## stroke-prediction

```
[2]: import numpy as np
     import pandas as pd
     df=pd.read_csv('/content/healthcare-dataset-stroke-data.csv')
[2]:
                   gender
                             age
                                  hypertension
                                                 heart_disease ever_married \
     0
            9046
                     Male
                            67.0
                                                              1
     1
           51676
                  Female
                           61.0
                                              0
                                                              0
                                                                          Yes
     2
           31112
                     Male
                           80.0
                                              0
                                                              1
                                                                          Yes
           60182 Female
     3
                            49.0
                                              0
                                                              0
                                                                          Yes
     4
             1665 Female
                           79.0
                                              1
                                                              0
                                                                          Yes
     5105
           18234
                   Female
                                                                          Yes
                            80.0
                                              1
                                                              0
           44873
                   Female
                            81.0
                                              0
     5106
                                                                          Yes
     5107
           19723
                   Female
                            35.0
                                              0
                                                              0
                                                                          Yes
     5108
           37544
                     Male
                            51.0
                                              0
                                                              0
                                                                          Yes
     5109 44679
                           44.0
                                              0
                                                              0
                   Female
                                                                          Yes
                work_type Residence_type
                                           avg_glucose_level
                                                                 bmi
                                                                        smoking_status
     0
                  Private
                                    Urban
                                                        228.69
                                                                36.6
                                                                       formerly smoked
     1
           Self-employed
                                    Rural
                                                        202.21
                                                                 NaN
                                                                          never smoked
     2
                  Private
                                    Rural
                                                        105.92
                                                                32.5
                                                                          never smoked
     3
                  Private
                                    Urban
                                                        171.23
                                                                34.4
                                                                                 smokes
     4
           Self-employed
                                    Rural
                                                        174.12
                                                                24.0
                                                                          never smoked
     5105
                                                         83.75
                  Private
                                    Urban
                                                                 NaN
                                                                          never smoked
                                                        125.20
     5106
                                    Urban
                                                                40.0
           Self-employed
                                                                          never smoked
     5107
           Self-employed
                                    Rural
                                                         82.99
                                                                30.6
                                                                          never smoked
     5108
                  Private
                                    Rural
                                                        166.29
                                                                25.6
                                                                       formerly smoked
     5109
                 Govt_job
                                    Urban
                                                         85.28
                                                                26.2
                                                                               Unknown
           stroke
     0
                 1
     1
                 1
     2
                 1
     3
                 1
```

```
5108
                 0
     5109
                 0
     [5110 rows x 12 columns]
[3]: df.head()
[3]:
            id
                gender
                          age
                               hypertension
                                              heart_disease ever_married
         9046
                  Male
                         67.0
                                                            1
                                           0
                                                           0
        51676
                Female
                        61.0
                                                                        Yes
     1
     2
        31112
                  Male
                        80.0
                                           0
                                                           1
                                                                        Yes
        60182
               Female
                                           0
                                                           0
     3
                        49.0
                                                                        Yes
         1665
               Female
                        79.0
                                                           0
                                           1
                                                                        Yes
             work_type Residence_type
                                         avg_glucose_level
                                                                     smoking_status
                                                               bmi
     0
                                 Urban
                                                     228.69
                                                                    formerly smoked
               Private
                                                              36.6
     1
        Self-employed
                                 Rural
                                                     202.21
                                                               NaN
                                                                       never smoked
     2
               Private
                                 Rural
                                                     105.92
                                                              32.5
                                                                       never smoked
     3
               Private
                                 Urban
                                                     171.23
                                                              34.4
                                                                              smokes
        Self-employed
                                                     174.12
                                                              24.0
                                 Rural
                                                                       never smoked
        stroke
     0
     1
              1
     2
              1
     3
              1
              1
[4]: df.tail()
[4]:
                   gender
                                  hypertension
                                                 heart_disease ever_married
                             age
     5105
            18234
                   Female
                            80.0
                                                               0
                                                                           Yes
                                                               0
                                              0
     5106
           44873
                   Female
                            81.0
                                                                           Yes
     5107
           19723
                   Female
                            35.0
                                              0
                                                               0
                                                                           Yes
     5108
           37544
                                              0
                                                               0
                     Male
                            51.0
                                                                           Yes
     5109
           44679
                  Female
                            44.0
                                              0
                                                                           Yes
                                            avg_glucose_level
                work_type Residence_type
                                                                         smoking_status
                                                                  bmi
     5105
                  Private
                                     Urban
                                                         83.75
                                                                  NaN
                                                                           never smoked
     5106
                                    Urban
                                                        125.20
                                                                 40.0
           Self-employed
                                                                           never smoked
     5107
           Self-employed
                                    Rural
                                                         82.99
                                                                 30.6
                                                                           never smoked
                                                                       formerly smoked
     5108
                  Private
                                     Rural
                                                        166.29
                                                                 25.6
     5109
                 Govt_job
                                     Urban
                                                         85.28
                                                                 26.2
                                                                                Unknown
```

