

SAMSUNG

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Enabling People

Education for Future Generations

Samsung Innovation Campus

Artificial Intelligence Course

Chapter 3.

Python Libraries

AI Course

Chapter 3.

Python Libraries

UNIT 3.

Visualization

Unit 3. Visualization

| What this unit is about:

- This unit is about visualization techniques.
- You will learn when to use the different visualization types.
- You will learn how to create basic visualization types using libraries.
- You will learn how to create more advanced visualization types using libraries.

| Expected outcome:

- Ability to select the proper visualization type.
- Ability to express data as a visualization to communicate and enhance the understanding.
- Ability to aid the exploratory data analysis (EDA) with visualization.

| How to check your progress:

- Coding Exercises.
- Quiz.

Chapter 3.

Python Libraries

| UNIT 1. NumPy Package

- 1.1. NumPy array basics.
- 1.2. NumPy array operations.
- 1.3. Linear algebra: vectors and matrices.

| UNIT 2. Pandas Package

- 2.1. Pandas Series and DataFrame.
- 2.2. Data summarization and manipulation.

| UNIT 3. Visualization

- 3.1. Introduction to visualization.
- 3.2. Matplotlib and Pandas visualization.
- 3.3. Seaborn visualization.

Visualization Principles

Reasons for applying visualization:

- ▶ To describe statistical properties of data.
- ▶ To show structural relations, correlations, etc. that may exist in the data.
- ▶ To summarize large amount of data.
- ▶ To compare different theories and hypotheses.
- ▶ To validate and support the analysis.
- ▶ To communicate our findings to others.

Visualization and EDA

Visualization in Exploratory Data Analysis (EDA):

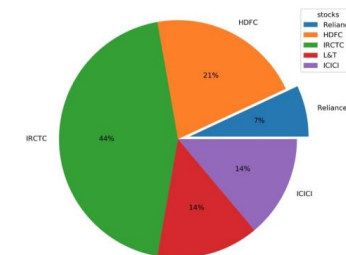
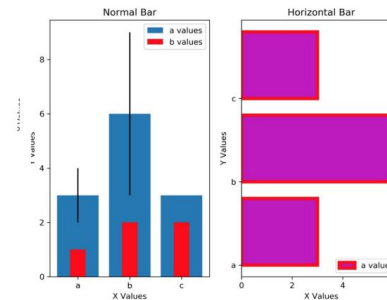
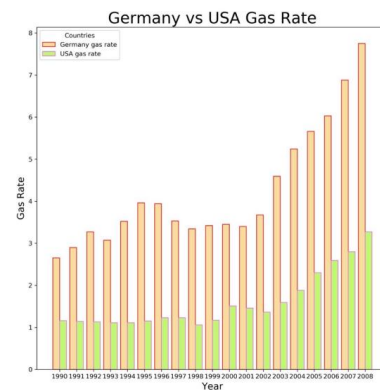
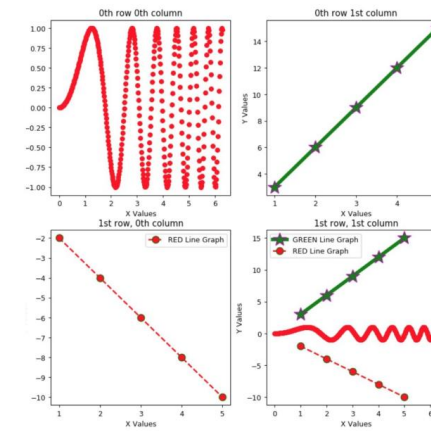
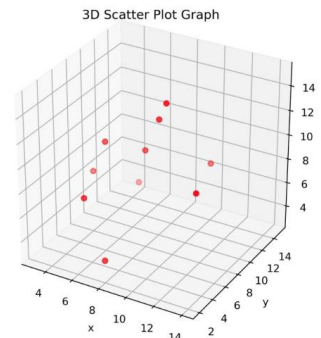
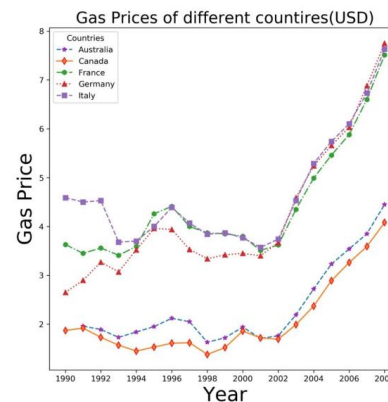
- Visualization is particularly useful for EDA.
- Visualization helps to determine future course of actions.
- You may need to make many “low-quality” graphics to enhance our own understanding of the data.
- You are the end consumers, thus decorative elements are kept to the minimum.

UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types

Matplotlib Plots:



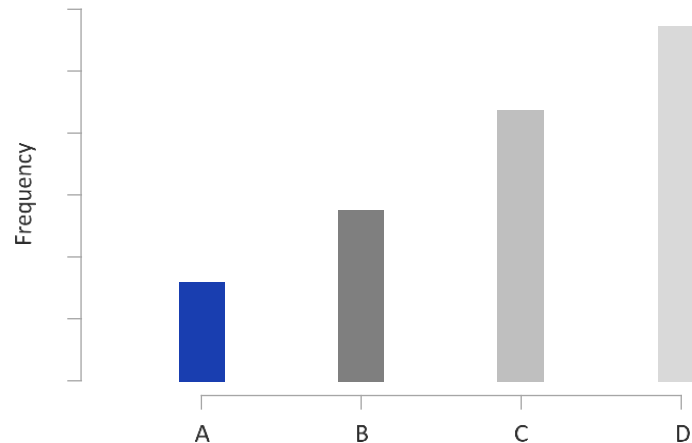
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (4/13)

Univariate visualization:

- ▶ One categorical variable: **Bar plot**.



- ▶ Shows the absolute or relative frequencies of each category (type).

