Assignment - 4

Assignment Date	5 November 2022
Student Name	S.Sureshkumar
Student Roll Number	717820P504
Maximum Marks	2 Marks

1.Loading Dataset into tool

from google.colab import files uploaded = files.upload() import pandas as pd import numpy as np

import matplotlib.pyplot as plt import seaborn as sns import warnings warnings.filterwarnings('ignore') data = pd.read_csv("abalone.csv")

<IPython.core.display.HTML object> Saving abalone.csv to abalone.csv 2.Performing Visualization

Univariate Analysis

data.head()

Sex Length Diameter Height weight \
0 M 0.455 0.365 0.095 0.1010
1 M 0.350 0.265 0.090 0.0485
2 F 0.530 0.420 0.135 0.1415
3 M 0.440 0.365 0.125 0.1140
4 I 0.330 0.255 0.080 0.0395

Shell weight Rings

- 1. 0 0.150 15
- 2. 1 0.070 7
- 3. 2 0.210 9
- 4. 3 0.155 10
- 5. 4 0.055 7

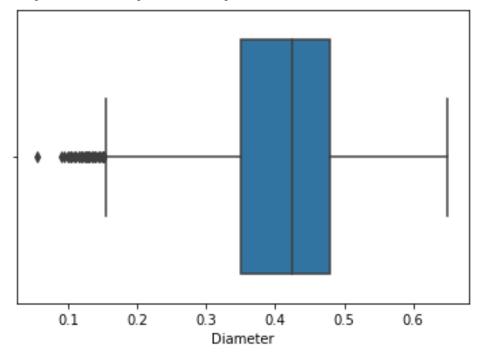
Whole

0.2245

weight Shucked 0.5140 0.2255 0.6770 0.5160 0.2050 weight 0.0995 0.2565 0.2155 0.0895

Viscera

sns.boxplot(data['Diameter'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f9624513c90>

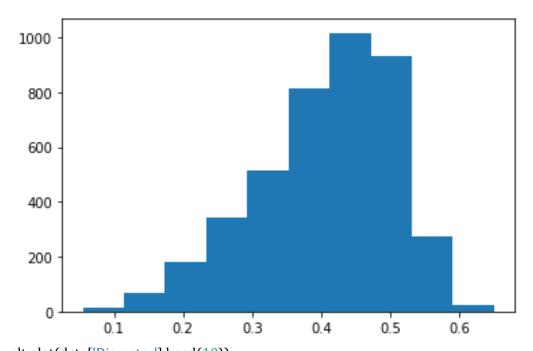


plt.hist(data['Diameter'])

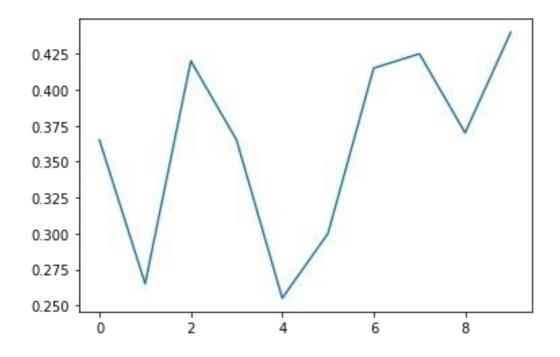
(array([13., 66., 180., 344., 513., 812., 1017., 934., 275., 23.]),

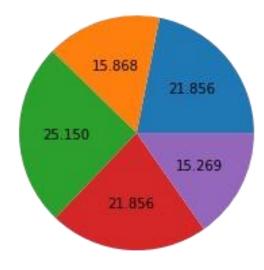
array([0.055, 0.1145, 0.174, 0.2335, 0.293, 0.3525, 0.412, 0.4715,

0.531, 0.5905, 0.65]), <a list of 10 Patch objects>)

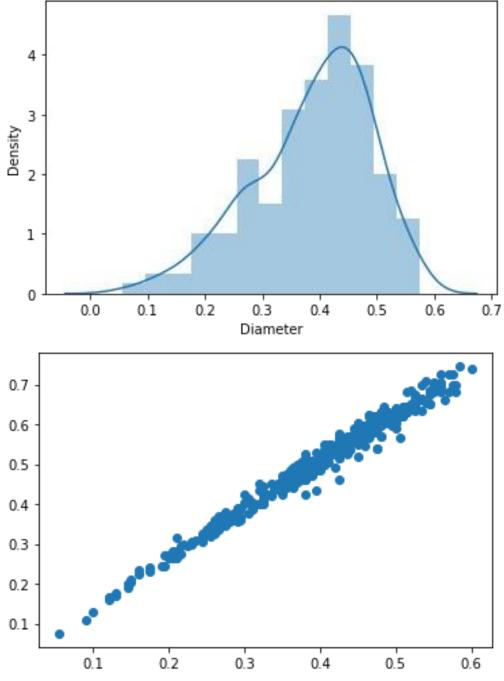


plt.plot(data['Diameter'].head(10)) [<matplotlib.lines.Line2D at 0x7f9623fc7ed0>] plt.pie(data['Diameter'].head(),autopct='%.3f') ([<matplotlib.patches.Wedge at 0x7f9623edc590>, <matplotlib.patches.Wedge at 0x7f9623edcc10>, <matplotlib.patches.Wedge at 0x7f9623ee7650>, <matplotlib.patches.Wedge at 0x7f9623ee7e90>, <matplotlib.patches.Wedge at 0x7f9623e72990>], [Text(0.8507215626110557, 0.6973326486753676, ''), Text(-0.32611344931648134, 1.0505474849691026, "), Text(-1.0998053664078908, -0.02069193128747144, "), Text(-0.08269436219656089, -1.096887251480709, "), Text(0.9758446362287218, -0.5076684409569241, ")], [Text(0.46402994324239394, 0.3803632629138369, '21.856'), Text(-0.17788006326353525, 0.5730259008922377, '15.868'), Text(-0.5998938362224858, -0.011286507974984419, '25.150'), Text(-0.045106015743578656, -0.5983021371712958, '21.856'), Text(0.5322788924883937, -0.2769100587037768, '15.269')])

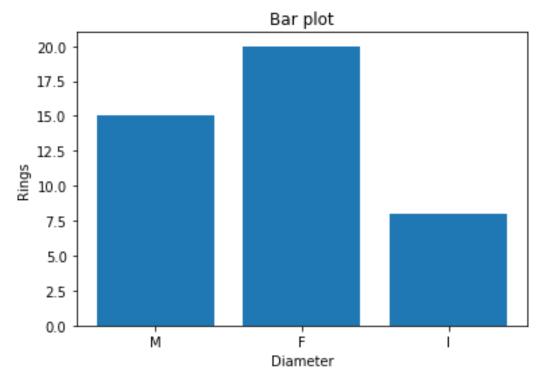




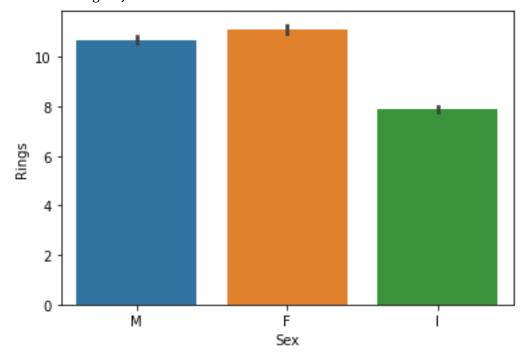
sns.distplot(data['Diameter'].head(300))
<matplotlib.axes._subplots.AxesSubplot at 0x7f9623e90250>
plt.scatter(data['Diameter'].head(400),data['Length'].head(400))
<matplotlib.collections.PathCollection at 0x7f9623d79c10>

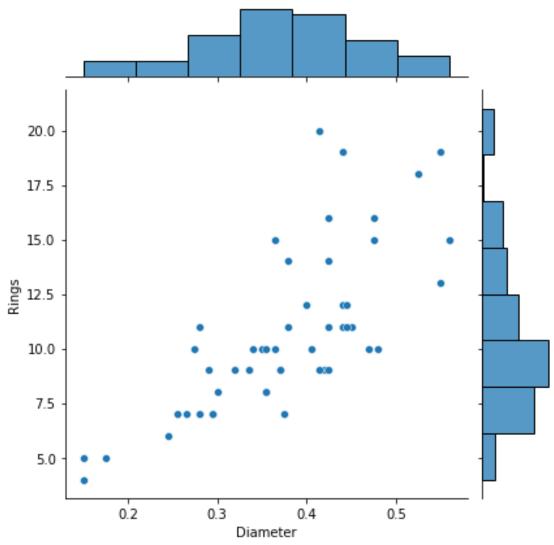


plt.bar(data['Sex'].head(20),data['Rings'].head(20))
plt.title('Bar plot')
plt.xlabel('Diameter')
plt.ylabel('Rings')
Text(0, 0.5, 'Rings')

