

Assignment-4
Python Programming

Assignment Date	22 October 2022
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Student Roll Number / Reg No	19CS104 / 312319104072
Maximum Marks	2 Marks

```
In [1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
```

Loading the dataset

```
In [ ]: df = pd.read_csv('Mall_Customers.csv')
df
```

```
Out[ ]:
```

	CustomerID	Gender	Age	Annual Income (k\$)	Spending Score (1-100)
0	1	Male	19	15	39
1	2	Male	21	15	81
2	3	Female	20	16	6
3	4	Female	23	16	77
4	5	Female	31	17	40
...
195	196	Female	35	120	79
196	197	Female	45	126	28
197	198	Male	32	126	74
198	199	Male	32	137	18
199	200	Male	30	137	83

200 rows × 5 columns

Encoding Categorical Columns

```
In [ ]: from sklearn.preprocessing import LabelEncoder  
le = LabelEncoder()  
df['Gender'] = le.fit_transform(df['Gender'])
```

```
In [ ]: df
```

Out[]:	CustomerID	Gender	Age	Annual Income (k\$)	Spending Score (1-100)
0	1	1	19	15	39
1	2	1	21	15	81
2	3	0	20	16	6
3	4	0	23	16	77
4	5	0	31	17	40
...
195	196	0	35	120	79
196	197	0	45	126	28
197	198	1	32	126	74
198	199	1	32	137	18
199	200	1	30	137	83

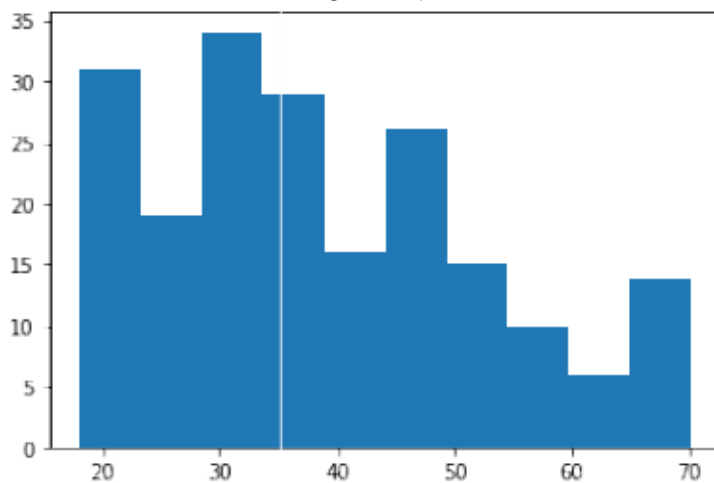
200 rows × 5 columns

Visualizations

Univariate Analysis

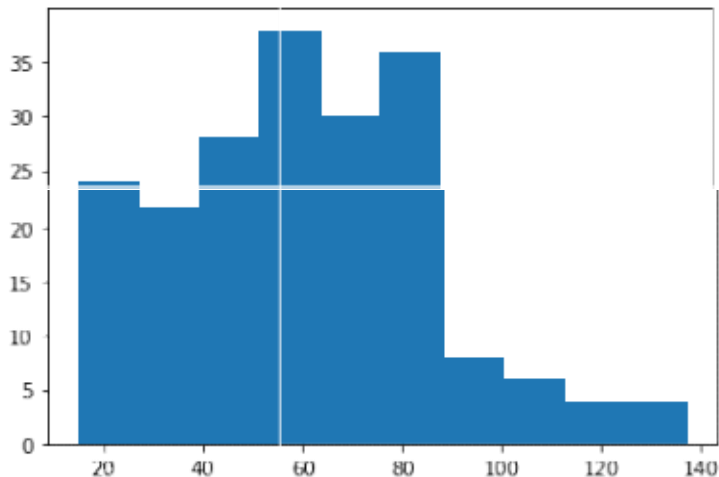
```
In [ ]: plt.hist(df['Age'])
```

```
Out[ ]: (array([31., 19., 34., 29., 16., 26., 15., 10., 6., 14.]),  
array([18. , 23.2, 28.4, 33.6, 38.8, 44. , 49.2, 54.4, 59.6, 64.8, 70. ]),  
<a list of 10 Patch objects>)
```



```
In [ ]: plt.hist(df['Annual Income (k$)'])
```

