ASSIGNMENT-4 CUSTOMERSEGMENTATIONANALYSIS

Assignment Date	28October2022
Student Name	PRAVIN.A
StudentRollNumber	820419104050
MaximumMarks	2 Marks

Importing the librariesimport pandas as pdimportnumpyas np importmatplotlib.pyplotasplt importseabornassns

Loadingthe dataset:

Input:

df =

pd.read_csv('Mall_Customers.csv')df

Output:

	CustomerID	Gender	Age	AnnualIncome (k\$)	SpendingScore(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

200rows× 5columns

Encoding Categorical

ColumnsInput:

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

Output:

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

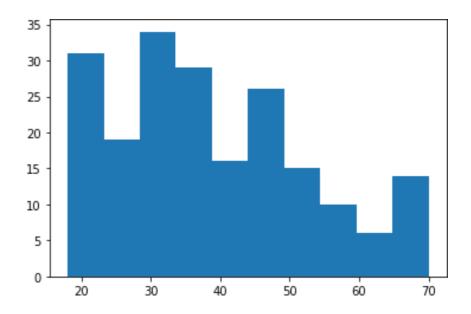
200rows ×6 columns

VisualizationsUniv ariateAnalysis

Input:

plt.hist(df['Age'])

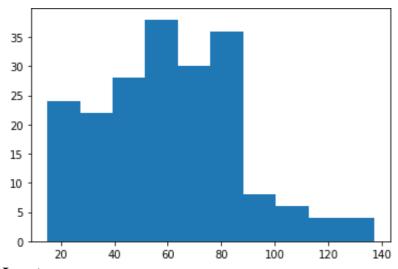
```
(array([31.,19.,34.,29.,16.,26.,15.,10.,6.,14.]),
array([18.,23.2,28.4,33.6,38.8,44.,49.2,54.4,59.6,64.8,70.]),
```



 $plt \boldsymbol{.} hist(df['AnnualIncome(k\$)'])$

Output:

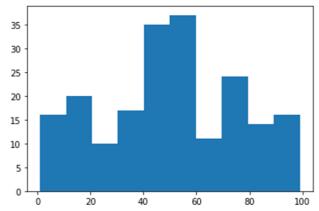
```
(array([24.,22.,28.,38.,30.,36.,8.,6.,4.,4.]),
array([15.,27.2,39.4,51.6,63.8,76.,88.2,100.4,112.6,124.8,137.]),
)
```



Input:

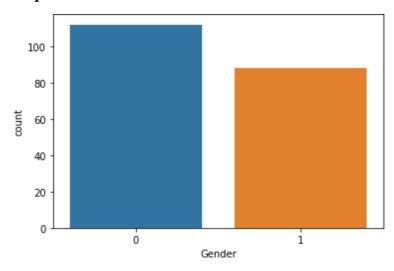
plt.hist(df['SpendingScore(1-100)'])

```
(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.]),
)
```



sns.countplot(df['Gender'])

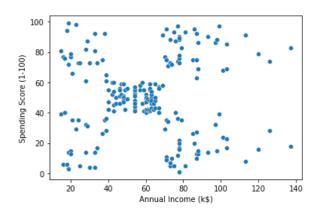
Output:



Bi-VariateAnalysis

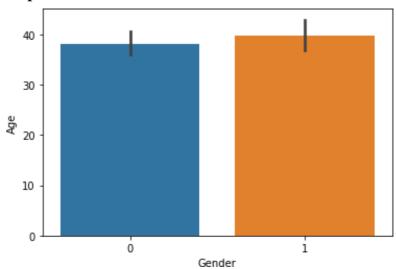
Input:

 $sns. scatterplot(df['AnnualIncome(k\$)'], df['SpendingScore(1-100)']) \\ \textbf{Output:}$



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

Output:



Input:

sns.heatmap(df.corr(),annot=True)

Output:

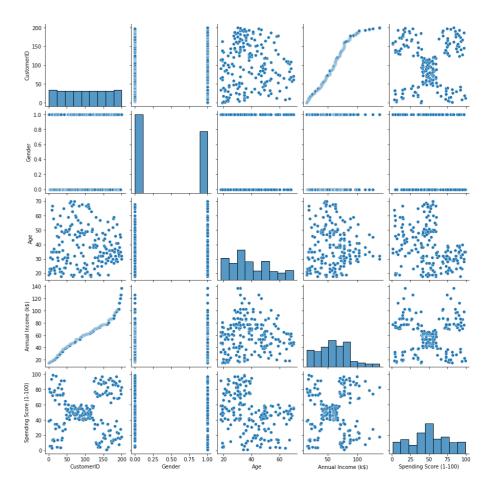


Multi-variate

AnalysisInput:

sns.pairplot(df)

output:



DescriptiveStatistics

Input:

df.info()

Output:

