, js_devs_y, label="Javascript Developers")
plt.xlabel("Ages")
plt.ylabel("Median Salary in USD")
plt.title("Median Salary by Age")
plt.legend()
plt.show()
```



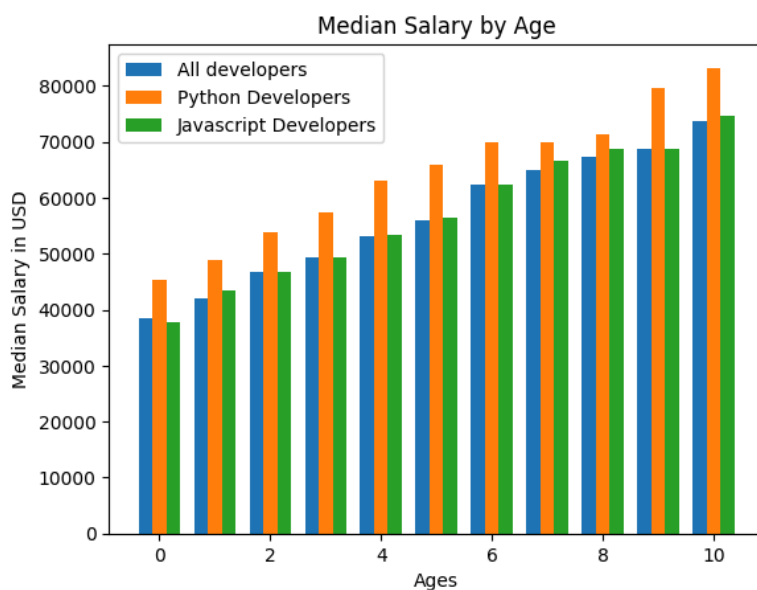
3. Adjusting the width of the plot

```
import numpy as np
```

```
x_indexes = np.arange(len(x))
```

```
width = 0.25
```

```
plt.bar(x_indexes - width, devs_y, width=width, label="All developers")
plt.bar(x_indexes, py_devs_y, width = width, label="Python Developers")
plt.bar(x_indexes + width, js_devs_y, width=width, label="Javascript Developers")
plt.xlabel("Ages")
plt.ylabel("Median Salary in USD")
plt.title("Median Salary by Age")
plt.legend()
plt.show()
```



4. Changing the xlabels

Median Salary by Age

Ages	All developers	Python Developers	Javascript Developers
25	38500	45000	37500
26	42000	48500	43000
27	46500	53500	46500
28	49500	57500	49000
29	53000	63000	53000
30	56000	65500	56500
31	62500	69500	62500
32	64500	69500	66500
33	67500	71000	68500
34	68500	79500	68500
35	73500	82500	74500

```
import pandas as pd
data = pd.read_csv('/content/data.csv')
```

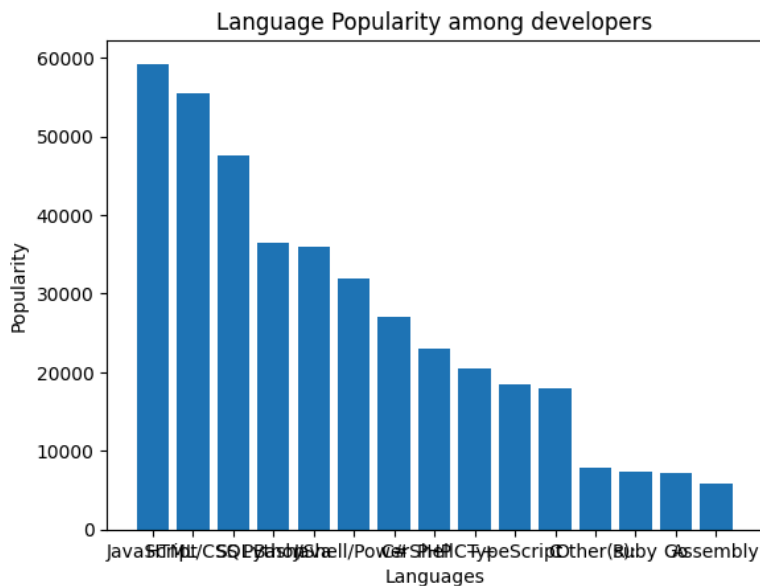
```
ids = data['Responder_id']
language_responses = data['LanguagesWorkedWith']
```

```
for response in language_responses:
    language_counter.update(response.split(";"))
```

```
for item in language_counter.most_common(15):
    languages.append(item[0])
    popularity.append(item[1])
```

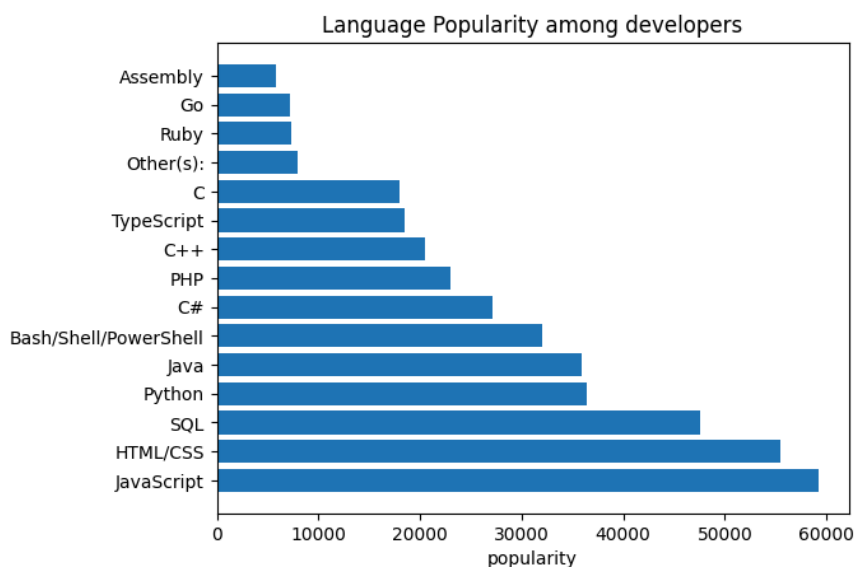
```
[ 'JavaScript', 'HTML/CSS', 'SQL', 'Python', 'Java', 'Bash/Shell/PowerShell', 'C#', 'PHP', 'C++', 'TypeScript', 'C', 'Other(s):', 'Ruby' ]
```

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6. Plotting Horizontal bar chart

```
plt.barh(languages, popularity)
plt.xlabel("popularity")
plt.title("Language Popularity among developers")
plt.show()
```



```
languages.reverse()
popularity.reverse()
```

<https://insights.stackoverflow.com/survey/2020#technology-programming-scripting-and-markup-languages>

```
plt.figure(figsize=(8,6)) plt.barh(languages, popularity) plt.xlabel("popularity") plt.title("Language Popularity among developers")
plt.tight_layout() plt.show()
```

Show Your Creativity

Automobile Land Speed Records (GR 5-10)

In the first recorded automobile race in 1898, Count Gaston de Chasseloup-Laubat of Paris, France, drove 1 kilometer in 57 seconds for an average speed of 39.2 miles per hour(mph) or 63.1 kilometers per hour (kph). In 1904, Henry Ford drove his Ford Arrow across frozen Lake St.

Clair, MI, at an average speed of 91.4 mph. Now, the North American Eagle is trying to break a land speed record of 800 mph. The Federation International de l'Automobile (FIA), the world's governing body for motor sport and land speed records, recorded the following land speed records.