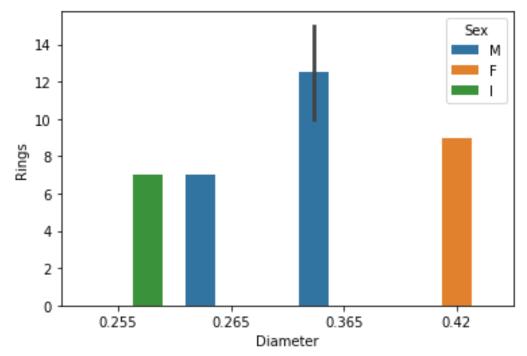


sns.barplot(data['Sex'], data['Rings'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f9623ce8450>
sns.jointplot(data['Diameter'].head(50),data['Rings'].head(100))
<seaborn.axisgrid.JointGrid at 0x7f9623c44c50>

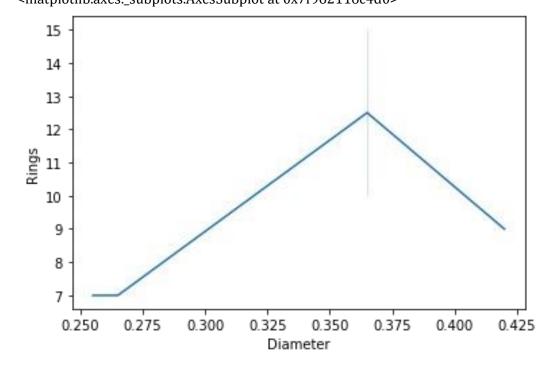


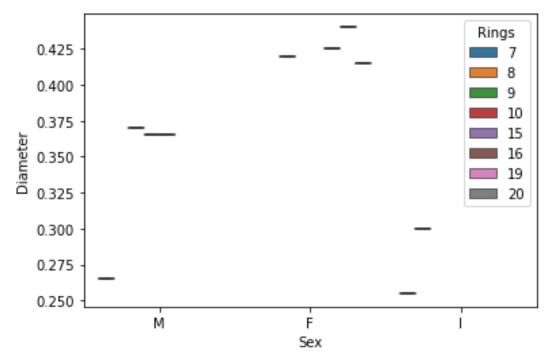


sns.barplot('Diameter','Rings',hue='Sex',data=data.head())
<matplotlib.axes_subplots.AxesSubplot at 0x7f9623b9e310>

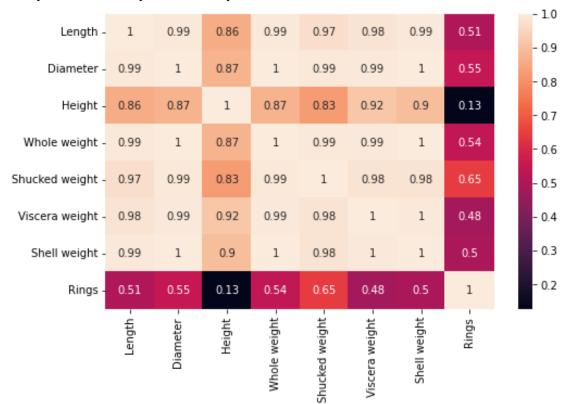


sns.lineplot(data['Diameter'].head(),data['Rings'].head())
<matplotlib.axes._subplots.AxesSubplot at 0x7f96212682d0>
sns.boxplot(data['Sex'].head(10),data['Diameter'].head(10),data['Rings'].head(10))
<matplotlib.axes._subplots.AxesSubplot at 0x7f962116c4d0>

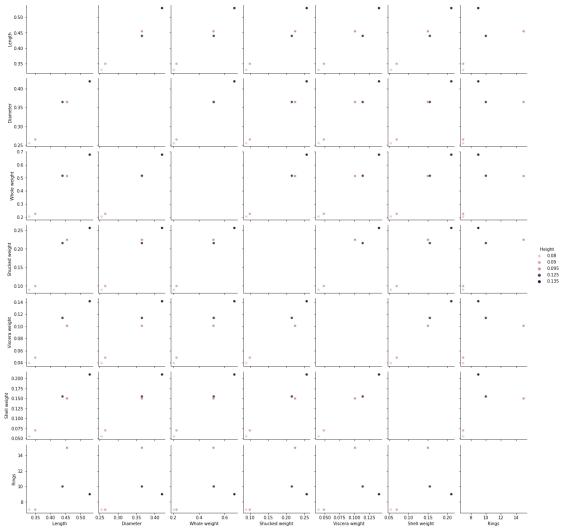




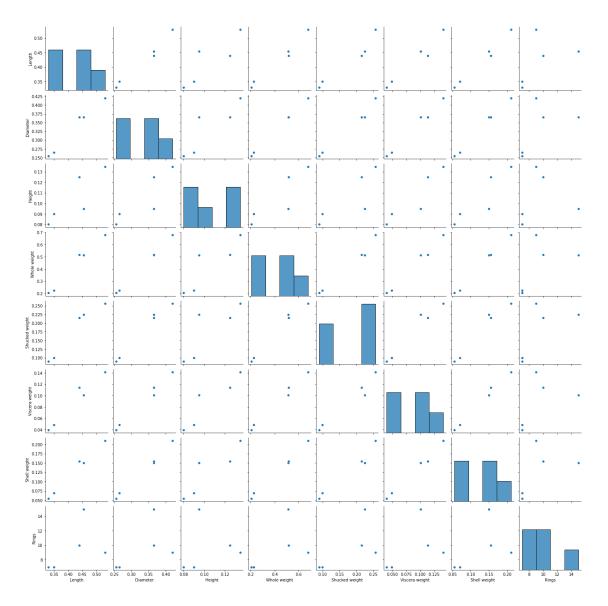
fig=plt.figure(figsize=(8,5)) sns.heatmap(data.head().corr(),annot=True) <matplotlib.axes._subplots.AxesSubplot at 0x7f9621046fd0>



sns.pairplot(data.head(),hue='Height')
<seaborn.axisgrid.PairGrid at 0x7f9620eb5910>



sns.pairplot(data.head())
<seaborn.axisgrid.PairGrid at 0x7f961ff9fcd0>



3.Perform Descriptive Statistics on the dataset

data.head()

Sex Length Diameter Height weight \backslash 0M 0.455 0.365 0.095 0.1010

1M 0.350 0.265 0.090 0.0485 2F 0.530 0.420 0.135 0.1415

3M 0.440 0.365 0.125 0.1140 4I 0.330 0.255 0.080 0.0395

Whole

weight Shucked 0.5140 0.2255 0.6770 0.5160

0.2050

weight

0.2245

0.0995

0.2565

0.2155

0.0895

Viscera

Shell weight Rings

- 1. 0 0.150 15
- $2. \ \ 1 \ 0.070 \ 7$
- 3. 2 0.210 9
- 4. 3 0.155 10
- 5. 4 0.055 7

data.tail()

Sex Length Diameter

Whole

Rings

11

10

9

10 12

weight Shucked

0.8870

0.9660

1.1760

1.0945

1.9485

weight \

0.3700

0.4390

0.5255

0.5310

0.9455

4172

4173

4174

4175

4176

4172

4173

4174

4175

4176

F 0.565

```
M 0.590
M 0.600
F 0.625
M 0.710
   Height
0.450 0.165
0.440 0.135
0.475 \quad 0.205
0.485 0.150
0.555 0.195
Viscera
weight Shell
0.2390
0.2145
0.2875
0.2610
0.3765
weight
0.2490
0.2605
0.3080
0.2960
0.4950
data.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 4177 entries, 0 to 4176
Data columns (total 9 columns):
# Column
---
   1. 0 Sex
   2. 1 Length
   3. 2 Diameter
   4. 3 Height
   5. 4 Whole weight
   6.
   7. 5 Shucked weight
   8.
   9. 6 Viscera weight
   10.
   11. 7 Shell weight
   12.
Non-Null Count
-----
4177 non-null
4177 non-null
4177 non-null
4177 non-null
4177 non-null
```

