Elective Course
Course Code: CS4103
Autumn 2025-26

Lecture #9

Artificial Intelligence for Data Science

Week-3:
Python Primer for AI [Part-III]

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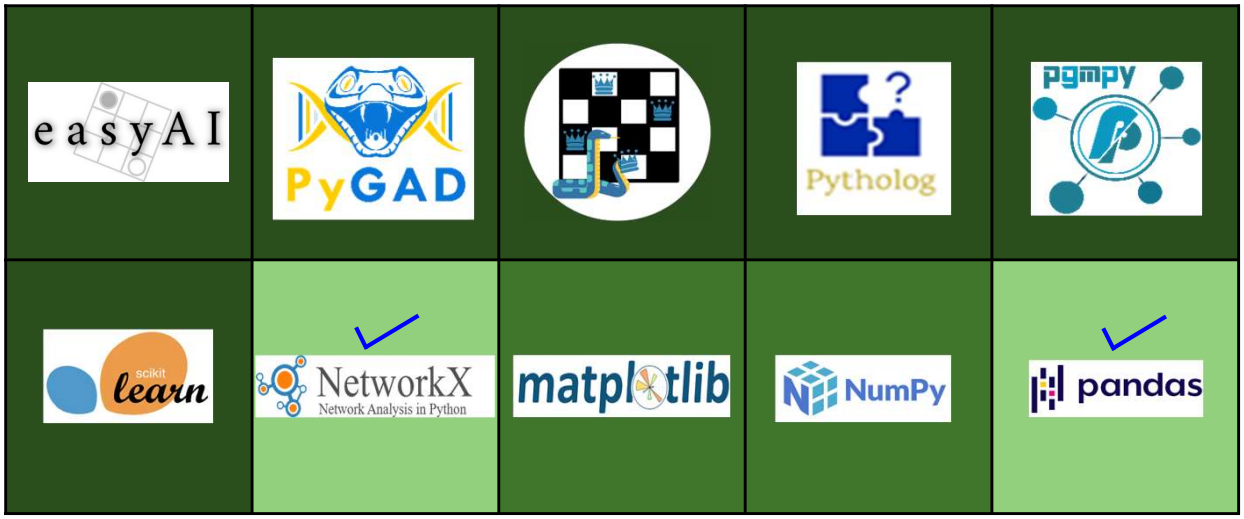
A Few Python Libraries for AI



Pandas Data Structures

```
import pandas as pd
#Series:
s = pd.Series([10, -11, 12, 13], index=['a', 'b', 'c', 'd'])
print(s)
print(s['c']) #output should be 12

#Dataframe:
data = {'ID': ['21MS990', '21MS991', '21MS992', '25RS999','21MS992'],
        'Name': ['Alan', 'Anna', 'Alex', 'Audrey','Alex'],
        'Marks': [96, 90, 88, 98, 88]}
df = pd.DataFrame(data,columns=list(data.keys()))

print(df)

#Subset Variables- columns
#Select multiple columns with specific names.
print(df[['Name', 'Marks']])
#Select single column with specific name.
print(df['Name'])
```

```
a    10
b   -11
c    12
d    13
dtype: int64
```

	ID	Name	Marks
0	21MS990	Alan	96
1	21MS991	Anna	90
2	21MS992	Alex	88
3	25RS999	Audrey	98
4	21MS992	Alex	88

	Name	Marks
0	Alan	96
1	Anna	90
2	Alex	88
3	Audrey	98
4	Alex	88

```
0      Alan
1      Anna
2      Alex
3    Audrey
4      Alex
Name: Name, dtype: object
```

Pandas: Subset Observations - rows


```
#Extract rows that meet logical criteria
print(df[df.Marks > 90])
```

	ID	Name	Marks
0	21MS990	Alan	96
3	25RS999	Audrey	98

```
#Remove duplicate rows
df=df.drop_duplicates()
print(df)
```

	ID	Name	Marks
0	21MS990	Alan	96
1	21MS991	Anna	90
2	21MS992	Alex	88
3	25RS999	Audrey	98

```
#Randomly select fraction of rows
print(df.sample(frac=0.8))
```

	ID	Name	Marks
2	21MS992	Alex	88
1	21MS991	Anna	90
0	21MS990	Alan	96

```
#Randomly select 3 rows
print(df.sample(n=3))
```

	ID	Name	Marks
1	21MS991	Anna	90
3	25RS999	Audrey	98
2	21MS992	Alex	88

```
#Select and order top 2 entries
print(df.nlargest(2, 'Marks'))
```

	ID	Name	Marks
3	25RS999	Audrey	98
0	21MS990	Alan	96

```
#Select and order bottom 2 entries
print(df.nsmallest(2, 'Marks'))
```