5105

5106

5107

0

0

0

```
stroke
     5105
                0
     5106
                0
     5107
                0
     5108
                0
     5109
                0
[5]: df.columns
[5]: Index(['id', 'gender', 'age', 'hypertension', 'heart_disease', 'ever_married',
            'work_type', 'Residence_type', 'avg_glucose_level', 'bmi',
            'smoking_status', 'stroke'],
           dtype='object')
[6]: df.shape
[6]: (5110, 12)
[7]: #checking for missing values in columns
     df.isna().sum()
[7]: id
                             0
    gender
                             0
                             0
     age
                             0
    hypertension
                             0
    heart_disease
     ever_married
                             0
     work_type
                             0
     Residence_type
                             0
     avg_glucose_level
                             0
    bmi
                           201
     smoking_status
                             0
     stroke
                             0
     dtype: int64
[8]: #Filling the missing values
     df['bmi']=df['bmi'].fillna(df['bmi'].mean())
     df.isna().sum()
[8]: id
                           0
                           0
     gender
     age
                           0
                           0
    hypertension
    heart_disease
                           0
```

```
0
      work_type
                            0
      Residence_type
                            0
      avg_glucose_level
                            0
                            0
      smoking_status
      stroke
                            0
      dtype: int64
 [9]: df.dtypes
 [9]: id
                              int64
                             object
      gender
                            float64
      age
     hypertension
                              int64
     heart_disease
                              int64
      ever_married
                             object
      work_type
                             object
      Residence_type
                             object
      avg_glucose_level
                            float64
                            float64
      smoking_status
                             object
      stroke
                              int64
      dtype: object
[10]: #Encoding the object columns
      from sklearn.preprocessing import LabelEncoder
      lb=LabelEncoder()
      df['gender']=lb.fit_transform(df['gender'])
      df['ever_married']=lb.fit_transform(df['ever_married'])
      df['work_type']=lb.fit_transform(df['work_type'])
      df['Residence_type']=lb.fit_transform(df['Residence_type'])
      df['smoking_status']=lb.fit_transform(df['smoking_status'])
      df.dtypes
[10]: id
                              int64
      gender
                              int64
                            float64
      age
                              int64
      hypertension
     heart_disease
                              int64
      ever_married
                              int64
      work_type
                              int64
      Residence_type
                              int64
      avg_glucose_level
                            float64
      bmi
                            float64
      smoking_status
                              int64
```

ever\_married

0

```
dtype: object
[11]: #Removing the non-essential column
      df.drop(['id'],axis=1,inplace=True)
[11]:
                     age hypertension heart_disease ever_married work_type \
            gender
                 1
                   67.0
                 0 61.0
      1
                                     0
                                                     0
                                                                   1
                                                                               3
      2
                 1 80.0
                                     0
                                                                               2
                                                     1
                                                                   1
                                                                               2
      3
                 0 49.0
                 0 79.0
      4
                                     1
                                                                   1
      5105
                 0.08
                                                                   1
                                                                               2
                                     1
      5106
                 0 81.0
                                                                   1
                                                                               3
                                     0
                                                     0
      5107
                 0 35.0
                                                                   1
                                                                               3
                                     0
                                                     0
      5108
                 1 51.0
                                     0
                                                     0
                                                                   1
                                                                               2
      5109
                 0 44.0
            Residence_type avg_glucose_level
                                                           smoking_status stroke
                                                      bmi
      0
                         1
                                       228.69 36.600000
                                                                                 1
                         0
                                                                        2
      1
                                       202.21
                                                28.893237
                                                                                 1
      2
                         0
                                       105.92
                                                32.500000
                                                                        2
      3
                                                                        3
                         1
                                       171.23
                                                34.400000
                                                                                 1
      4
                         0
                                                                        2
                                       174.12
                                                24.000000
                                        83.75
                                                                        2
                                                28.893237
      5105
                         1
      5106
                         1
                                       125.20
                                               40.000000
                                                                        2
                                                                                 0
      5107
                                                                        2
                         0
                                        82.99
                                                30.600000
                                                                                 0
      5108
                         0
                                        166.29
                                                25.600000
                                                                        1
                                                                                 0
      5109
                                        85.28
                                                26.200000
                                                                        0
                                                                                 0
      [5110 rows x 11 columns]
[12]: #Splitting data into input and output features
      x=df.iloc[:,:-1].values
[12]: array([[ 1.
                             67.
                                             0.
                                                       , ..., 228.69
               36.6
                              1.
                                         ],
             Γ Ο.
                             61.
                                             0.
                                                       , ..., 202.21
               28.89323691,
                              2.
                                         ],
```

