ASSIGNMENT – 4

PROBLEM STATEMENT: CUSTOMER SEGMENTATION ANALYSIS

ASSIGNMENT DATE	17 OCTOBER 2022
STUDENT NAME	V.SANJANA
STUDENT ROLL NUMBER	19BEC021
MAXIMUM MARKS	2 MARKS

import pandas as pd import numpy as np import matplotlib.pyplot
as plt import seaborn as sns from google.colab import files
data_to_load = files.upload()

< IPython.core.display.HTML object >

Saving Mall_Customers.csv to Mall_Customers.csv import io df = pd.read_csv(io.BytesIO(data_to_load['Mall_Customers.csv'])) df.head()

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 df.tail()

CustomerID Gender Age Annual Income (k\$) Spending Score (1100)

195 **196 Female 35 120 79**

196 **197 Female 45 126**

28

197 **198 Male 32 126**

74

198 **199 Male 32 137**

18

(200, 5) df.info()

199

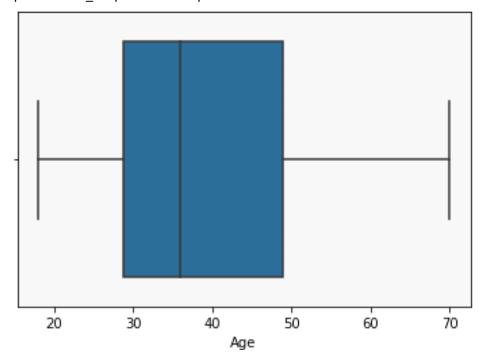
< class 'pandas.core.frame.DataFrame' > RangeIndex: 200 entries, 0 to 199

Data columns (total 5 columns):

Column Non-Null Count Dtype

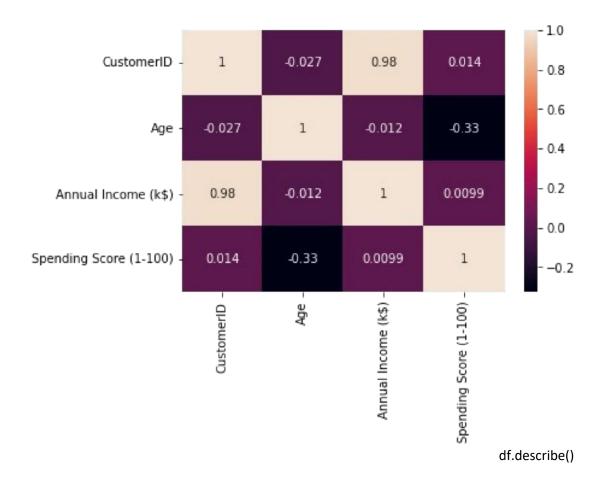
0 CustomerID 200 non-null int64 1 Gender 200 nonnull object 2 Age 200 non-null int64 3 Annual Income (k\$) 200 non-null int64 4 Spending Score (1-100) 200 non-null int64 dtypes: int64(4), object(1) memory usage: 7.9+ KB sns.boxplot(x=df['Age'])

< matplotlib.axes._subplots.AxesSubplot at 0x7ff8695244d 0>



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

< matplotlib.axes._subplots.AxesSubplot at 0x7ff869516990>



CustomerID Age Annual Income (k\$) Spending Score (1-

100) count 200.000000 200.000000

200.000000 200.000000 mean

100.500000 38.850000 60.560000

50.200000

std 57.879185 13.969007 26.264721

25.823522

min 1.000000 18.000000 15.000000

1.000000

25% 50.750000 28.750000 41.500000

34.750000

50% 100.500000 36.000000 61.500000 50.000000

```
73.000000 max 200.000000 70.000000
137.000000
99.000000 df.describe().T
            count mean
                            std min 25% 50% 75 % \
                 200.0 100.50 57.879185 1.0 50.75 100.5 150.25
CustomerID
              200.0 38.85 13.969007 18.0 28.75 36.0 49.00
Age
Annual Income (k$) 200.0 60.56 26.264721 15.0 41.50 61.5 78.00
Spending Score (1-100) 200.0 50.20 25.823522 1.0 34.75 50.0
73.00
             max CustomerID
                                   200.0 Age
70.0 Annual Income (k$) 137.0 Spending Score (1-100) 99.0 df.isna().sum()
CustomerID
                  0
Gender
                0 Age
                                 0
Annual Income (k$)
                     0 Spending Score (1-100)
       dtype: int64 df['Gender'].replace({'Male':1,
'Female':0},inplace=True) df.head()
 CustomerID Gender Age Annual Income (k$) Spending Score (1-100) 0
                                                                             1 19
                                                                                           15
39
1
       2
           1 21
                          15
                                       812
                                                 3
                                                      0 20
                                                                    16
                                                                                  63
                                                                                           4
0
       23
                  16
                                77 4
                                          5
                                               0 31
                                                             17
                                                                           40
df.Gender.unique() array([1, 0]) fig,ax = plt.subplots(figsize=(25,5)) plt.subplot(1,5,1)
sns.boxplot(x=df["CustomerID"]) plt.subplot(1,5,2) sns.boxplot(x=df["Gender"]) plt.subplot(1,5,3)
sns.boxplot(x=df["Age"]) plt.subplot(1,5,4) sns.boxplot(x=df["Annual Income (k$)"])
```

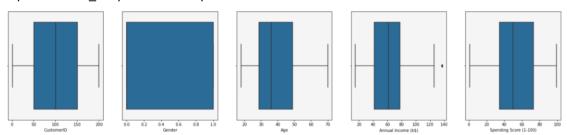
78.000000

75% 150.250000 49.000000

plt.subplot(1,5,5) sns.boxplot(x=df["Spending

Score (1-100)"])

