Data Collection & Pre-processing

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
df = pd.read csv("./heart.csv")
df.head()
   Age Sex ChestPainType RestingBP Cholesterol FastingBS RestingECG
MaxHR \
    40
                      ATA
                                  140
                                                289
                                                                    Normal
         М
172
1
    49
         F
                      NAP
                                  160
                                                180
                                                              0
                                                                    Normal
156
2
    37
         М
                      ATA
                                  130
                                                283
                                                                        ST
98
3
                      ASY
                                                214
    48
         F
                                  138
                                                                    Normal
108
    54
         М
                      NAP
                                  150
                                                195
                                                              0
                                                                    Normal
4
122
  ExerciseAngina
                   Oldpeak ST Slope
                                      HeartDisease
0
                       0.0
                                  Uр
1
                       1.0
                                                  1
                N
                                Flat
2
                N
                       0.0
                                                  0
                                  Up
3
                Υ
                       1.5
                                                  1
                                Flat
4
                N
                       0.0
                                  Up
df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 918 entries, 0 to 917
Data columns (total 12 columns):
#
     Column
                      Non-Null Count
                                       Dtype
0
     Age
                      918 non-null
                                       int64
 1
     Sex
                      918 non-null
                                       object
 2
     ChestPainType
                      918 non-null
                                       object
 3
     RestingBP
                      918 non-null
                                       int64
 4
     Cholesterol
                      918 non-null
                                       int64
 5
     FastingBS
                      918 non-null
                                       int64
 6
                      918 non-null
     RestingECG
                                       object
 7
     MaxHR
                      918 non-null
                                       int64
 8
     ExerciseAngina
                      918 non-null
                                       object
 9
     Oldpeak
                      918 non-null
                                       float64
 10
     ST_Slope
                      918 non-null
                                       object
```

```
11 HeartDisease 918 non-null int64 dtypes: float64(1), int64(6), object(5) memory usage: 86.2+ KB
```

Feature Engineering

```
df.shape
(918, 12)
df['ChestPainType'].unique()
array(['ATA', 'NAP', 'ASY', 'TA'], dtype=object)
df['FastingBS'].unique()
array([0, 1])
df['RestingECG'].unique()
array(['Normal', 'ST', 'LVH'], dtype=object)
df.isnull().sum()
Age
                   0
                   0
Sex
ChestPainType
                   0
RestingBP
                   0
Cholesterol
                   0
                   0
FastingBS
                   0
RestingECG
                   0
MaxHR
                   0
ExerciseAngina
                   0
Oldpeak
                   0
ST Slope
HeartDisease
                   0
dtype: int64
df.describe()
               Age
                     RestingBP
                                 Cholesterol
                                                FastingBS
                                                                 MaxHR \
count
       918.000000
                    918.000000
                                  918.000000
                                              918.000000
                                                           918.000000
        53.510893
                    132.396514
                                  198.799564
                                                 0.233115
                                                           136.809368
mean
std
         9.432617
                     18.514154
                                  109.384145
                                                 0.423046
                                                            25.460334
        28.000000
                                                            60.000000
                      0.000000
                                    0.000000
                                                 0.000000
min
25%
        47.000000
                    120.000000
                                  173.250000
                                                 0.000000
                                                           120.000000
50%
        54.000000
                    130.000000
                                  223.000000
                                                 0.000000
                                                           138.000000
        60.000000
                                  267.000000
75%
                    140.000000
                                                 0.000000
                                                           156.000000
        77.000000
                    200.000000
                                  603.000000
                                                 1.000000
                                                           202.000000
max
```