```
import matplotlib.pyplot as plt
import pandas as pd
```

```
from google.colab import drive
data = pd.read_csv('/content/LandRecords.csv')
```

```
data.head()
```

	Speed (mph)	Driver	Car	Engine	Date
0	407.447	Craig Breedlove	Spirit of America	GE J47	8/5/1963
1	413.199	Tom Green	Wingfoot Express	WE J46	10/2/1964
2	434.220	Art Arfons	Green Monster	GE J79	10/5/1964
3	468.719	Craig Breedlove	Spirit of America	GE J79	10/13/1964
4	526.277	Craig Breedlove	Spirit of America	GE J79	10/15/1965

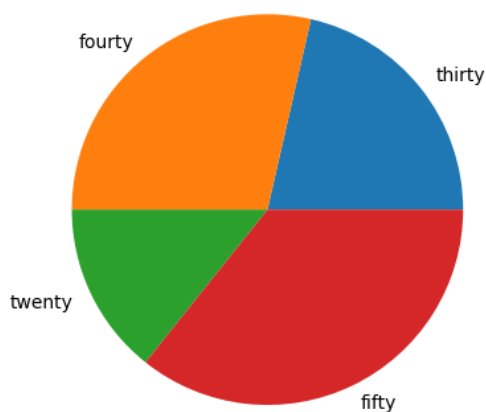
```
from matplotlib import pyplot as plt
```

1. Plotting the Pie Chart

```
slices = [30, 40, 20, 50] #sum needs not be 100
plt.pie(slices)
plt.show()
```

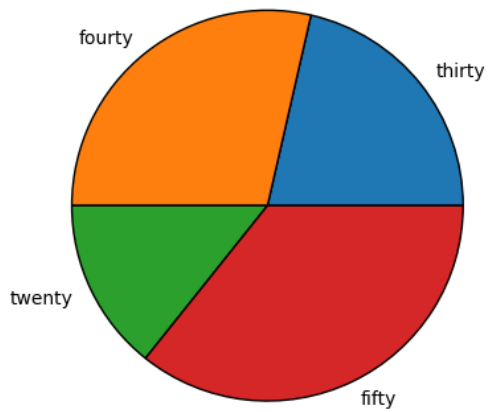
2. Adding labels to the pie chart

```
labels = ['thirty', 'fourty', 'twenty', 'fifty']
plt.pie(slices, labels=labels)
plt.show()
```



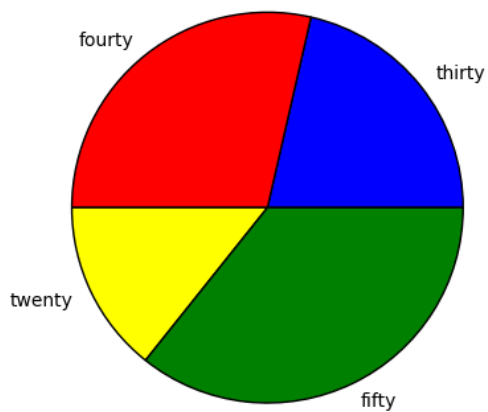
3. setting edge color

```
plt.pie(slices, labels=labels, wedgeprops={'edgecolor':'black'})
plt.show()
```



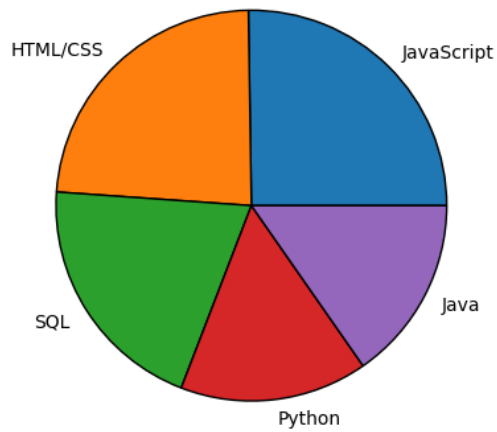
▼ 4. setting color of the slices

```
color = ['blue', 'red', 'yellow', 'green']  
  
#hexadecimal color codes can also be used  
plt.pie(slices, labels=labels, colors=color, wedgeprops={'edgecolor':'black'})  
plt.show()
```



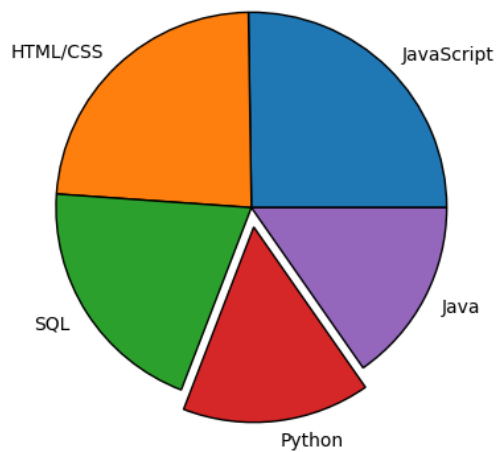
▼ 5. plotting real world data

```
labels = ['JavaScript', 'HTML/CSS', 'SQL', 'Python', 'Java']  
slices = [59219, 55466, 47544, 36443, 35917]  
  
plt.pie(slices, labels=labels, wedgeprops={'edgecolor':'black'})  
plt.show()
```



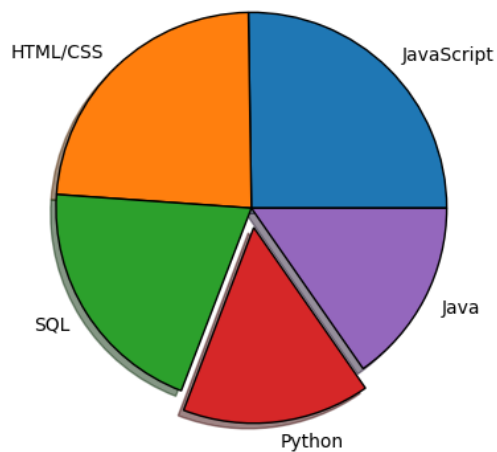
6. Exploding the slice

```
explode = [0, 0, 0, 0.1, 0]  
  
plt.pie(slices, labels=labels, explode=explode, wedgeprops={'edgecolor':'black'})  
plt.show()
```



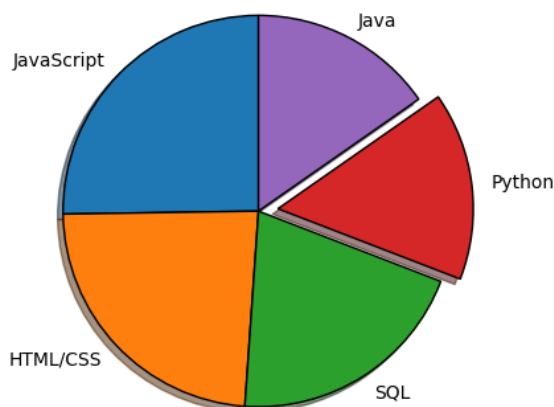
7. adding shadow to the chart

```
plt.pie(slices, labels=labels, explode=explode, shadow=True, wedgeprops={'edgecolor':'black'})  
plt.show()
```



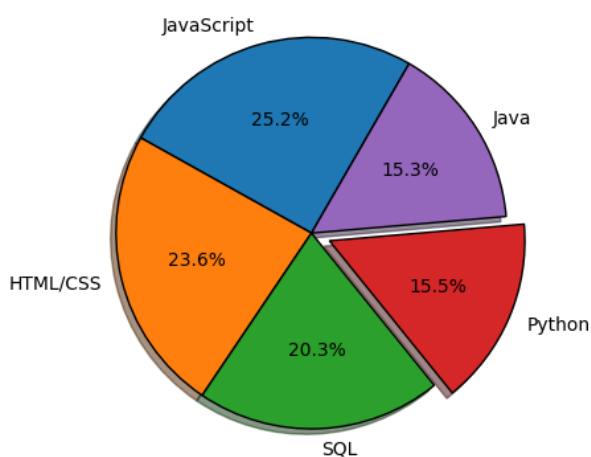
8. setting the starting angle

```
plt.pie(slices, labels=labels, explode=explode, shadow=True, startangle=90, wedgeprops={'edgecolor':'black'})
plt.show()
```



9. displaying percentage of each slices

```
plt.pie(slices, labels=labels, explode=explode, shadow=True, startangle=60, autopct="%0.1f%%", wedgeprops={'edgecolor':'black'})
plt.show()
```



Show Your Creativity

Covid 19 India Data as on 5th Sept 2020

```
import matplotlib.pyplot as plt
import pandas as pd
```

```
from google.colab import drive
data = pd.read_csv('/content/data.csv')
data.head()
```

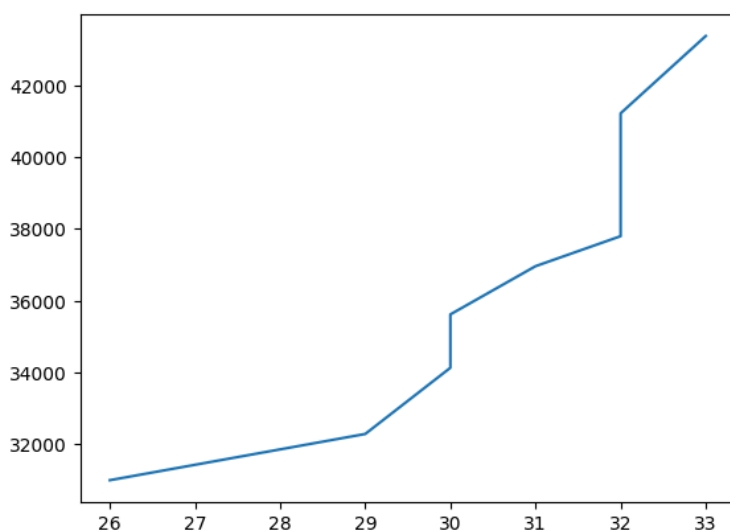
	Responder_id	LanguagesWorkedWith
0	1	HTML/CSS;Java;JavaScript;Python
1	2	C++;HTML/CSS;Python
2	3	HTML/CSS
3	4	C;C++;C#;Python;SQL
4	5	C++;HTML/CSS;Java;JavaScript;Python;SQL;VBA

1. Creating Plots