	ID	Name	Marks
2	21MS992	Alex	88
1	21MS991	Anna	90

```
print(df.head(2)) #Select first 2 rows
print(df.tail(2)) #Select last 2 rows
```

	ID	Name	Marks
0	21MS990	Alan	96
1	21MS991	Anna	90

	ID	Name	Marks
2	21MS992	Alex	88
3	25RS999	Audrey	98

Pandas: Subset - rows and columns


```
#Select 2nd and 4th row
print(df.iloc[[1,3]])
```

	ID	Name	Marks
1	21MS991	Anna	90
3	25RS999	Audrey	98

```
#Select 1st and 3rd column
print(df.iloc[:, [0, 2]])
```

	ID	Marks
0	21MS990	96
1	21MS991	90
2	21MS992	88
3	25RS999	98

```
#Select all columns between 'ID' and 'Marks' (inclusive)
print(df.loc[:, 'ID':'Marks'])
```

	ID	Name	Marks
0	21MS990	Alan	96
1	21MS991	Anna	90
2	21MS992	Alex	88
3	25RS999	Audrey	98

```
#Select rows meeting logical condition, and only the specific columns
print(df.loc[df['Marks']<90, ['ID', 'Name']])
```

	ID	Name
2	21MS992	Alex

```
#Access single value by index
print(df.iat[1, 2])
```

```
90
```

```
#Access single value by label
print(df.at[3, 'Name'])
```

```
Audrey
```

Pandas: Summarizing Data

```
data = {'ID': ['21MS990', '21MS991', '21MS992', '25RS999'],
        'Name': ['Alan', 'Anna', 'Alex', 'Audrey'],
        'Marks': [96, 90, 88, 96]}
df = pd.DataFrame(data,columns=list(data.keys()))
print(df)
```

	ID	Name	Marks
0	21MS990	Alan	96
1	21MS991	Anna	90
2	21MS992	Alex	88
3	25RS999	Audrey	96

```
#Count number of rows with each unique value of variable
df['Marks'].value_counts()
```

```
Marks
96    2
90    1
88    1
Name: count, dtype: int64
```

```
print(len(df)) # Number of rows in DataFrame
```

4

```
#Tuple of number of rows, number of columns in DataFrame
print(df.shape)
```

(4, 3)

```
print(df['Marks'].nunique()) # Number of distinct values in a column
```

3

```
#Basic descriptive and statistics for each column
print(df.describe())
```

	Marks
count	4.000000
mean	92.500000
std	4.123106
min	88.000000
25%	89.500000
50%	93.000000
75%	96.000000
max	96.000000

```
print(df.info()) #Prints a concise summary of the DataFrame
print(df.dtypes) #Prints a Series with the dtype of each column
print(df.count())#Number of non-NA values
print(df.columns)#Describe DataFrame columns
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 4 entries, 0 to 3
Data columns (total 3 columns):
 #   Column  Non-Null Count  Dtype
---  ------  --------------  -----
 0   ID      4 non-null      object
 1   Name    4 non-null      object
 2   Marks   4 non-null      int64
dtypes: int64(1), object(2)
memory usage: 228.0+ bytes
None
```

```
ID       4
Name     4
Marks    4
dtype: int64
```

```
ID       object
Name     object
Marks     int64
dtype: object
```

```
Index(['ID', 'Name', 'Marks'], dtype='object')
```


Pandas: Summarizing Data

```
print(df.sum()) #Sum values of each object
```

```
ID       21MS99021MS99121MS99225RS999
Name                 AlanAnnaAlexAudrey
Marks                               370
dtype: object
```

```
print(df.count())  #Count non-NA/null values of each object
```

```
ID       4
Name     4
Marks    4
dtype: int64
```

```
print(df.median()) #Median value of each object
```

```
Marks    93.0
dtype: float64
```

```
print(df.quantile([0.25,0.5, 0.75])) #Quantiles of each object
```

	Marks
0.25	89.5
0.50	93.0
0.75	96.0

```
print(df.min()) #Minimum value in each object
```

```
ID       21MS990
Name        Alan
Marks         88
dtype: object
```

```
print(df.max())   #Maximum value in each object
```

```
ID       25RS999
Name      Audrey
Marks         96
dtype: object
```

```
print(df.mean()) #Mean value of each object
```

```
Marks    92.5
dtype: float64
```

```
print(df.var())   #Variance of each object
```

```
Marks    17.0
dtype: float64
```

```
print(df.std())   #Standard deviation of each object
```

```
Marks    4.123106
dtype: float64
```

