```
In [1]: import numpy as np
          import pandas as pd
          from sklearn.model_selection import train_test_split
          from sklearn.linear_model import LogisticRegression
          from sklearn.metrics import accuracy_score
          Data Collection and Processing
In [7]: # loading the csv data to a Pandas DataFrame
          heart_data = pd.read_csv('heart_disease_data.csv')
 In [8]: # print first 5 rows of the dataset
          heart_data.head()
 Out[8]:
             age sex cp trestbps chol fbs restecg thalach exang oldpeak slope ca thal target
              63
                  1
                                 233
                                                   150
                                                          0
                                                                          0
                            145
                                             0
          1 37
                  1 2
                            130
                                250
                                      0
                                             1
                                                   187
                                                          0
                                                                3.5
                                                                       0 0
                                                                              2
                                                                                     1
                                204
              41
                  0 1
                            130
                                      0
                                             0
                                                   172
                                                                1.4
                                                                       2 0
                                                                              2
                                                                                     1
              56
                  1 1
                            120
                                236
                                      0
                                             1
                                                   178
                                                          0
                                                                8.0
                                                                       2 0
                                                                              2
                                                                                     1
             57
                  0 0
                            120 354
                                      0
                                                   163
                                                          1
                                                                0.6
                                                                       2 0 2
 In [9]: # print last 5 rows of the dataset
          heart_data.tail()
 Out[9]:
              age sex cp trestbps chol fbs restecg thalach exang oldpeak slope ca thal target
                                  241
                                                    123
                                                                  0.2
                                                                                      0
          298
               57
                    0
                        0
                              140
                                        0
                                               1
                                                            1
                                                                            0
          299
               45
                    1 3
                              110 264
                                        0
                                               1
                                                    132
                                                            0
                                                                  1.2
                                                                         1 0
                                                                                3
                                                                                      0
                              144 193
                                                                                      0
          300
               68
                    1
                        0
                                       1
                                                    141
                                                                  3.4
                                                                         1 2
                                                                                      0
          301
               57
                    1
                       0
                              130 131
                                        0
                                               1
                                                    115
                                                            1
                                                                  1.2
                                                                         1 1
                                                                                3
          302 57
                    0 1
                              130 236
                                      0
                                                    174
                                                                  0.0
                                                                         1 1 2
                                                                                      0
In [10]: # number of rows and columns in the dataset
          heart_data.shape
Out[10]: (303, 14)
In [11]: # getting some info about the data
          heart_data.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 303 entries, 0 to 302
          Data columns (total 14 columns):
                       303 non-null int64
          age
                       303 non-null int64
          sex
          ср
                       303 non-null int64
                       303 non-null int64
          trestbps
                       303 non-null int64
          chol
                       303 non-null int64
          fbs
                       303 non-null int64
          restecg
                       303 non-null int64
          thalach
                       303 non-null int64
          exang
          oldpeak
                       303 non-null float64
          slope
                       303 non-null int64
                       303 non-null int64
          ca
          thal
                       303 non-null int64
                       303 non-null int64
          target
          dtypes: float64(1), int64(13)
          memory usage: 33.2 KB
In [12]: # checking for missing values
          heart_data.isnull().sum()
Out[12]: age
                       0
          sex
                       0
          ср
                       0
                       0
          trestbps
                       0
          chol
          fbs
                       0
                       0
          restecg
          thalach
                       0
          exang
                       0
          oldpeak
                       0
          slope
                       0
                       0
          ca
          thal
                       0
          target
          dtype: int64
In [13]: # statistical measures about the data
          heart_data.describe()
Out[13]:
                      age
                                sex
                                          ср
                                               trestbps
                                                            chol
                                                                       fbs
                                                                             restecg
                                                                                       thalach
                                                                                                  exang
                                                                                                          oldpeak
                                                                                                                      slope
          count 303.000000 303.000000 303.000000 303.000000 303.000000 303.000000 303.000000 303.000000
                                                                                                                           303.000000 303.00
                                                                                                       303.000000 303.000000
                 54.366337
                            0.683168
                                     0.966997 131.623762 246.264026
                                                                   0.148515
                                                                            0.528053 149.646865
                                                                                                0.326733
