```
import pandas as pd
import numpy as np
from matplotlib import pyplot as plt
import seaborn as sns
from \ sklearn.linear\_model \ import \ LinearRegression
{\tt df=pd.read\_csv("} \underline{/content/drive/MyDrive/Colab} \ \ {\tt Notebooks/abalone.csv")}
df['age'] = df['Rings']+1.5
df = df.drop('Rings', axis = 1)
  Univariate Analysis
df.hist(figsize=(20,10), grid=False, layout=(2, 4), bins = 30)
     \begin{tabular}{ll} $\square$ array([[<matplotlib.axes.\_subplots.AxesSubplot object at 0x7f3d1b0fb690>, array([]<matplotlib.axes.\_subplots.AxesSubplot object at 0x7f3d1b0fb690>, array([]<matplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.axes.\_subplotlib.a
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                                                \verb|\colored=| watplotlib.axes.\_subplots.AxesSubplot| object at 0x7f3d1ad60990>], | watplotlib.axesSubplot| object| obj
                                             [<matplotlib.axes._subplots.AxesSubplot object at 0x7f3d1ad16f90>,
                                                \verb|\colored=| watplotlib.axes._subplots.AxesSubplot| object| at 0x7f3d1acda5d0>,
                                                <matplotlib.axes._subplots.AxesSubplot object at 0x7f3d1ac8fc50>,
                                                <matplotlib.axes._subplots.AxesSubplot object at 0x7f3d1ac531d0>]],
                                         dtype=object)
                                                                              Length
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                                                                  Shucked weight
                                                                                                                                                                                                                                                                                                                                                               Shell weight
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                                                                                                                                                                                                                                                                                                                                                                                                                                                            700
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df.groupby('Sex')[['Length', 'Diameter', 'Height', 'Whole weight', 'Shucked weight',
                            'Viscera weight', 'Shell weight', 'age']].mean().sort_values('age')
                                                                                                                                                                                                                                                                                                                                                                                                                      1
                                               Length Diameter
                                                                                                                   Height Whole weight Shucked weight Viscera weight Shell weight
                                                                                                                                                                                                                                                                                                                                                                                               age
                      Sex
                                         0.431363
                                                                                                                                                                                                                           0.191035
                                                                                                                                                                                                                                                                                    0.092010
                                                                                                                                                                                                                                                                                                                                        0.128182
                                                                                                                                                                                                                                                                                                                                                                             9.390462
                                         0.561391
                                                                           0.439287 0.151381
                                                                                                                                                                 0.991459
                                                                                                                                                                                                                           0.432946
                                                                                                                                                                                                                                                                                    0.215545
                                                                                                                                                                                                                                                                                                                                        0.281969
                                                                                                                                                                                                                                                                                                                                                                         12.205497
```