Column Dropping, Missing Data Handling, and Mapping


```
#Drop values from rows (axis=0)
s.drop(['a', 'c'])

#Drop columns from DataFrame
df.drop(columns=['ID', 'Marks'])

data = {'ID': ['21MS990', '21MS991', '21MS992', '25RS999'],
        'Name': ['Alan', 'Anna', 'Alex', 'Audrey'],
        'Marks': [96, np.nan, 88, 96]}
df = pd.DataFrame(data,columns=list(data.keys()))
print(df)
#Drop rows with any column having NA/null data
df.dropna()

#Replace all NA/null data with value.
df.fillna(df['Marks'].mean())

#Mapping
f = lambda x: x*2
print(s.map(f))
print(df.apply(f))
```

```
b   -11
d    13
dtype: int64
```

	Name
0	Alan
1	Anna
2	Alex
3	Audrey

	ID	Name	Marks
0	21MS990	Alan	96.0
1	21MS991	Anna	NaN
2	21MS992	Alex	88.0
3	25RS999	Audrey	96.0

	ID	Name	Marks
0	21MS990	Alan	96.0
2	21MS992	Alex	88.0
3	25RS999	Audrey	96.0

	ID	Name	Marks
0	21MS990	Alan	96.000000
1	21MS991	Anna	93.333333
2	21MS992	Alex	88.000000
3	25RS999	Audrey	96.000000

```
a    20
b   -22
c    24
d    26
dtype: int64
```

	ID	Name	Marks
0	21MS99021MS990	AlanAlan	192
1	21MS99121MS991	AnnaAnna	180
2	21MS99221MS992	AlexAlex	176
3	25RS99925RS999	AudreyAudrey	192

Pandas: Sorting, Ranking, Merging


```
df.sort_index()          #Sort by labels
df.sort_values(by='Marks')  #Sort by the values
#Assign ranks to entries
df.rank()

data1 = {'ID': ['21MS990', '21MS991', '21MS992', '25RS999'],
         'Name': ['Alan', 'Anna', 'Alex', 'Audrey'],
         'Marks': [96, 90, 88, 96]}
df = pd.DataFrame(data1,columns=list(data1.keys()))
print(df)
data2 = {'ID': ['21MS990', '21MS991', '21MS992', '22MS994'],
         'Age': ['22', '23', '22', '21']}
df2 = pd.DataFrame(data2,columns=list(data2.keys()))
print(df2)
#Join matching rows from df2 to df
pd.merge(df, df2, how='left', on='ID')
#Join matching rows from df to df2
pd.merge(df, df2, how='right', on='ID')
#Join data. Retain only rows in both sets
pd.merge(df, df2, how='inner', on='ID')
#Join data. Retain all values, all rows
pd.merge(df, df2, how='outer', on='ID')
```

	ID	Name	Marks
0	21MS990	Alan	96
1	21MS991	Anna	90
2	21MS992	Alex	88
3	25RS999	Audrey	96

	ID	Name	Marks
2	21MS992	Alex	88
1	21MS991	Anna	90
0	21MS990	Alan	96
3	25RS999	Audrey	96

	ID	Name	Marks
0	1.0	1.0	3.5
1	2.0	3.0	2.0
2	3.0	2.0	1.0
3	4.0	4.0	3.5

	ID	Name	Marks
0	21MS990	Alan	96
1	21MS991	Anna	90
2	21MS992	Alex	88
3	25RS999	Audrey	96

	ID	Age
0	21MS990	22
1	21MS991	23
2	21MS992	22
3	22MS994	21

	ID	Name	Marks	Age
0	21MS990	Alan	96	22
1	21MS991	Anna	90	23
2	21MS992	Alex	88	22
3	25RS999	Audrey	96	NaN

	ID	Name	Marks	Age
0	21MS990	Alan	96.0	22
1	21MS991	Anna	90.0	23
2	21MS992	Alex	88.0	22
3	22MS994	NaN	NaN	21

	ID	Name	Marks	Age
0	21MS990	Alan	96.0	22
1	21MS991	Anna	90.0	23
2	21MS992	Alex	88.0	22
3	25RS999	Audrey	96.0	NaN
4	22MS994	NaN	NaN	21