```
# Installation: pip install matplotlib/ conda install matplotlib
import matplotlib.pyplot as plt
import random
# generating 10 random numbers between 25 to 35
ages = [random.randrange(25,35,1) for ages in range(11)]
ages = sorted(ages, reverse=False)
# generating 10 random numbers between 30k to 45k
devs = [random.randrange(30000,45000,1) for devs in range(11)]
devs = sorted(devs, reverse=False)
```

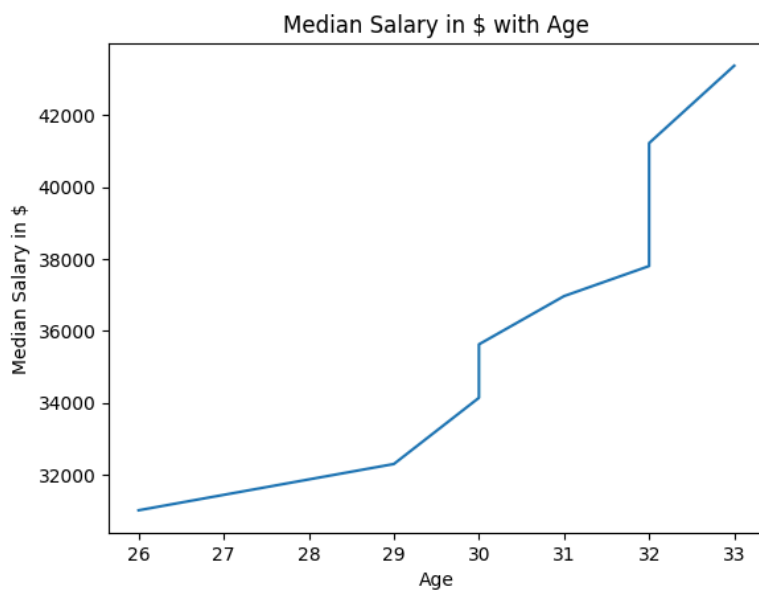
1.1. Plotting Line Plot

```
plt.plot(ages, devs)
plt.show()
```



1.2. Adding title, xlabel and ylabel

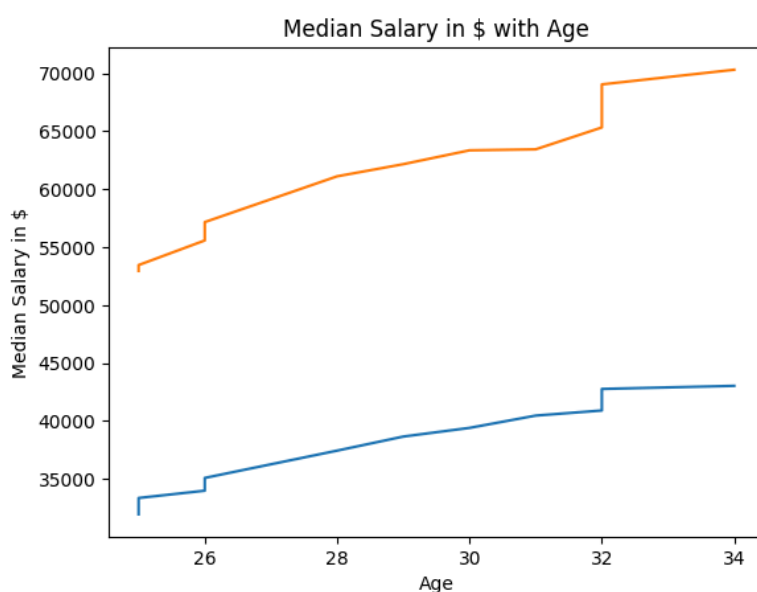
```
plt.plot(ages, devs)
plt.title("Median Salary in $ with Age") # add the title
plt.xlabel("Age") # add xlabel
plt.ylabel("Median Salary in $") #add ylabel
plt.show()
```



1.3. Adding more plot to the same graph

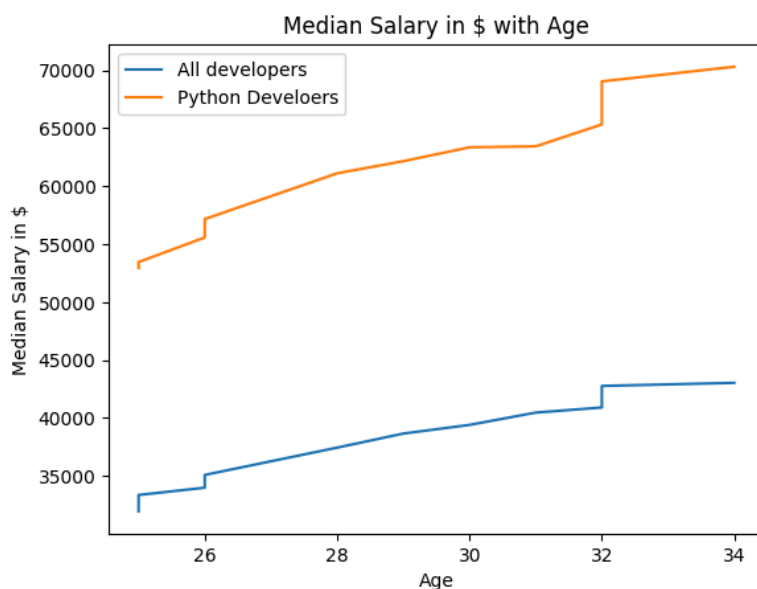
```
#creating 10 random numbers between 50k to 75k
import random
import matplotlib.pyplot as plt
ages = [random.randrange(25,35,1) for ages in range(11)]
ages = sorted(ages, reverse=False)
devs = [random.randrange(30000,45000,1) for devs in range(11)]
devs = sorted(devs, reverse=False)
py_devs = [random.randrange(50000,75000) for py_devs in range(11)]
py_devs = sorted(py_devs, reverse=False)
```