Bivariate Analysis

0.579093 0.454732 0.158011

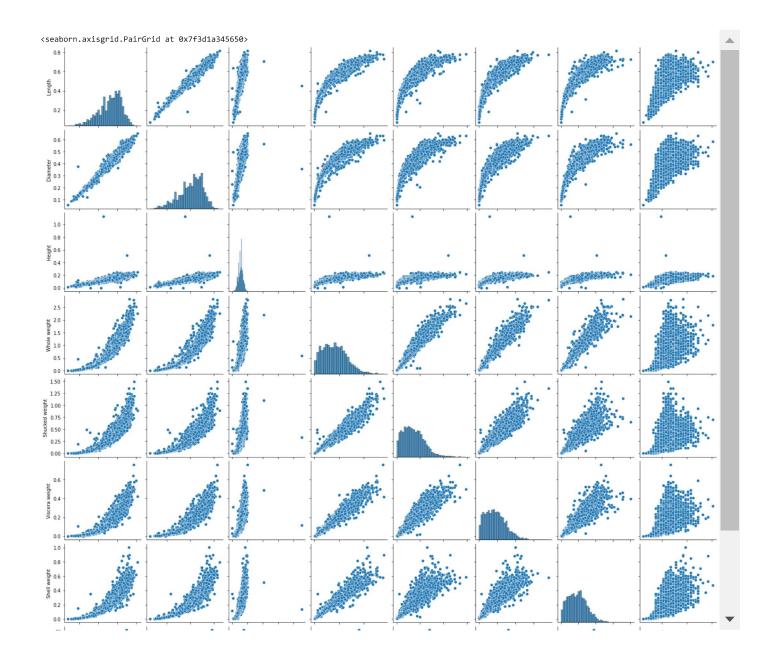
1.046532

0.446188

numerical_features = df.select_dtypes(include = [np.number]).columns
sns.pairplot(df[numerical_features])

0.230689

0.302010 12.629304



Descriptive statistics

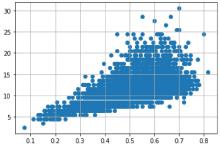
df.describe()

	Length	Diameter	Height	Whole weight	Shucked weight	Viscera weight	Shell weight	age
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	11.433684
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	2.500000
25%	0.450000	0.350000	0.115000	0.441500	0.186000	0.093500	0.130000	9.500000
50%	0.545000	0.425000	0.140000	0.799500	0.336000	0.171000	0.234000	10.500000
75%	0.615000	0.480000	0.165000	1.153000	0.502000	0.253000	0.329000	12.500000
max	0.815000	0.650000	1.130000	2.825500	1.488000	0.760000	1.005000	30.500000

Check for missing values

df.isnull().sum()

```
df = pd.get_dummies(df)
dummy_data = df.copy()
var = 'Viscera weight'
plt.scatter(x = df[var], y = df['age'],)
plt.grid(True)
# outliers removal
df.drop(df[(df['Viscera weight']> 0.5) & (df['age'] < 20)].index, inplace=True)</pre>
\label{eq:dfdf} $$ df.drop(df[(df['Viscera weight']<0.5) \& (df['age'] > 25)].index, inplace=True) $$
var = 'Shell weight'
plt.scatter(x = df[var], y = df['age'],)
plt.grid(True)
#Outliers removal
\label{lem:dfdf} $$ df.drop(df[(df['Shell weight']> 0.6) \& (df['age'] < 25)].index, inplace=True) $$
\label{lem:dfdf} $$ df.drop(df[(df['Shell weight'] < 0.8) & (df['age'] > 25)].index, inplace=True) $$
var = 'Shucked weight'
plt.scatter(x = df[var], y = df['age'],)
plt.grid(True)
#Outlier removal
\label{eq:df_df_df_df_df_df} $$ df.drop(df[(df['Shucked weight'] >= 1) & (df['age'] < 20)].index, inplace=True) $$
\label{lem:dfdf} $$ df.drop(df[(df['Shucked weight']<1) & (df['age'] > 20)].index, inplace=True) $$
var = 'Whole weight'
plt.scatter(x = df[var], y = df['age'])
plt.grid(True)
df.drop(df[(df['Whole weight'] >= 2.5) &
           (df['age'] < 25)].index, inplace = True)</pre>
df.drop(df[(df['Whole weight']<2.5) & (</pre>
df['age'] > 25)].index, inplace = True)
var = 'Diameter'
plt.scatter(x = df[var], y = df['age'])
plt.grid(True)
df.drop(df[(df['Diameter'] <0.1) &</pre>
           (df['age'] < 5)].index, inplace = True)</pre>
df.drop(df[(df['Diameter']<0.6) & (</pre>
df['age'] > 25)].index, inplace = True)
df.drop(df[(df['Diameter']>=0.6) & (
df['age'] < 25)].index, inplace = True)</pre>
var = 'Height'
plt.scatter(x = df[var], y = df['age'])
plt.grid(True)
df.drop(df[(df['Height'] > 0.4) &
           (df['age'] < 15)].index, inplace = True)</pre>
df.drop(df[(df['Height']<0.4) & (</pre>
df['age'] > 25)].index, inplace = True)
var = 'Length'
plt.scatter(x = df[var], y = df['age'])
plt.grid(True)
df.drop(df[(df['Length'] < 0.1) &
           (df['age'] < 5)].index, inplace = True)</pre>
df.drop(df[(df['Length']<0.8) & (</pre>
df['age'] > 25)].index, inplace = True)
df.drop(df[(df['Length']>=0.8) & (
df['age'] < 25)].index, inplace = True)</pre>
```