	ID	Name	Marks	Age
0	21MS990	Alan	96	22
1	21MS991	Anna	90	23
2	21MS992	Alex	88	22

Pandas: Reading from and Writing to Files

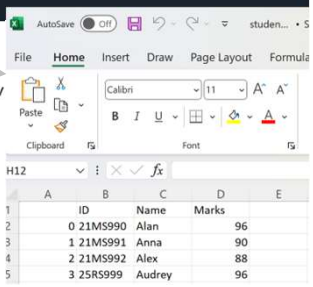

```
#Pandas: I/O
df1=pd.read_csv('F:/CS4103/code/hospitaldata.csv',
header=True, nrows=15)
print(df1)

data = {'ID': ['21MS990', '21MS991', '21MS992',
'25RS999'],
        'Name': ['Alan', 'Anna', 'Alex', 'Audrey'],
        'Age': [22, 23, 22, 26],
        'Marks': [96, 90, 88, 96]}
df = pd.DataFrame(data1,columns=list(data1.keys()))
df.to_csv('F:/CS4103/code/student.csv')

df2=pd.read_excel('F:/CS4103/code/rainfall.xlsx')
print(df2.columns)
print(len(df2))
print(df2.head())

df.to_excel('F:/CS4103/student.xlsx',
sheet_name='Sheet1')
```

```
   Patient_ID  Age  Gender  ... Readmission    Outcome  Satisfaction
0           1   45  Female  ...          No  Recovered             4
1           2   60    Male  ...         Yes     Stable             3
2           3   32  Female  ...          No  Recovered             5
3           4   75    Male  ...         Yes     Stable             2
4           5   50  Female  ...          No  Recovered             4
5           6   68    Male  ...          No     Stable             4
6           7   55  Female  ...          No  Recovered             3
7           8   40    Male  ...          No  Recovered             4
8           9   70  Female  ...         Yes     Stable             2
9          10   25    Male  ...          No  Recovered             5
10         11   48  Female  ...          No     Stable             4
11         12   65    Male  ...          No  Recovered             3
12         13   30  Female  ...          No  Recovered             4
13         14   52    Male  ...          No  Recovered             3
14         15   58  Female  ...          No     Stable             4

[15 rows x 10 columns]
```

student.csv

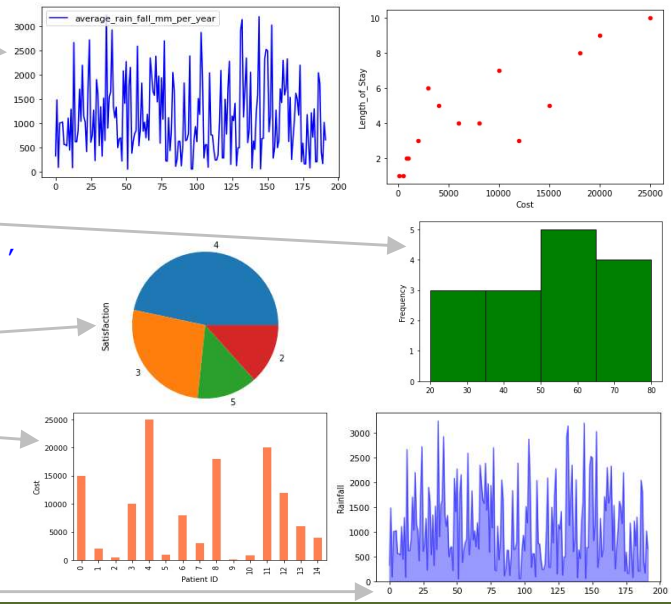
```
Index([' Area', 'Year', 'average_rain_fall_mm_per_year'],
dtype='object')
192
          Area  Year  average_rain_fall_mm_per_year
0  Afghanistan  2017                            327
1      Albania  2017                           1485
2      Algeria  2017                             89
3      Andorra  2017                           1010
4       Angola  2017                           1010
```

student.xlsx

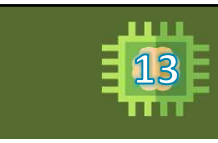


Pandas: Plotting


```
#Plot a line graph for the DataFrame
df2.iloc[:,[2]].plot(color='b')

#Plot a scatter graph of the DataFrame
df1.plot.scatter(x='Cost',y='Length_of_Stay',
color='r')

#Plot a histogram of the DataFrame
cbins = np.linspace(20, 80, 5)
df1['Age'].plot.hist(bins=cbins,edgecolor='k',
color='green')

#Plot a pie chart of the DataFrame
df1['Satisfaction'].value_counts().plot.pie()
#Plot a bar chart of the DataFrame
ax=df1['Cost'].plot.bar(color='coral')
ax.set_xlabel('Patient ID')
ax.set_ylabel('Cost')

#Area plot
ax=df2['average_rain_fall_mm_per_year'].plot.
area(color='b',alpha=0.4)
ax.set_ylabel('Rainfall')
```



Pandas: Plotting [contd.]