```
plt.plot(ages, devs)
plt.plot(ages, py_devs) # adding other plot to the same figure
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
plt.show()
```



1.4. Adding legend to the plot

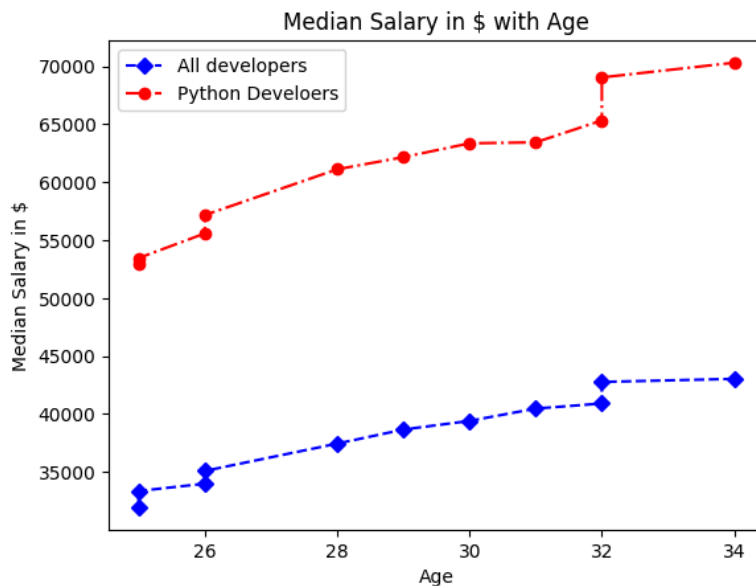
```
plt.plot(ages, devs, label = "All developers") # label
plt.plot(ages, py_devs, label = "Python Developers")
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
plt.legend() #plot the legend
plt.show()
```



1.5. Setting marker, linestyle and color

#https://matplotlib.org/api/_as_gen/matplotlib.pyplot.plot.html

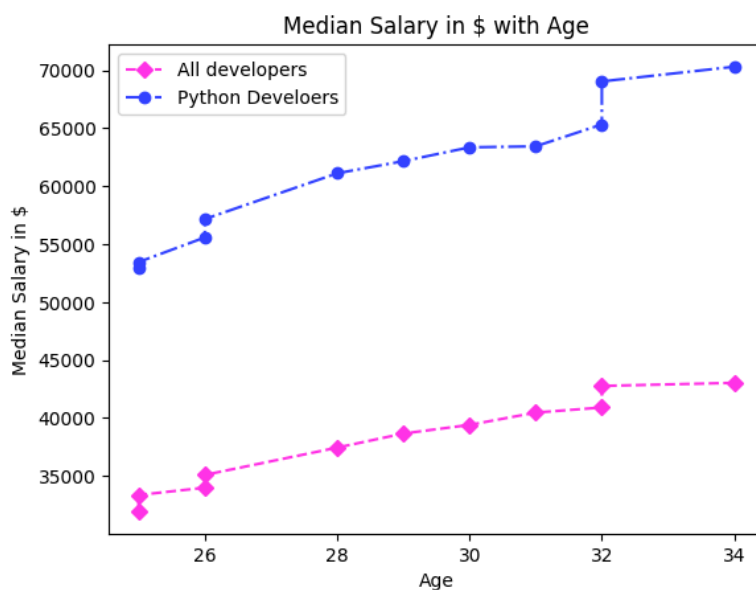
```
plt.plot(ages, devs, color="blue", linestyle = "--", marker = "D", label = "All developers")
plt.plot(ages, py_devs, color="red", linestyle = "-.", marker = "o", label = "Python Developers")
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
plt.legend()
plt.show()
```



1.6. Hexadecimal code for colors

#https://matplotlib.org/api/_as_gen/matplotlib.pyplot.plot.html

```
plt.plot(ages, devs, color="#FF33E9", linestyle = "--", marker = "D", label = "All developers")
plt.plot(ages, py_devs, color="#3344FF", linestyle = "-.", marker = "o", label = "Python Developers")
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
plt.legend()
plt.show()
```



Adding other plot to the same graph

```
#creating 10 random numbers between 40k to 60k
```

```
js_devs = [random.randrange(40000,60000) for js_devs in range(11)]
js_devs = sorted(js_devs, reverse=False)
```

```
#https://matplotlib.org/api/_as_gen/matplotlib.pyplot.plot.html
```

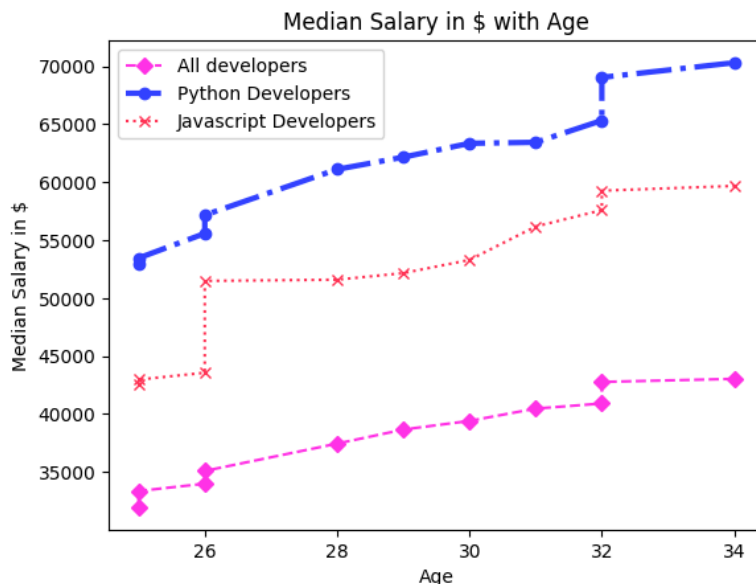
```
plt.plot(ages, devs, color="#FF33E9", linestyle = "--", marker = "D", label = "All developers")
plt.plot(ages, py_devs, color="#3344FF", linestyle = "-.", marker = "o", label = "Python Developers")
plt.plot(ages, js_devs, color="#FF3355", linestyle = ":", marker = "x", label = "Javascript Developers")
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
plt.legend()
plt.show()
```



✓ 1.7. Changing the line width

```
#https://matplotlib.org/api/_as_gen/matplotlib.pyplot.plot.html
```

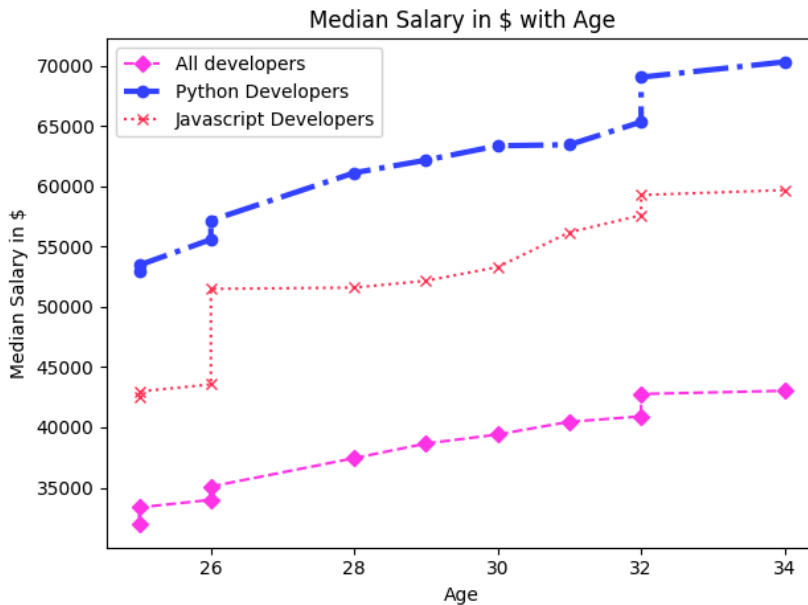
```
plt.plot(ages, devs, color="#FF33E9", linestyle = "--", marker = "D", label = "All developers")
plt.plot(ages, py_devs, color="#3344FF", linestyle = "-.", marker = "o", linewidth=3, label = "Python Developers")
plt.plot(ages, js_devs, color="#FF3355", linestyle = ":", marker = "x", label = "Javascript Developers")
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
plt.legend()
plt.show()
```



1.8. Add padding to the plot

#https://matplotlib.org/api/_as_gen/matplotlib.pyplot.plot.html

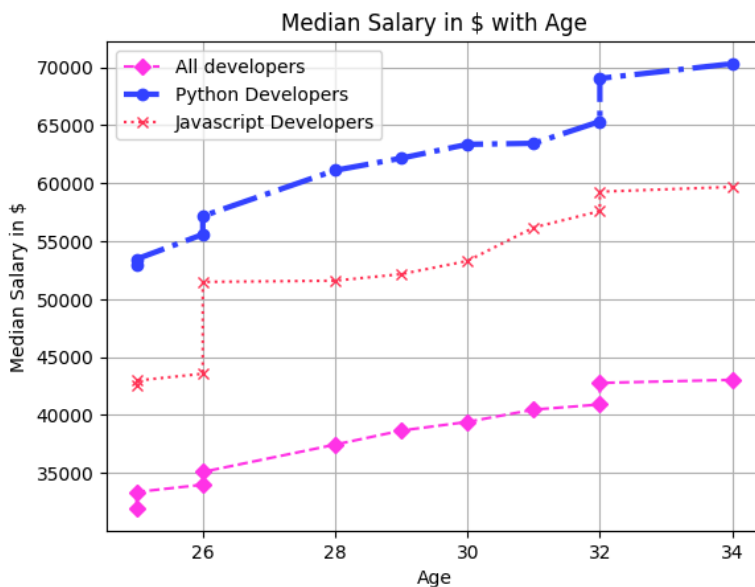
```
plt.plot(ages, devs, color="#FF33E9", linestyle = "--", marker = "D", label = "All developers")
plt.plot(ages, py_devs, color="#3344FF", linestyle = "-.", marker = "o", linewidth=3, label = "Python Developers")
plt.plot(ages, js_devs, color="#FF3355", linestyle = ":", marker = "x", label = "Javascript Developers")
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
plt.legend()
plt.tight_layout() #adds padding
plt.show()
```



1.9. Adding grid to the plot

#https://matplotlib.org/api/_as_gen/matplotlib.pyplot.plot.html