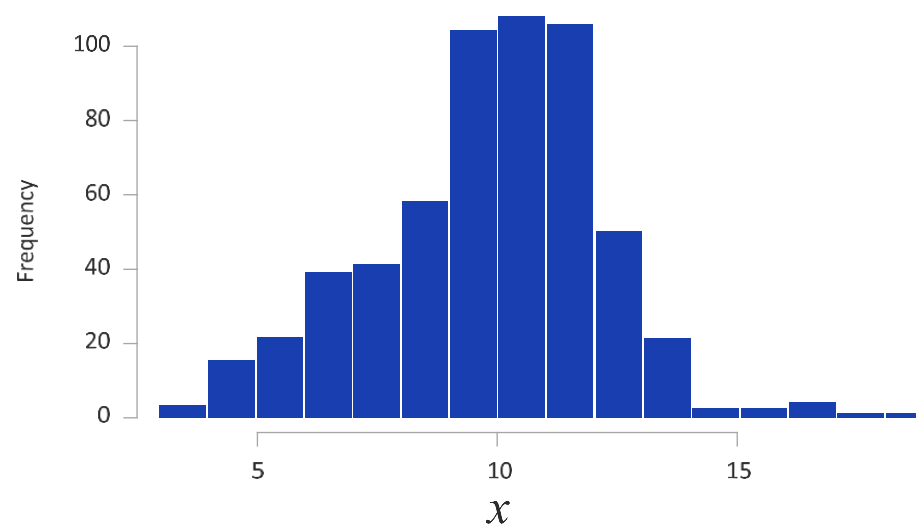
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (2/13)

Univariate visualization:

- ▶ One continuous numeric variable: **Histogram**.



- ▶ Shows the absolute or relative frequencies of each interval.

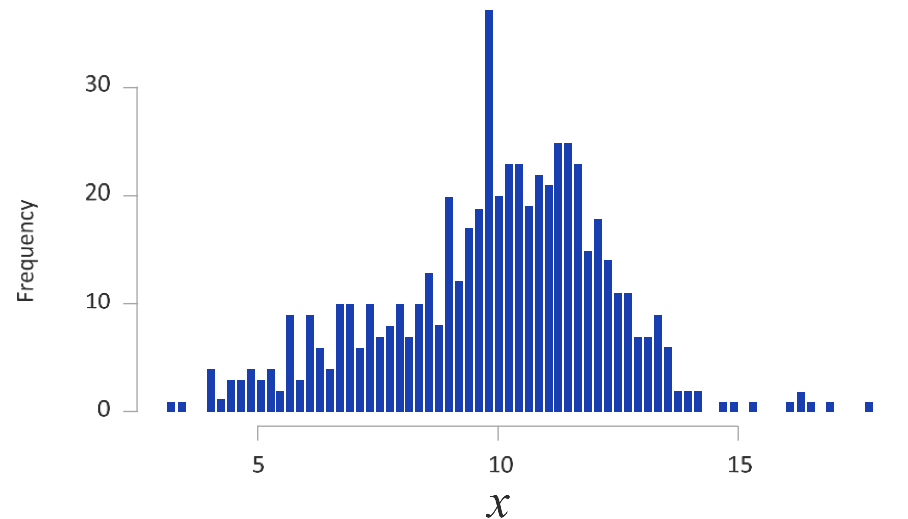
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (3/13)

Univariate visualization:

- ▶ One continuous numeric variable: **Histogram**.



- ▶ The interval width can be adjusted.

UNIT 3.

3.1. Introduction to visualization.

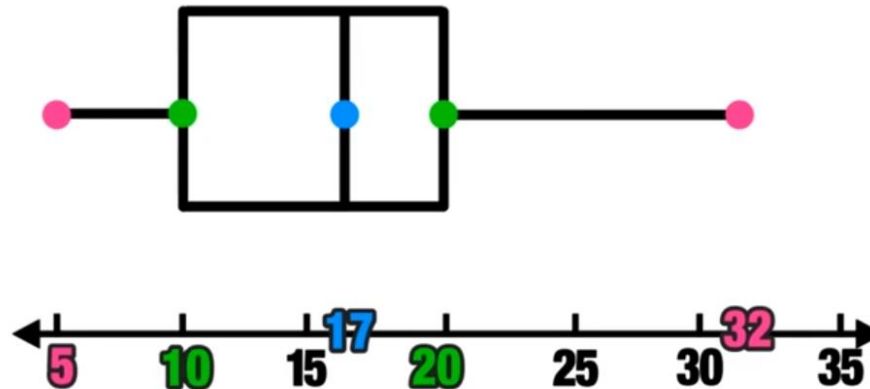
Basic Visualization Types (1/13)

Univariate visualization:

- One continuous numeric variable: **Boxplot**.

5 10 16 17 18 20 32

Upper Extreme: 32
Lower Extreme: 5
Median: 17
Upper Quartile: 20
Lower Quartile: 10



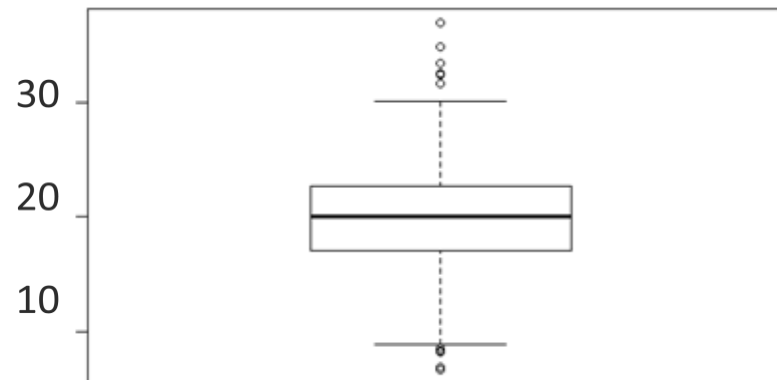
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (1/13)

Univariate visualization:

- ▶ One continuous numeric variable: **Boxplot**.



- ▶ A boxplot is composed of a box, whiskers, outliers, etc.

