

Project name :Retail Store Stock Inventory Analytics

1.Loading Datasets into tools

In [1]:

```
from google.colab import files
uploaded = files.upload()
```

Upload widget is only available when the cell has been executed in the current browser session.
Please rerun this cell to enable.

Saving abalone.csv to abalone.csv

In [2]:

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import warnings
warnings.filterwarnings('ignore')
```

In [4]:

```
data = pd.read_csv("abalone.csv")
```

2.Performing Visualization

Univariate Analysis

In [5]:

```
data.head()
```

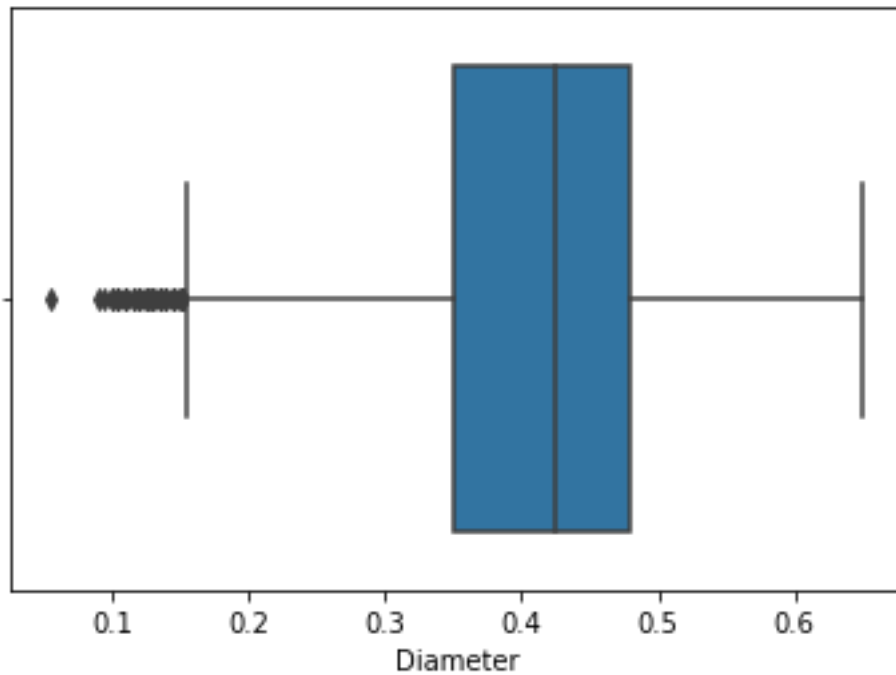
Out[5]:

	Sex	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight	Rings
0	M	0.455	0.365	0.095	0.5140	0.2245	0.1010	0.150	15
1	M	0.350	0.265	0.090	0.2255	0.0995	0.0485	0.070	7
2	F	0.530	0.420	0.135	0.6770	0.2565	0.1415	0.210	9
3	M	0.440	0.365	0.125	0.5160	0.2155	0.1140	0.155	10
4	I	0.330	0.255	0.080	0.2050	0.0895	0.0395	0.055	7

In [6]:

```
sns.boxplot(data['Diameter'])
```

Out[6]:

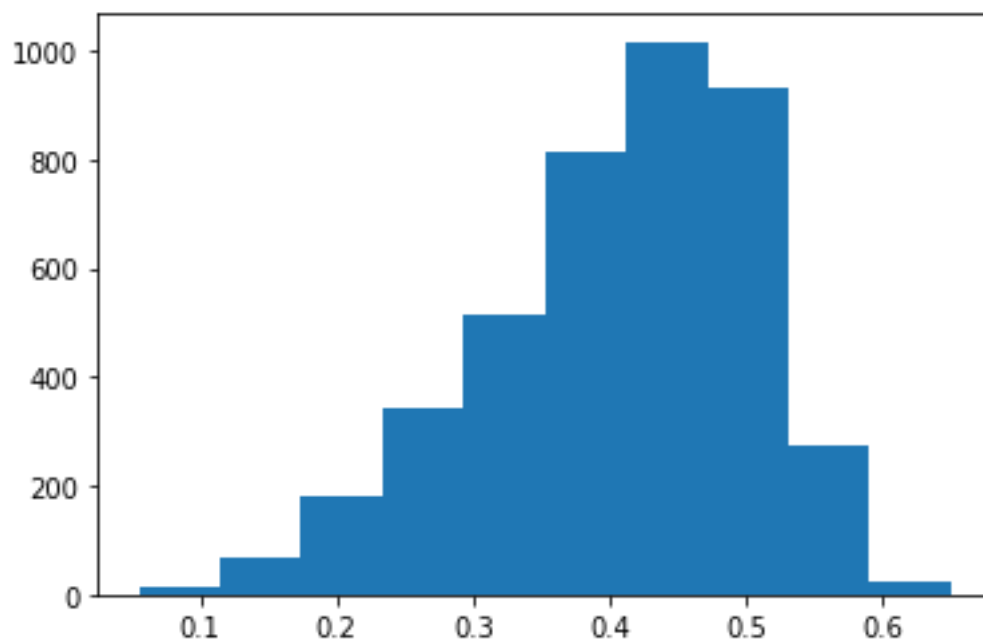


In [7]:

```
plt.hist(data['Diameter'])
```

Out[7]:

```
(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  ]),
)
```

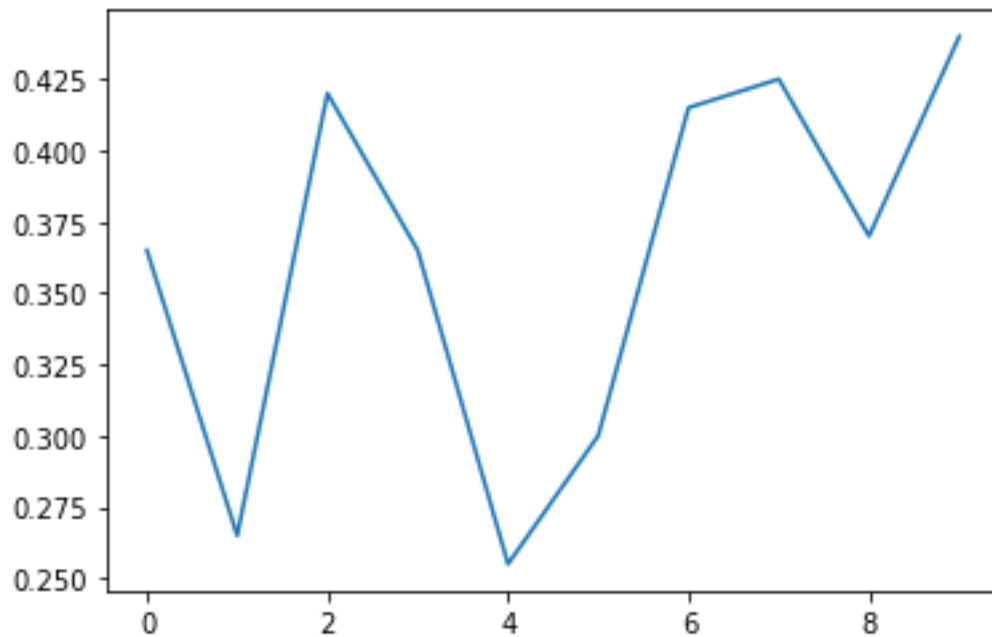


In [8]:

```
plt.plot(data['Diameter'].head(10))
```

Out[8]:

[]

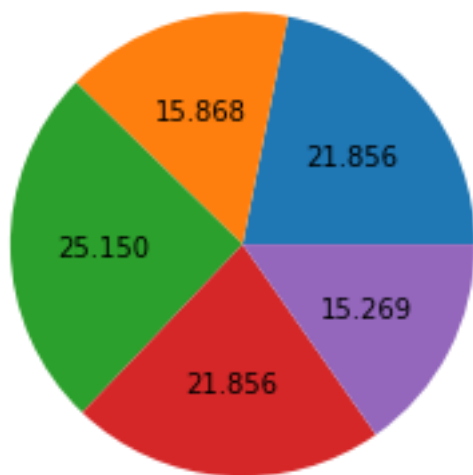


In [9]:

```
plt.pie(data['Diameter'].head(), autopct='%.3f')
```

Out[9]:

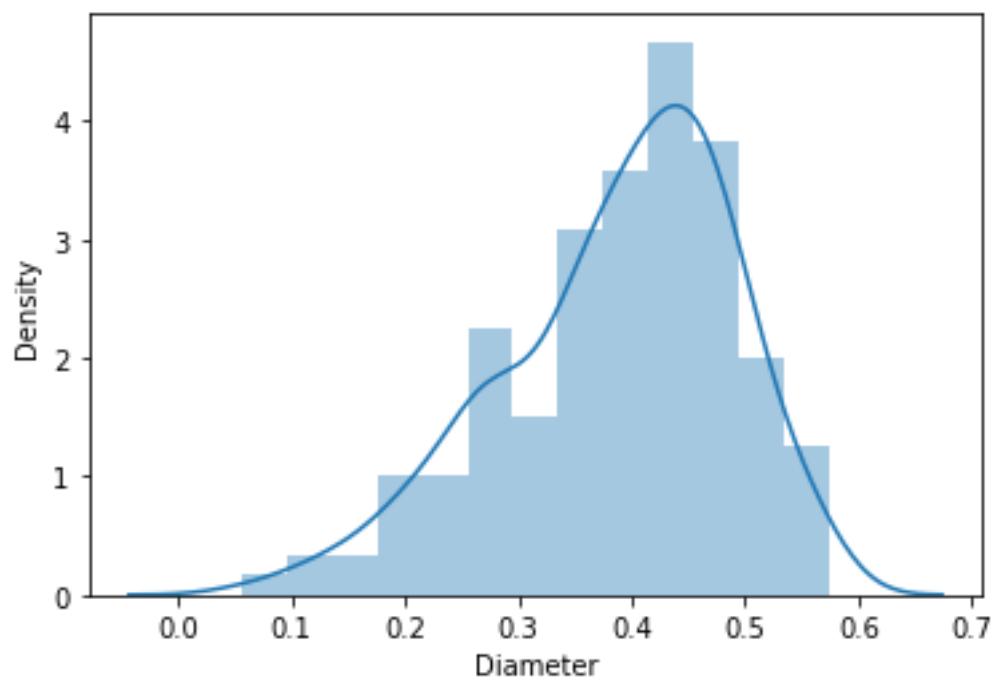
```
([,  
,  
,  
,  
,  
],  
[Text(0.8507215626110557, 0.6973326486753676, ''),  
Text(-0.32611344931648134, 1.0505474849691026, ''),  
Text(-1.0998053664078908, -0.02069193128747144, ''),  
Text(-0.08269436219656089, -1.096887251480709, ''),  
Text(0.9758446362287218, -0.5076684409569241, '')],  
[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))
```

In [10]:

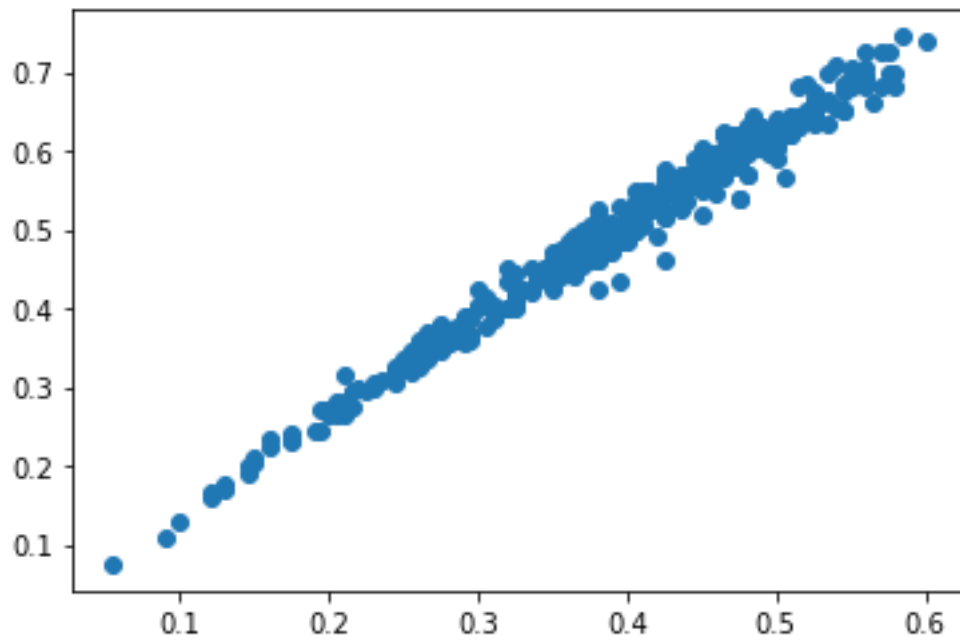
Out[10]:



