```
In [1]: import pandas as pd
In [2]: | df = pd.read csv('heart.csv')
In [3]: df.shape
Out[3]: (303, 15)
In [4]: df.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 303 entries, 0 to 302
        Data columns (total 15 columns):
             Column
         #
                          Non-Null Count Dtype
                          -----
         0
             Unnamed: 0
                          303 non-null
                                           int64
         1
             Age
                          303 non-null
                                           int64
         2
                          303 non-null
             Sex
                                           int64
         3
             ChestPain
                          303 non-null
                                           object
         4
             RestBP
                          303 non-null
                                           int64
         5
             Chol
                          303 non-null
                                           int64
         6
             Fbs
                          303 non-null
                                           int64
         7
             RestECG
                          303 non-null
                                           int64
         8
             MaxHR
                          303 non-null
                                           int64
         9
             ExAng
                          303 non-null
                                           int64
             Oldpeak
         10
                                           float64
                          303 non-null
         11
             Slope
                          303 non-null
                                           int64
         12
             Ca
                          299 non-null
                                           float64
         13
             Thal
                          301 non-null
                                           object
         14 AHD
                          303 non-null
                                           object
        dtypes: float64(2), int64(10), object(3)
        memory usage: 35.6+ KB
In [5]: (df==0).sum()
Out[5]: Unnamed: 0
                         0
        Age
                         0
                        97
        Sex
        ChestPain
                         0
        RestBP
                         0
        Chol
                         0
        Fbs
                       258
        RestECG
                       151
        MaxHR
                         0
        ExAng
                       204
        0ldpeak
                        99
        Slope
                         0
        Ca
                       176
        Thal
                         0
        AHD
                         0
        dtype: int64
In [6]: df['Age'].mean()
Out[6]: 54,43894389438944
In [7]: df.isna().sum()
Out[7]: Unnamed: 0
                       0
        Age
                       0
        Sex
                       0
        ChestPain
                       0
        RestBP
                       0
        Chol
                       0
        Fbs
                       0
        RestECG
                       0
                       0
        MaxHR
        ExAng
                       0
        Oldpeak
                       0
        Slope
                       0
        Ca
                       4
                       2
        Thal
                       0
        AHD
        dtype: int64
```

```
In [8]: | df.mean()
 Out[8]: Unnamed: 0
                         152.000000
          Age
                          54.438944
          Sex
                           0.679868
          RestBP
                         131.689769
                         246.693069
          Chol
                           0.148515
          Fbs
          RestECG
                           0.990099
                         149.607261
          MaxHR
          ExAng
                           0.326733
          Oldpeak
                           1.039604
          Slope
                           1.600660
          Ca
                           0.672241
          dtype: float64
 In [9]: df[df['Ca'].isnull()].index.tolist()
 Out[9]: [166, 192, 287, 302]
In [10]: df.iloc[[166]]
Out[10]:
               Unnamed: 0 Age Sex ChestPain RestBP Chol Fbs RestECG MaxHR ExAng Oldpeak Slope
                                                                                                    Thal AHD
                                                                                               Ca
          166
                     167
                          52
                               1 nonanginal
                                              138
                                                   223
                                                         0
                                                                 0
                                                                      169
                                                                              O
                                                                                     0.0
                                                                                            1 NaN normal
                                                                                                           Nο
In [11]: df['Ca'].fillna(df['Ca'].mean(), inplace=True)
In [12]: | df.isna().sum().sum()
Out[12]: 2
In [13]: | df.iloc[[166]]
Out[13]:
               Unnamed: 0 Age Sex ChestPain RestBP Chol Fbs RestECG MaxHR ExAng Oldpeak Slope
                                                                                                        Thal
                                                                                                            AHD
           166
                               1 nonanginal
                                              138
                                                   223
                                                                                            1 0.672241 normal
In [14]: | df = df[df['Thal'].notna()]
In [15]: | df2 = df.filter(['Age', 'Sex', 'ChestPain', 'RestBP', 'Chol'])
In [16]: print(df['ChestPain'].unique())
          ['typical' 'asymptomatic' 'nonanginal' 'nontypical']
In [17]: X = df2.replace(to replace=dict(typical=1 ,asymptomatic=2 ,nonanginal=3 ,nontypical=4))
          X = X / X.max()
In [18]: df3 = df.filter(['AHD'])
In [19]: y = df3.replace(dict(No=0, Yes=1))
In [20]: print("X size: ", X.shape)
print("y size: ", y.shape)
                   (301, 5)
          X size:
          y size:
                   (301, 1)
```