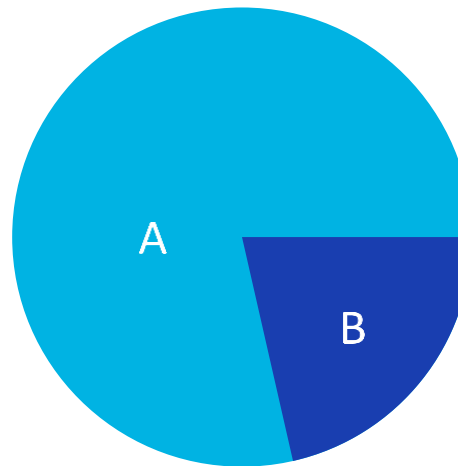
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (5/13)

Univariate visualization:

- ▶ One categorical variable: **Pie chart**.



- ▶ Shows the proportions of each category (type).

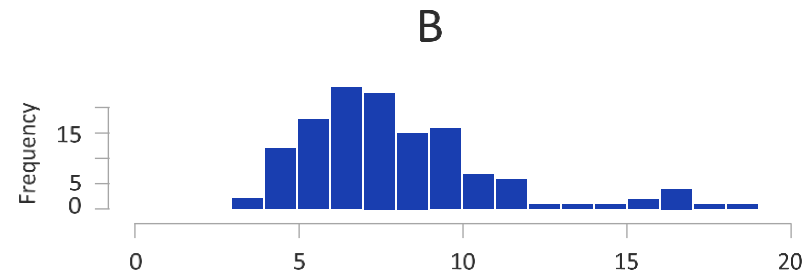
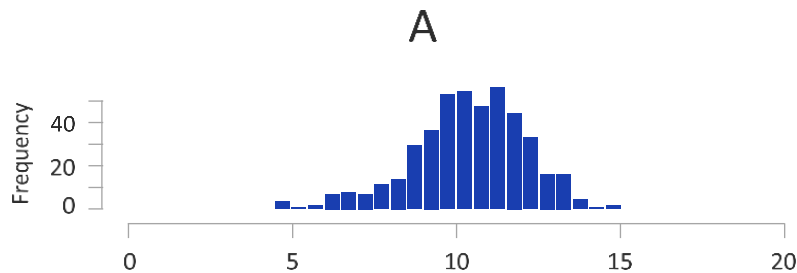
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (7/13)

Bivariate visualization:

- ▶ One continuous numeric variable & one categorical variable: **Multiple Histograms**.



- ▶ The number of categories (types) = the number of histograms.
- ▶ You should make sure that the axis ranges match for proper comparison.

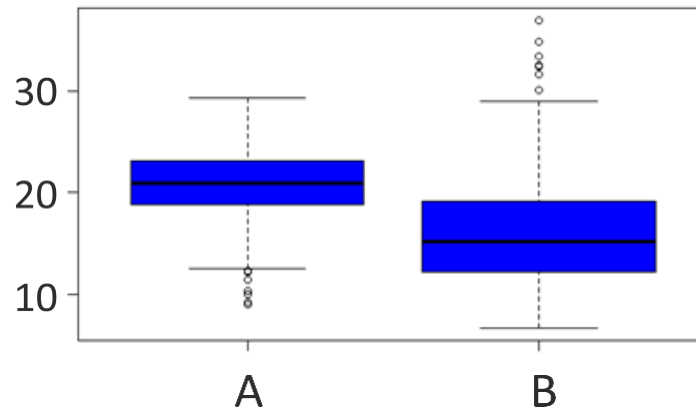
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (6/13)

| Bivariate visualization:

- ▶ One continuous numeric variable & one categorical variable: **Multiple Boxplots**



- ▶ The number of categories (types) = the number of boxplots.

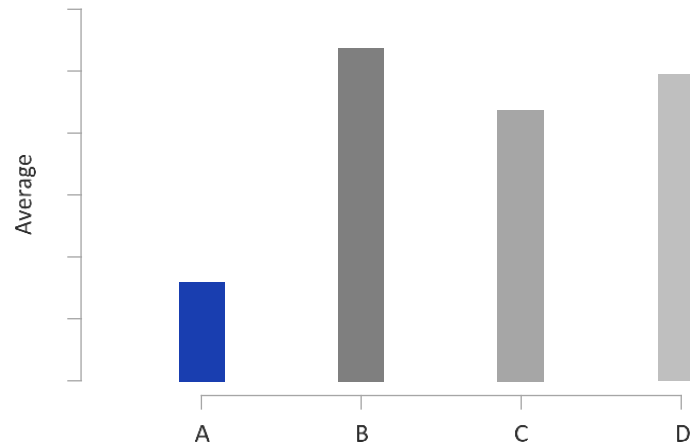
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (8/13)

| Bivariate visualization:

- ▶ One continuous numeric variable & one categorical variable: **Bar plot**.



- ▶ Shows the summary statistics (average, median, etc.) for each category (type, group).

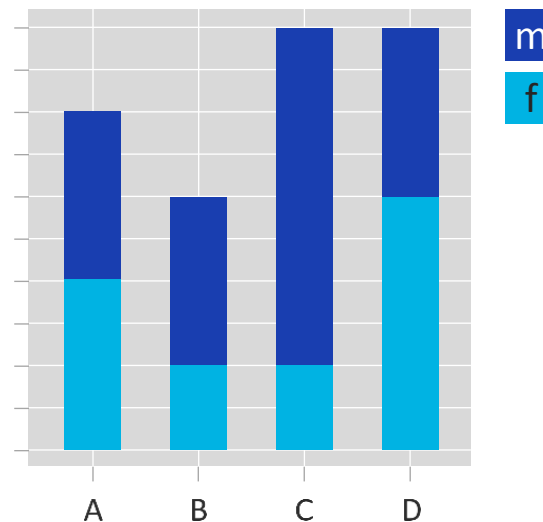
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (9/13)

Bivariate visualization:

- Two categorical variables: **Bar plot**.



- Use color to distinguish the categories of the secondary variable.