4177 non-null

```
4177 non-null
4177 non-null
object
float64
float64
float64
float64
float64
float64
float64
Dtype
8 Rings 4177 non-null int64 dtypes: float64(7), int64(1), object(1)
memory usage: 293.8+ KB data.describe()
Length
weight \
count 4177.000000
4177.000000
mean 0.523992
0.359367
std
      0.120093
0.221963
min
      0.075000
0.001000
25%
       0.450000
0.186000
50%
       0.545000
0.336000
75%
       0.615000
0.502000
       0.815000
max
1.488000
 Diameter
4177.000000
 0.407881
 0.099240
 0.055000
 0.350000
 0.425000
 0.480000
 0.650000
  Height
4177.000000
 0.139516
 0.041827
 0.000000
 0.115000
 0.140000
 0.165000
```

```
1.130000
Whole weight
4177.000000
 0.828742
 0.490389
 0.002000
 0.441500
 0.799500
 1.153000
 2.825500
Shucked
   Viscera weight
count 4177.000000
          Shell weight
           4177.000000
            0.238831
            0.139203
            0.001500
            0.130000
            0.234000
            0.329000
            1.005000
01
Sex
Length
Diameter
Height
Whole weight
Shucked weight
Viscera weight 0.1715 NaN Shell weight 0.275 NaN Rings 9.0 NaN
  Rings
4177.000000
 9.933684
 3.224169
 1.000000
 8.000000
 9.000000
 11.000000
29.000000
mean
std
min
25%
50%
75%
max
data.mode().T
0.180594
```

0.109614

0.000500

0.093500

0.171000

0.253000

0.760000

........

M NaN

 $0.55 \ 0.625$

0.45 NaN

0.15 NaN

0.2225 NaN

0.175 NaN

data.shape

(4177, 9)

data.kurt()

Length

Diameter

Height

Whole weight

Shucked weight

Viscera weight

Shell weight

Rings

dtype: float64

data.skew()

Length

Diameter

Height

Whole weight

Shucked weight

Viscera weight

Shell weight

Rings

dtype: float64

data.var()

Length

Diameter

Height

Whole weight

Shucked weight

Viscera weight

Shell weight

Rings

dtype: float64

data.nunique()

Sex

Length

Diameter

Height

Whole weight

Shucked weight

Viscera weight

Shell weight

Rings

```
dtype: int64
0.064621
-0.045476
76.025509
-0.023644
0.595124
0.084012
0.531926
2.330687
-0.639873
-0.609198
3.128817
0.530959
0.719098
0.591852
0.620927
1.114102
0.014422
0.009849
0.001750
0.240481
0.049268
0.012015
0.019377
10.395266
  3
 134
 111
 51
2429
1515
880
926
 28
4. Check for missing values and deal with them
data.isna()
Sex
   1. 0 False
   2. 1 False
   3. 2 False
   4. 3 False
   5. 4 False
```

... ...

4172. 4172 False

```
4173. 4173 False4174. 4174 False4175. 4175 False4176. 4176 False
```

Length

False

False

False

False

False

...

False

False

False

- 1

False

False

Diameter

False

False

False

False

False

...

False

False

False

False

False

Height

False

False

False

False

False

False

False

False

False

False

Whole weight

False

False

False

False

False

...

False False

False

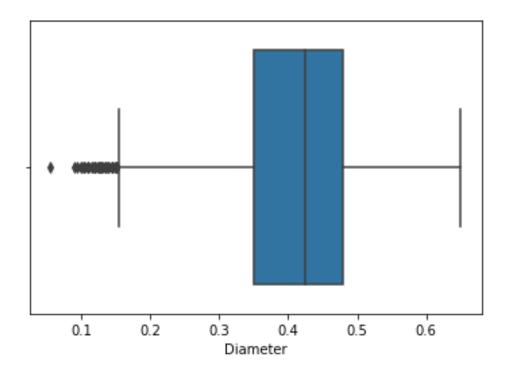
False

False

```
Shucked weight \
    False
    False
    False
    False
    False
    False
    False
    False
    False
    False
   Viscera weight
   1. 0 False
   2. 1 False
   3. 2 False
   4. 3 False
   5. 4 False
   4172.
              4172 False
   4173.
              4173 False
   4174.
              4174 False
              4175 False
   4175.
   4176.
              4176 False
Shell weight Rings
   False False
   False False
   False False
   False False
   False False
   ... ...
   False False
   False False
   False False
   False False
   False False
[4177 rows x 9 columns]
data.isna().any()
Sex
Length
Diameter
Height
Whole weight
Shucked weight
Viscera weight
Shell weight
Rings
dtype: bool
data.isna().sum()
```

```
Sex
Length
Diameter
Height
False
False
False
False
False
False
False
False
False
0 \ 0 \ 0 \ 0
Whole weight 0
Shucked weight 0
Viscera weight 0
Shell weight 0
Rings
           0
dtype: int64
data.isna().any().sum()
0
5. Find the outliers and replace them outliers
sns.boxplot(data['Diameter'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c642c10>
quant=data.quantile(q=[0.25,0.75])
quant
```

Length Diameter Height Whole weight Shucked weight Viscera weight \



 $\begin{array}{c} 0.25\ 0.450\ 0.35\ 0.115\ 0.4415\ 0.0935 \\ 0.75\ 0.615\ 0.48\ 0.165\ 1.1530\ 0.2530 \end{array}$

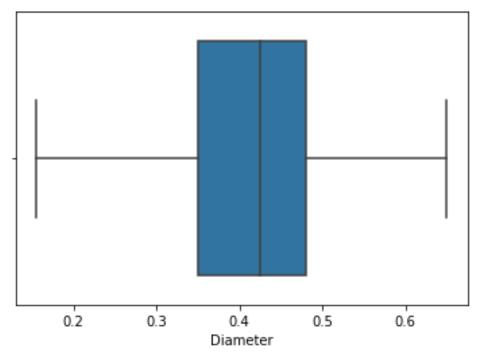
0.186 0.502

0.25 0.75

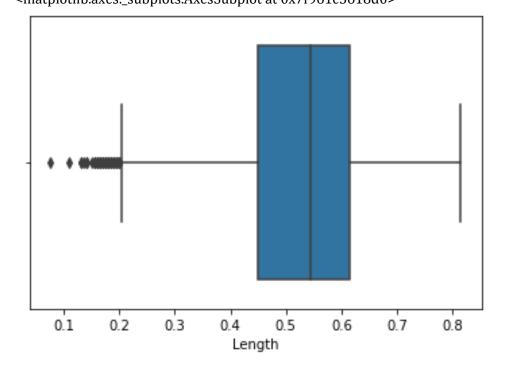
Length

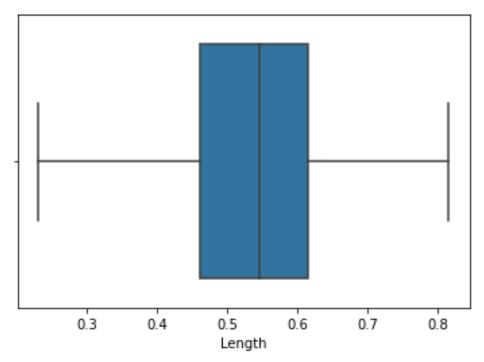
```
Shell weight Rings
   0.130 8.0
   0.329 11.0
iqr=quant.loc[0.75]-quant.loc[0.25]
iqr
Length
Diameter
Height
Whole weight
Shucked weight
Viscera weight
Shell weight
Rings
dtype: float64
0.1650
0.1300
0.0500
0.7115
0.3160
0.1595
0.1990
3.0000
low=quant.loc[0.25]-(1.5*iqr)
low
```

```
Diameter
Height
Whole weight
Shucked weight
Viscera weight
Shell weight
Rings
dtype: float64
0.20250
0.15500
0.04000
-0.62575
-0.28800
-0.14575
-0.16850
3.50000
up=quant.loc[0.75]+(1.5*iqr)
up
Length
Diameter
Height
Whole weight
Shucked weight
Viscera weight
Shell weight
Rings
dtype: float64
0.86250
0.67500
0.24000
2.22025
0.97600
0.49225
0.62750
15.50000
data['Diameter']=np.where(data['Diameter']<0.155,0.4078,data['Diameter
'])
sns.boxplot(data['Diameter'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c621090>
```