< matplotlib.axes. subplots.AxesSubplot at 0x 7ff866592c10>



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

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 iqr=qnt.loc[0.75]-qnt.loc[0.25] iqr

CustomerID 99.50

Gender 1.00 Age 20.25

Annual Income (k\$) 36.50 Spending Score (1-100)

38.25 dtype: float64 lower=qnt.loc[0.25]-(1.5*iqr) lower

CustomerID -98.500

Gender -1.500 Age -1.625

Annual Income (k\$) -13.250 Spending Score (1-100) 22.625

dtype: float64 upper=qnt.loc[0.75]+(1.5*iqr) upper

CustomerID 299.500

Gender 2.500 Age 79.375 Annual

Income (k\$) 132.750 Spending Score (1100)

130.375 dtype: float64 df.mean()

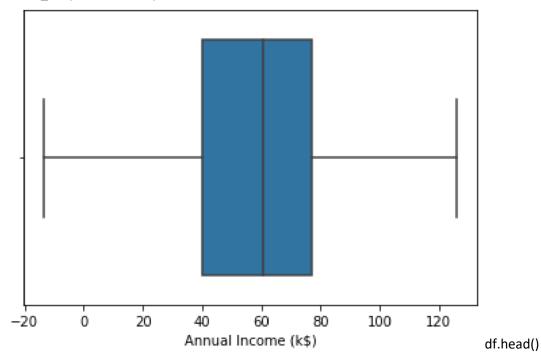
CustomerID 100.50

Gender 0.44 Age 38.85 Annual Income (k\$) 60.56 Spending Score (1-100) 50.20 dtype: float64 df['Annual Income

$\label{eq:come} $$(k\$)']=np.where(df['Annual Income (k\$)']>132.750,-\ 13.250,df['Annual Income (k\$)']>132.750,df['Annual Income (k\$)']>132$

Income (k\$)']) sns.boxplot(x=df['Annual Income (k\$)'])

< matplotlib.axes._subplots.AxesSubplot at 0x7ff8664e7ed 0>



CustomerID Gender Age Annual Income (k\$) Spending Score (1-100) 0 1 1 19

15.0 39

1 2 1 21 15.0 81 2 3 0 20 16.0 6 3 4 0 23 16.0 77 4 5 0 31 17.0 40 df['Gender'] .unique

() array([1, 0]) from sklearn.preprocessing import MinMaxScaler sc=MinMaxScaler()

data=sc.fit_transform(df.iloc[:,1:]) data

array([[1. , 0.01923077, 0.20287253, 0.3877551], [1. , 0.05769231, 0.20287253, 0.81632653],

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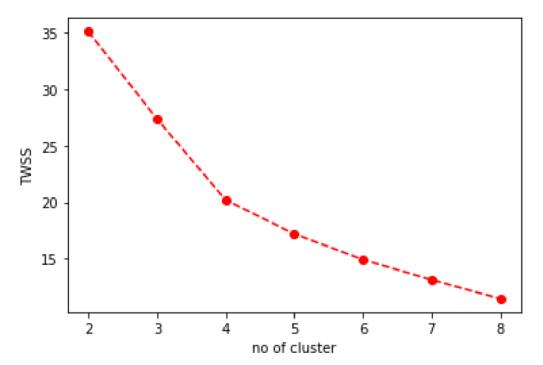
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[1. , 0.26923077, 0. , 0.17346939], [1. , 0.23076923, 0.
0.83673469]]) from sklearn.cluster import KMeans TWSS=[] k=list(range(2,9)) for
iin k:
kmeans=KMeans(n_clusters=i,init='k-means++') kmeans.fit(data)
 TWSS.append(kmeans.inertia_)
TWSS
[35.09354046290808,
27.37315679730296,
20.211573858371988,
17.210964888908972,
14.941607138943485,
13.153866803186235, 11.485368243450253]
plt.plot(k,TWSS,'ro--') plt.xlabel('no of cluster') plt.ylabel('TWSS')
Text(0, 0.5, 'TWSS')
```



model=KMeans(n_clusters=4) model.fit(data) KMeans(n_clusters=4) mb=pd.Series(model.labels_)
df.head(3)

Cust	omer	ID	Gender .	Age	Annual In	come	(k\$) S	pend	ing S	Scor	e (1-100) 0		1	1	19	
15.0			39													
1	2	1	21		15.0		81 2		3	0	20	16.0				6 df.tail()
Cus	tome	rID	Gender	Age	e Annual I	ncome	e (k\$)	Spen	ding	Sco	ore (1100)					
195			196	0	35	120.0	00									
79																
196			197	0	45	126.0	00									
28																
197			198	1	32	126.0	00									
74																
198			199	1	32	-13.2	.5									
18																
199			200	1	30	-13.2	.5		83	3 x=	df.drop(col	umns	=['Cu	sto	mer	ID'.

'Gender'],axis=1) x.head()

Age Annual Income (k\$) Spending Score (1-100) 0 19 15.0 39 1 21 15.0 81 2 20 63 23 16.0 16.0 77 4 31 17.0 40 y=df['Gender'] y 0 1 1 1 2 0 3 0 0 195 0 196 0 197 1 198 1 199 Name: Gender, Length: 200, dtype: int64 from sklearn.model_selection import train_test_split x_train,x_test,y_train,y_test=train_test_split(x,y,test_size=0.2) from sklearn.ensemble import RandomForestClassifier rf=RandomForestClassifier() rf.fit(x_train,y_train) RandomForestClassifier() pred=rf.predict(x_test) from sklearn.metrics import accuracy_score accuracy_score(y_test,pred) 0.575 from sklearn import metrics metrics.confusion_matrix(y_test,pred) array([[17, 8], [9, 6]])