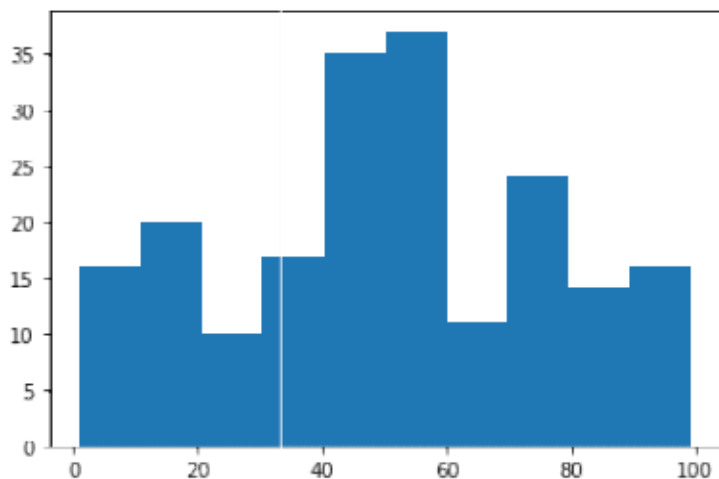
```
Out[ ]: (array([24., 22., 28., 38., 30., 36., 8., 6., 4., 4.]),  
array([15. , 27.2, 39.4, 51.6, 63.8, 76. , 88.2, 100.4, 112.6,  
124.8, 137. ]),  
<a list of 10 Patch objects>)
```



<a list of 10 Patch objects>)

```
In [ ]: plt.hist(df['Spending Score (1-100)'])
```

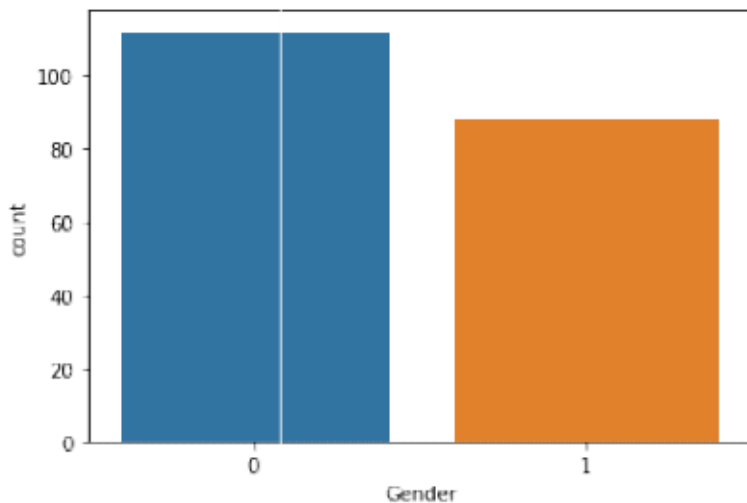
```
Out[ ]: (array([16., 20., 10., 17., 35., 37., 11., 24., 14., 16.]),  
array([ 1. , 10.8, 20.6, 30.4, 40.2, 50. , 59.8, 69.6, 79.4, 89.2, 99. ]),  
<a list of 10 Patch objects>)
```



```
In [ ]: sns.countplot(df['Gender'])
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
FutureWarning

```
Out[ ]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb93a2d490>
```



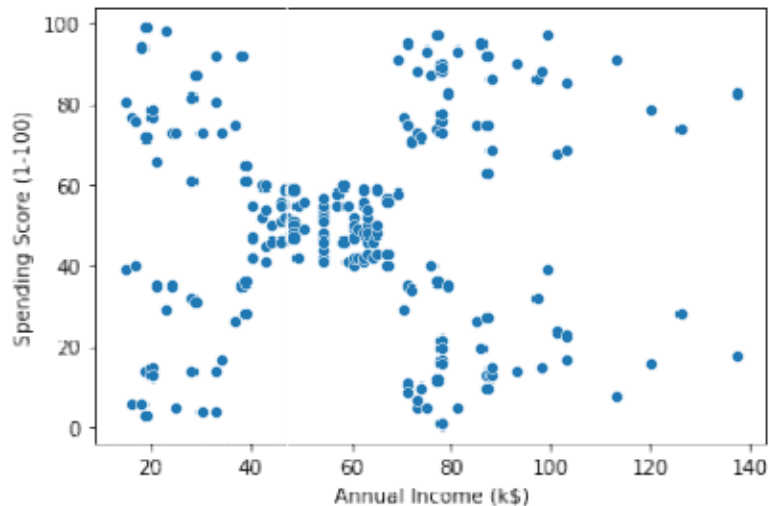
Bi-Variate Analysis

```
In [ ]: sns.scatterplot(df['Annual Income (k$)'], df['Spending Score (1-100)'])
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

```
Out[ ]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb93a1f1d0>
```