                                                                                                         1.039604
                                                                                                                   1.399340
                                                                                                                             0.729373
                                                                                                                                      2.31
           mean
                  9.082101
                           0.466011
                                                                            0.525860
                                                                                     22.905161
                                                                                                0.469794
                                     1.032052 17.538143
                                                       51.830751
                                                                   0.356198
                                                                                                         1.161075
                                                                                                                   0.616226
                                                                                                                             1.022606
                                                                                                                                      0.61
             std
            min
                 29.000000
                            0.000000
                                     0.000000
                                              94.000000 126.000000
                                                                   0.000000
                                                                            0.000000 71.000000
                                                                                                0.000000
                                                                                                         0.000000
                                                                                                                   0.000000
                                                                                                                             0.000000
                                                                                                                                      0.00
           25%
                 47.500000
                           0.000000
                                     0.000000 120.000000 211.000000
                                                                   0.000000
                                                                            0.000000 133.500000
                                                                                               0.000000
                                                                                                         0.000000
                                                                                                                   1.000000
                                                                                                                             0.000000
                                                                                                                                      2.00
            50%
                 55.000000
                           1.000000
                                     1.000000 130.000000 240.000000
                                                                   0.000000
                                                                            1.000000 153.000000
                                                                                                0.000000
                                                                                                         0.800000
                                                                                                                   1.000000
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                                                                                                                                       2.00
           75%
                 61.000000
                           1.000000
                                     2.000000 140.000000 274.500000
                                                                   0.000000
                                                                            1.000000 166.000000
                                                                                               1.000000
                                                                                                         1.600000
                                                                                                                   2.000000
                                                                                                                             1.000000
                                                                                                                                      3.00
                77.000000
                           1.000000
                                     3.000000 200.000000 564.000000
                                                                  1.000000
                                                                            2.000000 202.000000
                                                                                               1.000000
                                                                                                         6.200000
                                                                                                                   2.000000
                                                                                                                             4.000000
                                                                                                                                      3.00
           max
In [32]: # checking the distribution of Target Variable
          heart_data['target'].value_counts()
Out[32]: 1
               165
          Name: target, dtype: int64
          1 --> Defective Heart
          0 --> Healthy Heart
          Splitting the Features and Target
In [33]: X = heart_data.drop(columns='target', axis=1)
          Y = heart_data['target']
In [16]: print(X)
                                                               thalach
                                                                                oldpeak \
                     sex cp
                              trestbps
                                         chol fbs
                                                     restecg
                                                                        exang
               age
                63
                      1
                           3
                                   145
                                          233
                                                           0
                                                                   150
                                                                             0
                                                                                    2.3
          0
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                37
                      1
                           2
                                   130
                                          250
                                                  0
                                                           1
                                                                   187
                                                                             0
                                                                                    3.5
          1
                      0
                                                  0
                                                           0
                                                                   172
                                                                             0
          2
                41
                           1
                                   130
                                          204
                                                                                    1.4
          3
                56
                           1
                                   120
                                          236
                                                  0
                                                                   178
                                                                                    0.8
                57
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                                   120
                                          354
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                                                           1
                                                                   163
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                57
                                   140