```
plt.plot(ages, devs, color="#FF33E9", linestyle = "--", marker = "D", label = "All developers")
plt.plot(ages, py_devs, color="#3344FF", linestyle = "-.", marker = "o", linewidth=3, label = "Python Developers")
plt.plot(ages, js_devs, color="#FF3355", linestyle = ":", marker = "x", label = "Javascript Developers")
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
plt.grid(True)
plt.legend()
plt.show()
```



1.10. Changing style of the plot

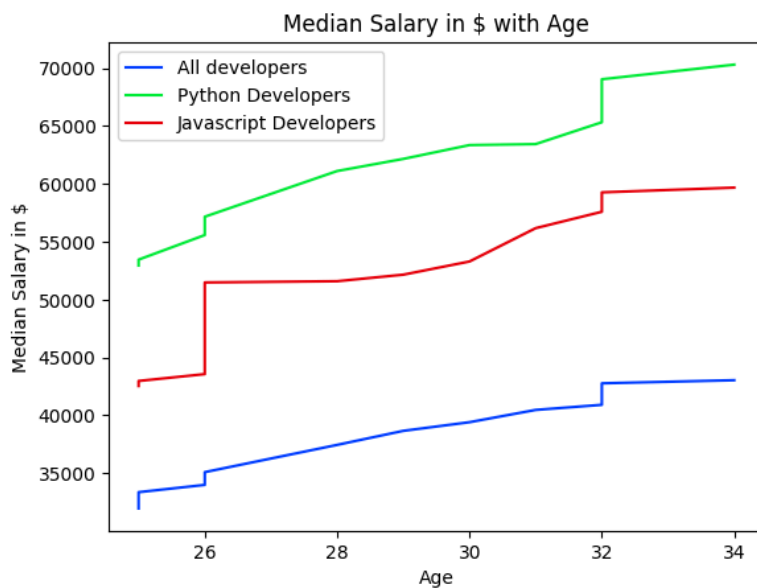
```
print(plt.style.available)
```

```
['Solarize_Light2', '_classic_test_patch', '_mpl-gallery', '_mpl-gallery-nogrid', 'bmh', 'classic', 'dark_background', 'fast', 'fiv
```

```
#https://matplotlib.org/api/_as_gen/matplotlib.pyplot.plot.html
```

```
plt.style.use('seaborn-bright') #to change the style
plt.plot(ages, devs, label = "All developers")
plt.plot(ages, py_devs, label = "Python Developers")
plt.plot(ages, js_devs, label = "Javascript Developers")
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
plt.legend()
plt.show()
```

<ipython-input-67-d07ee214d04f>:3: MatplotlibDeprecationWarning: The seaborn styles shipped by Matplotlib are deprecated since 3.6, a
plt.style.use('seaborn-bright') #to change the style



1.11. Saving the plot

```
#https://matplotlib.org/api/_as_gen/matplotlib.pyplot.plot.html
```

```
plt.style.use('ggplot')
```

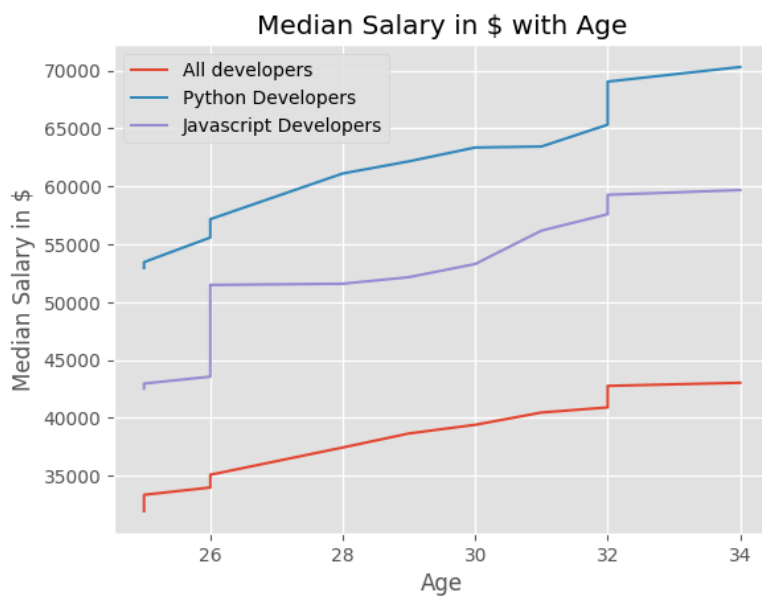
```
plt.plot(ages, devs, label = "All developers")
plt.plot(ages, py_devs, label = "Python Developers")
plt.plot(ages, js_devs, label = "Javascript Developers")
```

```
plt.title("Median Salary in $ with Age")
plt.xlabel("Age")
plt.ylabel("Median Salary in $")
```

```
plt.legend()
```

```
plt.savefig("plot.png")#save the plot
```

```
plt.show()
```



✓ for Further Reading click the below link

<https://matplotlib.org/tutorials/introductory/pyplot.html>

<https://pythonbasics.org/matplotlib-line-chart/>

```
import matplotlib.pyplot as plt
import pandas as pd
from google.colab import drive
data = pd.read_csv('/content/data_gapminder_gdp_oceania.csv', index_col='country')
print(data)
```

country	gdpPercap_1952	gdpPercap_1957	gdpPercap_1962	gdpPercap_1967
Australia	10039.59564	10949.64959	12217.22686	14526.12465
New Zealand	10556.57566	12247.39532	13175.67800	14463.91893

country	gdpPercap_1972	gdpPercap_1977	gdpPercap_1982	gdpPercap_1987
Australia	16788.62948	18334.19751	19477.00928	21888.88903
New Zealand	16046.03728	16233.71770	17632.41040	19007.19129

country	gdpPercap_1992	gdpPercap_1997	gdpPercap_2002	gdpPercap_2007
Australia	23424.76683	26997.93657	30687.75473	34435.36744
New Zealand	18363.32494	21050.41377	23189.80135	25185.00911

✓ **Plot data directly from a Pandas dataframe.**

- We can also plot Pandas dataframes.
- This implicitly uses matplotlib.pyplot.
- Before plotting, we convert the column headings from a string to integer data type, since they represent numerical values

```
# Extract year from last 4 characters of each column name
# The current column names are structured as 'gdpPercap_(year)',
# so we want to keep the (year) part only for clarity when plotting GDP vs. years
# To do this we use strip(), which removes from the string the characters stated in the argument
# This method works on strings, so we call str before strip()

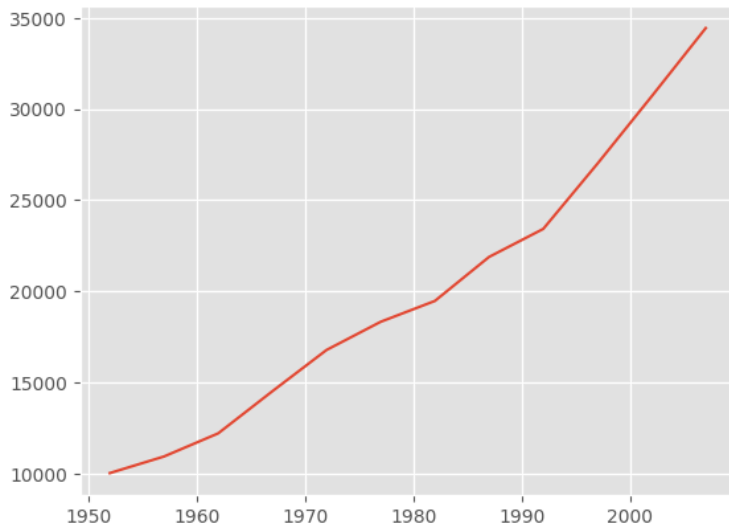
years = data.columns.str.strip('gdpPercap_')

# Convert year values to integers, saving results back to dataframe

data.columns = years.astype(int)

data.loc['Australia'].plot()
```

<Axes: >

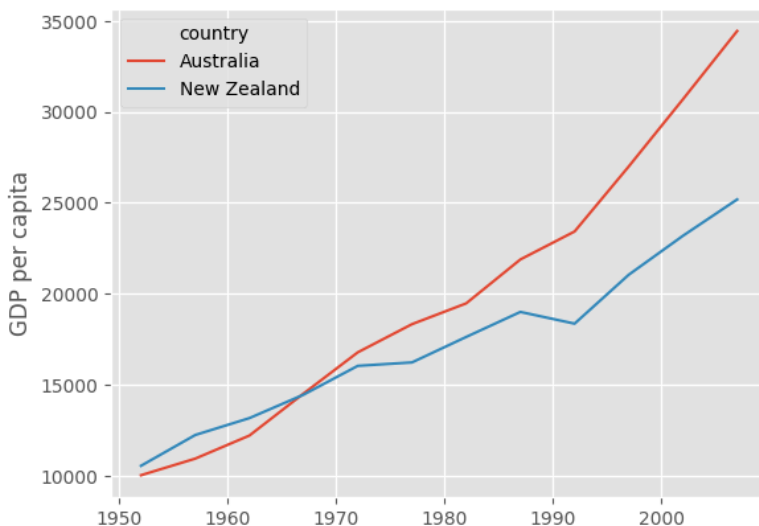


✓ Select and transform data, then plot it.

- By default, `DataFrame.plot` plots with the rows as the X axis.
- We can transpose the data in order to plot multiple series.