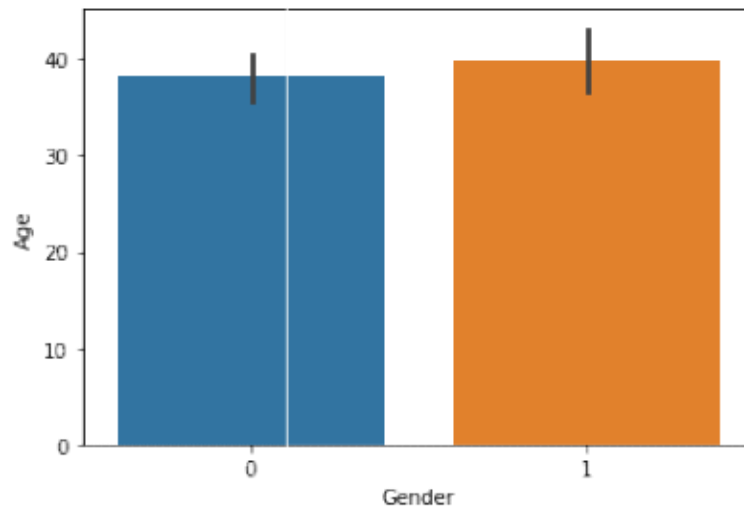


```
In [ ]: sns.barplot(df['Gender'], df['Age'])
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

```
Out[ ]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb93931b90>
```



```
In [ ]: sns.heatmap(df.corr(), annot = True)
```

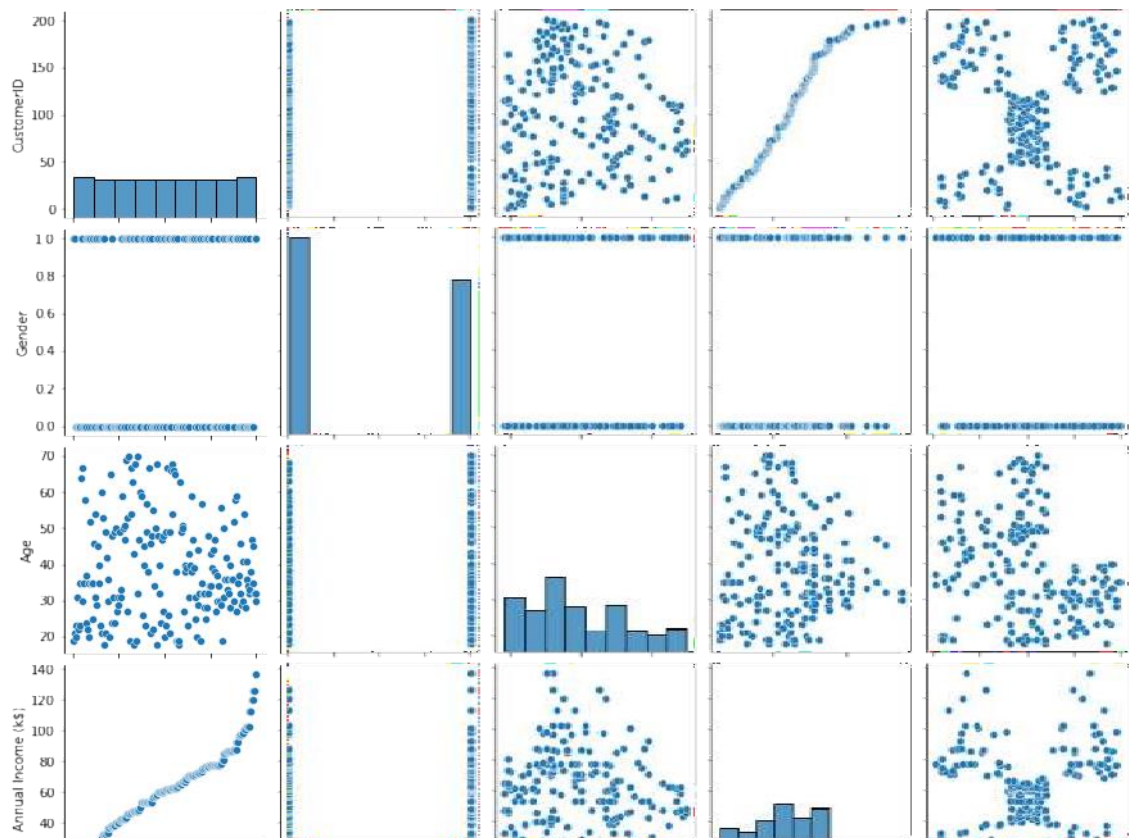
Out[]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb9390e4d0>

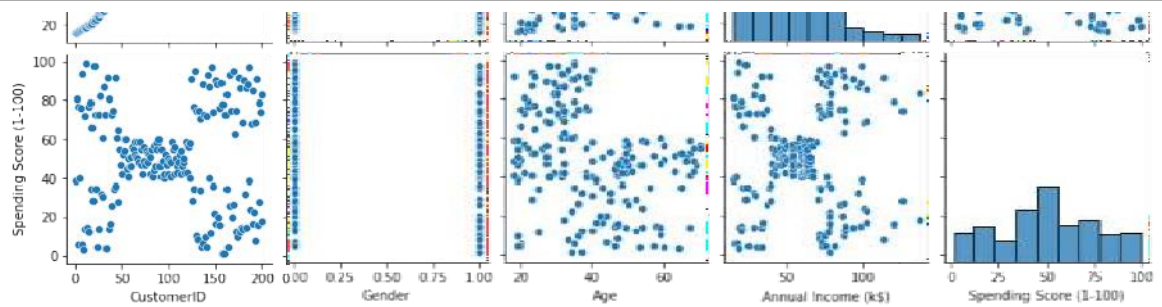


Multi-variate Analysis

In []: `sns.pairplot(df)`

Out[]: <seaborn.axisgrid.PairGrid at 0x7fdb91011e50>





In []:

Descriptive Statistics

In []:

```
df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 200 entries, 0 to 199
Data columns (total 5 columns):
#   Column                                Non-Null Count  Dtype
---  -
0   CustomerID                            200 non-null   int64
1   Gender                                200 non-null   int64
2   Age                                    200 non-null   int64
3   Annual Income (k$)                    200 non-null   int64
4   Spending Score (1-100)                200 non-null   int64
dtypes: int64(5)
memory usage: 7.9 KB
```

In []:

```
df.describe()
```

Out[]:

	CustomerID	Gender	Age	Annual Income (k\$)	Spending Score (1-100)
count	200.000000	200.000000	200.000000	200.000000	200.000000
mean	100.500000	0.440000	38.850000	60.560000	50.200000
std	57.879185	0.497633	13.969007	26.264721	25.823522
min	1.000000	0.000000	18.000000	15.000000	1.000000
25%	50.750000	0.000000	28.750000	41.500000	34.750000
50%	100.500000	0.000000	36.000000	61.500000	50.000000
75%	150.250000	1.000000	49.000000	78.000000	73.000000
max	200.000000	1.000000	70.000000	137.000000	99.000000

In []:

```
df.skew()
```

Out[]:

```
CustomerID    0.000000
Gender        0.243578
Age           0.485569
Annual Income (k$) 0.321843
```

```
Spending Score (1-100)    -0.047220
dtype: float64
```

```
In [ ]: df.kurt()
```

```
Out[ ]: Spending Score (1-100)    -0.826629
dtype: float64
```

```
In [ ]: df.corr()
```

```
CustomerID    -1.200000
Gender         -1.960375
Age            -0.671573
Annual Income (k$)  -0.098487
```

```
Out[ ]:
```

	CustomerID	Gender	Age	Annual Income (k\$)	Spending Score (1-100)
CustomerID	1.000000	0.057400	-0.026763	0.977548	0.013835
Gender	0.057400	1.000000	0.060867	0.056410	-0.058109
Age	-0.026763	0.060867	1.000000	-0.012398	-0.327227
Annual Income (k\$)	0.977548	0.056410	-0.012398	1.000000	0.009903
Spending Score (1-100)	0.013835	-0.058109	-0.327227	0.009903	1.000000

```
In [ ]: df.var()
```

```
Out[ ]: CustomerID    3350.000000
Gender           0.247638
Age             195.133166
Annual Income (k$)  689.835578
Spending Score (1-100)  666.854271
dtype: float64
```

```
In [ ]: df.std()
```

```
Out[ ]: CustomerID    57.879185
Gender           0.497633
Age             13.969007
Annual Income (k$)  26.264721
Spending Score (1-100)  25.823522
dtype: float64
```

Checking for missing values

```
In [ ]:
```



```
df.isna().sum()
```

```
Out[ ]: CustomerID      0
        Gender        0
        Age           0
```

Spending Score (1-100) 0

```
dtype: int64

In [ ]: df.isna().sum().sum()
```

```
Out[ ]: 0
```

```
In [ ]: df.duplicated().sum()
```

```
Out[ ]: 0
```

Finding & Handling Ouliers

```
In [ ]: quantile = df.quantile(q = [0.25, 0.75])
quantile
```

```
Out[ ]:
```

	CustomerID	Gender	Age	Annual Income (k\$)	Spending Score (1-100)
0.25	50.75	0.0	28.75	41.5	34.75
0.75	150.25	1.0	49.00	78.0	73.00