```
Oldpeak
                    HeartDisease
       918.000000
                      918.000000
count
         0.887364
                        0.553377
mean
         1.066570
                        0.497414
std
min
        -2.600000
                        0.000000
25%
         0.000000
                        0.000000
50%
         0.600000
                        1.000000
75%
         1.500000
                        1.000000
max
         6.200000
                        1.000000
# Removing Negative values from the 'Oldpeak' column, as Peak value
can't be negative
df = df.drop(df[df['Oldpeak']<0].index)</pre>
df.describe()
               Age
                     RestingBP
                                 Cholesterol
                                                FastingBS
                                                                 MaxHR
                                                                       \
       905.000000
                    905.000000
                                  905.000000
                                               905.000000
                                                            905.000000
count
        53.530387
                                                 0.227624
                    132.659669
                                  201.477348
                                                            136.988950
mean
std
         9.426557
                     18.477599
                                  107.719891
                                                 0.419531
                                                             25.330337
        28,000000
                      0.00000
                                    0.000000
                                                 0.000000
                                                             60.000000
min
        47,000000
                                                 0.000000
25%
                    120.000000
                                  177.000000
                                                            120,000000
50%
        54.000000
                    130.000000
                                  223,000000
                                                 0.000000
                                                            138,000000
        60,000000
                                  268.000000
75%
                    140.000000
                                                 0.000000
                                                            156,000000
        77,000000
                    200.000000
                                  603,000000
                                                 1.000000
                                                            202.000000
