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Jupyter Heart_Diseases_Predict Last Checkpoint: 17 hours ago (autosaved)
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            Heart Disease Prediction By Sabyasachi Bandyopadhyay
   In [ ]:
            Dataset
            The dataset has 14 attributes:

age: age in years.

sex: sex (1 = male; 0 = female).

cp: chest pain type (Value 0: typical angina; Value 1: atypical angina; Value 2: non-anginal pain; Value 3: asymptomatic).

trestbps: resting blood pressure in mm Hg on admission to the hospital.

chol: serum cholestoral in mg/dl.

fbs: fasting blood sugar > 120 mg/dl (1 = true; 0 = false).

              • restecg: resting electrocardiographic results (Value 0: normal; Value 1: having ST-T wave abnormality; Value 2: probable or definite left ventricular
                hypertrophy).

thalach: maximum heart rate achieved.

exang: exercise induced angina (1 = yes; 0 = no)

oldpeak: ST depression induced by exercise relative to rest.

              . slope: the slope of the peak exercise ST segment (Value 0: upsloping; Value 1: flat; Value 2: downsloping).

ca: number of major vessels (0-3) colored by flourosopy.

thal: thalassemia (3 = normal; 6 = fixed defect; 7 = reversable defect).

target: heart disease (1 = no, 2 = yes)