```
In [ ]: IQR = quantile.iloc[1] - quantile.iloc[0]
IQR
```

```
Out[ ]: CustomerID          99.50
Gender              1.00
Age                20.25
Annual Income (k$) 36.50
Spending Score (1-100) 38.25
dtype: float64
```

```
In [ ]: upper = quantile.iloc[1] + (1.5 * IQR)
upper
```

```
Out[ ]: CustomerID          299.500
Gender              2.500
Age                79.375
Annual Income (k$) 132.750
Spending Score (1-100) 130.375
dtype: float64
```

```
In [ ]: lower = quantile.iloc[0] - (1.5 * IQR)
lower
```

```
Out[ ]: CustomerID          -98.500
Gender              -1.500
Age                -1.625
Annual Income (k$) -13.250
Spending Score (1-100) -22.625
dtype: float64
```



```
In [ ]: df.mean()
```

```
Out[ ]: CustomerID      100.50  
Gender          0.44  
Age            38.85  
Annual Income (k$)  60.56  
Spending Score (1-100)  50.20  
dtype: float64
```

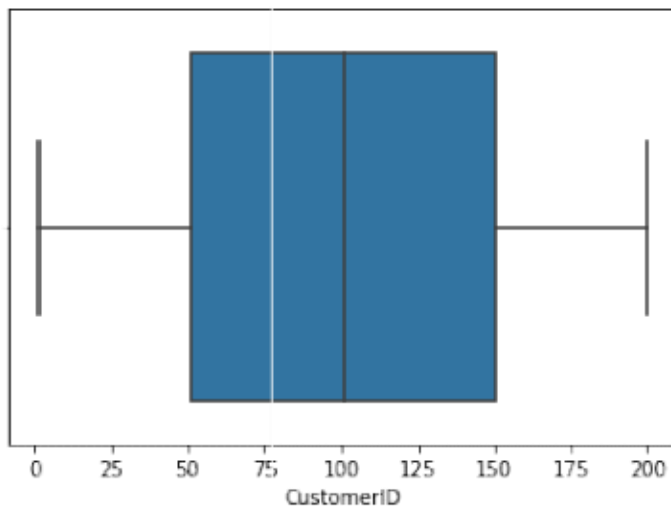
```
In [ ]: df['Annual Income (k$)'].max()
```

```
Out[ ]: 137
```

```
In [ ]: sns.boxplot(df['CustomerID'])
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
FutureWarning

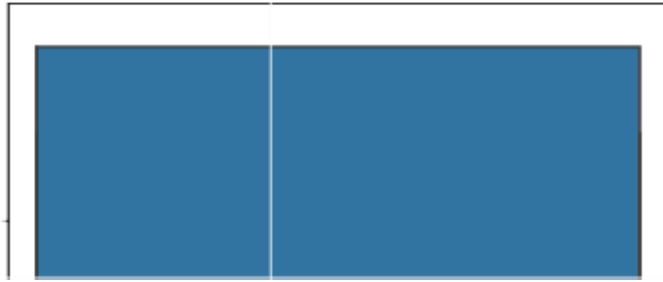
```
Out[ ]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb904c1290>
```

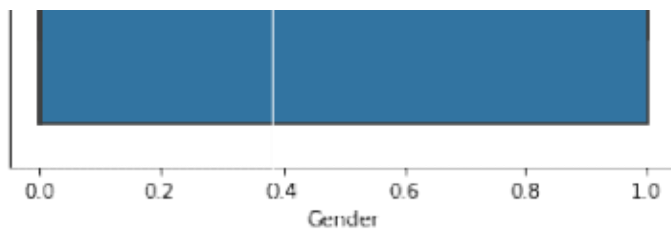


```
In [ ]: sns.boxplot(df['Gender'])
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
FutureWarning

Out[]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb8e250>

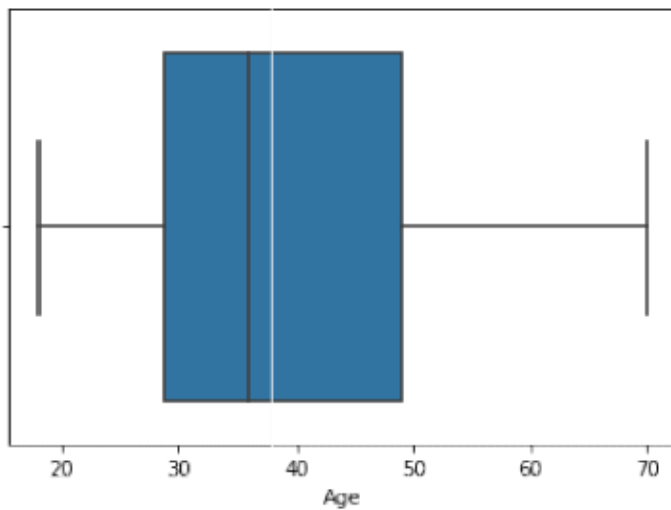