RangeIndex: 200 entries, 0 to 199Datacolumns(total5columns):

#	Column	,	Non-	NullCountDtype	
0 1 2 3 4	CustomerID Gender Age AnnualIncome SpendingScore(1-10 int64dtypes:int64(5)		200 200 200 200 200	non-null non-null non-null non-null	int64 int64 int64 int64

memoryusage:7.9KB

Input:

df.describe()

	CustomerID	Gender	Age	AnnualIncome(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

df.skew()

Output:

Input:

df.kurt()

Output:

 CustomerID
 -1.200000

 Gender
 -1.960375

 Age
 -0.671573

 AnnualIncome
 (k\$)

 -0.098487

SpendingScore(1-100)

0.826629dtype:float64

df.corr()

Output:

	CustomerID	Gender	Age	AnnualIncome(k\$)	SpendingScore(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
AnnualIncome(k\$)	0.977548	0.056410	-0.012398	1.000000	0.009903
SpendingScore(1-100)	0.013835	-0.058109	-0.327227	0.009903	1.000000

Input:

df.var()

Output:

 CustomerID
 3350.000000

 Gender
 0.247638

 Age
 195.133166

 AnnualIncome
 (k\$)
 689.835578

 SpendingScored
 (1-100)
 666.854271

type:float64

Input:

df.std()

Output:

 CustomerID
 57.879185

 Gender
 0.497633

 Age
 13.969007

 AnnualIncome
 (k\$)

 SpendingScore(1-100)
 25.823522

dtype:float64

Checking for missing

valuesInput:

df.isna().sum()

 CustomerID
 0

 Gender
 0

 Age
 0

 AnnualIncome (k\$)
 0

 SpendingScore(1-100)
 0

 dtype:int64
 0

Input:

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

Output:

0

Input:

df.duplicated().sum()

Output:

0

Finding & Handling Ouliers

Input:

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

Output:

	CustomerID	Gender	Age	AnnualIncome(k\$)	SpendingScore(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

Input:

IQR = quantile.iloc[1] quantile.iloc[0]IQR

Output:

CustomerID	99.50
Gender	1.00
Age	20.25
AnnualIncome(k\$)	36.50
SpendingScore(1-100)	38.25
dtype:float64	

Input:

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

CustomerID	299.500
Gender	2.500
Age	79.375
AnnualIncome (k\$)	132.750
SpendingScore(1-	130.375
100)dtype:float64	

100)dtype:float64

Input: lower=quantile.iloc[0]lo

wer -(1.5* IQR)

Output:

CustomerID	-98.500
Gender	-1.500
Age	-1.625
AnnualIncome(k\$)	-13.250
SpendingScore(1-	-22.625
100) 1	

100)dtype:float64

Input:

df.mean()

Output:

CustomerID	100.50
Gender	0.44
Age	38.85
AnnualIncome(k\$)	60.56
SpendingScore(1-100)	50.20
1. (1	

dtype:float64

Input:

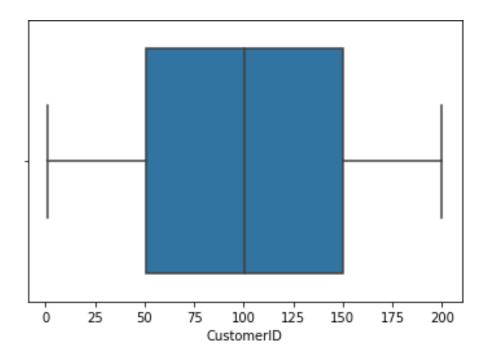
df['AnnualIncome(k\$)'].max()

Output:

137

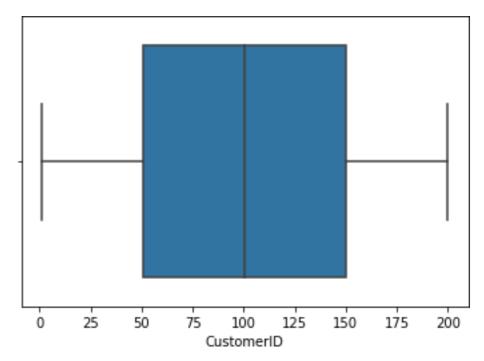
Input:

sns.boxplot(df['CustomerID'])

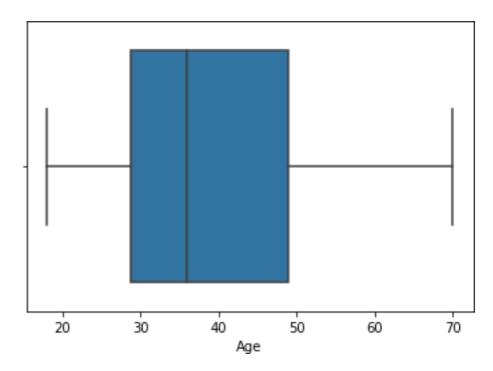


Input: sns.boxplot(df['Gender'])