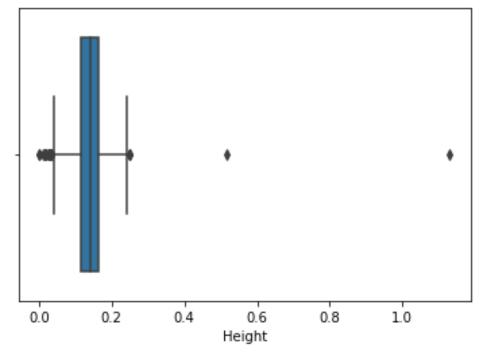


sns.boxplot(data['Length'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c5ba1d0>
data['Length']=np.where(data['Length']<0.23,0.52, data['Length'])
sns.boxplot(data['Length'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c5618d0>

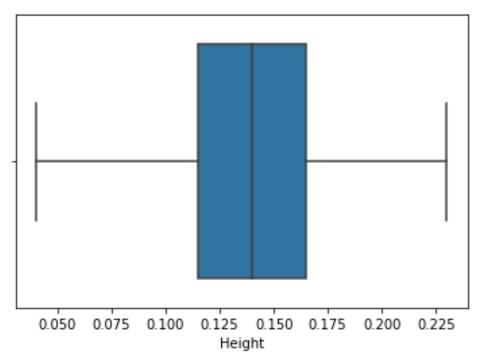


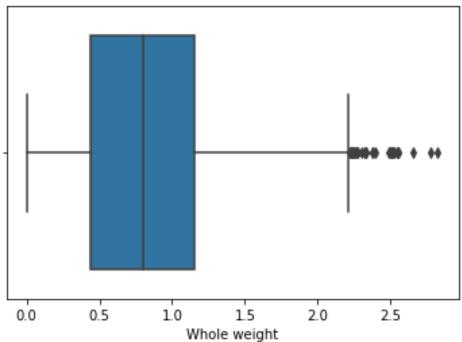


sns.boxplot(data['Height'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c4b55d0>
data['Height']=np.where(data['Height']<0.04,0.139, data['Height'])
data['Height']=np.where(data['Height']>0.23,0.139, data['Height'])
sns.boxplot(data['Height'])



<matplotlib.axes._subplots.AxesSubplot at 0x7f961c4325d0>
sns.boxplot(data['Whole weight'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c3eba10>



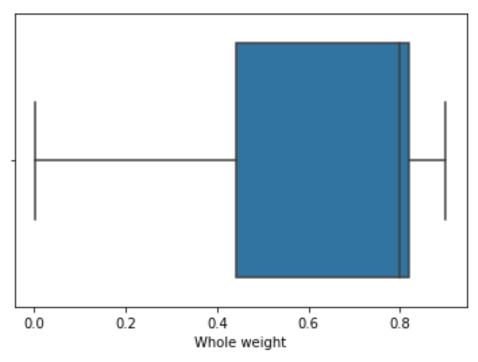


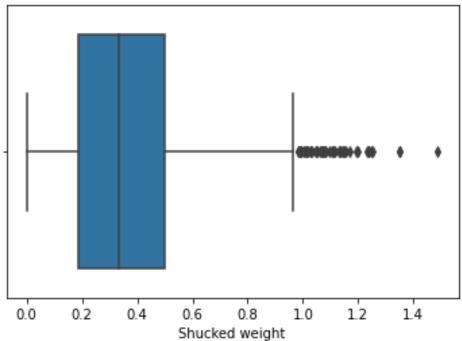
data['Whole weight']=np.where(data['Whole weight']>0.9,0.82,
data['Whole weight'])

sns.boxplot(data['Whole weight'])

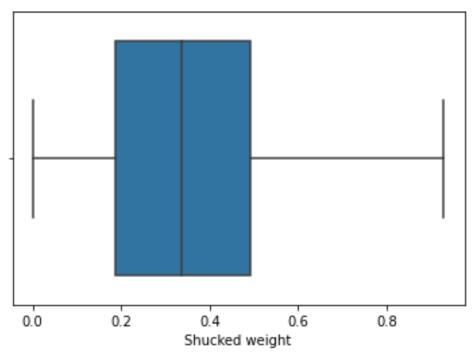
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c383d50>
sns.boxplot(data['Shucked weight'])

<matplotlib.axes._subplots.AxesSubplot at 0x7f961c2f6150>

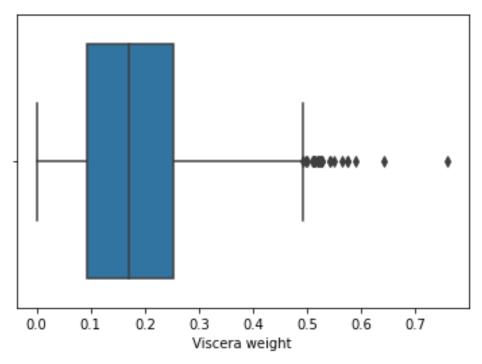


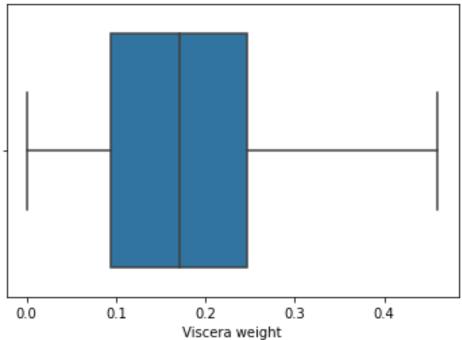


data['Shucked weight']=np.where(data['Shucked weight']>0.93,0.35, data['Shucked weight'])
sns.boxplot(data['Shucked weight'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c266bd0>
sns.boxplot(data['Viscera weight'])

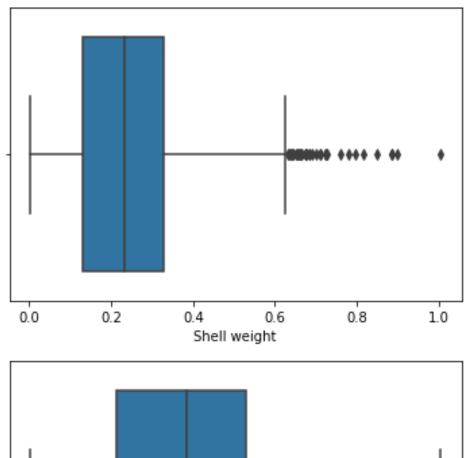


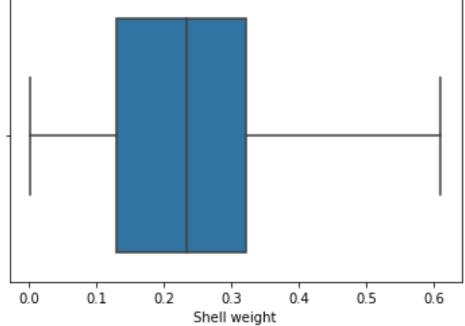
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c298e10>
data['Viscera weight']=np.where(data['Viscera weight']>0.46,0.18,
data['Viscera weight'])
sns.boxplot(data['Viscera weight'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c396ad0>





sns.boxplot(data['Shell weight'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c191f90>
data['Shell weight']=np.where(data['Shell weight']>0.61,0.2388,
data['Shell weight'])
sns.boxplot(data['Shell weight'])
<matplotlib.axes._subplots.AxesSubplot at 0x7f961c10dd50>





6. Check for Categorical columns and perform encoding.

 $\label{lem:data['Sex'].replace({'M':1,'F':0,'I':2},inplace=True)} \\ data$

Sex Length

- 1. 0 1 0.455
- 2. 1 1 0.350
- 3. 2 0 0.530
- 4. 3 1 0.440

5. 4 2 0.330

...

4172.4172 0 0.5654173.4173 1 0.5904174.4174 1 0.6004175.4175 0 0.6254176.4176 1 0.710

Diameter Height

 $0.365 \quad 0.095$

0.265 0.090

 $0.420 \ 0.135$

 $0.365 \quad 0.125$

0.255 0.080

... ...

 $0.450 \quad 0.165$

 $0.440 \ 0.135$

 $0.475 \quad 0.205$

0.485 0.150

0.555 0.195

Shell weight

0.1500

0.0700

0.2100

0.1550

0.0550

...

0.2490

0.2605

0.3080

0.2960

Whole

weight Shucked

0.5140

0.2255

0.6770

0.5160

0.2050

•••

0.8870

0.8200

0.8200

0.8200

0.8200

weight \

0.2245

0.0995

0.2565

0.2155

```
0.0895
0.3700
0.4390
0.5255
0.5310
0.3500
0
1
2
3
4
4172
4173
4174
4175
Viscera
weight
0.1010
0.0485
0.1415
0.1140
0.0395
0.2390
0.2145
0.2875
0.2610
Rings
 15
 7
  9
 10
  7
 11
 10
 9
 10
4176 0.3765 0.4950 12 [4177 rows x 9 columns]
7. Split the data into dependent and independent variables.
x=data.drop(columns= ['Rings'])
y=data['Rings']
  Sex Length Diameter Height
```

1. 0 1 0.455 0.365 0.095

```
2. 1 1 0.350 0.265 0.090
```

- 3. 2 0 0.530 0.420 0.135
- 4. 3 1 0.440 0.365 0.125
- 5. 4 2 0.330 0.255 0.080

...