```
plt.scatter(data['Diameter'].head(400), data['Length'].head(400))
```

In [11]:

Out[11]:

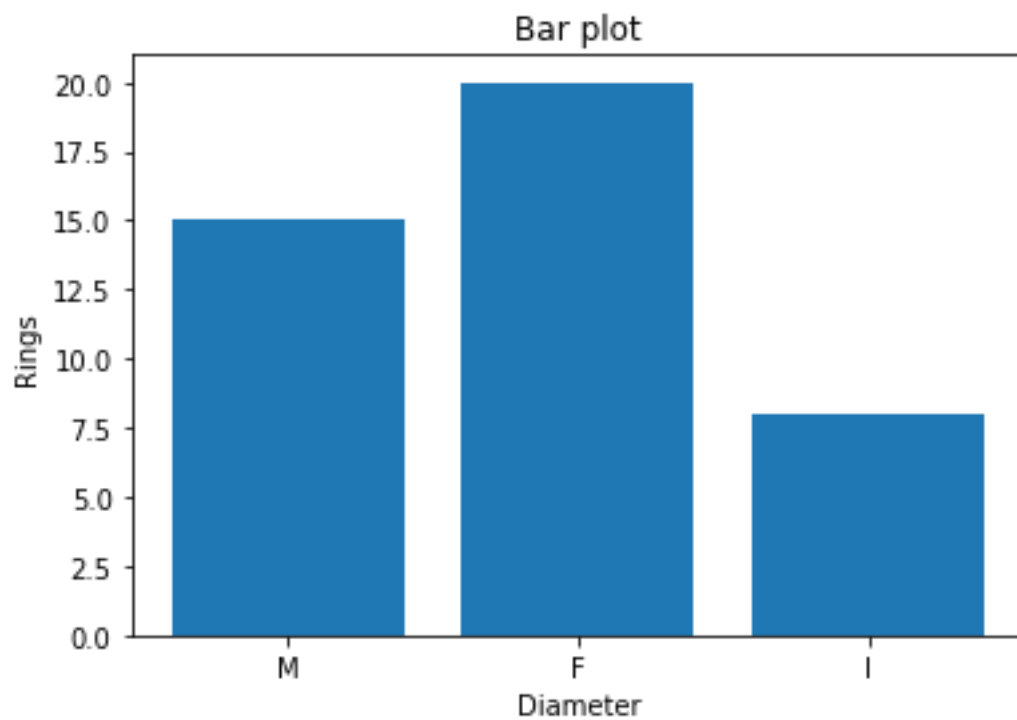


In [12]:

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

Out[12]:

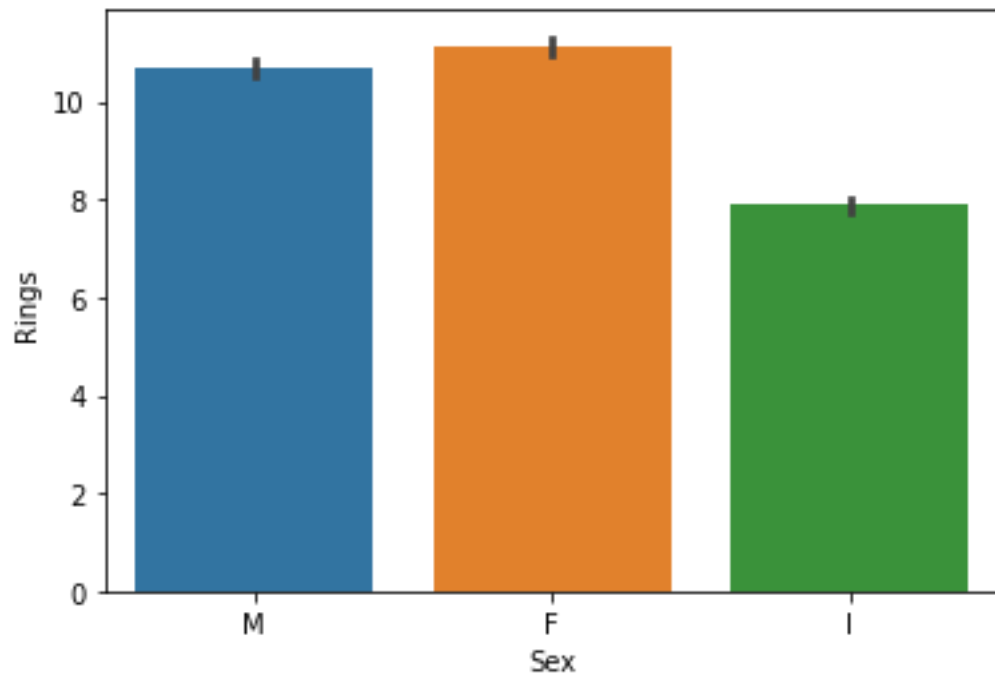
```
Text(0, 0.5, 'Rings')
```



In [13]:

```
sns.barplot(data['Sex'], data['Rings'])
```

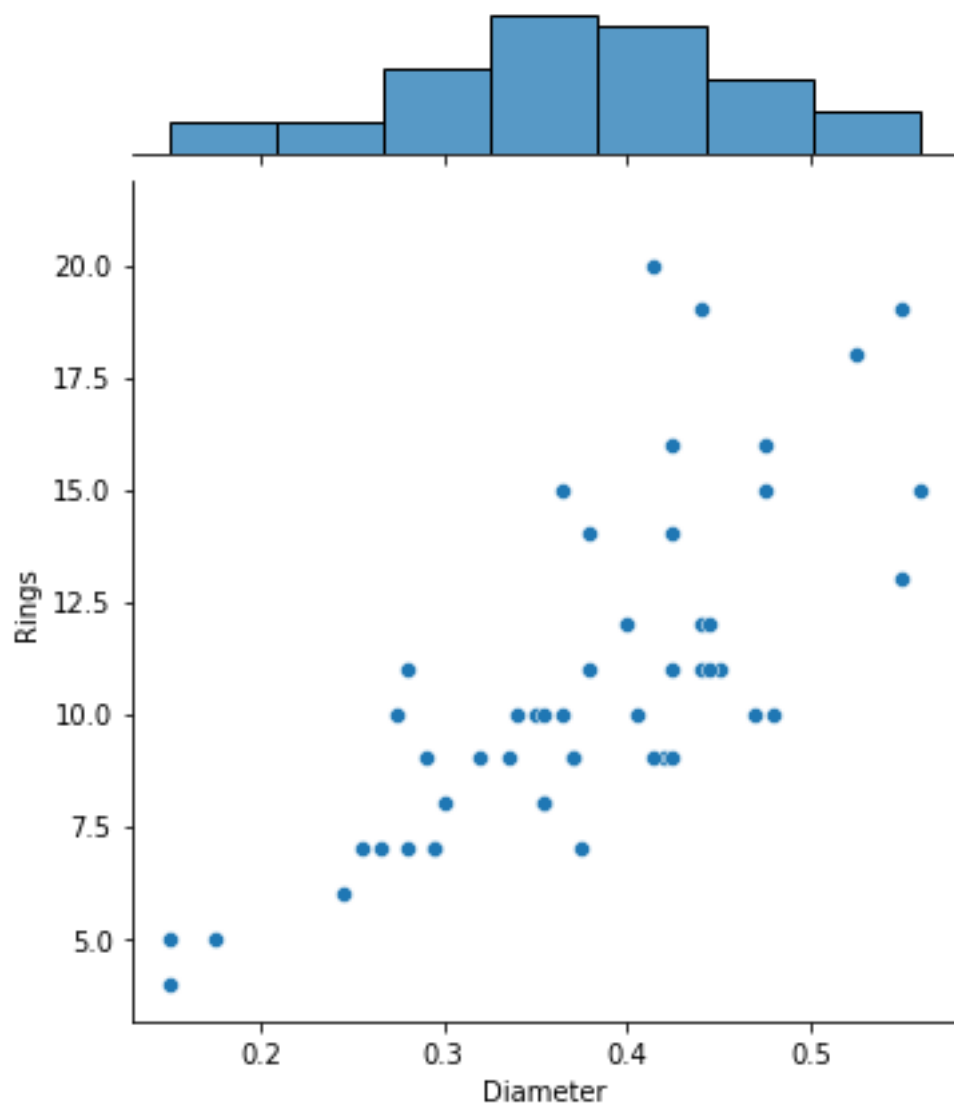
Out[13]:



```
sns.jointplot(data['Diameter'].head(50),data['Rings'].head(100))
```

In [14]:

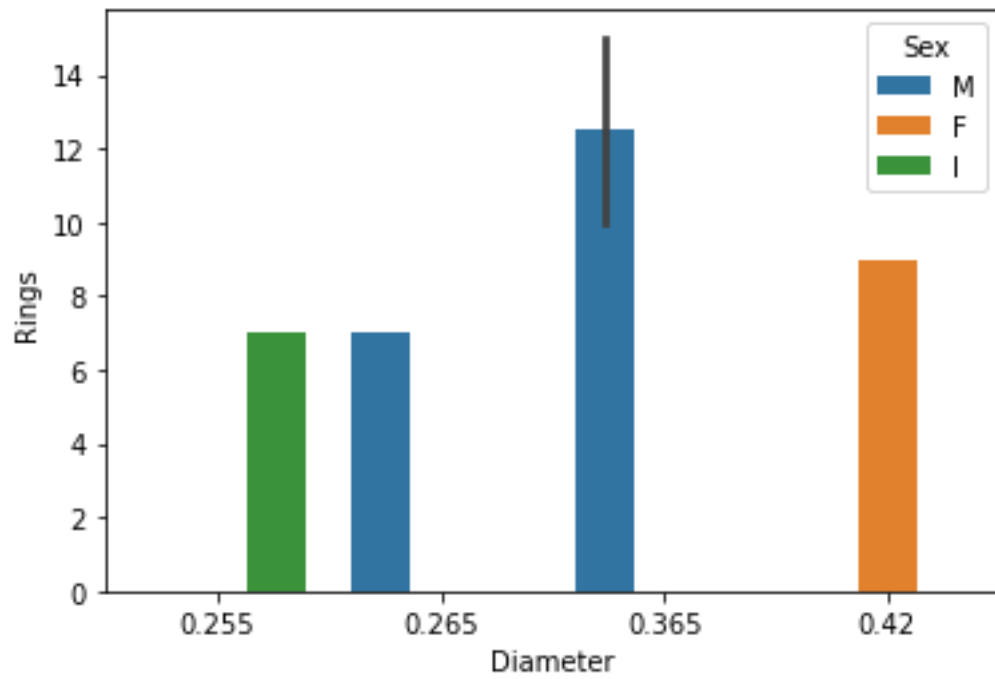
Out[14]:



```
sns.barplot('Diameter','Rings',hue='Sex',data=data.head())
```

In [15]:

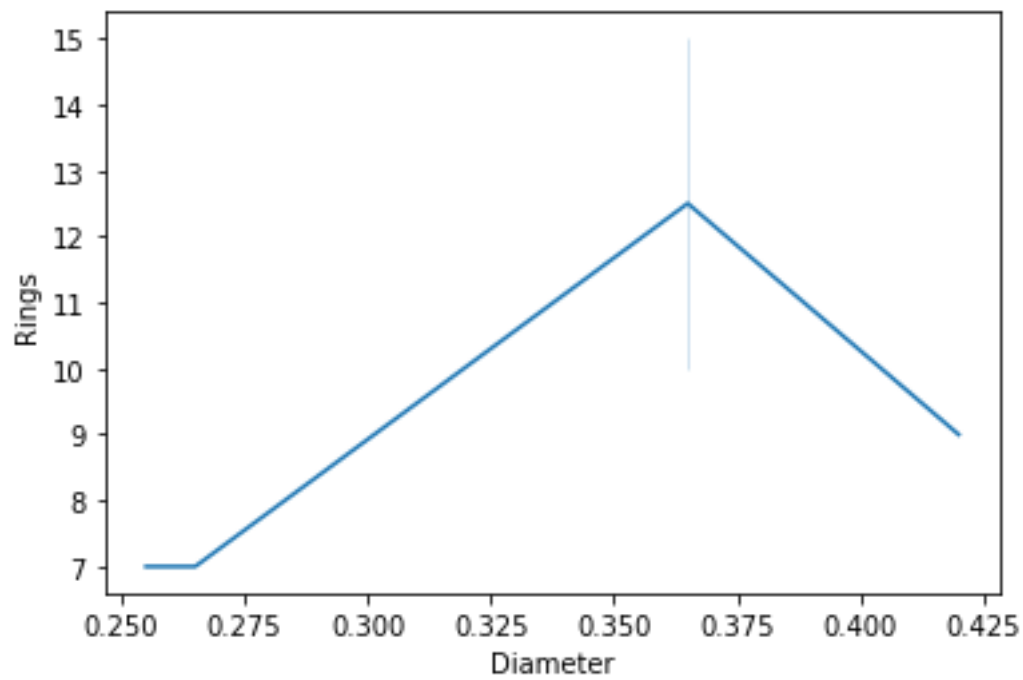
Out[15]:



```
sns.lineplot(data['Diameter'].head(),data['Rings'].head())
```

In [17]:

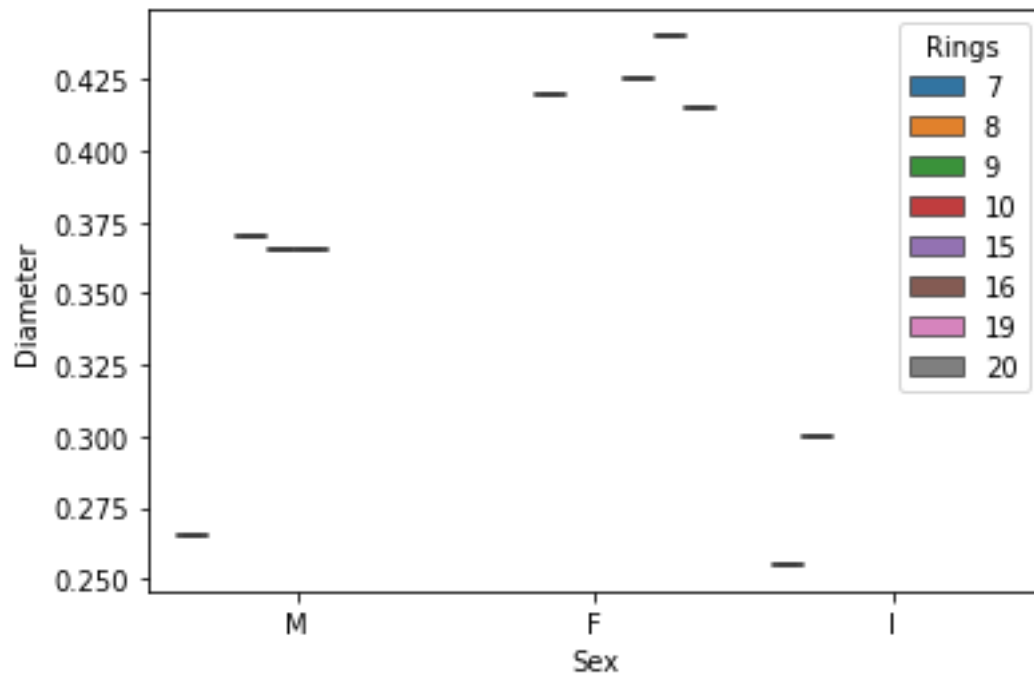
Out[17]:



```
sns.boxplot(data['Sex'].head(10),data['Diameter'].head(10),data['Rings'].head(10))
```

In [16]:

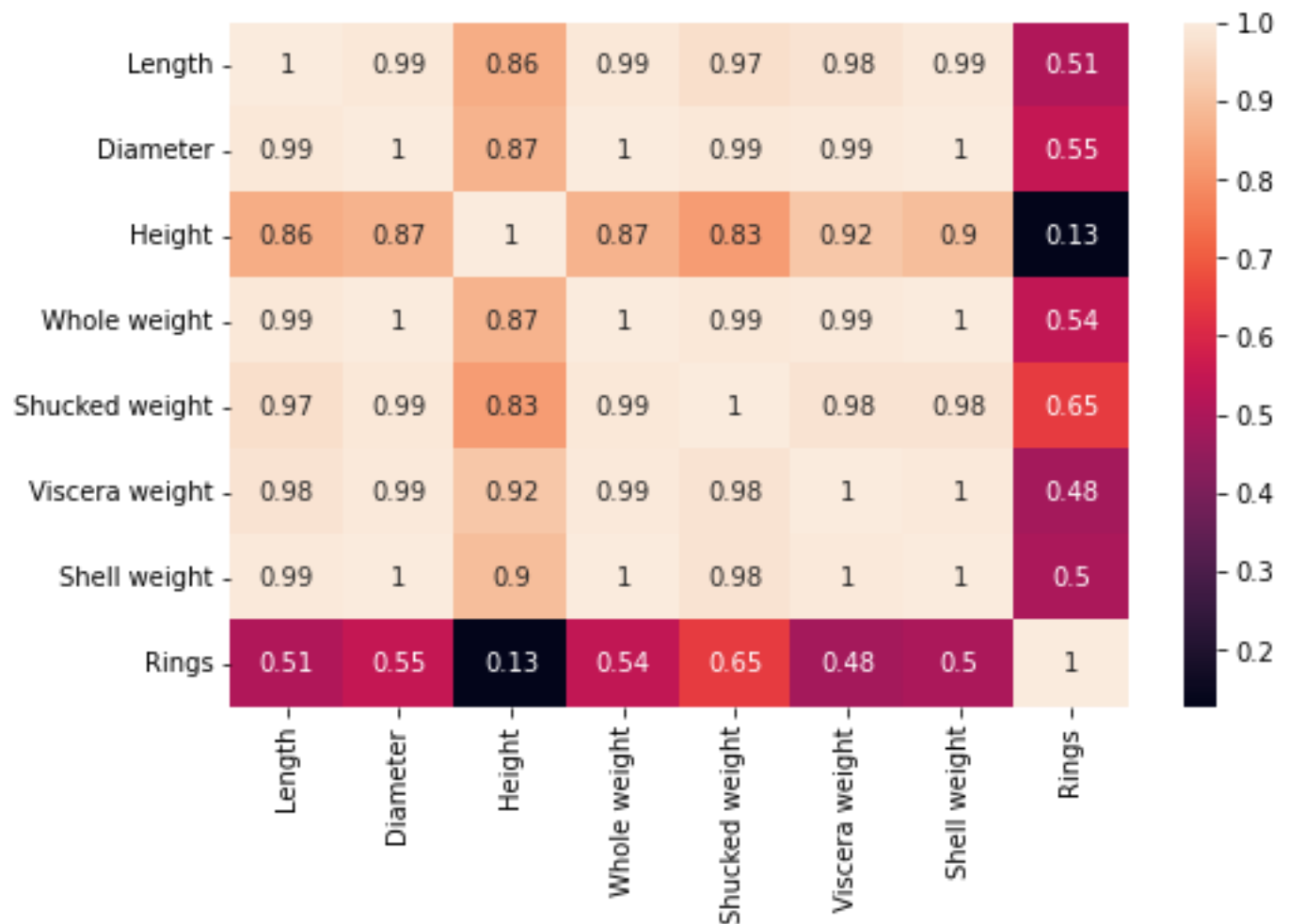
Out[16]:



In [18]:

```
fig=plt.figure(figsize=(8,5))
sns.heatmap(data.head().corr(),annot=True)
```

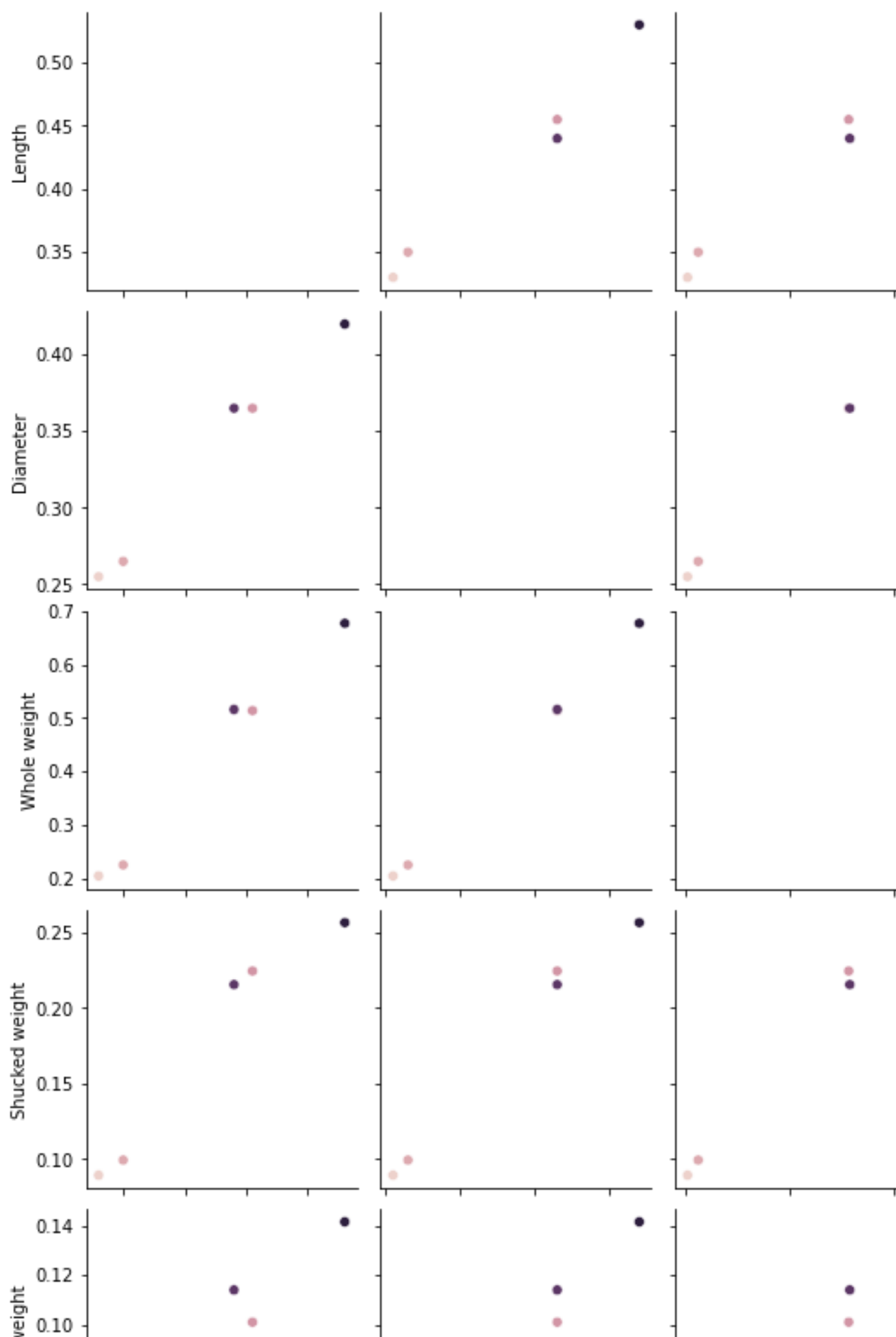
Out[18]:



```
sns.pairplot(data.head(), hue='Height')
```

In [21]:

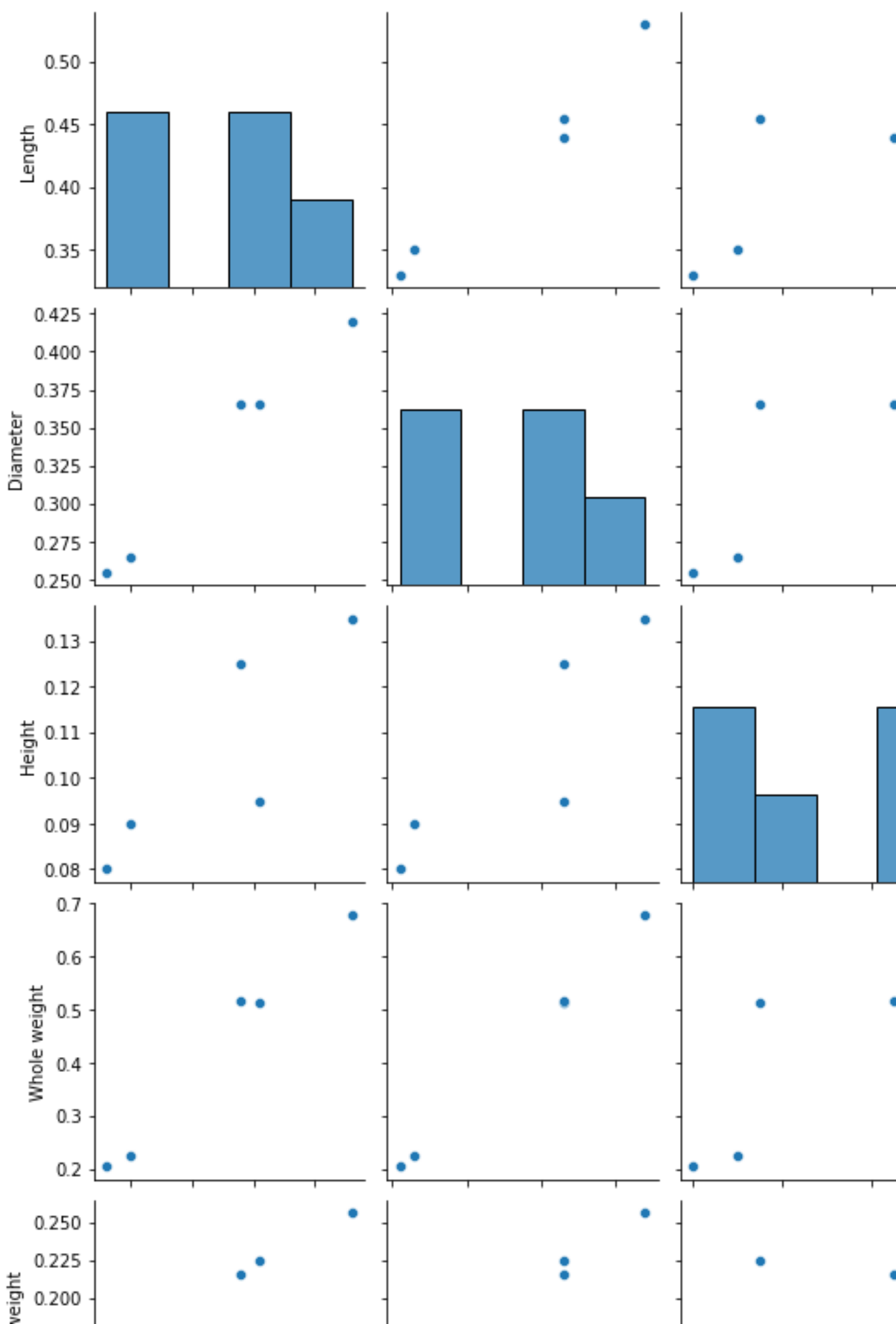
Out[21]:



```
sns.pairplot(data.head())
```

In [19]:

Out[19]:



3.Perform Descriptive Statistics on the dataset

In [22]:

```
data.head()
```

Out[22]:

	Sex	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight	Rings
0	M	0.455	0.365	0.095	0.5140	0.2245	0.1010	0.150	15
1	M	0.350	0.265	0.090	0.2255	0.0995	0.0485	0.070	7
2	F	0.530	0.420	0.135	0.6770	0.2565	0.1415	0.210	9
3	M	0.440	0.365	0.125	0.5160	0.2155	0.1140	0.155	10
4	I	0.330	0.255	0.080	0.2050	0.0895	0.0395	0.055	7

In [23]:

```
data.tail()
```

Out[23]:

	Sex	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight	Rings
4172	F	0.565	0.450	0.165	0.8870	0.3700	0.2390	0.2490	11
4173	M	0.590	0.440	0.135	0.9660	0.4390	0.2145	0.2605	10
4174	M	0.600	0.475	0.205	1.1760	0.5255	0.2875	0.3080	9
4175	F	0.625	0.485	0.150	1.0945	0.5310	0.2610	0.2960	10
4176	M	0.710	0.555	0.195	1.9485	0.9455	0.3765	0.4950	12

In [24]:

```
data.info()
```

```
RangeIndex: 4177 entries, 0 to 4176
```

```
Data columns (total 9 columns):
```

#	Column	Non-Null Count	Dtype
0	Sex	4177 non-null	object
1	Length	4177 non-null	float64
2	Diameter	4177 non-null	float64
3	Height	4177 non-null	float64
4	Whole weight	4177 non-null	float64
5	Shucked weight	4177 non-null	float64

```
6  Viscera weight  4177 non-null  float64
7  Shell weight   4177 non-null  float64
8  Rings          4177 non-null  int64
dtypes: float64(7), int64(1), object(1)
memory usage: 293.8+ KB
```

In [25]:

```
data.describe()
```

Out[25]:

	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight	Rings
count	4177.000000	4177.000000	4177.000000	4177.000000	4177.000000	4177.000000	4177.000000	4177.000000
mean	0.523992	0.407881	0.139516	0.828742	0.359367	0.180594	0.238831	9.933684
std	0.120093	0.099240	0.041827	0.490389	0.221963	0.109614	0.139203	3.224169
min	0.075000	0.055000	0.000000	0.002000	0.001000	0.000500	0.001500	1.000000
25%	0.450000	0.350000	0.115000	0.441500	0.186000	0.093500	0.130000	8.000000
50%	0.545000	0.425000	0.140000	0.799500	0.336000	0.171000	0.234000	9.000000
75%	0.615000	0.480000	0.165000	1.153000	0.502000	0.253000	0.329000	11.000000
max	0.815000	0.650000	1.130000	2.825500	1.488000	0.760000	1.005000	29.000000

In [27]:

```
data.mode().T
```

Out[27]:

	0	1
Sex	M	NaN
Length	0.55	0.625
Diameter	0.45	NaN
Height	0.15	NaN
Whole weight	0.2225	NaN

	0	1
Shucked weight	0.175	NaN
Viscera weight	0.1715	NaN
Shell weight	0.275	NaN
Rings	9.0	NaN

```
data.shape
```

In [26]:

```
(4177, 9)
```

Out[26]:

```
data.kurt()
```

In [28]:

Out[28]:

```
Length          0.064621
Diameter        -0.045476
Height          76.025509
Whole weight    -0.023644
Shucked weight  0.595124
Viscera weight  0.084012
Shell weight    0.531926
Rings           2.330687
dtype: float64
```

```
data.skew()
```

In [29]:

Out[29]:

```
Length          -0.639873
Diameter        -0.609198
Height           3.128817
Whole weight     0.530959
Shucked weight  0.719098
Viscera weight   0.591852
Shell weight     0.620927
Rings            1.114102
dtype: float64
```

```
data.var()
```

In [30]:

Out[30]:

```
Length          0.014422
Diameter         0.009849
Height           0.001750
Whole weight     0.240481
Shucked weight  0.049268
Viscera weight   0.012015
Shell weight     0.019377
Rings            10.395266
dtype: float64
```


In [31]:

```
data.nunique()
```

Out[31]:

```
Sex          3
Length      134
Diameter    111
Height      51
Whole weight 2429
Shucked weight 1515
Viscera weight 880
Shell weight 926
Rings       28
dtype: int64
```

4.Check for missing values and deal with them

In [32]:

```
data.isna()
```

Out[32]:

	Sex	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight	Rings
0	False	False	False	False	False	False	False	False	False
1	False	False	False	False	False	False	False	False	False
2	False	False	False	False	False	False	False	False	False
3	False	False	False	False	False	False	False	False	False
4	False	False	False	False	False	False	False	False	False
...
4172	False	False	False	False	False	False	False	False	False
4173	False	False	False	False	False	False	False	False	False
4174	False	False	False	False	False	False	False	False	False
4175	False	False	False	False	False	False	False	False	False
4176	False	False	False	False	False	False	False	False	False

4177 rows × 9 columns

In [33]:

```
data.isna().any()
```

Out[33]:

```
Sex           False
Length        False
Diameter       False
Height         False
Whole weight   False
Shucked weight False
Viscera weight False
Shell weight   False
Rings          False
dtype: bool
```

In [34]:

```
data.isna().sum()
```

Out[34]:

```
Sex           0
Length         0
Diameter        0
Height          0
Whole weight    0
Shucked weight  0
Viscera weight  0
Shell weight    0
Rings           0
dtype: int64
```

In [36]:

```
data.isna().any().sum()
```

Out[36]:

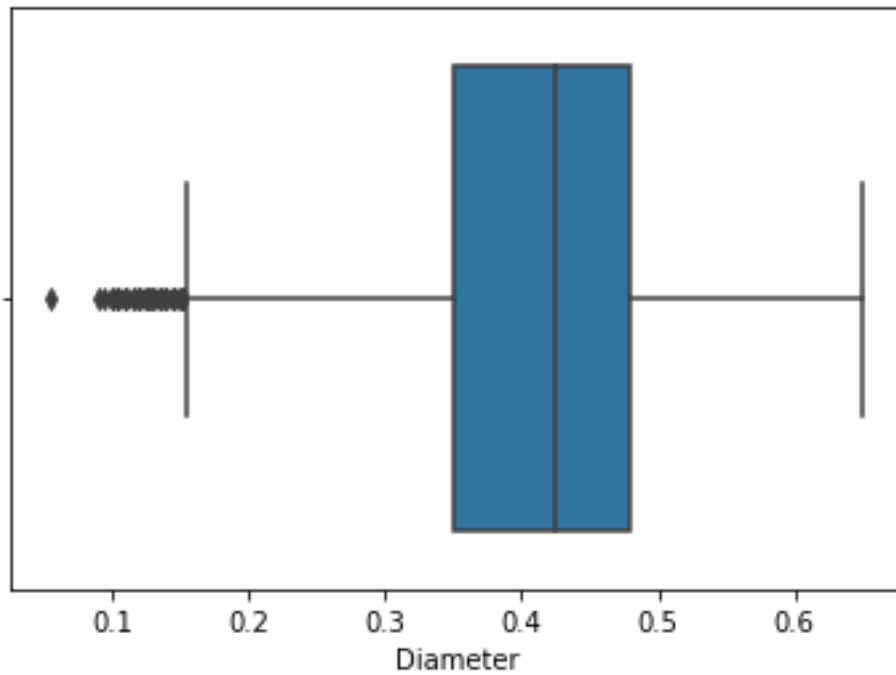
```
0
```

5. Find the outliers and replace them outliers

In [37]:

```
sns.boxplot(data['Diameter'])
```

Out[37]:



In [38]:

```
quant=data.quantile(q=[0.25,0.75])
quant
```

Out[38]:

	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight	Rings
0.25	0.450	0.35	0.115	0.4415	0.186	0.0935	0.130	8.0
0.75	0.615	0.48	0.165	1.1530	0.502	0.2530	0.329	11.0

In [40]:

```
iqr=quant.loc[0.75]-quant.loc[0.25]
iqr
```

Out[40]:

```
Length          0.1650
Diameter        0.1300
Height          0.0500
Whole weight    0.7115
Shucked weight  0.3160
Viscera weight  0.1595
Shell weight    0.1990
Rings           3.0000
dtype: float64
```

In [41]:

```
low=quant.loc[0.25]-(1.5*iqr)
low
```

Out[41]:

```
Length          0.20250
Diameter        0.15500
Height          0.04000
```

```
Whole weight      -0.62575
Shucked weight    -0.28800
Viscera weight    -0.14575
Shell weight      -0.16850
Rings              3.50000
dtype: float64
```

In [42]:

```
up=quant.loc[0.75]+(1.5*iqr)
up
```

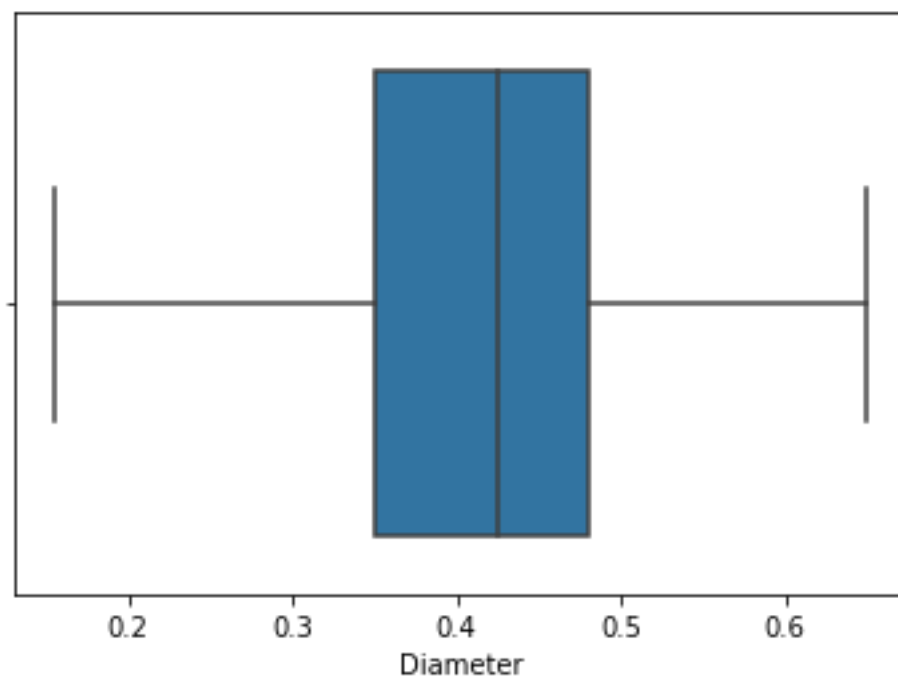
Out[42]:

```
Length            0.86250
Diameter           0.67500
Height            0.24000
Whole weight       2.22025
Shucked weight     0.97600
Viscera weight     0.49225
Shell weight       0.62750
Rings              15.50000
dtype: float64
```

In [43]:

```
data['Diameter']=np.where(data['Diameter']<0.155,0.4078,data['Diameter'])
sns.boxplot(data['Diameter'])
```

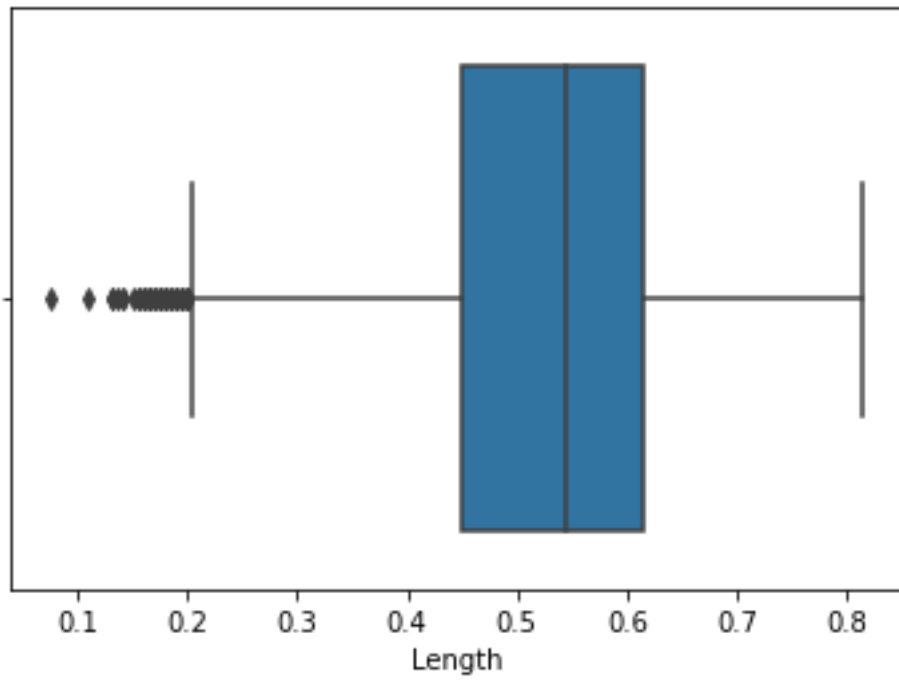
Out[43]:



In [44]:

```
sns.boxplot(data['Length'])
```

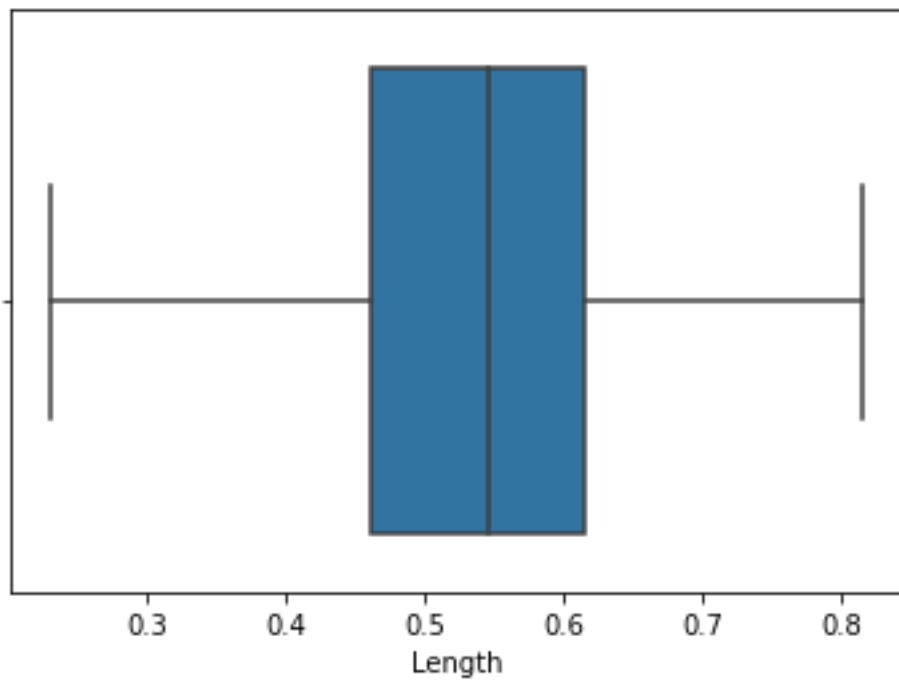
Out[44]:



```
data['Length']=np.where(data['Length']<0.23,0.52, data['Length'])
sns.boxplot(data['Length'])
```

In [45]:

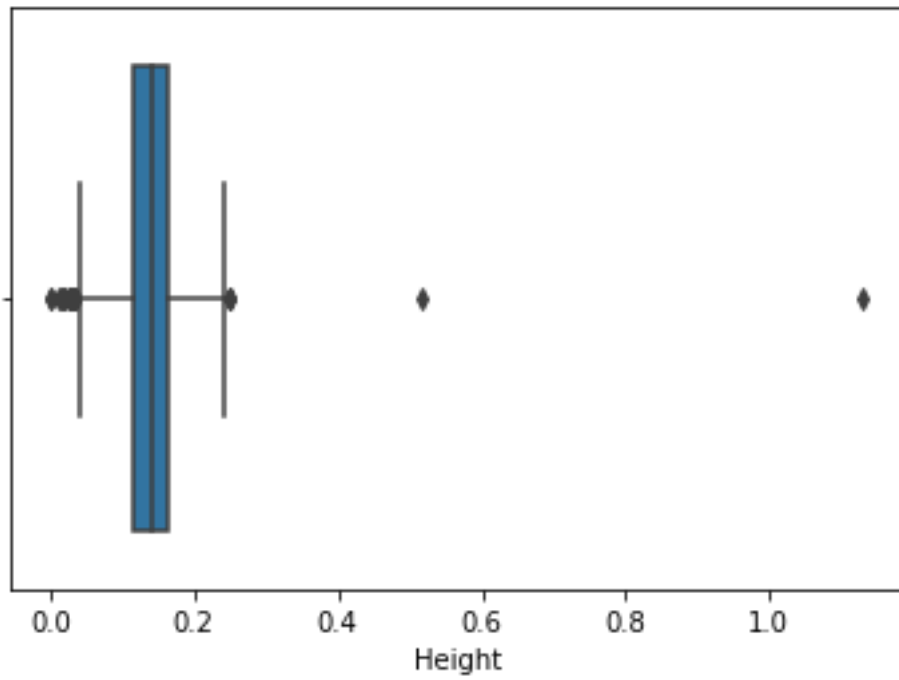
Out[45]:



```
sns.boxplot(data['Height'])
```

In [46]:

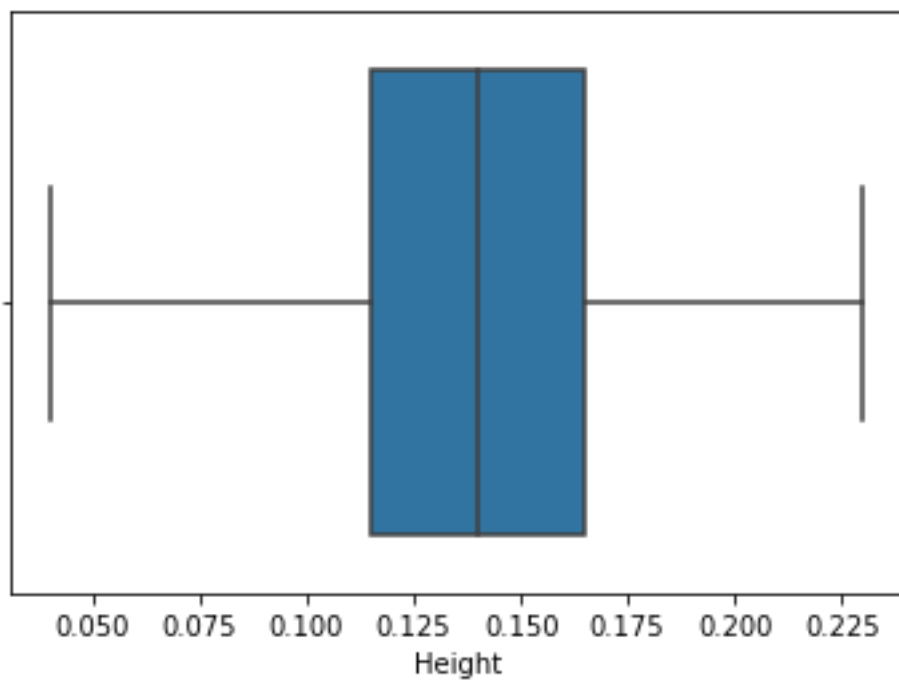
Out[46]:



In [47]:

```
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'])
```

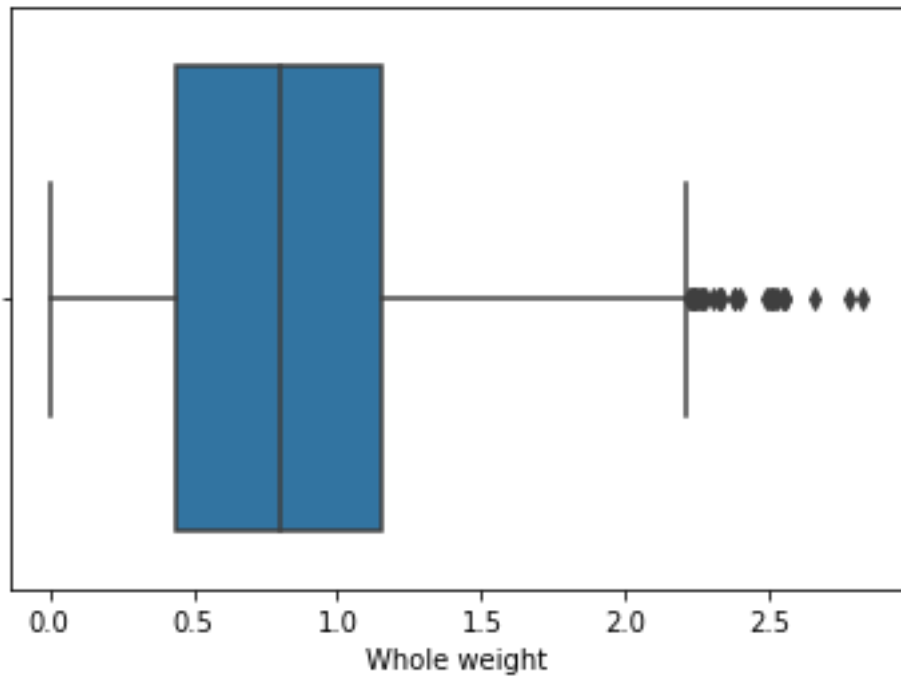
Out[47]:



In [48]:

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

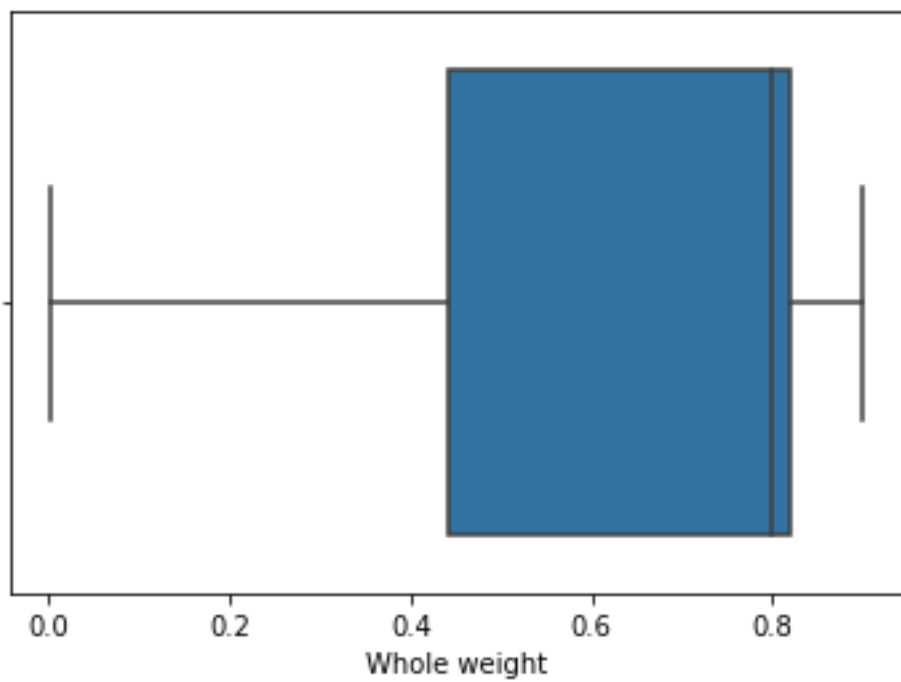
Out[48]:



In [49]:

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

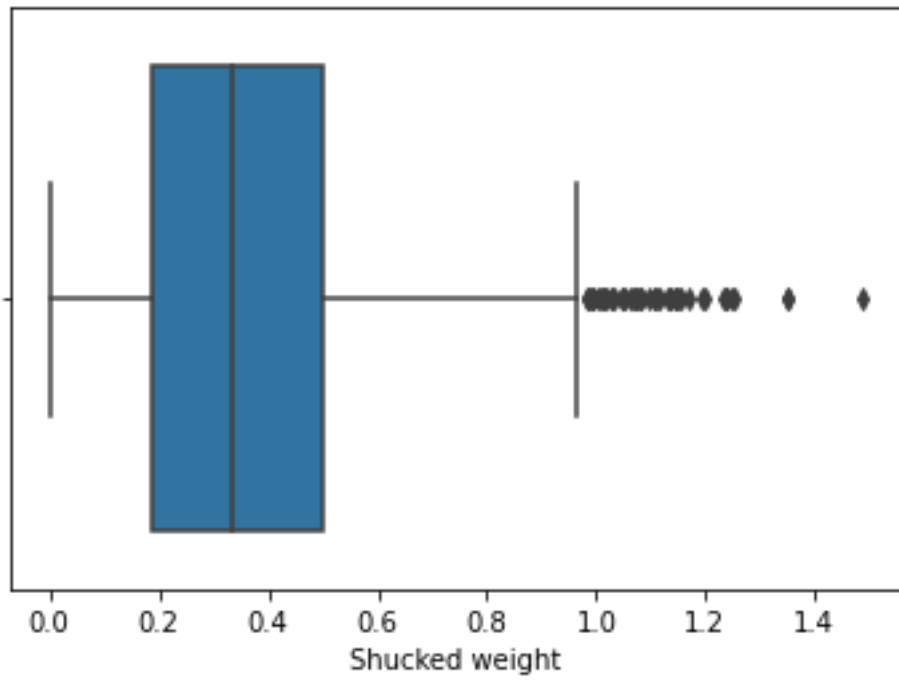
Out[49]:



In [50]:

```
sns.boxplot(data['Shucked weight'])
```

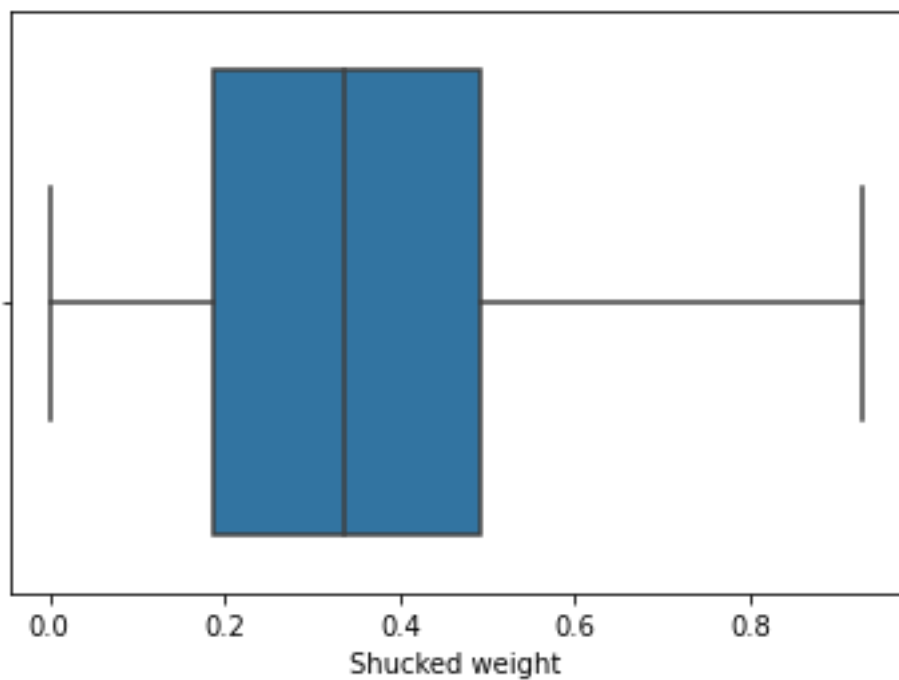
Out[50]:



In [51]:

```
data['Shucked weight']=np.where(data['Shucked weight']>0.93,0.35,
data['Shucked weight'])
sns.boxplot(data['Shucked weight'])
```

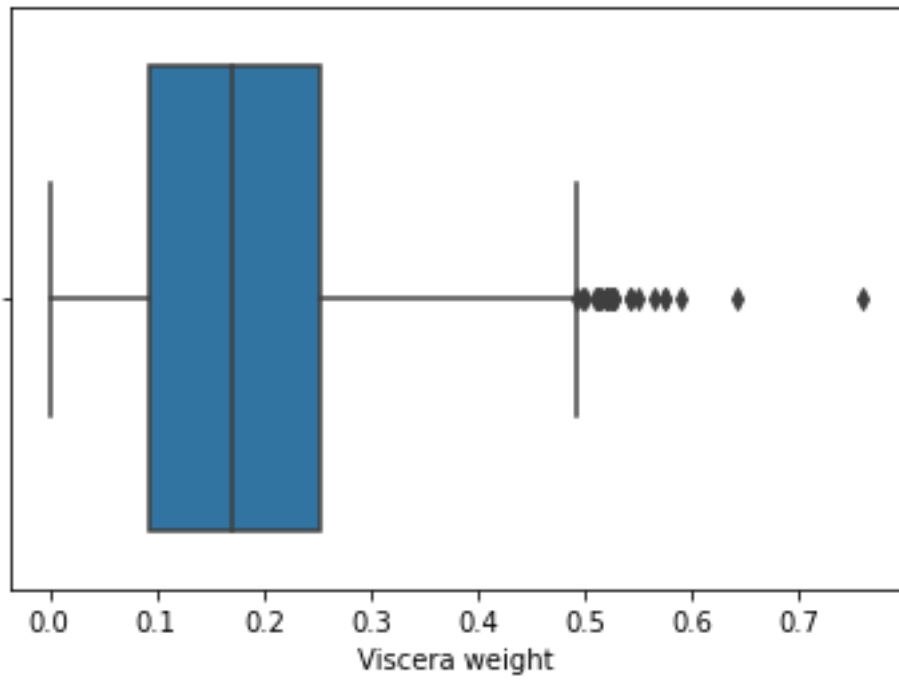
Out[51]:



In [52]:

```
sns.boxplot(data['Viscera weight'])
```

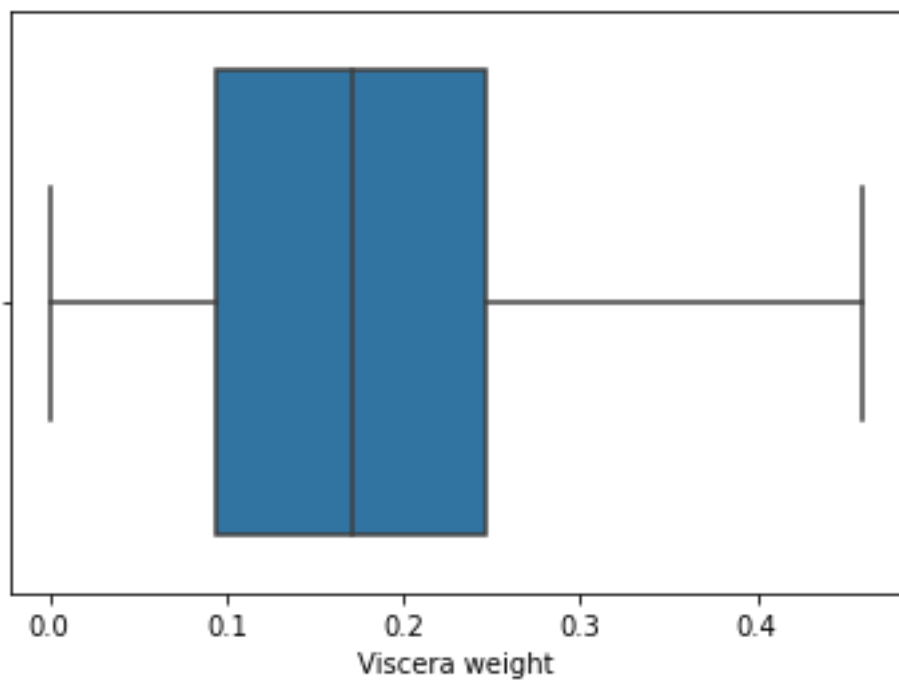
Out[52]:



In [53]:

```
data['Viscera weight']=np.where(data['Viscera weight']>0.46,0.18,
data['Viscera weight'])
sns.boxplot(data['Viscera weight'])
```

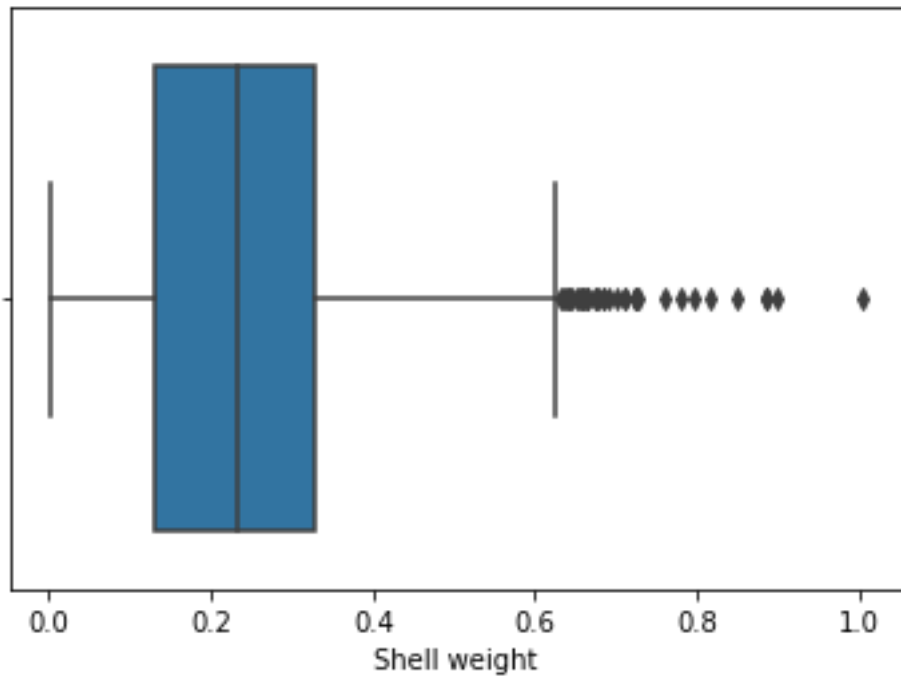
Out[53]:



In [54]:

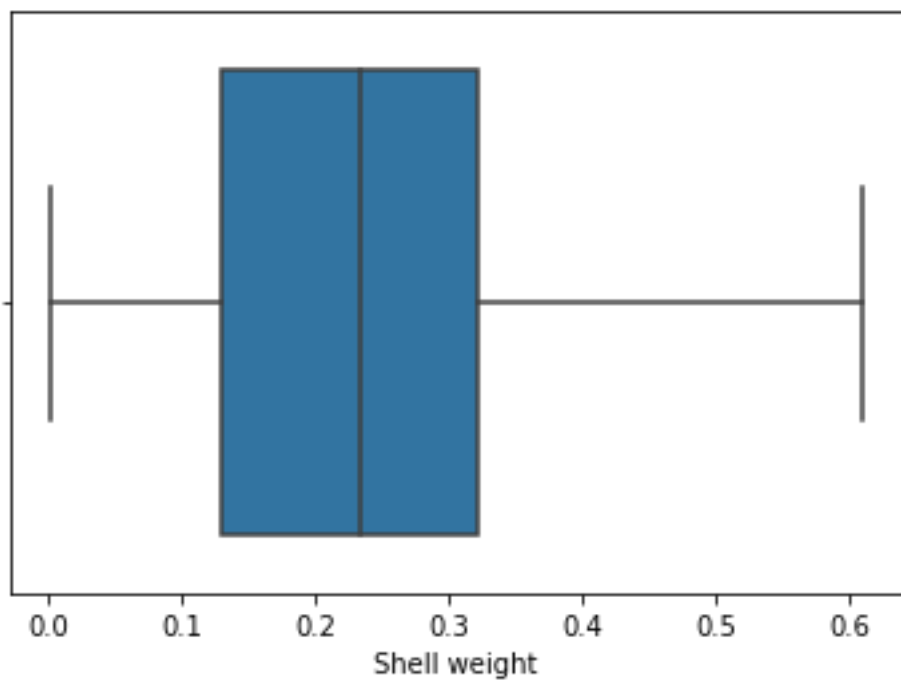
```
sns.boxplot(data['Shell weight'])
```

Out[54]:



In [55]:
`data['Shell weight']=np.where(data['Shell weight']>0.61,0.2388, data['Shell weight'])`
`sns.boxplot(data['Shell weight'])`

Out[55]:



6.Check for Categorical columns and perform encoding.

In [56]:
`data['Sex'].replace({'M':1, 'F':0, 'I':2},inplace=True)`
`data`

Out[56]:

Out[56]:

	Sex	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight	Rings
0	1	0.455	0.365	0.095	0.5140	0.2245	0.1010	0.1500	15
1	1	0.350	0.265	0.090	0.2255	0.0995	0.0485	0.0700	7
2	0	0.530	0.420	0.135	0.6770	0.2565	0.1415	0.2100	9
3	1	0.440	0.365	0.125	0.5160	0.2155	0.1140	0.1550	10
4	2	0.330	0.255	0.080	0.2050	0.0895	0.0395	0.0550	7
...
4172	0	0.565	0.450	0.165	0.8870	0.3700	0.2390	0.2490	11
4173	1	0.590	0.440	0.135	0.8200	0.4390	0.2145	0.2605	10
4174	1	0.600	0.475	0.205	0.8200	0.5255	0.2875	0.3080	9
4175	0	0.625	0.485	0.150	0.8200	0.5310	0.2610	0.2960	10
4176	1	0.710	0.555	0.195	0.8200	0.3500	0.3765	0.4950	12

4177 rows × 9 columns

7.Split the data into dependent and independent variables.

In [57]:

```
x=data.drop(columns= ['Rings'])
y=data['Rings']
x
```

Out[57]:

	Sex	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight
0	1	0.455	0.365	0.095	0.5140	0.2245	0.1010	0.1500
1	1	0.350	0.265	0.090	0.2255	0.0995	0.0485	0.0700
2	0	0.530	0.420	0.135	0.6770	0.2565	0.1415	0.2100

	Sex	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight
3	1	0.440	0.365	0.125	0.5160	0.2155	0.1140	0.1550
4	2	0.330	0.255	0.080	0.2050	0.0895	0.0395	0.0550
...
4172	0	0.565	0.450	0.165	0.8870	0.3700	0.2390	0.2490
4173	1	0.590	0.440	0.135	0.8200	0.4390	0.2145	0.2605
4174	1	0.600	0.475	0.205	0.8200	0.5255	0.2875	0.3080
4175	0	0.625	0.485	0.150	0.8200	0.5310	0.2610	0.2960
4176	1	0.710	0.555	0.195	0.8200	0.3500	0.3765	0.4950

4177 rows × 8 columns

In [58]:

y

Out[58]:

```
0      15
1       7
2       9
3      10
4       7
      ..
4172   11
4173   10
4174    9
4175   10
4176   12
```

Name: Rings, Length: 4177, dtype: int64

8.Scale the independent variables

In [59]:

```
from sklearn.preprocessing import scale
x = scale(x)
x
```

Out[59]:

```
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,  0.08738942, ..., -0.45300269,
        -0.33890749, -0.18321163],
       ...,
       ...])
```

```
[-0.0105225 ,  0.63117159,  0.67657577, ...,  0.86994729,
 1.08111018,  0.56873549],
[-1.26630752,  0.85566483,  0.78370057, ...,  0.89699645,
 0.82336724,  0.47666033],
[-0.0105225 ,  1.61894185,  1.53357412, ...,  0.00683308,
 1.94673739,  2.00357336]])
```

9.Split the data into training and testing

In [60]:

```
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

In [61]:

```
from sklearn.linear_model import LinearRegression
MLR=LinearRegression()
```

11.Train the model

In [62]:

```
MLR.fit(x_train,y_train)
```

Out[62]:

```
LinearRegression()
```

12.Test the model

In [63]:

```
y_pred=MLR.predict(x_test)
y_pred
```

Out[63]:

```
array([11.98970767,  9.46980168,  4.35025346,  8.48565951, 13.45658605,
        6.79469942, 11.05392311, 10.58127683, 10.86210502, 11.12758326,
       10.30538487,  7.59007537,  9.72358432, 10.93426172,  7.7700162 ,
        8.18401367, 13.00426089,  9.00766398,  7.88678041, 10.74517579,
       11.0364535 , 11.17721077, 10.28249725,  8.05769153, 10.03833697,
       12.08213167, 11.26672758,  9.48152993, 12.03100216, 10.50622097,
        9.62474771, 11.53617875, 10.4263722 ,  7.42842768,  8.45541483,
        7.75334244, 10.01917083, 10.30704137, 11.431343 ,  7.53701438,
       11.68998408,  5.81786965, 11.91290164, 10.46313361,  9.05947091,
        7.47445677,  8.09696943, 10.94896005, 11.35845534,  9.63959737,
        6.88737575, 10.50248168, 12.76790041, 11.02103028, 10.72490686,
        7.1508855 ,  7.31893241, 10.23197194,  9.36561869,  8.78050407,
        9.45441901,  6.21239092,  9.15676042, 10.50354829,  7.94642124,
       11.30220996, 14.78546011, 10.65179623, 11.27573463,  6.22170813,
       10.61988512,  7.31363897, 10.18320192, 12.65074413,  8.53154805,
       10.08650898,  6.19428344,  9.19233924,  5.88918593,  9.83478369,
        9.13470566, 10.97642799, 10.14764678,  9.22926113,  8.87803015,
        8.92596367,  7.76736095, 13.08650929, 10.12176844, 10.85091207,
       12.61153724, 12.71571095,  9.15302103,  7.57808902, 10.32748718,
        9.99261727,  9.48924954,  9.44324015, 11.61404884,  8.48033306,
       14.55887537,  8.84876869,  5.92235587,  8.9315552 , 11.16910548,
        8.49017686, 10.25918005, 13.200296 , 12.34085468,  9.72937226,
       11.16389598,  7.59160183,  8.01797072, 11.04378886,  9.13215097,
       12.56460677,  6.70468796,  6.25290802, 10.94584676,  9.89511691,
        9.86155519, 10.50629574,  9.47791399, 11.32819595, 10.52565937,
       10.0952434 , 12.22174724,  9.25466345, 11.06032529, 11.05791947,
```

11.20692934, 6.27165522, 10.2597939 , 6.05958795, 11.84180734,
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6.6275382 , 7.82748258, 10.45556032, 8.00963757, 11.33195157,

```

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6.38143593, 6.25775954, 8.90652966, 11.62298011, 8.88096547,
8.77541787, 9.42464492, 11.87174067, 8.6647173 , 10.8092521 ,
9.52452318, 10.6367846 , 13.285861 , 11.20171482, 10.98622665,
11.48839113, 11.52502121, 12.32588484, 6.63384375, 10.82116114,
10.24621482, 8.96253033, 13.44621885, 6.94038277, 8.74830537,
10.97918968])

```

In [64]:

```

pred=MLR.predict(x_train)
pred

```

Out[64]:

```

array([ 9.92784979, 10.35813798, 6.56020653, ..., 9.24069844,
        8.53446807, 10.25800281])

```

In [65]:

```

from sklearn.metrics import r2_score
accuracy=r2_score(y_test,y_pred)
accuracy

```

Out[65]:

```

0.4989573317530529

```

In [66]:

```

MLR.predict([[1,0.455,0.365,0.095,0.5140,0.2245,0.1010,0.150]])

```

Out[66]:

```

array([9.87970961])

```

13.Measure the performance using Metrics

In [67]:

```

from sklearn import metrics
from sklearn.metrics import mean_squared_error
np.sqrt(mean_squared_error(y_test,y_pred))

```

Out[67]:

```

2.2952783609522607

```

LASSO

In [68]:


```

from sklearn.linear_model import Lasso, Ridge
#initialising 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

```

Out[68]:

```

array([-0.          ,  0.          ,  0.          ,  0.46241716,  0.20671087,
        0.          ,  0.          ,  0.74636559])

```

In [69]:

```

from sklearn import metrics
from sklearn.metrics import mean_squared_error
metrics.r2_score(y_test,lso_pred)

```

Out[69]:

```

0.38322738481767316

```

In [70]:

```

np.sqrt(mean_squared_error(y_test,lso_pred))

```

Out[70]:

```

2.5465989046842914

```

RIDGE

In [71]:

```

#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

```

Out[71]:

```

array([[11.98352897,  9.42892675,  4.49818396,  8.48737085, 13.355495 ,
        6.77287934, 11.0920111 , 10.59527459, 10.74978581, 11.13457017,
       10.35270607,  7.62353385,  9.72408223, 10.93505704,  7.78241361,
        8.16777068, 12.90444173,  9.19446497,  8.14773434, 10.8257376 ,
       11.02655099, 11.20491985, 10.30262701,  8.11682572, 10.03467159,
       11.97682407, 11.24091732,  9.52516865, 11.98804589, 10.5531938 ,
        9.79342209, 11.60618133, 10.43547944,  7.47214372,  8.45558322,
        7.78491507,  9.95657829, 10.38124828, 11.34058365,  7.55982939,
       11.64217332,  5.79955307, 11.90706752, 10.40261384,  9.03409672,
        7.47718722,  8.06206888, 10.88364451, 11.35288486,  9.66313675,
        6.89712708, 10.50313213, 12.69968003, 11.06911418, 10.7482954 ,
        7.17621055,  7.32900136, 10.37170343,  9.45921503,  8.79466909,
        9.45443092,  6.21143317,  9.1947239 , 10.50200188,  7.9549207 ,
       11.2743297 , 14.64196291, 10.63272527, 11.2747729 ,  6.19833399,
       10.55333685,  7.2775159 , 10.2813656 , 12.6524492 ,  8.54601837,
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In [72]:

```
rg.coef_
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Out[72]:

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```

In [73]:

```
metrics.r2_score(y_test,rg_pred)
```

Out[73]:

```
0.49819524561746076
```

In [74]:

```
np.sqrt(mean_squared_error(y_test,rg_pred))
```

Out[74]:

```
2.2970232574440512
```