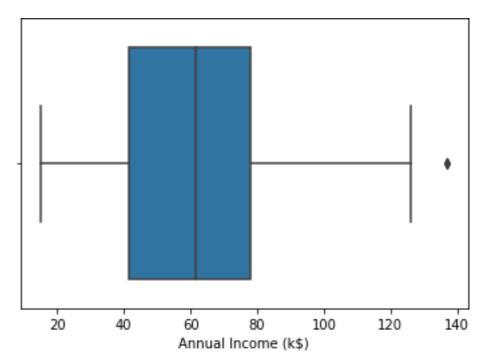
Output:



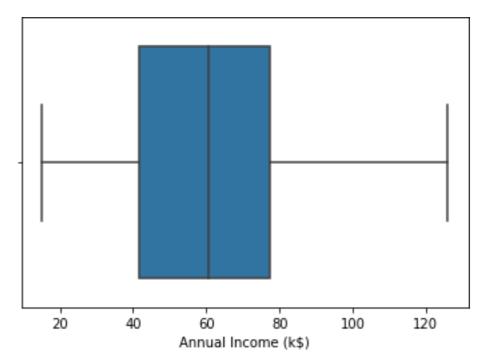
Input: sns.boxplot(df['Age'])



Input: sns.boxplot(df['AnnualIncome(k\$)'])



Input: df['Annual Income (k\$)'] = np.where(df['Annual Income (k\$)'] > 132.750,60.55,df['Annual Income (k\$)']) sns.boxplot(df['AnnualIncome(k\$)'])



Input:

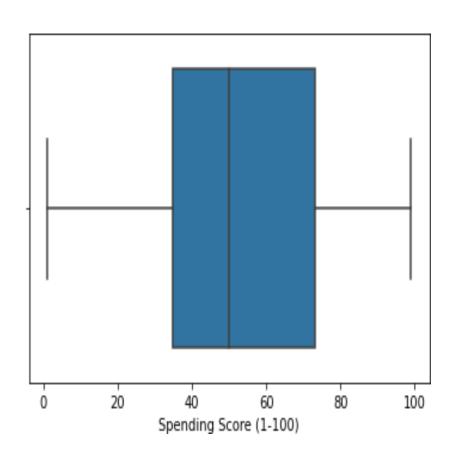
df['AnnualIncome(k\$)'].max()

Output:

126.0

Input:

sns.boxplot(df['SpendingScore(1-100)'])



Scalingthe data

Input:

from sklearn.preprocessing
importStandardScalerss=StandardScaler().fit_transform(df)
ss

l.				
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ClusteringAlgorithm

Input:

from sklearn.cluster import
KMeansTWSS= [] k=list(range(2,9))
foriink:

$$\begin{split} kmeans &= KMeans(n_clusters = i \;,\; init = 'k-\\ means++')kmeans.fit(df) \; TWSS.append(kmeans.inertia_) \end{split}$$

TWSS

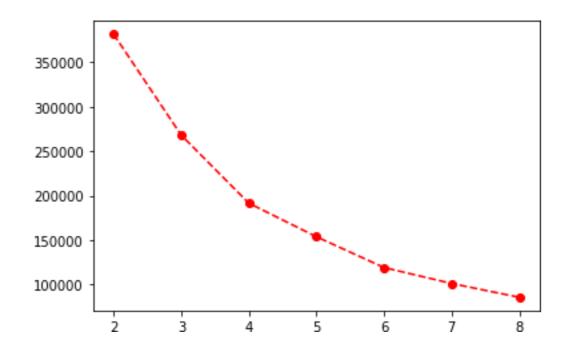
Output:

[381507.64738523855, 268062.55433747417, 191550.08627670942, 153777.55391034693, 119166.15727643928, 101239.32626154403, 85744.90139221892]

Input:

plt.plot(k,TWSS,'ro--')

Output:



 $model = \! KMeans(n_clusters \! = \! 4)$

Input:

model.fit(df)

Output:

KMeans(n_clusters=4)

Input:

mb = pd.Series(model.labels_)df['C

luster']=mb

df

	CustomerID	Gender	Age	AnnualIncome(k\$)	Spending Score(1-100)	Cluster
0	1	1	19	15.00	39	2
1	2	1	21	15.00	81	2

	CustomerID	Gender	Age	AnnualIncome(k\$)	Spending Score(1-100)	Cluster
2	3	0	20	16.00	6	2
3	4	0	23	16.00	77	2
4	5	0	31	17.00	40	2
						
195	196	0	35	120.00	79	3
196	197	0	45	126.00	28	1
197	198	1	32	126.00	74	3
198	199	1	32	60.55	18	1
199	200	1	30	60.55	83	3

 $200 rows \times 6 columns$