- 4172. 4172 0 0.565 0.450 0.165
- 4173. 4173 1 0.590 0.440 0.135
- 4174. 4174 1 0.600 0.475 0.205
- 4175. 4175 0 0.625 0.485 0.150
- 4176. 4176 1 0.710 0.555 0.195
- 4177. Viscera weight Shell weight

Whole

weight Shucked

0.5140

0.2255

0.6770

0.5160

0.2050

•••

0.8870

0.8200

0.8200

0.8200

0.8200

weight \

0.2245

0.0995

0.2565

0.2155

0.0895

...

0.3700

0.4390

0.5255

0.5310

0.3500

- 1. 0 0.1010
- 2. 1 0.0485
- 3. 2 0.1415
- 4. 3 0.1140
- 5. 4 0.0395

... ...

- 4172. 4172 0.2390
- 4173. 4173 0.2145
- 4174. 4174 0.2875

```
4175.
              4175 0.2610
   4176.
              4176 0.3765
[4177 rows x 8 columns]
У
0 15 17 29 3 10 47
4172 11
4173 10
4174 9
4175 10
0.1500
0.0700
0.2100
0.1550
0.0550
0.2490
0.2605
0.3080
0.2960
0.4950
4176 12
Name: Rings, Length: 4177, dtype: int64
8. Scale the independent variables
from sklearn.preprocessing import scale x = scale(x)
array([[-0.0105225, -0.67088921, -0.50179694, ..., -0.61037964, -0.7328165, -0.64358742],
[-0.0105225, -1.61376082, -1.57304487, ..., -1.22513334, -1.24343929, -1.25742181],
   [-1.26630752, 0.00259051,
   -0.33890749, -0.18321163],
   [-0.0105225, 0.63117159,
    1.08111018, 0.56873549],
   [-1.26630752, 0.85566483,
    0.82336724, 0.47666033],
   [-0.0105225, 1.61894185,
    1.94673739, 2.00357336]])
9. Split the data into training and testing
0.08738942, ..., -0.45300269,
0.67657577, ..., 0.86994729,
```

```
0.78370057, ..., 0.89699645,
1.53357412, ..., 0.00683308,
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)
print(x_train.shape, x_test.shape)
(3341, 8) (836, 8)
10.Build the Model
from sklearn.linear_model import LinearRegression MLR=LinearRegression()
11.Train the model
MLR.fit(x_train,y_train)
LinearRegression()
12.Test the model
y_pred=MLR.predict(x_test)
y_pred
array([11.54069678, 9.49895399, 6.52443921, 8.83112905, 7.17856508,
   11.05657152, 11.64851477, 8.14081022, 10.27889967,
6.95196725,
8.55440106, 6.83326006, 13.65739688, 9.64587342,
8.9877502,
6.6198843, 7.80248655, 8.80790722, 8.69792834,
11.26489978,
   12.58112011, 15.56881783, 12.24601581, 7.78309109,
12.33762125,
   11.95248582, 10.96621889, 10.29262391, 6.41772893,
12.64866118,
    9.42259048, 11.69398584, 13.81562522, 10.56547208,
13.77344532,
    9.46104164, 11.50841302, 9.09427682, 11.52031183,
9.70834125,
8.75237909, 10.55322532, 6.848486, 10.7103863,
8.06918025,
9.7279291, 9.73358905, 11.56150296, 8.6842891,
6.37816315.
7.73366501, 11.2405997, 7.49066102, 9.62782361,
```

```
15.33711265,
9.8808388, 13.66376956, 12.11126275, 8.49532274,
9.8658764,
   14.14171599, 10.31795531, 9.16754365, 13.22474541,
6.92352778,
   12.04355879, 11.15099777, 12.75412711, 9.20082015,
12.1712762,
8.89864407, 12.43181958, 6.81709844, 6.5583841,
   7.51277931, 10.74486258, 11.35120432, 9.69690972,
7.8923869.
8.13969586, 8.8475261, 7.36041772, 6.64092439,
11.26322908.
7.71181081, 8.97342293, 10.94593504, 10.4868579,
11.73430544,
8.5731762, 10.51921164, 9.73482231, 9.15055446,
7.04296576,
10.13047939, 8.93314545, 7.37894174, 10.64731869,
11.36743605.
12.38734199, 9.24562918, 11.19180978, 11.07303436,
9.68069916,
7.58254393, 9.044852, 9.95115811, 11.0582989,
11.72043006,
   9.67082246, 11.09766282, 9.96802379, 7.53600837,
10.51973965,
   9.17255415, 11.13257636, 10.63089427, 8.75554344,
13.41820769,
11.5738427, 10.58324109, 7.60918431, 8.7857617,
7.7827081,
7.36470215, 9.94393466, 6.66549046, 7.69276842,
10.08500178,
11.4109651, 10.62891559, 10.82433697, 10.59739469,
10.01546589.
11.71960777, 6.93158646, 6.21466601, 10.06788277,
10.72273275,
8.9801887, 12.10745006, 12.04020196, 6.88791044,
```

13.29018362,

13.22568905, 9.27016388, 10.08534367, 11.90450271,

4.64919239,

13.61539616, 9.11384336, 12.8187526, 4.31801239,

7.15719192,

4.8870934, 12.90531414, 11.12777407, 10.02845693,

6.15250609,

13.09957628, 10.65641679, 13.42556673, 9.89013183, 7.78006145,

11.23521899, 14.51022451, 13.47270706, 11.85214133, 9.37453725,

11.65696338, 10.11378553, 5.86883913, 9.29581286,

13.19204926,

11.17191568, 6.5645379, 15.48418468, 10.62798278,

12.2998294,

9.70337247, 13.01686409, 8.49448202, 9.16106491, 10.63770327,

8.35417634, 13.10041415, 13.42677458, 5.79134174, 11.33063144,

10.39325912, 13.38584917, 13.40916376, 10.42568761, 7.73749088,

9.16003971, 11.30348186, 7.95272523, 7.93512011,

7.86977829,

9.1494961, 10.8396161, 10.42791526, 12.06135993,

11.31430079,

13.98523552, 10.72480273, 10.76613282, 10.12098284, 6.66718688,

10.58914884, 10.93595723, 9.91502263, 11.29411918,

7.88521276,

9.33995138, 6.50229808, 11.58257584, 6.87771628,

12.67517329,

16.55763652, 10.69159895, 11.24279756, 9.13442737, 8.72323611,

10.22601629, 12.05258808, 8.71989817, 12.93656197, 6.45097046,

6.98213794, 11.52635762, 11.40841129, 10.76663776,

9.38412642,

10.89935953, 7.31982532, 11.97448724, 9.72507277,

12.26438271,

9.37215795, 7.12058354, 9.27677394, 8.63066054,

11.30215674,

```
6.08077549, 7.92229701, 7.2767753, 10.88676783,
```

9.21305141,

12.15461642, 9.63110367, 7.70126284, 12.46114346,

7.59480401,

12.00577623, 10.28743849, 8.82975649, 11.45512588, 8.3442881.

10.02688931, 10.02630384, 11.44411395, 11.90229353, 12.00368773,

7.98148357, 11.33917258, 9.32368155, 7.93424756,

10.99753962.