                                          192
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                                          294
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                                                           0
                                                                   153
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                       0
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                                                                                    1.3
                       1
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                                   120
                                          263
                                                  0
                                                           1
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                                                                                    0.0
          8
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                                   140
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          10
                54
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                           2
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                                          275
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                47
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          280
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                                          311
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          286
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          297
                59
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                                   164
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                                   140
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          299
                45
                           3
                                   110
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                                                           1
                                                                   132
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                                          264
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                           0
                                   144
                                          193
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                                                                   141
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                                                                                    3.4
          301
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                                   130
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                                                                   115
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          302
                57
                       0
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                                   130
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                           thal
               slope
                       ca
          0
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                              2
          1
          2
                   2
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                              2
                   2
                              2
          3
                        0
                   2
          5
                   1
                        0
                              1
          6
                              2
                   1
                        0
          7
                   2
                              3
                        0
                   2
                              3
          9
                   2
                              2
                        0
                   2
          10
                        0
                              2
                   2
                              2
          11
                   2
          12
          13
                   1
          14
          15
                   1
          16
          17
                   0
          18
                   2
                              2
          19
                   2
          20
          21
                   2
          22
                   2
          23
                   1
          24
          25
                   2
                              2
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          27
                   2
          28
          29
                   0
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          274
                   1
          275
                   2
                        2
                              3
          276
                   1
                              3
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          277
                   2
          278
          279
                   1
          280
                   1
                              1
          281
                   1
          282
                   1
          283
                   2
                        0
                              3
          284
                   2
          285
                   1
          286
          287
                   2
          288
                   1
                              3
          289
                   1
                              3
          290
          291
                   0
                        3
                              1
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                   1
                        2
                              1
          293
                   1
          294
          295
                   2
          296
                   1
          297
                   1
          298
                   1
          299
                   1
                              3
          300
                   1
          301
                   1
                              3
          302
          [303 rows x 13 columns]
In [31]: print(Y)
                 1
          3
                 1
                 1
                 1
                 1
          8
                 1
          9
                 1
          10
                 1
          11
                 1
          12
                 1
          13
                 1
          14
          15
                 1
          16
                 1
          17
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          19
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          22
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          292
          293
                 0
          294
                 0
          295
          296
          297
          298
          299
          300
          301
          302
          Name: target, Length: 303, dtype: int64
          Splitting the Data into Training data & Test Data
In [18]: X_train, X_test, Y_train, Y_test = train_test_split(X, Y, test_size=0.2, stratify=Y, random_state=2)
In [30]: print(X.shape, X_train.shape, X_test.shape)
          (303, 13) (242, 13) (61, 13)
          Model Training
          Logistic Regression
In [20]: model = LogisticRegression()
In [21]: # training the LogisticRegression model with Training data
          model.fit(X_train, Y_train)
          C:\ProgramData\Anaconda3\lib\site-packages\sklearn\linear_model\logistic.py:433: FutureWarning: Default solver will b
          e changed to 'lbfgs' in 0.22. Specify a solver to silence this warning.
            FutureWarning)
Out[21]: LogisticRegression(C=1.0, class_weight=None, dual=False, fit_intercept=True,
                     intercept_scaling=1, max_iter=100, multi_class='warn',
                     n_jobs=None, penalty='12', random_state=None, solver='warn',
                     tol=0.0001, verbose=0, warm_start=False)
          Model Evaluation
          Accuracy Score
In [29]: # accuracy on training data
          X_train_prediction = model.predict(X_train)
          training_data_accuracy = accuracy_score(X_train_prediction, Y_train)
In [23]: print('Accuracy on Training data : ', training_data_accuracy)
          Accuracy on Training data : 0.8553719008264463
In [28]: # accuracy on test data
          X_test_prediction = model.predict(X_test)
          test_data_accuracy = accuracy_score(X_test_prediction, Y_test)
In [25]: print('Accuracy on Test data : ', test_data_accuracy)
          Accuracy on Test data : 0.8032786885245902
          Building a Predictive System
In [27]: input_data = (62,0,0,140,268,0,0,160,0,3.6,0,2,2)
          # change the input data to a numpy array
          input_data_as_numpy_array= np.asarray(input_data)
          # reshape the numpy array as we are predicting for only on instance
          input_data_reshaped = input_data_as_numpy_array.reshape(1,-1)
          prediction = model.predict(input_data_reshaped)
          print(prediction)
          if (prediction[0]== 0):
            print('The Person does not have a Heart Disease')
```

print('The Person has Heart Disease')

The Person does not have a Heart Disease

In []:

Importing the Dependencies