```
data.T.plot()
plt.ylabel('GDP per capita')
```

```
Text(0, 0.5, 'GDP per capita')
```



Data can also be plotted by calling the matplotlib plot function directly.

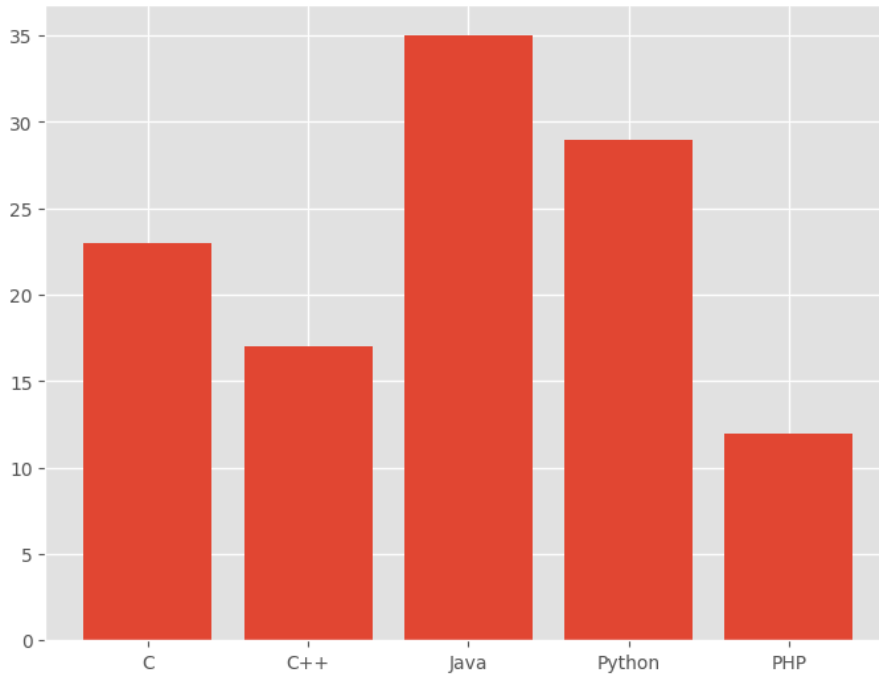
- The command is `plt.plot(x, y)`
- The color and format of markers can also be specified as an additional optional argument e.g., `b-` is a blue line, `g--` is a green dashed line.

✓ Get Australia data from dataframe

Plot with both countries

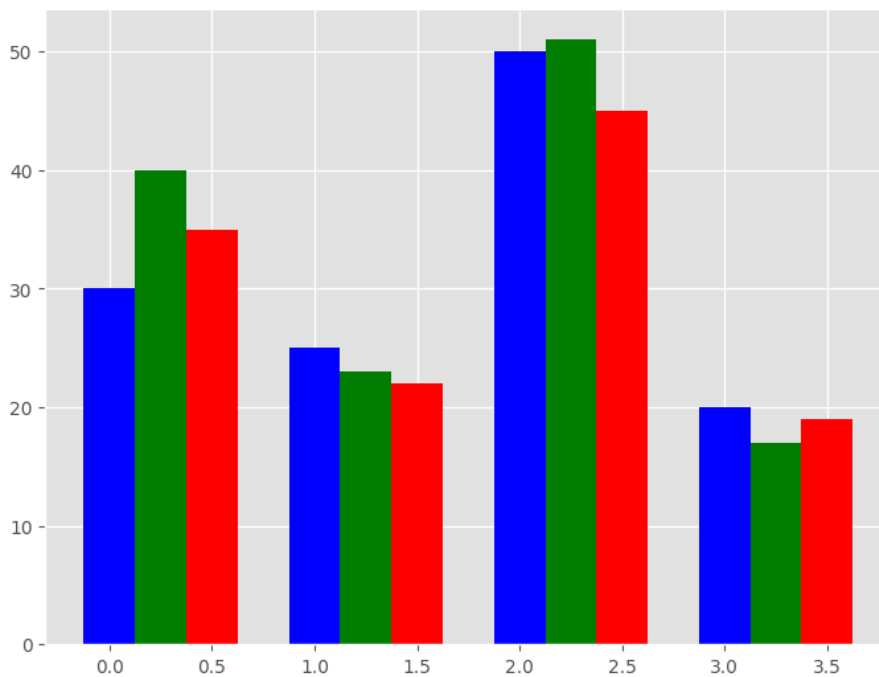
- Select two countries' worth of data.
- Plot with differently-colored markers.
- Create legend.

```
import matplotlib.pyplot as plt
fig = plt.figure()
ax = fig.add_axes([0,0,1,1])
langs = ['C', 'C++', 'Java', 'Python', 'PHP']
students = [23,17,35,29,12]
ax.bar(langs,students)
plt.show()
```



```
import numpy as np
import matplotlib.pyplot as plt
data = [[30, 25, 50, 20],
[40, 23, 51, 17],
[35, 22, 45, 19]]
X = np.arange(4)
fig = plt.figure()
ax = fig.add_axes([0,0,1,1])
ax.bar(X + 0.00, data[0], color = 'b', width = 0.25)
ax.bar(X + 0.25, data[1], color = 'g', width = 0.25)
ax.bar(X + 0.50, data[2], color = 'r', width = 0.25)
```

<BarContainer object of 4 artists>



```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
from sklearn.datasets import load_breast_cancer
```

```
breast = load_breast_cancer()
breast_data = breast.data
print(breast_data)
print(breast_data.shape)
```

```
[[1.799e+01 1.038e+01 1.228e+02 ... 2.654e-01 4.601e-01 1.189e-01]
 [2.057e+01 1.777e+01 1.329e+02 ... 1.860e-01 2.750e-01 8.902e-02]
 [1.969e+01 2.125e+01 1.300e+02 ... 2.430e-01 3.613e-01 8.758e-02]
 ...
 [1.660e+01 2.808e+01 1.083e+02 ... 1.418e-01 2.218e-01 7.820e-02]
 [2.060e+01 2.933e+01 1.401e+02 ... 2.650e-01 4.087e-01 1.240e-01]
 [7.760e+00 2.454e+01 4.792e+01 ... 0.000e+00 2.871e-01 7.039e-02]]
(569, 30)
```

```
cancer = load_breast_cancer(as_frame=True)
```

```
df=cancer.frame
```

```
df.head()
```

	mean radius	mean texture	mean perimeter	mean area	mean smoothness	mean compactness	mean concavity	mean concave points	mean symmetry	mean fractal dimension	...	worst texture	worst perimeter	wors are
0	17.99	10.38	122.80	1001.0	0.11840	0.27760	0.3001	0.14710	0.2419	0.07871	...	17.33	184.60	2019.
1	20.57	17.77	132.90	1326.0	0.08474	0.07864	0.0869	0.07017	0.1812	0.05667	...	23.41	158.80	1956.
2	19.69	21.25	130.00	1203.0	0.10960	0.15990	0.1974	0.12790	0.2069	0.05999	...	25.53	152.50	1709.
3	11.42	20.38	77.58	386.1	0.14250	0.28390	0.2414	0.10520	0.2597	0.09744	...	26.50	98.87	567.
4	20.29	14.34	135.10	1297.0	0.10030	0.13280	0.1980	0.10430	0.1809	0.05883	...	16.67	152.20	1575.

5 rows × 31 columns