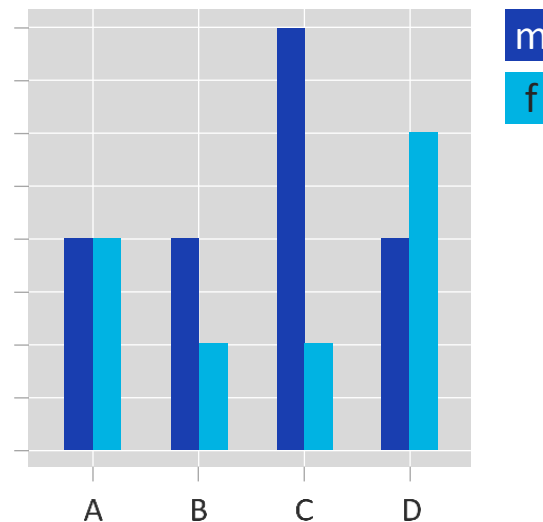
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (10/13)

| Bivariate visualization:

- ▶ Two categorical variables: Bar plot.



- ▶ Use color and dodged bars to distinguish the categories of the secondary variable.

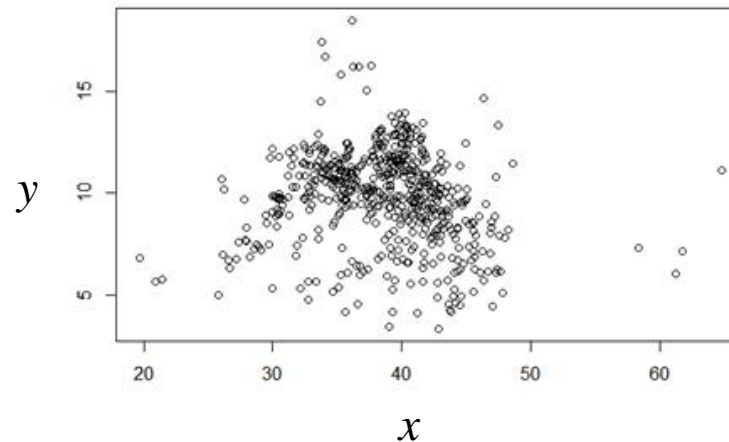
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (11/13)

| Bivariate visualization:

- ▶ Two continuous numeric variables: **Scatter plot**.



- ▶ Identify whether a linear relation exists between the two variables.

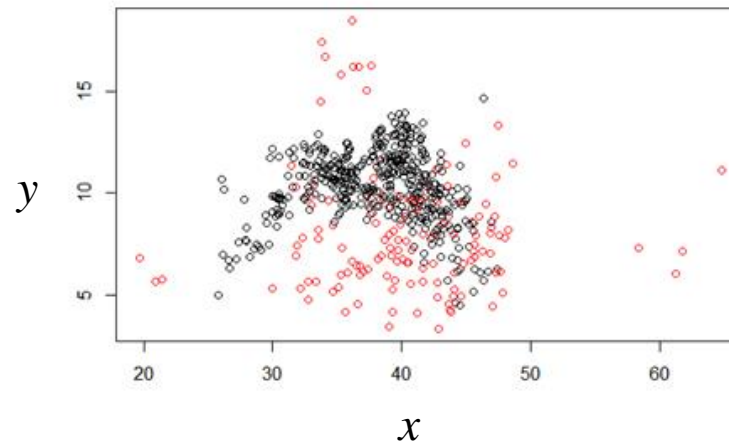
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (12/13)

| Multivariate visualization:

- ▶ Two continuous numeric variables and one categorical variable: **Scatter plot**.



- ▶ Different categories can be denoted by different colors or markers (symbols).

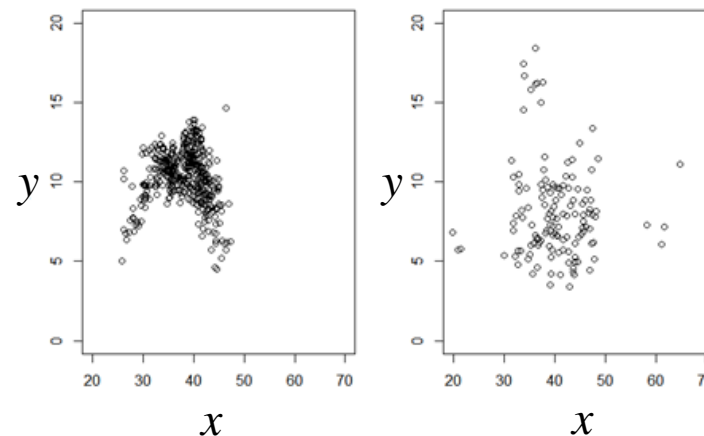
UNIT 3.

3.1. Introduction to visualization.

Basic Visualization Types (13/13)

Multivariate visualization:

- Two continuous numeric variables and one categorical variable: **Multiple Scatter plots.**



- Different categories can be plotted separately.
- You should make sure that the axis ranges match for proper comparison.

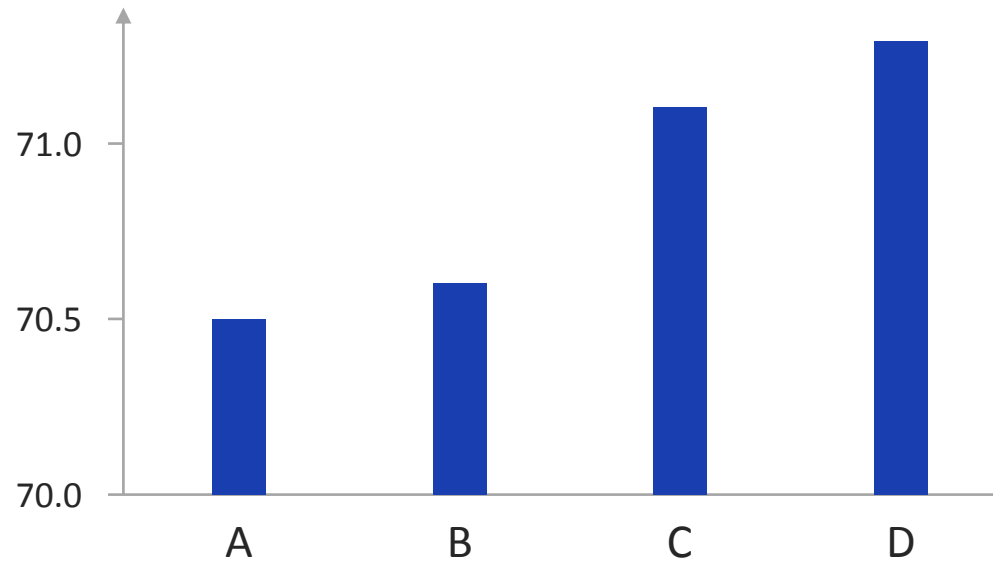
UNIT 3.