7.91754348, 6.16968169, 8.42003195, 10.57324381,

8.73373817,

8.80732335, 10.8936687, 8.61627177, 12.0350052,

12.42387851,

15.51804693, 9.82438264, 6.61711709, 8.53958333,

10.29161468,

5.94139478, 9.97690317, 10.336068, 10.16515659,

9.15840085,

10.32360899, 11.30860679, 11.53640835, 7.85714689,

9.15165221,

6.38278905, 7.59652161, 10.16159927, 10.07843594,

7.97044259,

8.03569699, 8.02497031, 6.4322271, 11.25501593,

11.83823874,

11.28503596, 6.87043255, 10.62894104, 10.99084524,

10.87908847,

12.06087707, 9.72764585, 7.79195275, 11.64611316,

10.57040484,

8.35775137, 12.23658447, 10.99945952, 15.50560555,

6.87374354,

8.60776074, 10.8593621, 10.92229355, 11.07865536,

11.18738022,

10.93889866, 11.02435426, 10.99694487, 12.24766539, 7.87130066,

11.28334764, 13.07071067, 14.55709035, 8.95150329,

9.64381581,

8.53787374, 9.49814311, 11.04742947, 13.38410997,

10.43320536, 7.60519427, 8.32091959, 13.06360894, 14.50773568, 11.73965713, 12.48794147, 10.53951409, 11.04174252, 6.71936628, 11.1749459, 8.80586382, 8.26446109, 8.00674414, 11.58885536, 6.28875443, 8.33768758, 12.16236891, 10.08951878, 11.23161672, 11.92167545. 9.72787884, 9.89092893, 11.41601555, 8.75136282, 8.40485261, 6.99332406, 12.65369418, 9.28696132, 12.34199251, 11.55961076, 9.49910065, 7.71538709, 7.66748446, 7.92104409, 9.99653039, 12.10311262, 13.27010447, 13.89632175, 7.96276005, 8.28105499, 11.92062257, 11.86485603, 11.30236942, 11.72699485, 7.07287823, 10.01222378, 9.07595321, 10.99479604, 6.89937414, 14.57880665, 9.66840208, 9.34428944, 11.97554553, 7.06939809, 10.02929938, 10.01331059, 11.15814941, 13.12856179, 11.20333523, 7.57481498, 13.24071771, 10.50038133, 9.41093928, 11.99729048, 7.34077605, 7.85625332, 10.20192578, 10.00426864, 6.20358916, 10.16448511, 6.55642685, 10.77799647, 11.1162666, 13.3863546, 11.92437896, 9.12040391, 5.99458465, 10.1199788, 9.75812607, 7.02392668, 13.26021246, 9.4738486, 10.97756881, 8.30744953, 10.68386186, 12.40904103, 7.22187259, 12.07846073, 9.60276861,

10.5635443,

7.73462142, 13.59163377, 9.06150914, 14.06291771, 10.43109922, 11.25463293, 11.92593621, 12.17267906, 8.77355942, 13.80654218, 6.3145801, 9.96318075, 10.62635096, 12.9487035, 8.78554027, 12.65575278, 11.00725139, 14.78443748, 8.43861728, 10.6263765, 10.28836292, 10.01449497, 8.25546854, 12.1758287, 6.95523486, 8.90112605, 10.04798264, 10.43414356, 9.99962877, 11.03583022, 9.52482548, 10.7294708, 8.86458229, 10.65738116, 11.12856712, 13.64794822, 9.60929351, 7.96351326, 9.32198228, 6.85888818, 10.87625026, 10.08503211, 11.25642064, 10.63925411, 10.21518367, 10.23375535, 12.56757299, 8.73411142, 10.28266098, 9.09557167, 12.33719483, 10.23237896, 12.03494537, 7.20341854, 9.04576135, 13.45789077, 8.05741121, 11.2391486, 9.90515751, 11.63561003, 10.82240081, 10.02462766, 10.37319587, 7.32561844, 7.74274613, 7.96664097, 12.12810876, 9.65800013. 7.05560025, 7.0765866, 8.08674607, 6.1525542, 12.74588665, 4.48862357, 9.35569147, 10.06336609, 10.56911428, 11.9991985, 11.031902, 9.10207106, 9.16700788, 4.25036511, 10.44505832, 10.5248957, 6.68575993, 15.96716935, 10.82662125, 8.09924411, 10.70869237, 12.35006318, 10.11425341, 9.28638073, 11.28456034,

6.88890746, 12.26664829, 8.33975993, 8.63395437,

12.7534647,

11.58794713, 12.32931121, 11.03947718, 14.44278997, 9.1526754, 9.96753573, 12.26568522, 11.35694972, 12.31490192, 10.21722021, 16.29976957, 12.370311, 12.24447926, 11.173701 . 10.179486 , 11.81898172, 9.86346586, 9.27256167, 6.39317203, 7.96060048, 11.98230431, 7.20884879, 10.19870416, 10.54332877. 9.60829602, 8.90425344, 8.94845116, 9.35246022, 14.56196371, 11.03963102, 12.5023797, 9.67399269, 9.3511401,10.96072018, 10.69721757, 7.51690148, 11.511517, 9.67811192,7.33734619, 11.00287908, 11.87786789, 8.0526612, 11.01033907, 13.36181267, 10.62125768, 10.75647649, 9.05527551, 9.39940694, 11.25291985. 9.67323418, 7.80449237, 9.04200461, 11.76068937, 8.95085535, 15.56892138, 10.43707649, 12.59822203, 12.83931103, 11.14957871, 11.93105691, 7.80490952, 10.47569057, 7.80852019, 10.03441283, 11.00290668, 6.3213835, 13.28008836, 5.44262249, 10.0072763, 6.90588402, 10.62869477, 8.71239076, 10.87123808, 11.72001852. 7.19167124, 7.92167321, 7.68634043, 9.96813104, 10.21169043, 8.96348928, 10.75308121, 11.65412869, 14.58618679, 12.02425713, 10.66056363, 8.00168655, 8.56812593,

12.895106, 9.4923062, 11.47145176, 10.53720392,

6.02905054,

```
12.83304005,
10.33670183, 16.03943759, 12.02522946, 8.5739522,
11.98857379,
   8.82110981, 10.45519425, 9.1200697, 10.52044421,
8.87813041,
6.72495962, 8.06392527, 9.19981327, 13.39096262,
9.26367146,
8.14837182, 8.85554945, 6.30515766, 10.25859235,
11.04432486.
11.93588945, 9.36256843, 9.68425387, 11.76199261,
9.00569387,
   9.23569088, 11.51970577, 9.12069266, 7.94013073,
11.06286984,
12.92030963, 13.8943073, 10.91871503, 8.74697235,
6.71089935.
   14.71731037, 12.09769803, 8.54391856, 11.68705443,
11.08870433,
10.27946584, 10.51998226, 12.85751036, 9.9292065,
10.70116006,
8.89267373, 7.05760295, 11.68713402, 6.20648635,
10.82224239,
11.04772861, 11.3995166, 10.33354214, 6.34144409,
15.50105519,
7.92176241, 9.87279381, 6.70097096, 7.83487912,
6.55063095,
   5.93984218, 11.28170239, 7.97955425, 7.27822732,
10.22515415,
4.28748681, 7.5934957, 12.16089328, 13.19196436,
11.89672074,
   7.14104358, 10.51890117, 6.9754901, 10.98348927,
11.85615632,
   12.27658476, 10.26603983, 11.40583227, 7.99224812,
12.32434175,
11.09305975, 10.71953854, 10.25748861, 10.4759517,
8.49307286,
```