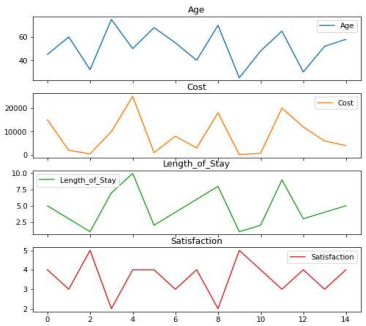

```
df1_plot=df1[['Age','Cost',
'Length_of_Stay', 'Satisfaction']]
```

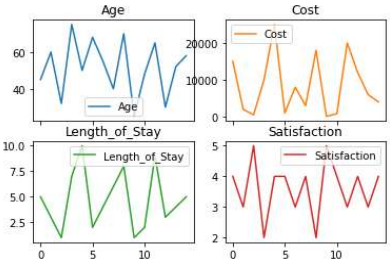
```
df1_plot.plot(subplots=True,
figsize=(8,8), title=['Age','Cost',
'Length_of_Stay', 'Satisfaction'])
```

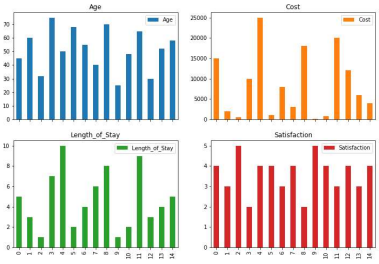
```
df1_plot.plot(subplots=True, layout=(2,2),
title=['Age','Cost', 'Length_of_Stay',
'Satisfaction'])
```

```
df1_plot.plot.bar(subplots=True,
layout=(2,2),
figsize=(12,8),title=['Age','Cost',
'Length_of_Stay', 'Satisfaction'])
```

	Age	Cost	Length_of_Stay	Satisfaction
0	45	15000	5	4
1	60	2000	3	3
2	32	500	1	5
3	75	10000	7	2
4	50	25000	10	4
5	68	1000	2	4
6	55	8000	4	3
7	40	3000	6	4
8	70	18000	8	2
9	25	100	1	5
10	48	800	2	4
11	65	20000	9	3
12	30	12000	3	4
13	52	6000	4	3
14	58	4000	5	4







Basic Graph Manipulation


```
import networkx as nx

G1=nx.Graph() #Create an empty Undirected graph with no nodes and no edges

G1.add_node(1) #add one node at a time
G1.add_nodes_from([2,3,4]) #add a list of nodes
G1.add_edge(2,3) #add one edge at a time
G1.add_edges_from([(1,2),(1,3),(2,4),(1,4)])

G2=nx.DiGraph() #Create an empty Directed graph with no nodes and no edges

G2.add_node(1) #add one node at a time
G2.add_nodes_from([2,3,4]) #add a list of nodes
G2.add_edge(2,3) #add one edge at a time
G2.add_edges_from([(1,2),(1,3),(2,4),(1,4)])

#Create Undirected Graph by mapping nodes to neighbors
adjacency_dict = {0:(1,2), 1:(0,2,4), 2:(0,1,3,4), 3:(1,), 4:(0,)}
G3 = nx.Graph(adjacency_dict)

#Create Directed Graph dict mapping nodes to neighbors
adjacency_dict = {0: (1, 2), 1: (0, 2), 2: (0, 1), 3: (1,), 4:(0,)}
G4 = nx.DiGraph(adjacency_dict)
```


Basic Graph Manipulation [contd.]


```
print(G4.nodes())
print(G4.edges())
print(G4.number_of_nodes())
print(G4.number_of_edges())
```

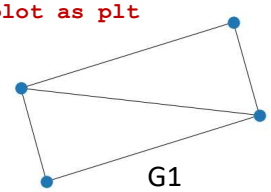
```
[0, 1, 2, 3, 4]
[(0, 1), (0, 2), (1, 0), (1, 2), (2, 0), (2, 1), (3, 1), (4, 0)]
5
8
```

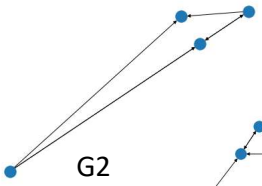
```
print([i for i in G4.neighbors(1)])
print(nx.adjacency_matrix(G4).toarray())
adjacency_matrix = nx.to_numpy_array(G4)
print(adjacency_matrix)
```

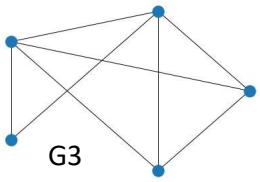
```
[0, 2]
```

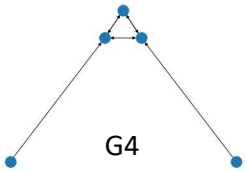
```
[[0 1 1 0 0]
 [1 0 1 0 0]
 [1 1 0 0 0]
 [0 1 0 0 0]
 [1 0 0 0 0]]
[[0. 1. 1. 0. 0.]
 [1. 0. 1. 0. 0.]
 [1. 1. 0. 0. 0.]
 [0. 1. 0. 0. 0.]
 [1. 0. 0. 0. 0.]]
```