3.1. Introduction to visualization.

Recommendations (1/3)

| In the following bar plot, can you see big difference among the categories?

- Apparently, yes?



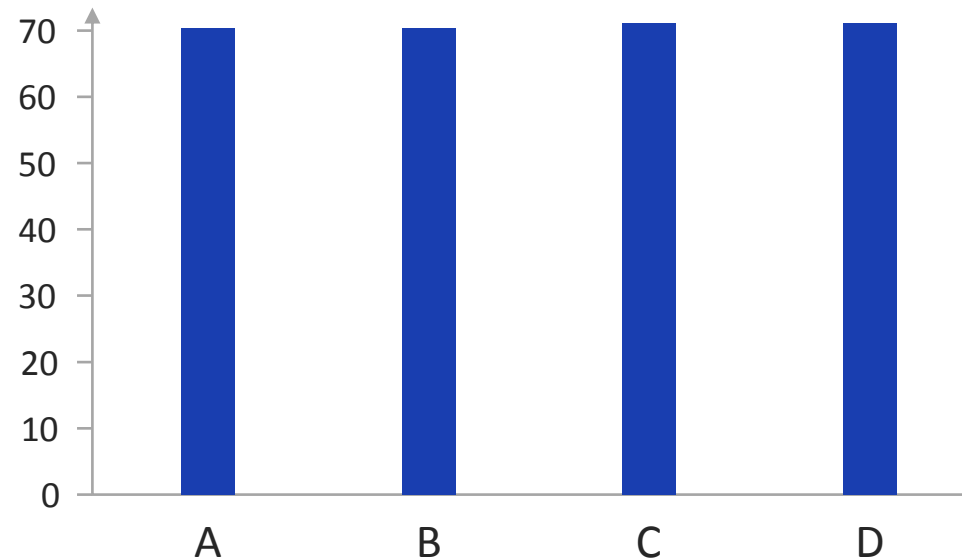
UNIT 3.

3.1. Introduction to visualization.

Recommendations (2/3)

| In the following bar plot, can you see big difference between the categories?

- ▶ In this case where the vertical zero is shown, you see little difference.



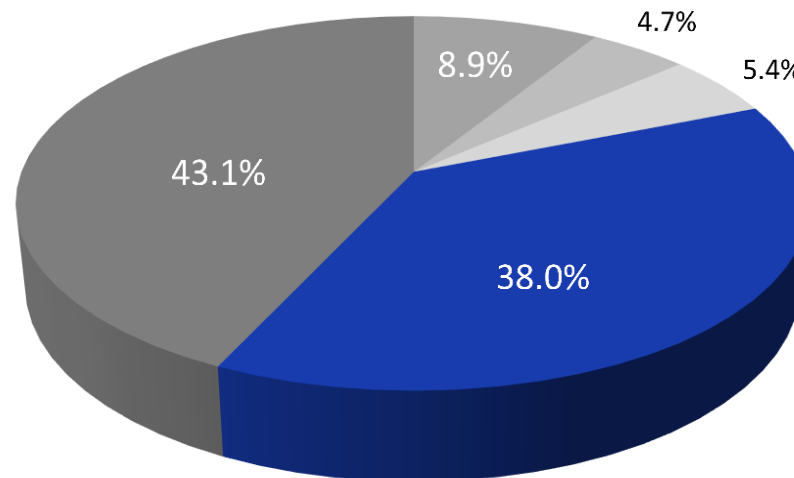
UNIT 3.

3.1. Introduction to visualization.

Recommendations (3/3)

■ Sometimes 3D effects should be avoided.

- ▶ In a 3D pie chart, it is hard to distinguish the relative proportions due to the perspective.



Chapter 3.

Python Libraries

| UNIT 1. NumPy Package

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- 1.3. Linear algebra: vectors and matrices.

| UNIT 2. Pandas Package

- 2.1. Pandas Series and DataFrame.
- 2.2. Data summarization and manipulation.

| UNIT 3. Visualization

- 3.1. Introduction to visualization.
- 3.2. Matplotlib and Pandas visualization.
- 3.3. Seaborn visualization.

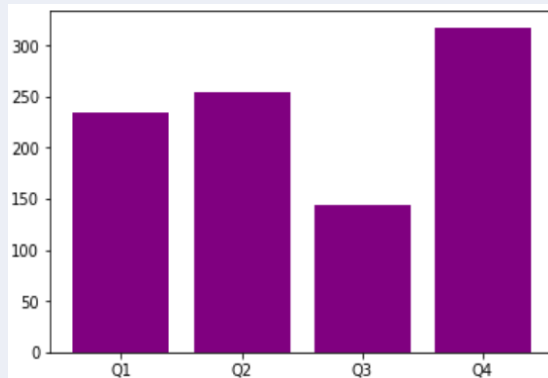
UNIT 3.

3.2. Matplotlib and Pandas visualization.

Basic Matplotlib Visualization (1/8)

Bar plot.

```
In[1] : import matplotlib.pyplot as plt  
import numpy as np  
x = np.array(['Q1', 'Q2', 'Q3', 'Q4'])  
y = np.array([ 234.0, 254.7, 144.6, 317.6])  
plt.bar(x, y, color = 'purple')  
plt.show()
```



UNIT 3.

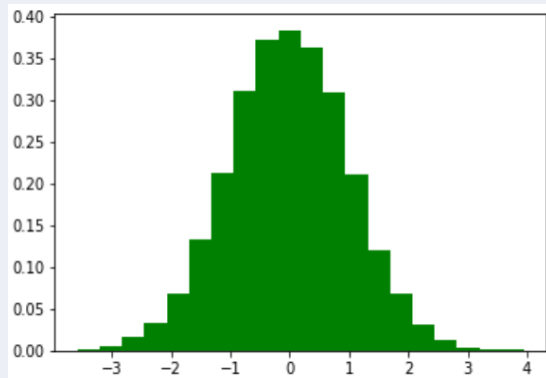
3.2. Matplotlib and Pandas visualization.