12.12488102, 8.65438527, 8.01858675, 7.14776458,

```
8.63032337,
11.2980198, 11.29170328, 10.86003592, 6.26014084,
12.08001959,
10.43953314, 7.73987972, 11.99588048, 13.72401048,
8.63330819,
7.49253125, 10.20135478, 9.583333657, 10.5842399,
11.62679412,
7.68972791, 9.4646659, 10.75059857, 6.69462086,
10.68554059.
   7.55337542, 10.11978428, 11.15513888, 9.78756708,
7.86669589,
9.40048379, 5.66182888, 7.03918958, 11.57230128,
6.92239735,
10.71587496, 11.52892599, 7.79487777, 6.4461293,
11.59679899,
   10.91807069, 11.65768382, 11.5984792, 12.56106231,
10.52476051,
9.20765166, 14.4122295, 8.04542852, 11.0218053,
6.12226262,
10.45628958, 11.0452751, 10.65411905, 11.95752265,
11.4082904,
10.44351749, 5.87083955, 12.67297728, 9.14008833,
11.14123184,
10.97716762, 7.66987454, 10.21859958, 8.11501349,
4.03027355.
   9.84334321, 11.14981452, 12.15089576, 7.67781124,
11.38619315,
13.20374376, 7.11300851, 8.49650293, 14.82672519,
9.7862761,
11.59659898, 7.85166071, 8.49747448, 7.43724277,
12.13105014.
10.07690974, 6.28311991, 10.87273209, 9.28976732,
7.25922486,
10.9465525, 15.16016343, 7.79559915, 12.09636916,
```

```
10.19603123,
7.37850565, 6.6609198, 6.75683481, 6.00570726,
10.00832715,
8.4120339, 9.89161085, 13.39563291, 10.02679784,
10.73800476,
   8.44704692, 12.26196649, 11.45369701, 9.22437065,
9.12619882,
    7.25844296, 8.19338082, 10.0747906, 8.26008144,
10.92636769,
    7.66241316, 10.30171643, 11.85160087, 8.24892183,
11.82981831,
   15.76865947, 8.55261702, 11.5525222, 8.34384644,
6.62327531.
   8.88634835, 13.30231386, 11.10002118, 9.72346458,
13.64771642,
   10.26539644])
pred=MLR.predict(x_train)
pred
array([11.08442404, 7.61246988, 11.40560108, ..., 6.23338339, 6.68160695, 11.62326458])
from sklearn.metrics import r2_score accuracy=r2_score(y_test,y_pred) accuracy
0.4563299997265451 MLR.predict([[1,0.455,0.365,0.095,0.5140,0.2245,0.1010,0.150]])
array([9.87256759])
13. Measure the performance using Metrics
from sklearn import metrics
from sklearn.metrics import mean_squared_error np.sqrt(mean_squared_error(y_test,y_pred))
2.400658687128463
LASSO
from sklearn.linear_model import Lasso, Ridge
#intialising model
lso=Lasso(alpha=0.01,normalize=True) #fit the model lso.fit(x train,y train) Lasso(alpha=0.01,
normalize=True) #prediction on test data lso_pred=lso.predict(x_test)
#coef
coef=lso.coef_
coef
array([-0.00867704, 0.
0.14076131,
0.,0.
```

```
from sklearn import metrics
from sklearn.metrics import mean_squared_error metrics.r2_score(y_test,lso_pred)
0.35217661094369934 np.sqrt(mean_squared_error(y_test,lso_pred)) 2.6205415255898603
RIDGE
#initialising model
rg=Ridge(alpha=0.01,normalize=True) #fit the model rg.fit(x_train,y_train) Ridge(alpha=0.01,
normalize=True) #prediction rg_pred=rg.predict(x_test)
rg_pred
array([11.48829185, 9.49185638, 6.52855715, 8.88572713, 7.1794515,
   11.05400464, 11.61368185, 8.12311058, 10.32334947,
6.97106698,
8.57358187, 6.92975464, 13.52565076, 9.71367977, 8.99229802,
6.59818005, 7.83324476, 8.82713334, 8.70295194, 11.31079488,
   12.46405845, 15.41781124, 12.20179819, 7.80859249,
12.21941921,
   11.89746333, 11.02051962, 10.37978812, 6.40274613,
, 0.
, 0.81943443])
, 0.47886483,
12.5752096,
   9.49536694, 11.73343905, 13.70396588, 10.53086589,
13.5982056.
9.45932051, 11.46540406, 9.32111182, 11.6327897,
9.67613273,
   8.77272442, 10.55104433, 6.94417975, 10.67002081,
8.22482202,
9.69096894, 9.80602087, 11.60076362, 8.7238234,
6.37643978,
   7.71860431, 11.30796156, 7.51879937, 9.69349058,
15.22763351,
   9.86282438, 13.54770668, 12.0519293, 8.51635754,
10.01110922,
   13.96406923, 10.35099925, 9.17449114, 13.06598803,
   11.940958 , 11.09800171, 12.64262738, 9.17196555,
12.14184668,
8.86549075, 12.32471479, 6.91419185, 6.5446013,
```

```
9.87679619,
   7.49979378, 10.76058357, 11.25199274, 9.86106422,
7.89388401,
8.37874926, 8.85212072, 7.35881066, 6.62699443,
11.2281232,
7.6803694, 8.94168637, 10.95538742, 10.53536396,
11.75822781,
8.6316109, 10.57898259, 9.72618332, 9.19702998,
7.05287605.
10.1853031, 8.93128132, 7.38872276, 10.65090156,
11.36569117,
12.41541576, 9.2367783, 11.11851486, 11.10208616,
9.68954224,
7.75166796, 9.05878184, 9.93400923, 11.07427757,
11.68715435.
   9.66808682, 11.04776757, 9.91355145, 7.53134185,
10.56537734,
   9.18490047, 11.15626926, 10.63660332, 8.73460768,
13.27876897.
11.56363276, 10.5354652, 7.63624197, 8.78808886,
7.84197225,
7.36098072, 9.92803929, 6.69636345, 7.68963635,
10.03629225,
   11.40370911, 10.62421834, 10.80896965, 10.65490043,
10.11986272,
11.69670119, 6.96258016, 6.20255724, 10.06623424,
10.72316963,
   8.99348206, 12.09107221, 11.97218142, 6.91257446,
13.19318951,
13.13463583, 9.28686352, 10.0689656, 11.91721126,
4.7631824,
13.51087731, 9.11531517, 12.81740474, 4.43780222,
7.16790279,
   5.00112592, 12.86453911, 11.10478879, 10.01843888,
6.1461971,
```

13.0028451, 10.79678097, 13.36006937, 9.94739918,

7.83117841,

11.18475737, 14.32890667, 13.39670664, 11.85487015, 9.33234782,

11.59427795, 10.15109076, 5.85820739, 9.30382537,

13.18305534,

11.11248639, 6.54275907, 15.29214822, 10.55212795,

12.32715875,

9.68922795, 12.94650132, 8.54586199, 9.15940396,

10.60976459,

8.3247563, 12.96480032, 13.40086387, 5.78719843,

11.3238015.

10.45312483, 13.37895337, 13.32003513, 10.36924346, 7.76356965,

9.17163962, 11.30404613, 7.95803521, 7.94620503, 7.83062425,

9.15279212, 10.82942256, 10.43350984, 12.06239446, 11.29198439,

13.86994304, 10.77448157, 10.84682398, 10.08766098,

6.68154558,

10.6373005, 11.04170201, 9.90525856, 11.29544118,

7.9058032,

9.35249912, 6.48343295, 11.56325071, 6.91258952,

12.63592168,

16.38940653, 10.70491488, 11.16838137, 9.10528211, 8.85104643,

10.23729585, 11.89814771, 8.71838891, 12.79383571,

6.44079822,

6.9707811, 11.43537137, 11.40028719, 10.7716477,

9.36116658,

10.94608619, 7.34322513, 11.8331405, 9.84685072,

12.11155414,

9.45815459, 7.11376981, 9.25863825, 8.65726028,

11.31982481.

6.07524434, 7.97503133, 7.30637776, 10.81806281,

9.20357185.

12.07204695, 9.61627488, 7.74887857, 12.442504,

7.58886688,

11.99380739, 10.24772157, 8.77839811, 11.45146639,

```
8.39899075,
10.11320108, 10.0245763, 11.41739069, 11.82376497,
11.96302391,
   7.97452309, 11.30414343, 9.44022391, 7.94857294,
10.97816286,
   7.89419368, 6.17345341, 8.4501155, 10.59587552,
8.85373305,
   8.87748269, 10.77863866, 8.61787217, 12.01199382,
12.42080795,
15.40130648, 9.86589674, 6.65727677, 8.57728889,
10.217948,
   5.90972332, 10.00264519, 10.41249197, 10.26984907,
9.21742817,
   10.37729794, 11.33307884, 11.55995441, 7.91042502,
9.15348908,
6.3819584, 7.61432151, 10.13642697, 10.19031162,
7.99443324,
8.0825615, 8.08070422, 6.47164249, 11.24267189,
11.84608469,
11.29310399, 6.89175627, 10.56923366, 11.09699615,
10.90404062.
11.99250267, 9.80642905, 7.76902873, 11.57262024,
10.6298646,
8.3825652, 12.26505129, 10.94913874, 15.33660141,
6.9182721,
8.66492578, 10.8733721, 10.93365862, 11.02661621,
11.16986407,
   10.96052154, 11.02382056, 10.97735488, 12.20802827,
7.8451432,
11.2313359, 13.01478444, 14.40754815, 9.06007376,
9.72137464.
8.56117855, 9.62320742, 11.06000929, 13.33161608,
10.43813182,
7.56920004, 8.35508948, 12.99272773, 14.37281313,
```

12.39452222, 10.47734612, 11.05119654, 6.71210553,

11.7633051,

11.12718781, 8.83418598, 8.29063699, 8.04954168, 11.53899331,

6.25774546,

8.35866575, 12.16360395, 10.08106856, 11.17571594,

11.91187196,

9.8289716, 9.93515592, 11.32459497, 8.75770579,

8.45203268,

7.01934846, 12.66381774, 9.28363872, 12.23227455,

11.57595187,

9.53096951, 7.73378041, 7.68983706, 7.91609618,

10.07741908,

12.02544182, 13.19229437, 13.75259075, 7.99893428, 8.30439167.