```
In [ ]: sns.boxplot(df['Age'])
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
FutureWarning

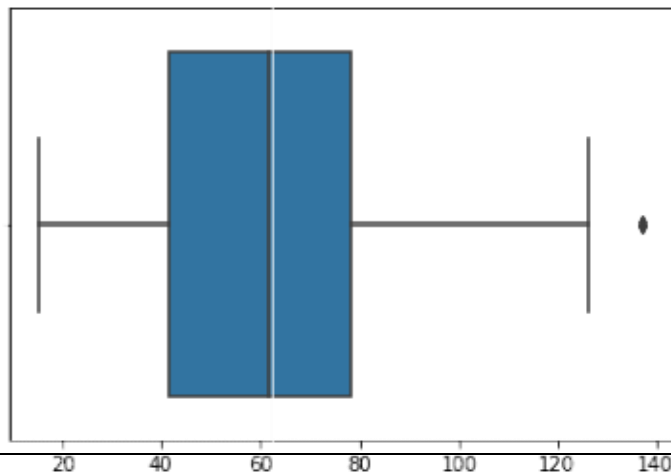
```
Out[ ]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb93b3ee50>
```



```
In [ ]: sns.boxplot(df['Annual Income (k$)'])
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
FutureWarning

```
Out[ ]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb8eb28450>
```



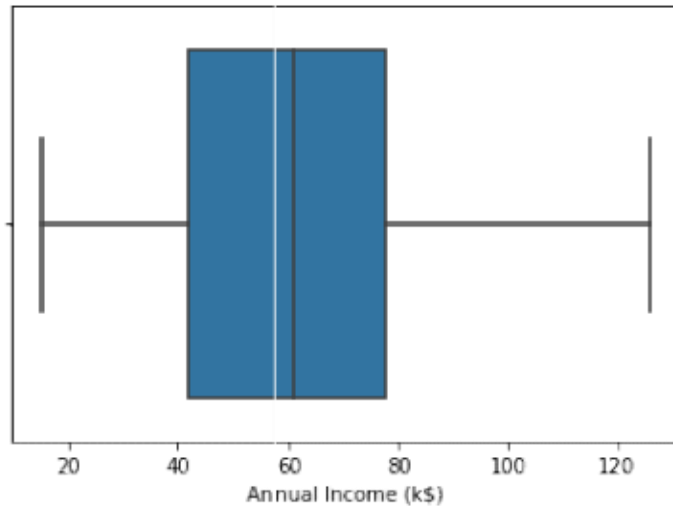
Annual Income (k\$)

```
In [ ]: df['Annual Income (k$)'] = np.where(df['Annual Income (k$)'] > 132.750, 60.55,
```

```
In [ ]: sns.boxplot(df['Annual Income (k$)'])
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
FutureWarning

```
Out[ ]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb8eb18e90>
```



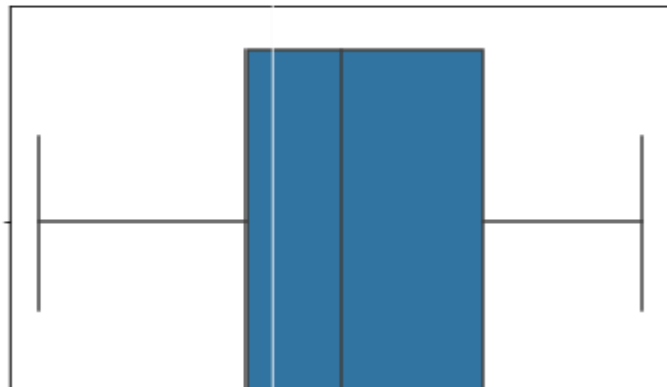
```
In [ ]: df['Annual Income (k$)'].max()
```

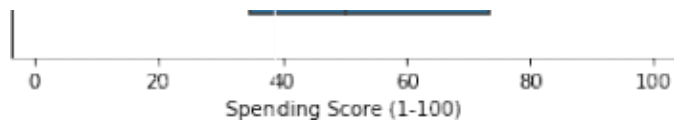
```
Out[ ]: 126.0
```

```
In [ ]: sns.boxplot(df['Spending Score (1-100)'])
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
FutureWarning

Out[]: <matplotlib.axes._subplots.AxesSubplot at 0x7fdb8ea8fc10>





Scaling the data