Basic Matplotlib Visualization (2/8)

| Histogram.

```
In[1] : x = np.random.randn(10000)  
        plt.hist(x ,bins=20, color='green', density=True)  
        plt.show()
```

NumPy array of random normal values.



UNIT 3.

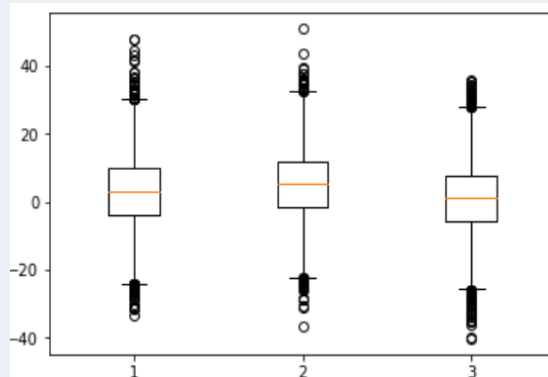
3.2. Matplotlib and Pandas visualization.

Basic Matplotlib Visualization (3/8)

Multiple Boxplots.

```
In[1] : x = np.random.randn(10000)*10+3  
        y = np.random.randn(10000)*10+5  
        z = np.random.randn(10000)*10+1  
        plt.boxplot([x, y, z], 0)  
        plt.show()
```

x, y, z = NumPy arrays of random normal values.



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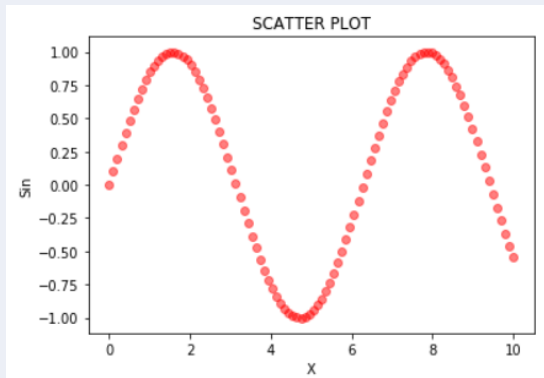
3.2. Matplotlib and Pandas visualization.

Basic Matplotlib Visualization (4/8)

Scatter plot.

```
In[1] : x = np.linspace(0,10,100)
        y = np.sin(x)
        plt.scatter(x, y, c='red', marker='o', alpha=0.5)
        plt.xlabel('X')
        plt.ylabel('Sin')
        plt.title('SCATTER PLOT')
        plt.show()
```

100 equally spaced values between 0 and 10.



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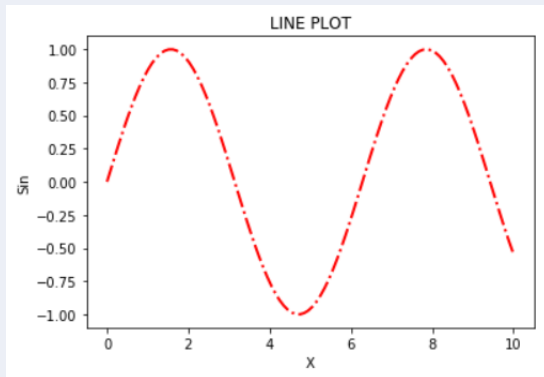
3.2. Matplotlib and Pandas visualization.

Basic Matplotlib Visualization (5/8)

Line plot.

```
In[1] : x = np.linspace(0,10,100)
        y = np.sin(x)
        plt.plot(x, y, color='red', linestyle='-.', linewidth=2)
        plt.xlabel('X')
        plt.ylabel('Sin')
        plt.title('LINE PLOT')
        plt.show()
```

100 equally spaced values between 0 and 10.



UNIT 3.

3.2. Matplotlib and Pandas visualization.

Basic Matplotlib Visualization (6/8)

Arguments of the plot() function:

Argument	Explanation
color	Color.
alpha	Transparency.
linewidth	Line width.
linestyle	Line style.
marker	Marker type.
markersize	Marker size.
markerfacecolor	Marker color inside.
markeredgecolor	Color of the marker edge.
markeredgewidth	Width of the marker edge.

More information can be found at https://matplotlib.org/3.1.1/api/_as_gen/matplotlib.pyplot.plot.html

UNIT 3.

3.2. Matplotlib and Pandas visualization.

Basic Matplotlib Visualization (7/8)

Values of the linestyle argument:

linestyle	Explanation
'none'	No line.
'.'	Dotted line.
'--'	Dashed line.
'-.'	Dash dot.
'_'	Continuous line.
'steps'	In steps.

More information can be found at https://matplotlib.org/3.1.1/api/_as_gen/matplotlib.pyplot.plot.html

UNIT 3.

3.2. Matplotlib and Pandas visualization.

Basic Matplotlib Visualization (8/8)

Values of the marker argument:

marker	Explanation
'.'	Point.
','	Pixel.
'o'	Circle.
'^'	Triangle up.
'v'	Triangle down.
's'	Square.
'*'	Star.
'+'	Plus sign.
'x'	X character.
'D'	Diamond.
'p'	Pentagon.

More information can be found at https://matplotlib.org/3.1.1/api/_as_gen/matplotlib.pyplot.plot.html

UNIT 3.

3.2. Matplotlib and Pandas visualization.

Coding Exercise #0209

Follow practice steps on 'ex_0209.ipynb' file

UNIT 3.

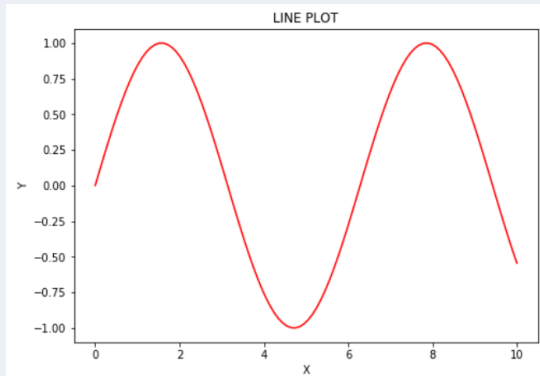
3.2. Matplotlib and Pandas visualization.