Graph Visualization

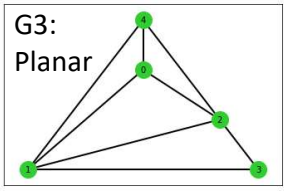


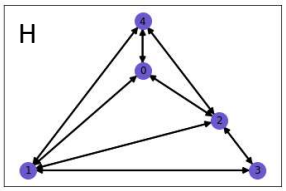







```
import matplotlib.pyplot as plt

nx.draw(G1)
plt.show()
nx.draw_random(G2)
plt.show()
nx.draw_circular(G3)
plt.show()
nx.draw_spectral(G4)
plt.show()

pos=nx.planar_layout(G3)
nx.draw_networkx_nodes(G3, pos,node_size=400,node_color='limegreen')
nx.draw_networkx_labels(G3, pos,font_size=10)
nx.draw_networkx_edges(G3, pos, width=2)
plt.show()

H=nx.DiGraph(G3)
pos=nx.planar_layout(H)
nx.draw_networkx_nodes(H, pos,node_size=400,node_color='slateblue')
nx.draw_networkx_labels(H, pos,font_size=12)
nx.draw_networkx_edges(H, pos, width=2,arrowsize=15)
plt.show()
```

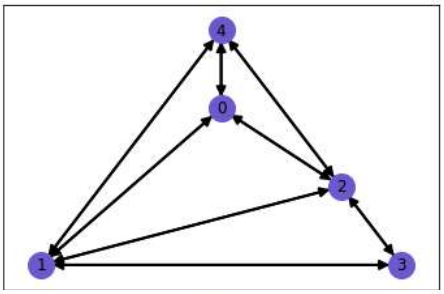




Graph Manipulation and Visualization

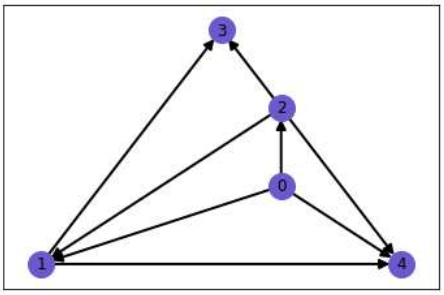
```
H.remove_edge(1,0)
H.remove_edge(1,2)
H.remove_edge(2,0)
H.remove_edge(3,1)
H.remove_edge(3,2)
H.remove_edge(4,2)
H.remove_edge(4,1)
H.remove_edge(4,0)
```

H (previous)




```
pos=nx.planar_layout(H)
nx.draw_networkx_nodes(H,
pos,node_size=400,node_color='slateblue')
nx.draw_networkx_labels(H,
pos,font_size=12)
nx.draw_networkx_edges(H, pos,
width=2,arrowsize=15)
plt.show()
```

H (after edge removal)



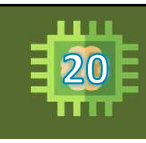
Adding Attributes to Nodes and Edges


```
for i in range(5):
    if i in [0,2]:
        G3.nodes[i]['color'] = 'royalblue'
    else:
        G3.nodes[i]['color'] = 'green'
for i in G3.edges():
    if i in [(0,1),(0,2),(2,3)]:
        G3.edges[i[0],i[1]]['color'] = 'red'
    else:
        G3.edges[i[0],i[1]]['color'] = 'black'
```

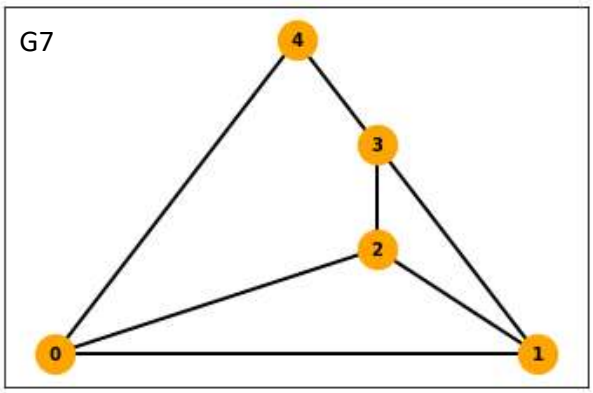

G3

```
node_colors = nx.get_node_attributes(G3, 'color').values()
edge_colors = nx.get_edge_attributes(G3, 'color').values()

pos=nx.planar_layout(G3)
nx.draw_networkx_nodes(G3, pos,node_size=400,node_color=node_colors)
nx.draw_networkx_labels(G3, pos,font_size=10)
nx.draw_networkx_edges(G3, pos, width=2, edge_color=edge_colors)
plt.show()
```