max
          0ldpeak
                    HeartDisease
       905.000000
count
                      905,000000
         0.914254
                        0.551381
mean
         1.046944
                        0.497628
std
         0.000000
                        0.00000
min
25%
         0.000000
                        0.000000
50%
         0.600000
                        1.000000
75%
         1.500000
                        1.000000
max
         6.200000
                        1.000000
# Find Duplicate values in the DF
df.duplicated().sum()
0
from sklearn.preprocessing import LabelEncoder
label encoder = LabelEncoder()
```

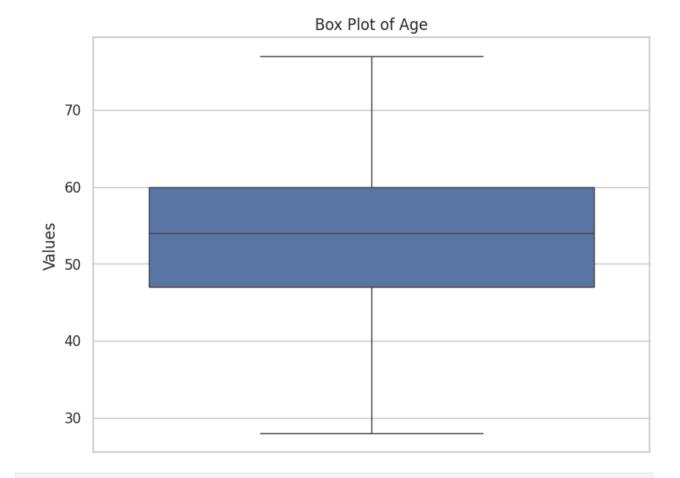
Label Encoding

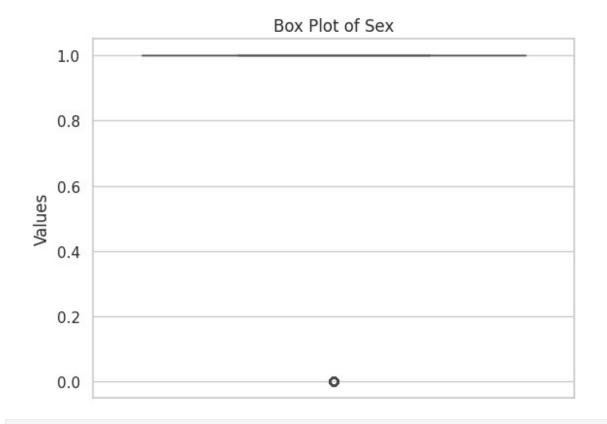
```
columns = ['Sex', 'ChestPainType', 'RestingECG', 'ExerciseAngina',
'ST_Slope']
```

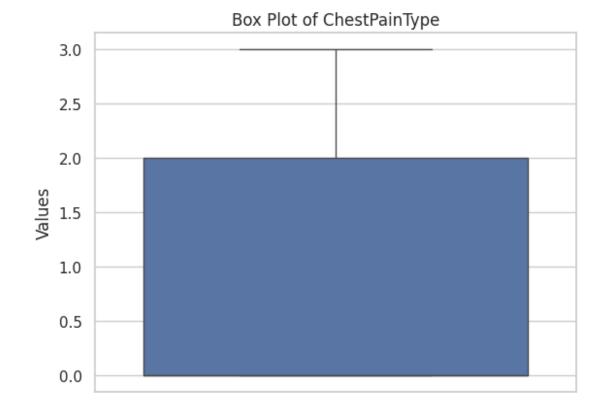
```
for i in columns:
    df['{}'.format(i)] = label_encoder.fit_transform(df['{}'.format(i)])
```

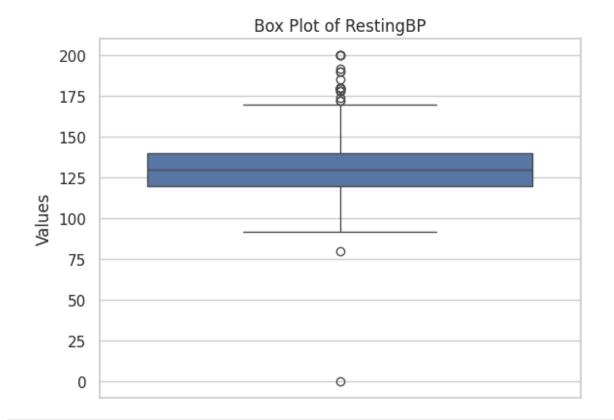
Outlier Handling

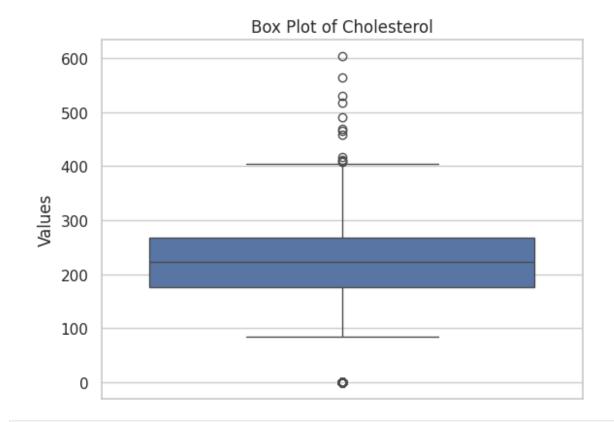
```
def remove outliers iqr(df, column, threshold=1.5):
    Q1 = df[column].quantile(0.25)
    Q3 = df[column].quantile(0.75)
    IQR = Q3 - Q1
    lower bound = Q1 - threshold * IQR
    upper bound = Q3 + threshold * IQR
    outliers = (df[column] < lower bound) | (df[column] > upper bound)