Matplotlib Visualization with Objects (1/5)

Visualization with a figure object:

```
In[1] : fig=plt.figure()  
        axes = fig.add_axes([0,0,1,1])  
        axes.plot(x,y,color='red',linestyle='-')  
        axes.set_xlabel('X')  
        axes.set_ylabel('Y')  
        axes.set_title('LINE PLOT')  
        plt.show()
```

Create a figure object.
Left, bottom, width, height of the axes.



UNIT 3.

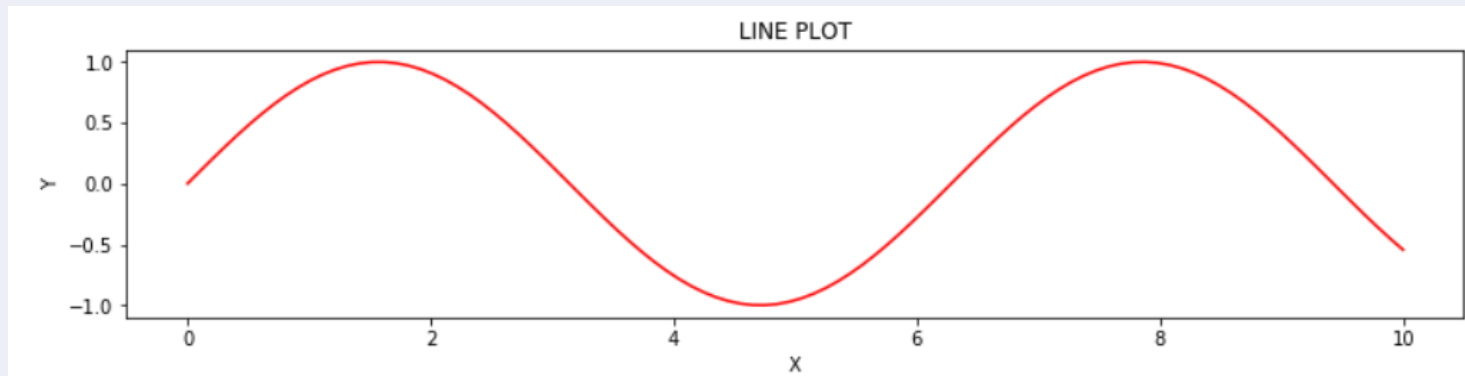
3.2. Matplotlib and Pandas visualization.

Matplotlib Visualization with Objects (2/5)

Visualization with a figure object:

```
In[1] : fig=plt.figure(figsize=(10,2))  
        axes = fig.add_axes([0,0,1,1])  
        axes.plot(x,y,color='red',linestyle='-')  
        axes.set_xlabel('X')  
        axes.set_ylabel('Y')  
        axes.set_title('LINE PLOT')  
        plt.show()
```

Width and height specified.
Left, bottom, width, height of the axes.



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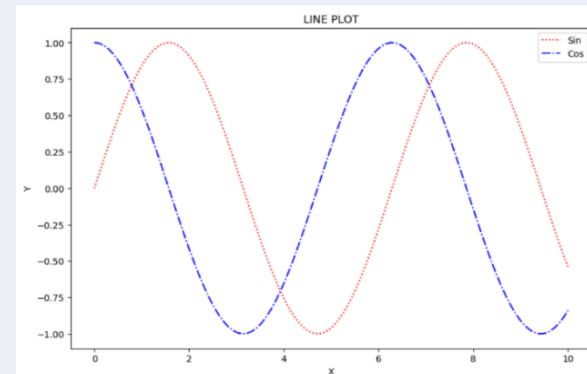
3.2. Matplotlib and Pandas visualization.

Matplotlib Visualization with Objects (3/5)

Multiple plots within the same axes:

```
In[1] : fig=plt.figure(figsize=(8,5), dpi=100)
        axes = fig.add_axes([0,0,1,1])
        axes.plot(x,y,color='red',linestyle=':', label='Sin')
        axes.plot(x,z,color='blue',linestyle='-.', label='Cos')
        axes.legend(loc=0)
        axes.set_xlabel('X')
        axes.set_ylabel('Y')
        axes.set_title('LINE PLOT')
        plt.show()
```

```
# Width, height and DPI setting.
# Left, bottom, width, height of the axes.
# Label for the legend.
# Label for the legend.
# Legend at the top-right corner.
```



UNIT 3.

3.2. Matplotlib and Pandas visualization.

Matplotlib Visualization with Objects (4/5)

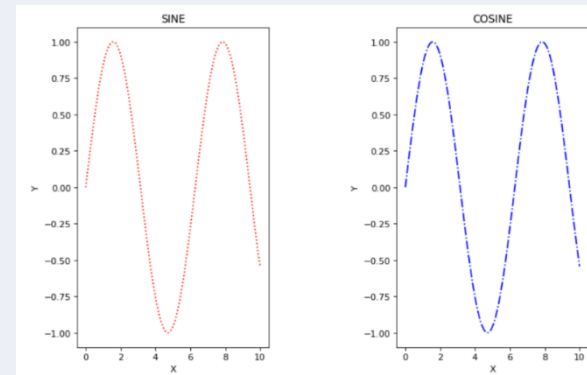
Multiple plots in separate axes:

```
In[1] : fig=plt.figure(figsize=(10,5), dpi=80)
        axes1 = fig.add_axes([0,0,0.3,1])
        axes2 = fig.add_axes([0.5,0,0.3,1])
        axes1.plot(x,y,color='red',linestyle=':')
        axes2.plot(x,y,color='blue',linestyle='-.')
        axes1.set_xlabel('X')
        axes1.set_ylabel('Y')
        axes1.set_title('SINE')
        axes2.set_xlabel('X')
        axes2.set_ylabel('Y')
        axes2.set_title('COSINE')
        plt.show()
```

Width, height and DPI setting.

Left, bottom, width, height of the axes1.

Left, bottom, width, height of the axes2.