Creating Undirected Graph from Adjacency Matrix



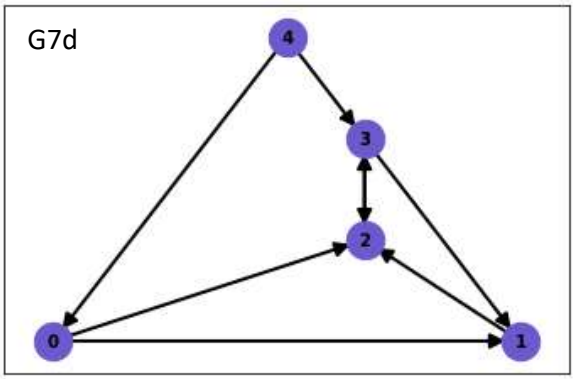

```
import numpy as np

a=np.array(
[[0,1,1,0,0],
 [0,0,1,0,0],
 [0,0,0,1,0],
 [0,1,1,0,0],
 [1,0,0,1,0]])

G7 = nx.from_numpy_array(a)
```




```
pos = nx.planar_layout(G7)
nx.draw_networkx_nodes(G7, pos,node_size=500,node_color='orange')
nx.draw_networkx_labels(G7, pos,font_size=10,font_weight='bold')
nx.draw_networkx_edges(G7, pos, width=2)
plt.show()
```

Creating Directed Graph from Adjacency Matrix


```
import numpy as np

a=np.array(
[[0,1,1,0,0],
 [0,0,1,0,0],
 [0,0,0,1,0],
 [0,1,1,0,0],
 [1,0,0,1,0]])

G7d = nx.from_numpy_array(a,
           create_using=nx.DiGraph())
```



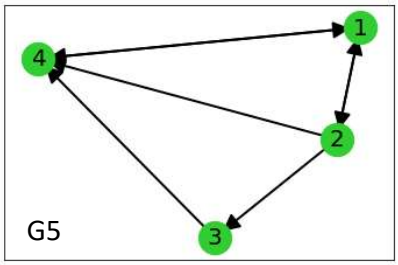

```
pos = nx.planar_layout(G7d)
nx.draw_networkx_nodes(G7d, pos,node_size=500,node_color='slateblue')
nx.draw_networkx_labels(G7d, pos,font_size=10,font_weight='bold')
nx.draw_networkx_edges(G7d, pos, width=2,arrowsize=18)
plt.show()
```


Creating Graphs from File Data


```
G5 =
nx.read_adjlist('adj.txt',create_using=nx.DiGraph())
pos = nx.spring_layout(G5)
nx.draw_networkx_nodes(G5,
pos,node_size=800,node_color='limegreen')
nx.draw_networkx_labels(G5, pos,font_size=20)
nx.draw_networkx_edges(G5, pos, width=2,arrowsize=30)
plt.show()
```

adj.txt

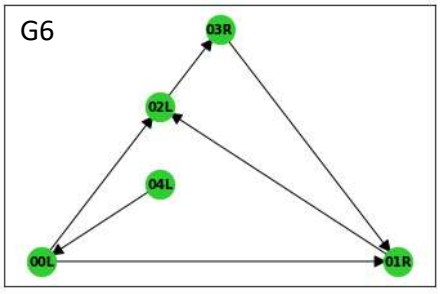
```
File  Edit  View
1     2     4
2     1     3     4
3     4
4     1
```




```
G6 =
nx.read_edgelist('edge.txt',create_using=nx.DiGraph())
pos = nx.planar_layout(G6)
nx.draw_networkx_nodes(G6,
pos,node_size=500,node_color='limegreen')
nx.draw_networkx_labels(G6,
pos,font_size=10,font_weight='bold')
nx.draw_networkx_edges(G6, pos,arrowsize=20)
plt.show()
```

edge.txt

```
File  Edit
00L 01R
01R 02L
02L 03R
00L 02L
03R 01R
04L 00L
```



Creating Graphs from File Data [contd.]

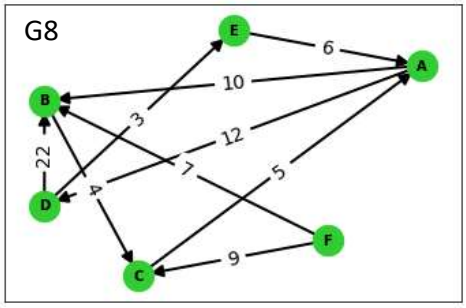

```
import pandas as pd
df=pd.read_excel('F:/CS4103/code/nodeposition.xlsx')
pos={}
for i in range(len(df)):
    pos[df['Node'][i]]=(df['X'][i],df['Y'][i])

df=pd.read_csv('F:/CS4103/code/graphdataset.csv')
G8=nx.from_pandas_edgelist(df, source='S', target='D',
edge_attr='W',create_using=nx.DiGraph())
edge_labels = {}
for u, v, d in G8.edges(data=True):
    edge_labels[(u, v)] = d['W']

nx.draw_networkx_nodes(G8,
pos,node_size=500,node_color='limegreen')
nx.draw_networkx_labels(G8,
pos,font_size=10,font_weight='bold')
nx.draw_networkx_edges(G8, pos, width=2,arrowsize=18)
nx.draw_networkx_edge_labels(G8, pos,
edge_labels=edge_labels, font_size=14, font_color='k')
plt.show()
```

Node	X	Y
A	5	10
B	1	9
C	2	4
D	1	6
E	3	11
F	4	5

nodeposition.xlsx

S	D	W
A	B	10
A	D	12
B	C	4
C	A	5
D	E	3
E	A	6
F	B	7
F	C	9
D	B	22

graphdataset.csv



Creating Graphs from File Data [contd.]