In [21]: import matplotlib.pyplot as plt

```
In [22]: plt.scatter(X['RestBP'], X['Age'] , c= y.values.tolist())
Out[22]: <matplotlib.collections.PathCollection at 0x7fbba1e038d0>
           1.0
           0.9
           0.8
           0.7
           0.6
           0.5
           0.4
                 0.5
                                        0.8
                         0.6
                                0.7
                                               0.9
                                                       1.0
In [23]: plt.scatter(X['RestBP'], X['Chol'] , c= y.values.tolist())
Out[23]: <matplotlib.collections.PathCollection at 0x7fbb99d02828>
           1.0
           0.9
           0.8
           0.7
           0.6
           0.5
           0.4
           0.3
           0.2
                                               0.9
                                                       1.0
In [24]: plt.scatter(X['Age'], X['Chol'] , c= y.values.tolist())
Out[24]: <matplotlib.collections.PathCollection at 0x7fbb99c7a550>
           1.0
           0.9
           0.8
           0.7
           0.6
           0.5
```

0.4 0.3 0.2

1.0 0.9 0.8 0.7 0.6 0.5 0.4 0.4

0.5

0.6

0.6

0.7

In [25]: plt.scatter(X['Age'], X['ChestPain'] , c= y.values.tolist())
Out[25]: <matplotlib.collections.PathCollection at 0x7fbb99ccd748>

0.9

0.9

1.0

1.0

0.8

```
In [26]: actual = pd.Series([1 \text{ for } i \text{ in } range(50)] + [0 \text{ for } i \text{ in } range(50)], name='Actual')
In [27]: prediction = pd.Series([1 for i in range(45)] + [0 for i in range(55)], name='Prediction')
In [28]: cm = pd.crosstab(actual, prediction)
In [29]: cm
Out[29]:
          Prediction
                   0 1
             Actual
                 0 50
                 1 5 45
In [30]: tp = cm[0][0]
          tn = cm[1][1]
          fp = cm[1][0]
          fn = cm[0][1]
         print("TP : ", tp)
print("TN : ", tn)
print("FP : ", fp)
print("FN : ", fn)
         TP: 50
          TN: 45
          FP: 0
          FN: 5
In [31]: accuracy = (tp + tn) / (tp + tn + fp + fn)
          precision = tp / (tp + fp)
          recall = tp / (tp + fn)
          f1 = (2 * precision * recall) / (precision + recall)
In [32]: print("Accuracy : ", accuracy)
          print("Precision : ", precision)
          print("Recall : ", recall)
          print("F1 Score : ", f1)
         Accuracy: 0.95
          Precision: 1.0
          Recall: 0.9090909090909091
          F1 Score: 0.9523809523809523
In [33]: from sklearn.metrics import accuracy_score, precision_recall_fscore_support,classification_repo
In [34]: | accuracy_score(actual, prediction)
Out[34]: 0.95
In [35]: precision_recall_fscore = precision_recall_fscore_support(actual, prediction, average="weighte")
          d")
          precision recall fscore
Out[35]: (0.9545454545454546, 0.95, 0.949874686716792, None)
In [36]: print(classification report(actual, prediction))
                         precision
                                       recall f1-score
                                                            support
                     0
                                                    0.95
                              0.91
                                         1.00
                                                                 50
                              1.00
                                         0.90
                                                    0.95
                                                                 50
                     1
                                                    0.95
                                                                100
              accuracy
                              0.95
                                         0.95
             macro avg
                                                    0.95
                                                                100
                              0.95
                                         0.95
                                                    0.95
                                                                100
         weighted avg
```