   In [2]: import numpy as np
            import pandas as pd
            import matplotlib.pyplot as plt
            import seaborn as sns
            %matplotlib inline
            from IPython.display import display
            from sklearn.preprocessing import LabelEncoder, MinMaxScaler, StandardScaler
            import pickle
   In [3]: df = pd.read_csv('heart.csv')
            print('NO OF ROWS AND COLUMN IN DATASET ',df.shape,'\n')
            display(df.head(),"\n",df.dtypes)
            NO OF ROWS AND COLUMN IN DATASET (303, 14)
                age sex cp trestbps chol fbs restecg thalach exang oldpeak slope ca thal target
                                    233
                                                                             0 0
                 63
                     1 3
                                145
                                                  0
                                                       150
                                                               0
                                                                      2.3
                 37
                     1 2
                                130
                                    250
                                          0
                                                       187
                                                               0
                                                                      3.5
                                                                             0
                                                                                0
                                                                                    2
                                    204
                      0 1
                                130
                                          0
                                                       172
                                                                             2 0
                                                       178
                                                                             2 0
                 56
                     1 1
                                120
                                    236
                                          0
                                                               0
                                                                      8.0
                                                                                     2
                                120 354
                 57
                     0 0
                                          0
                                                       163
                                                                      0.6
                                                                             2 0
                                                                                   2
             '\n'
                           int64
            age
                           int64
            sex
                           int64
            ср
            trestbps
                           int64
            chol
                           int64
            fbs
                           int64
            restecg
                           int64
            thalach
                           int64
                           int64
            exang
                         float64
            oldpeak
            slope
                           int64
                           int64
            ca
                           int64
            thal
                           int64
            target
            dtype: object
   In [4]: print('COUNT NO OF NULL IN EACH COLUMN','\n',df.isnull().sum())
            COUNT NO OF NULL IN EACH COLUMN
                          0
             age
                         0
            sex
                         0
            ср
            trestbps
                         Θ
            chol
            fbs
                         0
            restecg
                         Θ
            thalach
                         0
            exang
            oldpeak
                         0
            slope
                         Θ
            ca
                         0
            thal
            target
            dtype: int64
    In [5]:
            df.describe().T
   Out[5]:
                                                min
                                                    25% 50%
                                                               75%
                     count
                               mean
                                           std
                 sex 303.0
                             0.683168
                                      0.466011
                                                 0.0
                                                      0.0
                                                           1.0
                                                                 1.0
                                                                       1.0
                     303.0
                             0.966997
                                      1.032052
                                                 0.0
                                                      0.0
                                                            1.0
                                                                 2.0
                                                                       3.0
                     303.0 131.623762 17.538143
                                               94.0 120.0 130.0 140.0 200.0
                     303.0 246.264026 51.830751 126.0 211.0 240.0 274.5 564.0
                     303.0
                             0.148515
                                      0.356198
                                                            0.0
                                                                 0.0
                                                 0.0
                                                      0.0
                                                                       1.0
                     303.0
                             0.528053
                                      0.525860
                                                                       2.0
              restecg
                                                 0.0
                                                      0.0
                                                           1.0
                                                                 1.0
                                               71.0 133.5 153.0 166.0 202.0
                     303.0
                           149.646865 22.905161
              thalach
                     303.0
                             0.326733
                                      0.469794
                                                 0.0
                                                      0.0
                                                            0.0
                                                                 1.0
                                                                       1.0
               exang
              oldpeak
                     303.0
                             1.039604
                                      1.161075
                                                 0.0
                                                      0.0
                                                            8.0
                                                                 1.6
                                                                       6.2
               slope 303.0
                             1.399340
                                      0.616226
                                                                 2.0
                                                 0.0
                                                      1.0
                                                            1.0
                                                                       2.0
                     303.0
                             0.729373
                                      1.022606
                                                 0.0
                                                      0.0
                                                            0.0
                                                                 1.0
                                                                       4.0
                     303.0
                             2.313531
                                      0.612277
                                                 0.0
                                                      2.0
                                                            2.0
                                                                 3.0
                                                                       3.0
                 thal
               target 303.0
                             0.544554
                                      0.498835
                                                0.0
                                                      0.0
                                                            1.0
                                                                 1.0
                                                                       1.0
    In [6]: data = df.copy(deep = True)
            ## showing the count of Nans
            print(data.isnull().sum())
                         0
            age
                         Θ
            sex
                         Θ
            cp
            trestbps
            chol
            fbs
                         0
            restecg
            thalach
            exang
            oldpeak
            slope
            ca
            thal
            target
            dtype: int64
    In [7]: #corr=data.corr()
            #corr.nlargest(15, 'target')['target']
            print(data.corr()["target"].abs().sort_values(ascending=False))
            target
                         1.000000
                         0.436757
            exang
                         0.433798
            oldpeak
                         0.430696
            thalach
                         0.421741
                         0.391724
            ca
            slope
                         0.345877
                         0.344029
            thal
                         0.280937
            sex
                         0.225439
            age
                         0.144931
            trestbps
            restecg
                         0.137230
            chol
                         0.085239
                         0.028046
            fbs
            Name: target, dtype: float64
            age,sex,cp=Chest pain ,trestbps=resting blood pressure ,chol=cholesterol,fbs=fasting blood
            suger,
            restecg= resting electrocardiographic, ca=number of major vessels colored by
            fluoroscopy.
            thalach= maximum heart rate achived, exang=exercise include angina, slope.
   In [8]: x = data[['age','sex','cp','trestbps','chol','fbs','restecg','thalach','exang','slope','ca','thal']]
            y = data['target']
            x.head()
   Out[8]:
                age sex cp trestbps chol fbs restecg thalach exang slope ca thal
             0 63 1 3
                                                                     0 0 1
                               145 233 1
                                                       150
             1 37 1 2
                               130 250 0
                                                       187
                                                                     0 0 2
                                                                     2 0 2
             2 41 0 1
                             130 204 0
                                                       172
                                                                     2 0 2
             3 56 1 1
                            120 236 0 1 178
             4 57 0 0
                               120 354 0
                                              1
                                                       163
                                                             1 2 0 2
   In [9]: 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, random_state=0)
            print('X TRAIN DATA ', x_train.shape)
            print('X TEST DATA ', x_test.shape)
            print('Y TRAIN DATA ', y_train.shape)
            print('Y TEST DATA ', y_test.shape)
            X TRAIN DATA (242, 12)
            X TEST DATA (61, 12)
            Y TRAIN DATA (242,)
            Y TEST DATA (61,)
  In [10]: from sklearn.ensemble import RandomForestClassifier
            clf = RandomForestClassifier(n_estimators=20)
            clf.fit(x_train, y_train)
   Out[10]: RandomForestClassifier(bootstrap=True, ccp alpha=0.0, class weight=None,
                                    criterion='gini', max_depth=None, max_features='auto',
                                    max_leaf_nodes=None, max_samples=None,
                                    min_impurity_decrease=0.0, min_impurity_split=None,
                                    min samples leaf=1, min samples split=2,
                                    min_weight_fraction_leaf=0.0, n_estimators=20,
                                    n_jobs=None, oob_score=False, random_state=None,
                                    verbose=0, warm start=False)
  In [11]: y_pred = clf.predict(x_test)
  In [12]: from sklearn.metrics import confusion_matrix
            print(confusion matrix(y test,y pred))
            [[23 4]
             [ 6 28]]
  In [13]: from sklearn.metrics import classification_report
            print('CLASSIFICATION REPORT','\n',classification report(y test, y pred))
            CLASSIFICATION REPORT
                                         recall f1-score support
                            precision
                        0
                                0.79
                                          0.85
                                                     0.82
                                                                 27
                        1
                                0.88
                                          0.82
                                                     0.85
                                                                 34
                                                     0.84
                 accuracy
                                                                 61
               macro avg
                                                     0.83
                                0.83
                                          0.84
                                                                 61
            weighted avg
                                0.84
                                          0.84
                                                     0.84
                                                                 61
  In [14]: filename = open('heartdiseasespredictmodel.pkl', 'wb')
            pickle.dump(clf,filename )
   In [15]: filename.close()
```