Categorical columns

```
numerical_features = df.select_dtypes(include = [np.number]).columns
categorical_features = df.select_dtypes(include = [np.object]).columns
```

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:2: DeprecationWarning: `np.object` is a deprecated alias for the builtin `object`. To siler Deprecated in NumPy 1.20; for more details and guidance: https://numpy.org/devdocs/release/1.20.0-notes.html#deprecations

```
4
```

```
>
```

numerical_features

${\tt categorical_features}$

```
Index(['Sex'], dtype='object')
```

ENCODING

from sklearn.preprocessing import LabelEncoder
le=LabelEncoder()
print(df.Sex.value_counts())

M 1525 I 1341 F 1301

Name: Sex, dtype: int64

x=df.iloc[:,:5]

Х	

	Sex	Length	Diameter	Height	Whole weight
0	М	0.455	0.365	0.095	0.5140
1	М	0.350	0.265	0.090	0.2255
2	F	0.530	0.420	0.135	0.6770
3	М	0.440	0.365	0.125	0.5160
4	I	0.330	0.255	0.080	0.2050
4172	F	0.565	0.450	0.165	0.8870
4173	М	0.590	0.440	0.135	0.9660
4174	М	0.600	0.475	0.205	1.1760
4175	F	0.625	0.485	0.150	1.0945
4176	М	0.710	0.555	0.195	1.9485

4167 rows × 5 columns

y=df.iloc[:,5:]
v

	Shucked weight	Viscera weight	Shell weight	age	10+
0	0.2245	0.1010	0.1500	16.5	
1	0.0995	0.0485	0.0700	8.5	
2	0.2565	0.1415	0.2100	10.5	
3	0.2155	0.1140	0.1550	11.5	
4	0.0895	0.0395	0.0550	8.5	
4172	0.3700	0.2390	0.2490	12.5	
4173	0.4390	0.2145	0.2605	11.5	
4174	0.5255	0.2875	0.3080	10.5	
4175	0.5310	0.2610	0.2960	11.5	
4176	0.9455	0.3765	0.4950	13.5	

4167 rows × 4 columns

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)

Model Building

from sklearn.linear_model import LinearRegression
mlr=LinearRegression()
mlr.fit(x_train,y_train)

Train and Test model

x_test[0:5]

	Sex	Length	Diameter	Height	Whole weight	1
661	ı	0.535	0.450	0.170	0.781	
370	F	0.650	0.545	0.165	1.566	
2272	М	0.635	0.510	0.210	1.598	
1003	М	0.595	0.455	0.150	1.044	
1145	М	0.580	0.455	0.195	1.859	

y_test[0:5]

	Shucked weight	Viscera weight	Shell weight	age	1
661	0.3055	0.1555	0.295	12.5	
370	0.6645	0.3455	0.415	17.5	
2272	0.6535	0.2835	0.580	16.5	
1003	0.5180	0.2205	0.270	10.5	
1145	0.9450	0.4260	0.441	10.5	

Feature Scaling

from sklearn.preprocessing import StandardScaler
ss=StandardScaler()
x_train=ss.fit_transform(x_train)
mlrpred=mlr.predict(x_test[0:9])
mlrpred

Performance measure

from sklearn.metrics import r2_score
r2_score(mlr.predict(x_test),y_test)

0.5597133867640833