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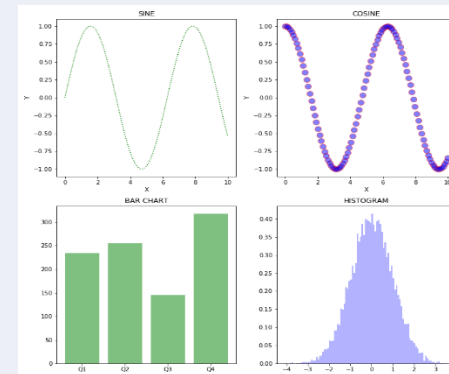
3.2. Matplotlib and Pandas visualization.

Matplotlib Visualization with Objects (5/5)

Multiple plots in an array of axes:

```
In[1] : fig, axes = plt.subplots(nrows=2, ncols=2, figsize=(10,10))
        # (0,0) <= The top-left axes.
        axes[0,0].plot(x,y,color='green',linestyle=':')
        axes[0,0].set_xlabel('X')
        axes[0,0].set_ylabel('Y')
        axes[0,0].set_title('SINE')
        # (0,1) <= Continue with the top-right axes.
        :
        :
        :
        :
        plt.tight_layout()
        plt.show()
```

A 2x2 array of axes.



Avoid overlapping.

UNIT 3.

3.2. Matplotlib and Pandas visualization.

Coding Exercise #0210

Follow practice steps on 'ex_0210.ipynb' file

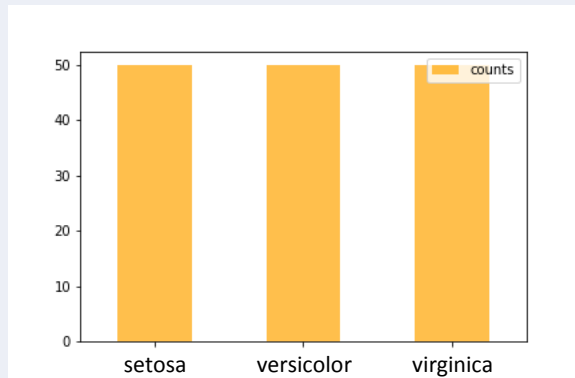
UNIT 3.

3.2. Matplotlib and Pandas visualization.

Pandas Visualization (1/4)

Visualize directly from Series and DataFrames:

```
In[1] : frequencies = df.Species.value_counts()  
        my_counts = list(frequencies.values)  
        my_labels = list(frequencies.index)  
        df2 = pd.DataFrame( {'counts':my_counts}, index = my_labels)  
        df2.plot.bar(color='orange', alpha=0.7)  
        plt.show()
```



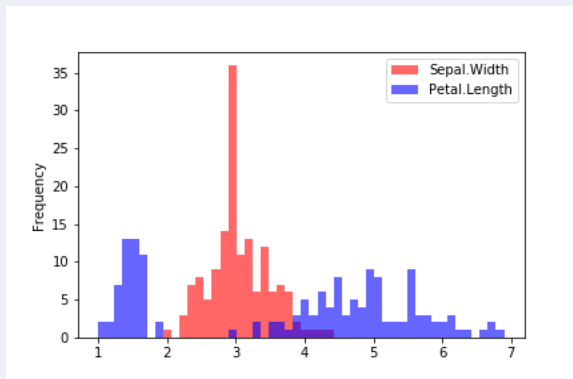
UNIT 3.

3.2. Matplotlib and Pandas visualization.

Pandas Visualization (2/4)

Visualize directly from Series and DataFrames:

```
In[1] : df.loc[:,['Sepal.Width','Petal.Length']].plot.hist(bins=50, color=['red','blue'], alpha=0.6)  
plt.show()
```



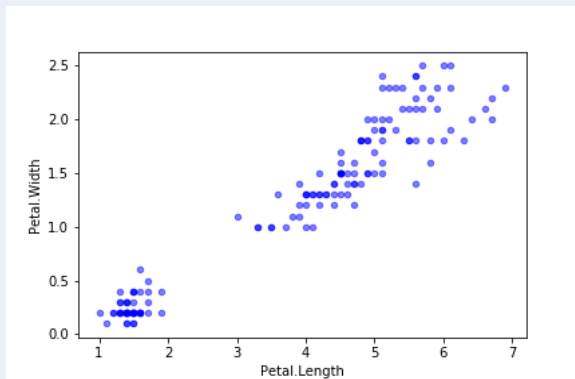
UNIT 3.

3.2. Matplotlib and Pandas visualization.

Pandas Visualization (3/4)

Visualize directly from Series and DataFrames:

```
In[1] : df.plot.scatter(x='Petal.Length', y='Petal.Width', color='blue', alpha=0.5, marker='o', s=20)  
plt.show()
```



UNIT 3.

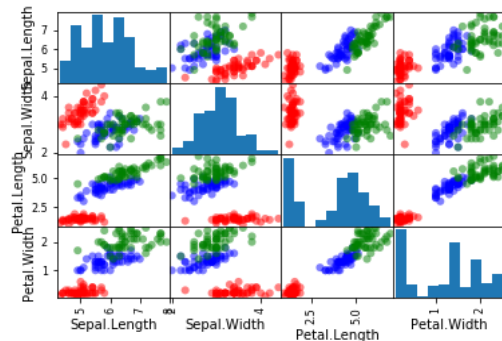
3.2. Matplotlib and Pandas visualization.

Pandas Visualization (4/4)

Pandas provides specialized visualization functions:

```
In[1] : my_cols_dict = {'setosa':'red', 'virginica':'green', 'versicolor':'blue'}  
        my_cols = df['Species'].apply(lambda x: my_cols_dict[x])  
        pd.plotting.scatter_matrix(df, c=my_cols, marker='o', alpha=0.5)  
        plt.show()
```

Convert species into colors.



UNIT 3.

3.2. Matplotlib and Pandas visualization.

Coding Exercise #0211

Follow practice steps on 'ex_0211.ipynb' file

UNIT 3.

3.2. Matplotlib and Pandas visualization.

Coding Exercise #0212

Follow practice steps on 'ex_0212.ipynb' file