```
df.shape
```

(569, 31)

```
breast_labels = breast.target
print(breast_labels)
print(breast_labels.shape)
```

```
[0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 1 1 1 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0
 1 0 0 0 0 0 0 0 0 1 0 1 1 1 1 0 0 1 0 0 1 1 1 1 0 1 0 0 1 1 1 1 0 1 0 0 1 0 0
 1 0 1 0 0 1 1 1 0 0 1 0 0 0 1 1 1 0 1 1 0 0 1 1 1 0 0 1 1 1 1 0 1 1 0 1 1
 1 1 1 1 1 1 0 0 0 1 0 0 1 1 1 0 0 1 0 1 0 0 1 0 0 1 1 0 1 1 0 1 1 1 1 0 1
 1 1 1 1 1 1 1 0 1 1 1 0 1 1 1 0 0 1 0 1 1 0 0 1 1 1 0 0 1 1 1 0 0 0 1 0
 1 0 1 1 1 0 1 1 0 0 1 0 0 0 0 1 0 0 0 1 0 1 0 1 1 0 1 0 0 0 0 1 1 0 0 1 1
 1 0 1 1 1 1 1 0 0 1 1 0 1 1 0 0 1 0 1 1 1 1 0 1 1 1 1 0 1 0 0 0 0 0 0
 0 0 0 0 0 0 0 1 1 1 1 1 1 0 1 0 1 1 0 1 0 0 1 1 1 1 1 1 1 1 1 1 1 1
 1 0 1 1 0 1 0 1 1 1 1 1 1 1 1 1 1 1 1 1 0 1 1 1 0 1 0 1 1 1 1 0 0 0 1 1
 1 1 0 1 0 1 0 1 1 1 0 1 1 1 1 1 1 0 0 0 1 1 1 1 1 1 1 1 1 1 0 0 1 0 0
 0 1 0 0 1 1 1 1 0 1 1 1 1 1 0 1 1 1 0 1 1 0 0 1 1 1 1 1 1 0 1 1 1 1 1
 1 0 1 1 1 1 1 0 1 1 0 1 1 1 1 1 1 1 1 1 1 1 0 1 0 0 1 0 1 1 1 1 0 1 1
 0 1 0 1 1 0 1 0 1 1 1 1 1 1 1 1 0 0 1 1 1 1 1 0 1 1 1 1 1 1 1 1 0 1
 1 1 1 1 1 1 0 1 0 1 1 0 1 1 1 1 1 0 0 1 0 1 0 1 1 1 1 1 0 1 1 0 1 0 0
 1 1 0 1 1 1 1 1 1 1 1 1 1 1 0 1 0 0 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1
 1 1 1 1 1 1 1 1 0 0 0 0 0 0 1]
```

(569,)

```
labels = np.reshape(breast_labels,(569,1))
final_breast_data = np.concatenate([breast_data,labels],axis=1)
print(final_breast_data.shape)
```

(569, 31)

```
breast_dataset = pd.DataFrame(final_breast_data)
print(breast_dataset.head())
```

	0	1	2	3	4	5	6	7	8	\
0	17.99	10.38	122.80	1001.0	0.11840	0.27760	0.3001	0.14710	0.2419	
1	20.57	17.77	132.90	1326.0	0.08474	0.07864	0.0869	0.07017	0.1812	
2	19.69	21.25	130.00	1203.0	0.10960	0.15990	0.1974	0.12790	0.2069	
3	11.42	20.38	77.58	386.1	0.14250	0.28390	0.2414	0.10520	0.2597	


```
4 20.29 14.34 135.10 1297.0 0.10030 0.13280 0.1980 0.10430 0.1809

      9      ...      21      22      23      24      25      26      27  \
0 0.07871 ... 17.33 184.60 2019.0 0.1622 0.6656 0.7119 0.2654
1 0.05667 ... 23.41 158.80 1956.0 0.1238 0.1866 0.2416 0.1860
2 0.05999 ... 25.53 152.50 1709.0 0.1444 0.4245 0.4504 0.2430
3 0.09744 ... 26.50 98.87 567.7 0.2098 0.8663 0.6869 0.2575
4 0.05883 ... 16.67 152.20 1575.0 0.1374 0.2050 0.4000 0.1625

      28      29      30
0 0.4601 0.11890 0.0
1 0.2750 0.08902 0.0
2 0.3613 0.08758 0.0
3 0.6638 0.17300 0.0
4 0.2364 0.07678 0.0
```

[5 rows x 31 columns]

```
features = breast.feature_names
print(features)

['mean radius' 'mean texture' 'mean perimeter' 'mean area'
 'mean smoothness' 'mean compactness' 'mean concavity'
 'mean concave points' 'mean symmetry' 'mean fractal dimension'
 'radius error' 'texture error' 'perimeter error' 'area error'
 'smoothness error' 'compactness error' 'concavity error'
 'concave points error' 'symmetry error' 'fractal dimension error'
 'worst radius' 'worst texture' 'worst perimeter' 'worst area'
 'worst smoothness' 'worst compactness' 'worst concavity'
 'worst concave points' 'worst symmetry' 'worst fractal dimension']
```

```
features_labels = np.append(features,'label')
```

```
breast_dataset.columns = features_labels
breast_dataset.head()
```

	mean radius	mean texture	mean perimeter	mean area	mean smoothness	mean compactness	mean concavity	mean concave points	mean symmetry	mean fractal dimension	...	worst texture	worst perimeter	worst area
0	17.99	10.38	122.80	1001.0	0.11840	0.27760	0.3001	0.14710	0.2419	0.07871	...	17.33	184.60	2019.
1	20.57	17.77	132.90	1326.0	0.08474	0.07864	0.0869	0.07017	0.1812	0.05667	...	23.41	158.80	1956.
2	19.69	21.25	130.00	1203.0	0.10960	0.15990	0.1974	0.12790	0.2069	0.05999	...	25.53	152.50	1709.
3	11.42	20.38	77.58	386.1	0.14250	0.28390	0.2414	0.10520	0.2597	0.09744	...	26.50	98.87	567.
4	20.29	14.34	135.10	1297.0	0.10030	0.13280	0.1980	0.10430	0.1809	0.05883	...	16.67	152.20	1575.

5 rows x 31 columns

```
breast_dataset['label'].replace(0,'benign',inplace = True)
breast_dataset['label'].replace(1,'malignant',inplace = True)
breast_dataset.tail()
```

	mean radius	mean texture	mean perimeter	mean area	mean smoothness	mean compactness	mean concavity	mean concave points	mean symmetry	mean fractal dimension	...	worst texture	worst perimeter	worst area
564	21.56	22.39	142.00	1479.0	0.11100	0.11590	0.24390	0.13890	0.1726	0.05623	...	26.40	166.10	202.
565	20.13	28.25	131.20	1261.0	0.09780	0.10340	0.14400	0.09791	0.1752	0.05533	...	38.25	155.00	173.
566	16.60	28.08	108.30	858.1	0.08455	0.10230	0.09251	0.05302	0.1590	0.05648	...	34.12	126.70	112.
567	20.60	29.33	140.10	1265.0	0.11780	0.27700	0.35140	0.15200	0.2397	0.07016	...	39.42	184.60	182.
568	7.76	24.54	47.92	181.0	0.05263	0.04362	0.00000	0.00000	0.1587	0.05884	...	30.37	59.16	26.

5 rows x 31 columns

```
from sklearn.preprocessing import StandardScaler
x = breast_dataset.loc[:, features].values
x = StandardScaler().fit_transform(x) # normalizing the features
print(x.shape)
```

(569, 30)

```
np.mean(x),np.std(x)
```

(-6.118909323768877e-16, 1.0)