```
In [ ]: from sklearn.preprocessing import StandardScaler
        ss = StandardScaler().fit_transform(df)
        ss
```

```
Out[ ]: array([[ -1.7234121,  1.12815215, -1.42456879, -1.78843062, -0.43480148],
 [ -1.70609137,  1.12815215, -1.28103541, -1.78843062,  1.19570407],
 [ -1.68877065, -0.88640526, -1.3528021 , -1.74850629, -1.71591298],
 [ -1.67144992, -0.88640526, -1.13750203, -1.74850629,  1.04041783],
 [ -1.6541292 , -0.88640526, -0.56336851, -1.70858195, -0.39597992],
 [ -1.63680847, -0.88640526, -1.20926872, -1.70858195,  1.00159627],
 [ -1.61948775, -0.88640526, -0.27630176, -1.66865761, -1.71591298],
 [ -1.60216702, -0.88640526, -1.13750203, -1.66865761,  1.70038436],
 [ -1.5848463 ,  1.12815215,  1.80493225, -1.62873328, -1.83237767],
 [ -1.56752558, -0.88640526, -0.6351352 , -1.62873328,  0.84631002],
 [ -1.55020485,  1.12815215,  2.02023231, -1.62873328, -1.4053405 ],
 [ -1.53288413, -0.88640526, -0.27630176, -1.62873328,  1.89449216],
 [ -1.5155634 , -0.88640526,  1.37433211, -1.58880894, -1.36651894],
 [ -1.49824268, -0.88640526, -1.06573534, -1.58880894,  1.04041783],
 [ -1.48092195,  1.12815215, -0.13276838, -1.58880894, -1.44416206],
 [ -1.46360123,  1.12815215, -1.20926872, -1.58880894,  1.11806095],
 [ -1.4462805 , -0.88640526, -0.27630176, -1.5488846 , -0.59008772],
 [ -1.42895978,  1.12815215, -1.3528021 , -1.5488846 ,  0.61338066],
 [ -1.41163905,  1.12815215,  0.94373197, -1.46903593, -0.82301709],
 [ -1.39431833, -0.88640526, -0.27630176, -1.46903593,  1.8556706 ],
 [ -1.3769976 ,  1.12815215, -0.27630176, -1.42911159, -0.59008772],
 [ -1.35967688,  1.12815215, -0.99396865, -1.42911159,  0.88513158],
 [ -1.34235616, -0.88640526,  0.51313183, -1.38918726, -1.75473454],
 [ -1.32503543,  1.12815215, -0.56336851, -1.38918726,  0.88513158],
 [ -1.30771471, -0.88640526,  1.08726535, -1.26941425, -1.4053405 ],
 [ -1.29039398,  1.12815215, -0.70690189, -1.26941425,  1.23452563],
 [ -1.27307326, -0.88640526,  0.44136514, -1.26941425, -0.7065524 ],
 [ -1.25575253,  1.12815215, -0.27630176, -1.26941425,  0.41927286],
 [ -1.23843181, -0.88640526,  0.08253169, -1.22948991, -0.74537397],
 [ -1.22111108, -0.88640526, -1.13750203, -1.22948991,  1.42863343],
 [ -1.20379036,  1.12815215,  1.51786549, -1.18956557, -1.7935561 ],
 [ -1.18646963, -0.88640526, -1.28103541, -1.18956557,  0.88513158],
 [ -1.16914891,  1.12815215,  1.01549866, -1.06979256, -1.7935561 ],
 [ -1.15182818,  1.12815215, -1.49633548, -1.06979256,  1.62274124],
 [ -1.13450746, -0.88640526,  0.7284319 , -1.06979256, -1.4053405 ],
 [ -1.11718674, -0.88640526, -1.28103541, -1.06979256,  1.19570407],
 [ -1.09986601, -0.88640526,  0.22606507, -1.02986823, -1.28887582],
 [ -1.08254529, -0.88640526, -0.6351352 , -1.02986823,  0.88513158],
 [ -1.06522456, -0.88640526, -0.20453507, -0.91009522, -0.93948177],
 [ -1.04790384, -0.88640526, -1.3528021 , -0.91009522,  0.96277471],
 [ -1.03058311, -0.88640526,  1.87669894, -0.87017088, -0.59008772],
 [ -1.01326239,  1.12815215, -1.06573534, -0.87017088,  1.62274124],
 [ -0.99594166,  1.12815215,  0.65666521, -0.83024654, -0.55126616],
 [ -0.97862094, -0.88640526, -0.56336851, -0.83024654,  0.41927286],
 [ -0.96130021, -0.88640526,  0.7284319 , -0.83024654, -0.86183865],
 [ -0.94397949, -0.88640526, -1.06573534, -0.83024654,  0.5745591 ]],
```

[-0.92665877, -0.88640526, 0.80019859, -0.79032221, 0.18634349],
[-0.90933804, -0.88640526, -0.85043527, -0.79032221, -0.12422899],
[-0.89201732, -0.88640526, -0.70690189, -0.79032221, -0.3183368],
[-0.87469659, -0.88640526, -0.56336851, -0.79032221, -0.3183368],
[-0.85737587, -0.88640526, 0.7284319 , -0.71047353, 0.06987881],
[-0.84005514, 1.12815215, -0.41983513, -0.71047353, 0.38045129],
[-0.82273442, -0.88640526, -0.56336851, -0.6705492 , 0.14752193],
[-0.80541369, 1.12815215, 1.4460988 , -0.6705492 , 0.38045129],
[-0.78809297, -0.88640526, 0.80019859, -0.6705492 , -0.20187212],
[-0.77077224, 1.12815215, 0.58489852, -0.6705492 , -0.35715836],
[-0.75345152, -0.88640526, 0.87196528, -0.63062486, -0.00776431],
[-0.73613079, 1.12815215, 2.16376569, -0.63062486, -0.16305055],
[-0.71881007, -0.88640526, -0.85043527, -0.55077619, 0.03105725],
[-0.70148935, 1.12815215, 1.01549866, -0.55077619, -0.16305055],
[-0.68416862, 1.12815215, 2.23553238, -0.55077619, 0.22516505],
[-0.6668479 , 1.12815215, -1.42456879, -0.55077619, 0.18634349],
[-0.64952717, -0.88640526, 2.02023231, -0.51085185, 0.06987881],
[-0.63220645, -0.88640526, 1.08726535, -0.51085185, 0.34162973],
[-0.61488572, 1.12815215, 1.73316556, -0.47092751, 0.03105725],
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```

Clustering Algorithm