    df = df[~outliers]
    return df
columns to check = df.columns.tolist()
sns.set(style="whitegrid")
plt.figure(figsize=(8, 6))
for item in columns_to_check:
  sns.boxplot(data=df[item])
  plt.xlabel("".format(item))
  plt.ylabel("Values")
  plt.title("Box Plot of {}".format(item))
  plt.show()
  print('\n')
```







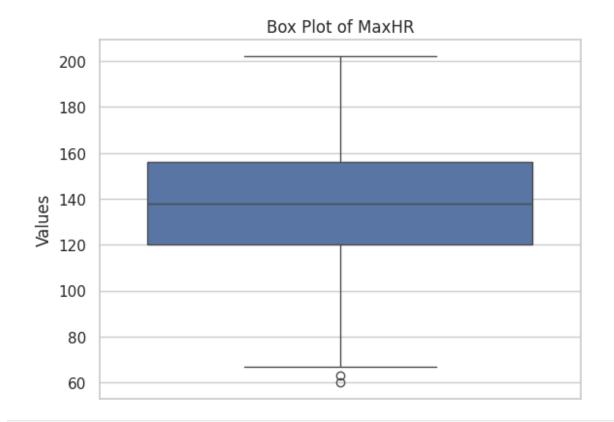


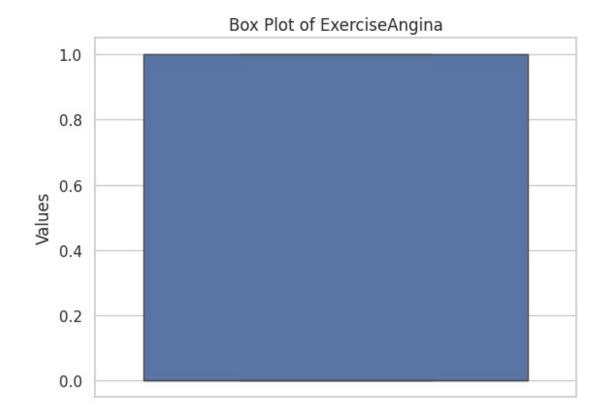


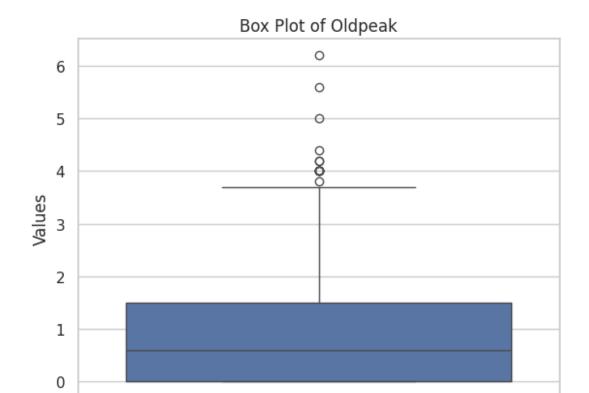


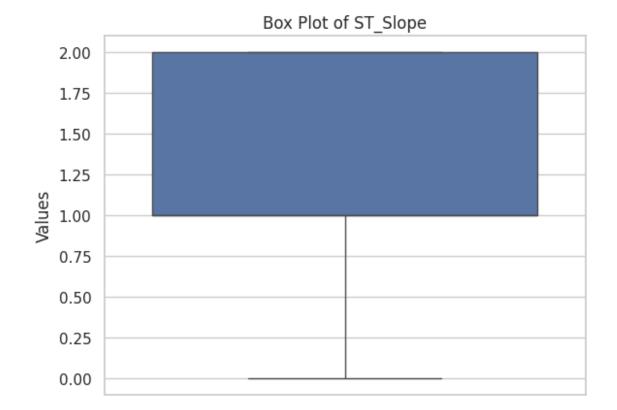


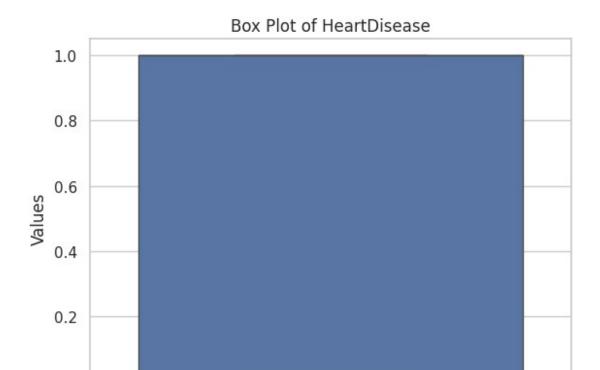








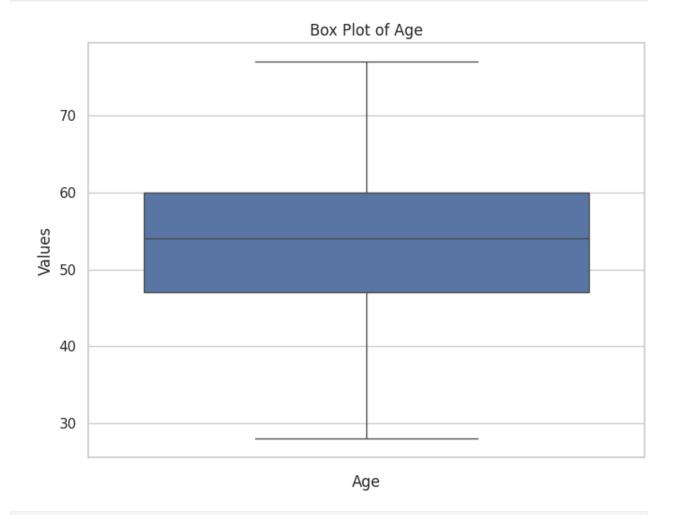


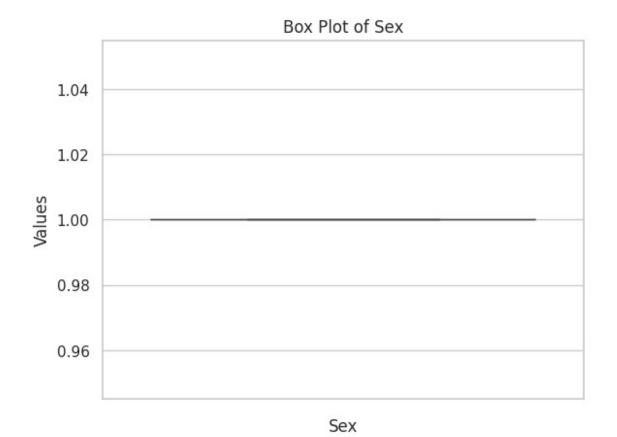


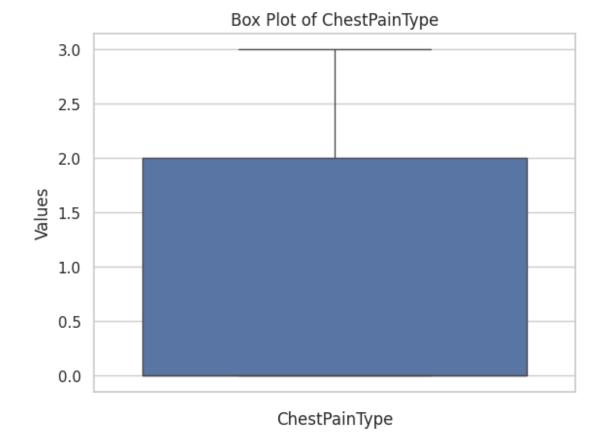
0.0

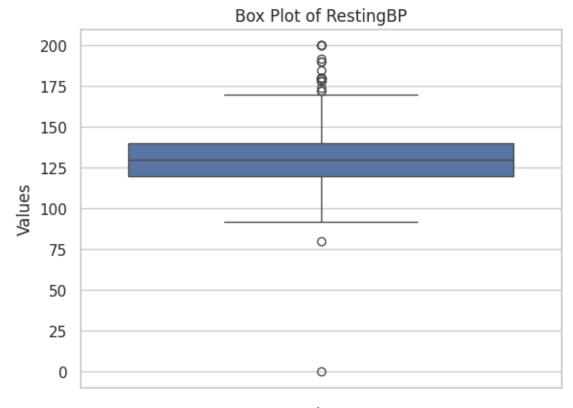
```
column = ['Sex', 'FastingBS', 'RestingECG', 'RestingECG', 'Oldpeak']
for item in column:
 Q1 = df[item].quantile(0.25)
  Q3 = df[item].quantile(0.75)
  IQR = 03 - 01
 whisker width = 1.5
  lower whisker = Q1 - (whisker width*IQR)
  upper_whisker = Q3 + (whisker_width*IQR)
df[item]=np.where(df[item]>upper whisker,upper whisker,np.where(df[ite
m]<lower whisker,lower whisker,df[item]))</pre>
sns.set(style="whitegrid")
plt.figure(figsize=(8, 6))
for item in columns to check:
  sns.boxplot(data=df[item])
  plt.xlabel('{}'.format(item))
  plt.ylabel("Values")
  plt.title("Box Plot of {}".format(item))
```