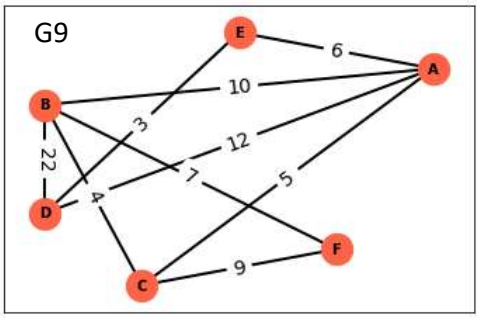

```
import pandas as pd
df=pd.read_excel('F:/CS4103/code/nodeposition.xlsx')
pos={}
for i in range(len(df)):
    pos[df['Node'][i]]=(df['X'][i],df['Y'][i])

df=pd.read_csv('F:/CS4103/code/graphdataset.csv')
G9=nx.from_pandas_edgelist(df, source='S', target='D',
edge_attr='W',create_using=nx.Graph())
edge_labels = {}
for u, v, d in G9.edges(data=True):
    edge_labels[(u, v)] = d['W']

nx.draw_networkx_nodes(G9,
pos,node_size=500,node_color='tomato')
nx.draw_networkx_labels(G9,
pos,font_size=10,font_weight='bold')
nx.draw_networkx_edges(G9, pos, width=2,arrowsize=18)
nx.draw_networkx_edge_labels(G9, pos,
edge_labels=edge_labels, font_size=14, font_color='k')
plt.show()
```

Node	X	Y
A	5	10
B	1	9
C	2	4
D	1	6
E	3	11
F	4	5

nodeposition.xlsx

S	D	W
A	B	10
A	D	12
B	C	4
C	A	5
D	E	3
E	A	6
F	B	7
F	C	9
D	B	22

graphdataset.csv



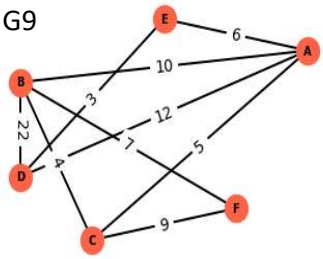
A Few Network Structure and Analysis Measures


```
print(nx.shortest_path(G9,'D','B',
weight='W'))
print(nx.shortest_path_length(G9,'D',
'B',weight='W'))
print(nx.average_shortest_path_length
(G9,weight='W'))
print(nx.diameter(G9,weight='W'))
print(nx.radius(G9,weight='W'))
print(nx.eccentricity(G9,weight='W'))
print(nx.periphery(G9,weight='W'))
print(nx.center(G9,weight='W'))
print(nx.node_connectivity(G9))
print(nx.edge_connectivity(G9))
print(nx.minimum_node_cut(G9))
print(nx.minimum_edge_cut(G9))
print(nx.is_connected(G9))

print(G8.degree())
print(G8.in_degree())
print(G8.out_degree())
print(nx.degree_centrality(G8))
```

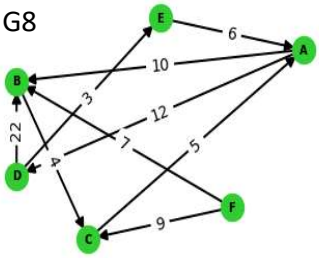
```
['D', 'E', 'A', 'C', 'B']
18
11.133333333333333
23
14
{'A': 14, 'B': 18, 'D': 23, 'C': 14, 'E': 20,
'F': 23}
['D', 'F']
['A', 'C']
2
2
{'C', 'B'}
{('F', 'B'), ('F', 'C')}
True
```

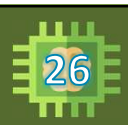
```
[('A', 4), ('B', 4), ('D', 3), ('C', 3),
('E', 2), ('F', 2)]
[('A', 2), ('B', 3), ('D', 1), ('C', 2),
('E', 1), ('F', 0)]
[('A', 2), ('B', 1), ('D', 2), ('C', 1),
('E', 1), ('F', 2)]
{'A': 0.8, 'B': 0.8, 'D': 0.6000000000000001,
'C': 0.6000000000000001, 'E': 0.4, 'F': 0.4}
```

G9



G8





Questions?