```
In [ ]: from sklearn.cluster import KMeans
TWSS = []
k = list(range(2,9))

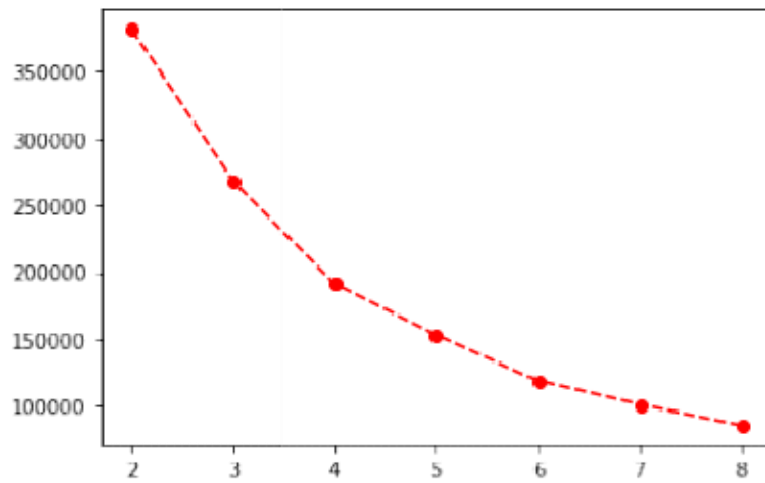
for i in k:
    kmeans = KMeans(n_clusters = i , init = 'k-means++')
    kmeans.fit(df)
    TWSS.append(kmeans.inertia_)
```

```
In [ ]: TWSS
```

```
Out[ ]: [381507.64738523855,
268062.55433747417,
191550.08627670942,
153530.68956249507,
119166.15727643928,
101321.0166427429,
85744.90139221892]
```

```
In [ ]: plt.plot(k,TWSS, 'ro--')
```

Out[]: [



```
In [ ]: model = KMeans(n_clusters = 4)
        model.fit(df)
```

Out[]: KMeans(n_clusters=4)

```
In [ ]: mb = pd.Series(model.labels_)
```

```
In [ ]: df['Cluster'] = mb
```

```
In [ ]: df
```

```
Out[ ]:   CustomerID  Gender  Age  Annual Income (k$)  Spending Score (1-100)  Cluster
0           1        1   19             15.00             39             0
1           2        1   21             15.00             81             0
2           3        0   20             16.00              6             0
3           4        0   23             16.00             77             0
4           5        0   31             17.00             40             0
...         ...      ...   ...              ...              ...             ...
195        196        0   35            120.00             79             1
196        197        0   45            126.00             28             3
197        198        1   32            126.00             74             1
198        199        1   32             60.55             18             3
199        200        1   30             60.55             83             1
```

200 rows × 6 columns