```
plt.show()
print("")
```

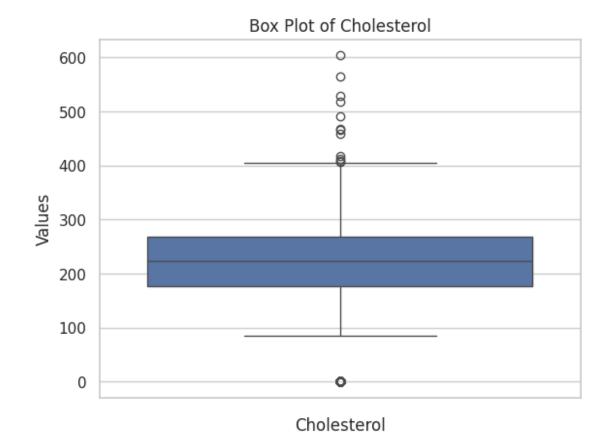






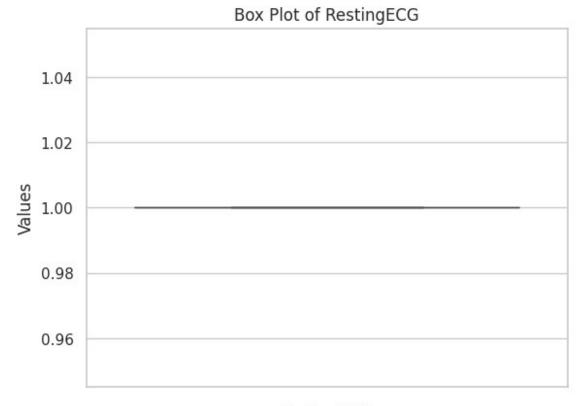


RestingBP

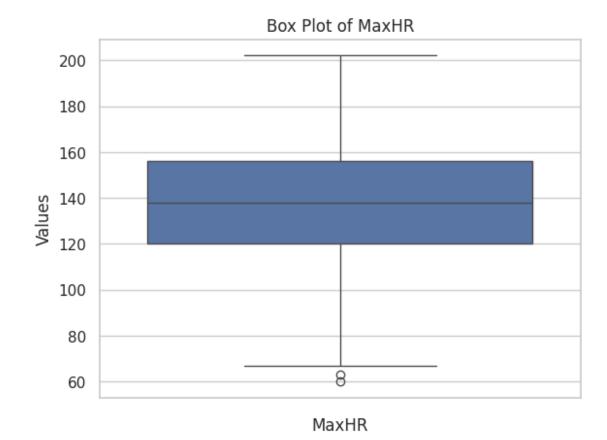


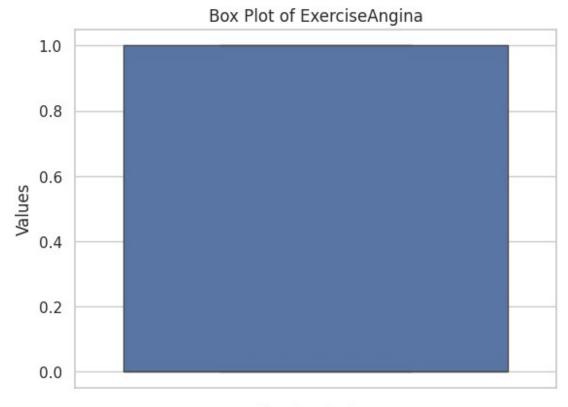


FastingBS

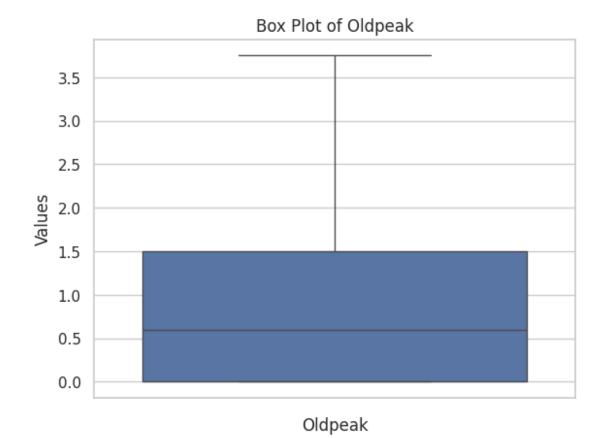


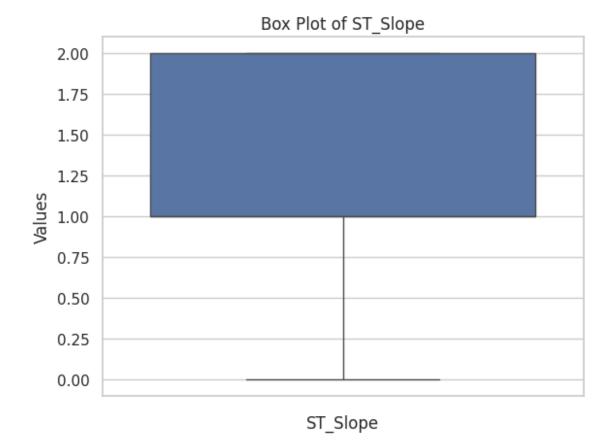
RestingECG

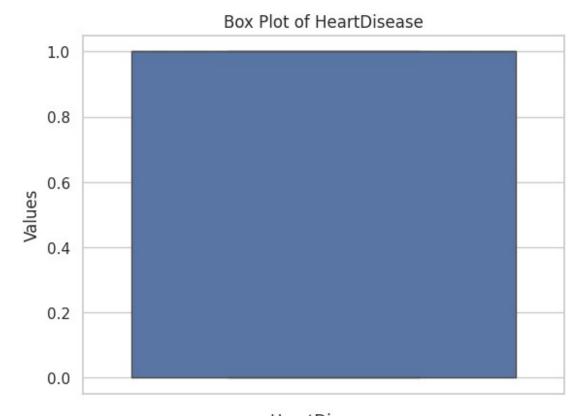




ExerciseAngina







HeartDisease

X&Y Split