11.86533153, 11.86727546, 11.24065322, 11.73004046,

7.07480034,

10.10675942, 9.20759516, 11.05798055, 6.87157171,

14.43409935,

9.64182668, 9.38025051, 11.97495499, 7.08438188,

10.03435746,

10.04408419, 11.14318561, 13.05714042, 11.20794865, 7.56695973,

13.13045988, 10.55064571, 9.33754557, 11.98287976,

7.33022646,

7.8561511, 10.23271788, 9.97719298, 6.21740842,

10.22347911,

6.53635592, 10.74978627, 11.11174262, 13.3400204,

11.85700009,

9.18547194, 5.99196026, 10.11339035, 9.75578879,

7.01064331,

13.12775642, 9.44123659, 10.94166899, 8.30328587,

10.65615788,

12.3805864, 7.24653988, 12.02247978, 9.65949225,

10.5457433,

7.76029501, 13.44617552, 9.04120181, 13.93357462, 10.41136326,

11.25612879, 11.94969346, 12.15010205, 8.78209152,

```
10.17434646,
13.7477988, 6.32931606, 9.92530257, 10.65781341,
12.87900268,
   8.80958739, 12.53166118, 11.10652958, 14.65226729,
8.48241303,
10.61712776, 10.28878344, 10.15604084, 8.244834,
12.18860294.
6.930467, 8.91382648, 10.02706252, 10.47403862,
10.03477945,
11.02756519, 9.48187924, 10.64974581, 8.86664196,
10.7649816,
11.1032976, 13.51835898, 9.75094048, 8.02888855,
9.33012471,
   6.83033455, 10.94304311, 10.21005067, 11.19062782,
10.66915739,
   10.15175642, 10.24459739, 12.45319066, 8.72214027,
10.29686448.
   9.13018844, 12.27167032, 10.20668047, 12.00545148,
7.18755909,
9.0397991, 13.37428074, 8.10959737, 11.25904744,
9.94240709.
   11.62649409, 10.78812888, 10.01422036, 10.32715966,
9.29001675.
7.3266678, 7.75068445, 7.97596299, 12.15602707,
9.73032029,
7.05584208, 7.09625707, 8.11239959, 6.16027227,
12.66807021,
4.60567084, 9.343517, 10.06244919, 10.65287057,
12.03523628,
10.99342212, 9.09767521, 9.17552459, 4.36839568,
10.42384283,
10.60574791, 6.68956059, 15.80742279, 10.7951137,
8.08189712.
10.6926337, 12.21128071, 10.14654396, 9.41739236,
11.28195112,
6.93248938, 12.26885255, 8.39572045, 8.7406461,
```

12.69034168,

11.49318133, 12.25964808, 11.08014253, 14.37427062, 9.21617514,

9.96818875, 12.27758929, 11.28015796, 12.22329462, 12.77737085,

10.23352345, 16.08497568, 12.37872426, 12.14813951,

11.18622756,

10.23787776, 11.8158512, 9.82904188, 9.33779071,

6.3901006,

8.03757195, 11.94852768, 7.22909104, 10.18668172,

10.5022804,

9.72012851, 8.88451057, 8.92805863, 9.33431875,

14.39529363,

11.10718108, 12.2307042, 9.65006821, 9.36205093,

11.05877757,

10.69884279, 7.53724444, 11.50104215, 9.72891912,

7.35115781,

11.04419274, 11.79715097, 8.05207826, 11.06362993, 13.2671064,

10.64596476, 10.69952882, 9.24874574, 9.51034352,

11.2793115,

9.81975112, 7.81825267, 9.03856725, 11.76784756,

9.02808058,

15.44633968, 10.40604045, 12.57636427, 12.85224006,

11.09291857,

11.95890952, 7.83312891, 10.44266764, 7.79073352,

10.0046309,

11.02375359, 6.33725408, 13.11043708, 5.4294093,

10.04486242,

6.99905506, 10.67360861, 8.74171042, 10.84105225,

11.66436845,

7.20706858, 7.92164592, 7.68446934, 10.02502452,

10.23595405,

9.0013227, 10.68778694, 11.66251239, 14.44788625,

14.05511425,

11.94679343, 10.64891309, 7.9968667, 8.56823768,

```
6.00915406,
12.76016519, 9.50907796, 11.48713264, 10.5648931,
12.79860507,
   10.38920132, 15.85105763, 12.01034026, 8.57200724,
11.99949995,
8.82714977, 10.4553905, 9.13303597, 10.57447283,
8.86155487.
6.73062625, 8.07342506, 9.17215383, 13.2858116,
9.26436748,
8.18105105, 9.0107502, 6.26498889, 10.21779876,
11.0409425,
11.92544274, 9.33789576, 9.67647565, 11.77542023,
9.02666917,
   9.25561352, 11.57869119, 9.12013424, 8.20186749,
11.06676989,
12.7788211, 13.76491299, 10.94068, 8.75672159,
6.690432,
14.4956619, 12.06751912, 8.57345473, 11.64608222,
11.04176895,
   10.36441448, 10.56046046, 12.86718174, 9.99253427,
10.603819.
8.90708521, 7.08501527, 11.61623972, 6.20261783,
10.88939725,
   11.00938563, 11.41003739, 10.32121915, 6.34835823,
15.26133349,
   7.92926401, 9.85697784, 6.7916182, 7.80934371,
6.56335507,
5.92765412, 11.25343232, 8.01402096, 7.2498473,
10.40425517,
4.40903645, 7.614689, 12.13145246, 13.12946032,
11.86873141,
   7.16295937, 10.57670554, 6.98745094, 11.02971488,
11.86152536,
   12.25054238, 10.35007946, 11.36374006, 8.00953907,
12.26949318.
   11.05956441, 10.64906129, 10.20220601, 10.52735951,
8.51091687,
   12.11579486, 8.65857757, 8.0365289, 7.16009108,
```

```
8.59460134,
   11.23746879, 11.33333432, 10.92356515, 6.28305417,
12.07855713,
10.48508398, 7.72373265, 11.95374443, 13.60155892,
8.61754843,
   7.52310305, 10.27127525, 9.69304382, 10.61604583,
11.67588014,
7.67551672, 9.50184394, 10.77950122, 6.71044345,
10.68353891,
   7.58866907, 10.14479145, 11.15488106, 9.87437438,
7.86423978,
9.49931356, 5.6554684, 7.03718954, 11.54741398,
7.1869371,
   10.71132375, 11.49623964, 7.84589086, 6.44741686,
11.5387835.
10.95640556, 11.7450581, 11.61736114, 12.42439193,
10.51406192,
   9.21374258, 14.28205012, 8.02749499, 11.10564932,
6.10609667,
10.352845, 11.06878526, 10.66838316, 12.01038164,
11.34981665.
10.47836566, 5.87230133, 12.69151735, 9.15469969,
11.21324205,
11.03403314, 7.69318537, 10.29300193, 8.17806607,
4.43535199,
   9.82008619, 11.24436145, 12.12476841, 7.66668345,
11.36774655,
   13.16987311, 7.09171718,
9.83090434,
   11.59774925, 7.85011687,
12.13273433.
   10.0800497, 6.25534426,
7.28333626,
8.51840563, 14.70366035,
8.52249436, 7.49062757,
10.7752602, 9.29336829,
```

11.00926295, 15.00915824, 7.80843969, 12.03795447,

```
10.16456012,
7.38610632, 6.67694658, 6.76395885, 6.00137317,
10.07374731,
8.40384552, 9.90397019, 13.25680879, 10.10226594,
10.79620112,
   8.47371473, 12.27215101, 11.37223303, 9.24073609,
9.26123534,
7.30210992, 8.18668614, 10.01057952, 8.16795417,
10.85423587.
   7.67387938, 10.27239999, 11.84077286, 8.26251054,
11.87670125,
15.55387759, 8.61521603, 11.54492611, 8.36432299,
6.61923449,
   8.89563542, 13.16830017, 11.16941883, 9.72452574,
13.57075134,
   10.31189721])
rg.coef_
array([-0.35348315, -0.6483044, 0.30214801, 1.01384178, 0.86876941,
   -1.37261901, -0.17689802, 1.75483723])
metrics.r2_score(y_test,rg_pred)
0.45466391197604406
np.sqrt(mean_squared_error(y_test,rg_pred))
2.4043343069157084
```