```
feat_cols = ['features'+str(i) for i in range (x.shape[1])]
normalised_breast = pd.DataFrame(x,columns = feat_cols)
print(normalised_breast)
```

	features1	features1	features1	features1	features1	features1	\
0	1.097064	-2.073335	1.269934	0.984375	1.568466	3.283515	
1	1.829821	-0.353632	1.685955	1.908708	-0.826962	-0.487072	
2	1.579888	0.456187	1.566503	1.558884	0.942210	1.052926	
3	-0.768909	0.253732	-0.592687	-0.764464	3.283553	3.402909	
4	1.750297	-1.151816	1.776573	1.826229	0.280372	0.539340	
..	
564	2.110995	0.721473	2.060786	2.343856	1.041842	0.219060	
565	1.704854	2.085134	1.615931	1.723842	0.102458	-0.017833	
566	0.702284	2.045574	0.672676	0.577953	-0.840484	-0.038680	
567	1.838341	2.336457	1.982524	1.735218	1.525767	3.272144	
568	-1.808401	1.221792	-1.814389	-1.347789	-3.112085	-1.150752	
	features1	features1	features1	features1	...	features1	features1 \
0	2.652874	2.532475	2.217515	2.255747	...	1.886690	-1.359293
1	-0.023846	0.548144	0.001392	-0.868652	...	1.805927	-0.369203
2	1.363478	2.037231	0.939685	-0.398008	...	1.511870	-0.023974
3	1.915897	1.451707	2.867383	4.910919	...	-0.281464	0.133984
4	1.371011	1.428493	-0.009560	-0.562450	...	1.298575	-1.466770
..
564	1.947285	2.320965	-0.312589	-0.931027	...	1.901185	0.117700
565	0.693043	1.263669	-0.217664	-1.058611	...	1.536720	2.047399
566	0.046588	0.105777	-0.809117	-0.895587	...	0.561361	1.374854
567	3.296944	2.658866	2.137194	1.043695	...	1.961239	2.237926
568	-1.114873	-1.261820	-0.820070	-0.561032	...	-1.410893	0.764190
	features1	features1	features1	features1	features1	features1	\
0	2.303601	2.001237	1.307686	2.616665	2.109526	2.296076	
1	1.535126	1.890489	-0.375612	-0.430444	-0.146749	1.087084	
2	1.347475	1.456285	0.527407	1.082932	0.854974	1.955000	
3	-0.249939	-0.550021	3.394275	3.893397	1.989588	2.175786	
4	1.338539	1.220724	0.220556	-0.313395	0.613179	0.729259	
..	
564	1.752563	2.015301	0.378365	-0.273318	0.664512	1.629151	
565	1.421940	1.494959	-0.691230	-0.394820	0.236573	0.733827	
566	0.579001	0.427906	-0.809587	0.350735	0.326767	0.414069	
567	2.303601	1.653171	1.430427	3.904848	3.197605	2.289985	
568	-1.432735	-1.075813	-1.859019	-1.207552	-1.305831	-1.745063	
	features1	features1					
0	2.750622	1.937015					
1	-0.243890	0.281190					
2	1.152255	0.201391					
3	6.046041	4.935010					
4	-0.868353	-0.397100					
..					
564	-1.360158	-0.709091					
565	-0.531855	-0.973978					
566	-1.104549	-0.318409					
567	1.919083	2.219635					
568	-0.048138	-0.751207					

[569 rows x 30 columns]

```
normalised_breast.head()
```

	features1	features1	features1	features1	features1	features1	features1	featur
0	1.097064	-2.073335	1.269934	0.984375	1.568466	3.283515	2.652874	2.532
1	1.829821	-0.353632	1.685955	1.908708	-0.826962	-0.487072	-0.023846	0.548
2	1.579888	0.456187	1.566503	1.558884	0.942210	1.052926	1.363478	2.037
3	-0.768909	0.253732	-0.592687	-0.764464	3.283553	3.402909	1.915897	1.451
4	1.750297	-1.151816	1.776573	1.826229	0.280372	0.539340	1.371011	1.428

5 rows x 30 columns

```
from sklearn.decomposition import PCA
pca_breast = PCA(n_components=2)
PrincipalComponents_breast = pca_breast.fit_transform(x)
Principal_breast_Df = pd.DataFrame(data = PrincipalComponents_breast,columns = ['principal component 1','principal component 2'])
Principal_breast_Df.tail()
```

	principal component 1	principal component 2
564	6.439315	-3.576817
565	3.793382	-3.584048
566	1.256179	-1.902297
567	10.374794	1.672010
568	-5.475243	-0.670637

```
import matplotlib.pyplot as plt
plt.figure()
plt.figure(figsize = (10,10))
plt.xticks(fontsize =12)
plt.yticks(fontsize = 14)
plt.xlabel('PrincipalComponent - 1',fontsize=20)
plt.ylabel('PrincipalComponent - 2',fontsize=20)
plt.title("PrincipalComponent analysis of Breast Cancer Dataset",fontsize=20)
targets = ['Benign','Malignant']
colors = ['r','g']
for target,color in zip(targets,colors):
    indicesTokeep = breast_dataset['label'] == target
    plt.scatter(Principal_breast_Df.loc[indicesTokeep,'Principal component 1']
                ,Principal_breast_Df.loc[indicesTokeep,'Principal component 2'],c = color,s=5)

plt.legend(targets,prop={'size':15})
```

```
-----
KeyError                                Traceback (most recent call last)
/usr/local/lib/python3.10/dist-packages/pandas/core/indexes/base.py in get_loc(self, key, method, tolerance)
    3801         try:
-> 3802             return self._engine.get_loc(casted_key)
    3803         except KeyError as err:
```

10 frames

pandas/_libs/hashtable_class_helper.pxi in pandas._libs.hashtable.PyObjectHashTable.get_item()

pandas/_libs/hashtable_class_helper.pxi in pandas._libs.hashtable.PyObjectHashTable.get_item()

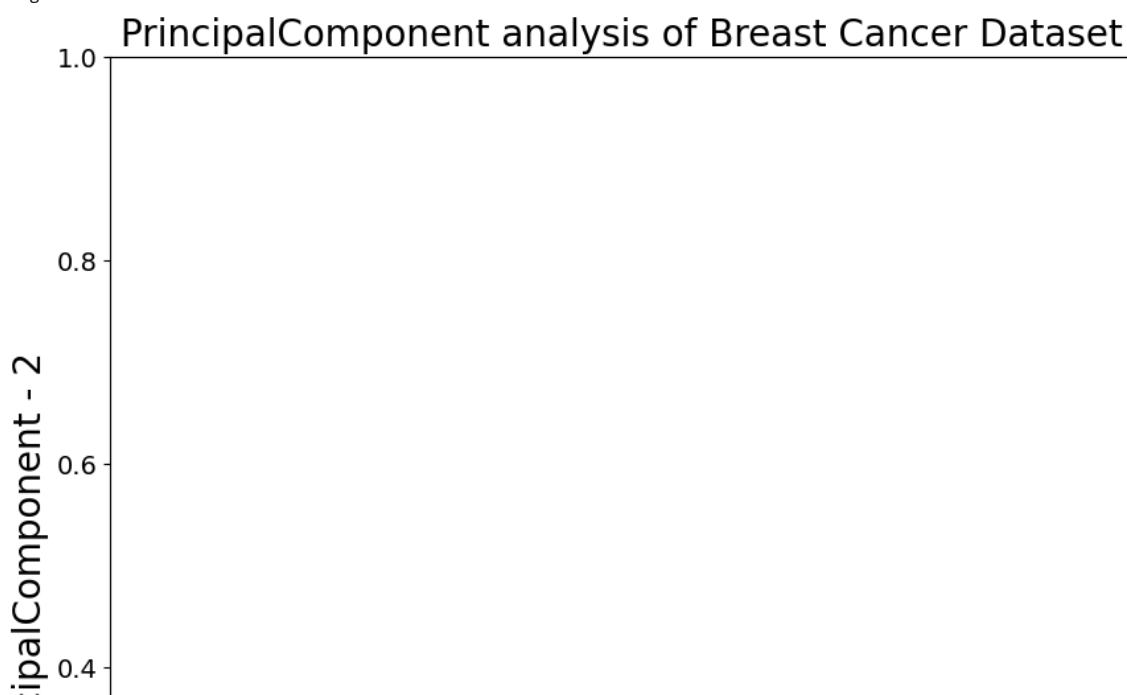
KeyError: 'Principal component 1'

The above exception was the direct cause of the following exception:

```
KeyError                                Traceback (most recent call last)
/usr/local/lib/python3.10/dist-packages/pandas/core/indexes/base.py in get_loc(self, key, method, tolerance)
    3802         return self._engine.get_loc(casted_key)
    3803     except KeyError as err:
-> 3804         raise KeyError(key) from err
    3805     except TypeError:
    3806         # If we have a listlike key, _check_indexing_error will raise
```

KeyError: 'Principal component 1'

<Figure size 640x480 with 0 Axes>



✓ 2.3 correlation Regression

```
import matplotlib.pyplot as plt
import seaborn as sns
df = sns.load_dataset('iris')
#without regression
sns.pairplot(df,kind="scatter")
plt.show()
```