```
X = df.drop(['HeartDisease'], axis=1)
y = df['HeartDisease']
X.shape
(905, 11)
y.shape
(905,)
```

Train - Test Split

```
from sklearn.model_selection import train_test_split

X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.3, random_state=42)
```

```
X_train.shape
(633, 11)
y_train.shape
(633,)
X_test.shape
(272, 11)
y_test.shape
(272,)
```

Model Training

```
from sklearn.linear_model import LinearRegression
from sklearn.tree import DecisionTreeRegressor
from sklearn.ensemble import RandomForestRegressor
from sklearn.neighbors import KNeighborsRegressor
from sklearn.svm import SVR
model1 = LinearRegression()
model1.fit(X_train, y_train)
LinearRegression()
model2 = DecisionTreeRegressor()
model2.fit(X_train, y_train)
DecisionTreeRegressor()
model3 = RandomForestRegressor(n estimators=100)
model3.fit(X train, y train)
RandomForestRegressor()
model4 = KNeighborsRegressor(n neighbors=5)
model4.fit(X train, y train)
KNeighborsRegressor()
model5 = SVR(kernel='linear')
model5.fit(X_train, y_train)
SVR(kernel='linear')
```

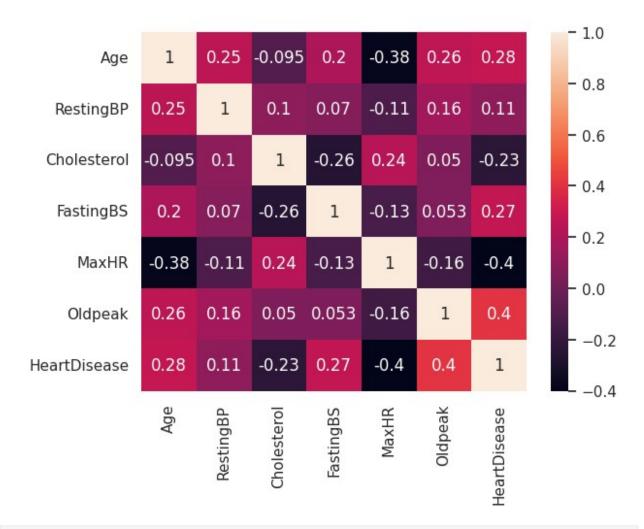
Model Evaluation

```
from sklearn.metrics import mean squared error, r2 score
models = [model1, model2, model3, model4, model5]
for model in models:
    y_pred = model.predict(X test)
    mse = mean squared error(y test, y pred)
    model_name = type(model).__name_
    print(f'{model name} Mean Squared Error: {mse*100:.2f}')
LinearRegression Mean Squared Error: 12.67
DecisionTreeRegressor Mean Squared Error: 23.16
RandomForestRegressor Mean Squared Error: 10.51
KNeighborsRegressor Mean Squared Error: 19.74
SVR Mean Squared Error: 13.60
for model in models:
    y_pred = model.predict(X test)
    r2 = r2 score(y test, y pred)
    model_name = type(model).__name
    print(f'{model name} Mean Squared Error: {r2*100:.2f}')
LinearRegression Mean Squared Error: 47.56
DecisionTreeRegressor Mean Squared Error: 4.11
RandomForestRegressor Mean Squared Error: 56.49
KNeighborsRegressor Mean Squared Error: 18.30
SVR Mean Squared Error: 43.70
```

Visualisation

```
sns.heatmap(df.corr(), annot=True)
<ipython-input-94-6dc1c4c1753e>:1: FutureWarning: The default value of
numeric_only in DataFrame.corr is deprecated. In a future version, it
will default to False. Select only valid columns or specify the value
of numeric_only to silence this warning.
    sns.heatmap(df.corr(), annot=True)

<Axes: >
```



sns.pairplot(df)

<seaborn.axisgrid.PairGrid at 0x7bd663bbf400>