int64

stroke

[ 1.

32.5

80.

2.

0.

],

, ..., 105.92

```
[ 0.
                            35.
                                           0.
                                                          82.99
              30.6
                             2.
                                       ],
                            51.
                                           0.
                                                     , ..., 166.29
             [ 1.
              25.6
                                       ],
                            1.
             Γ Ο.
                            44.
                                           0.
                                                          85.28
              26.2
                             0.
                                       ]])
[13]: y=df.iloc[:,-1].values
     У
[13]: array([1, 1, 1, ..., 0, 0, 0])
[14]: #Separating features into training and testing datas
     from sklearn.model_selection import train_test_split
     x_train,x_test,y_train,y_test=train_test_split(x,y,test_size=0.
      →30,random_state=42)
     x_{train}
[14]: array([[ 1. ,
                     4.,
                               0.
                                  , ..., 90.42,
                                                 16.2 ,
                                                          0.],
              1. ,
                                   , ..., 207.58,
            29.
                               0.
                                                 22.8 ,
                                                          3. ],
            [
              1.
                      44. ,
                               1.
                                         91.28,
                                                 26.5 ,
                                                          2.
                                                             ],
            ...,
              0.
                       1.16,
                               0.
                                   , ..., 97.28,
                                                 17.8 ,
                      80.,
                                  , ..., 196.08, 31. ,
                               0.
            [ 0. ,
                                                          3. ]])
                      46.,
                               0.
                                  , ..., 100.15, 50.3 ,
[15]: x_test
[15]: array([[ 1. , 31. , 0. , ..., 64.85, 23. , 0.
            [1., 40., 0., ..., 65.29, 28.3, 2.
            [0., 8., 0., ..., 74.42, 22.5, 0.
            ...,
                 , 42. , 0.
                               , ..., 93.79, 27.2 , 2.
                  , 57.
                        , 0.
                               , ..., 69.4 , 24. , 0.
                 , 60. , 0. , ..., 73.04, 25.3 , 2. ]])
[16]: #Normalization
     from sklearn.preprocessing import MinMaxScaler
     scaler=MinMaxScaler()
     scaler.fit(x_train)
     x_train=scaler.transform(x_train)
     x_test=scaler.transform(x_test)
     x_train
```

```
[16]: array([[1.
                      , 0.04692082, 0. , ..., 0.16295818, 0.06758305,
              0.
                        ],
             Г1.
                        , 0.35239492, 0.
                                                , ..., 0.70381313, 0.14318442,
              1.
             Г1.
                                                , ..., 0.16692826, 0.18556701,
                       , 0.53567937, 1.
             0.66666667],
             ... ,
             ΓΟ.
                        , 0.01221896, 0.
                                                , ..., 0.19462653, 0.08591065,
             0.
                        ],
             [1.
                        , 0.97556207, 0.
                                                , ..., 0.65072477, 0.2371134 ,
             0.33333333],
             [0.
                        , 0.5601173 , 0. , ..., 0.20787554, 0.45819015,
                        ]])
              1.
[17]: #Models creation
      from sklearn.neighbors import KNeighborsClassifier
      from sklearn.naive_bayes import BernoulliNB
      from sklearn.svm import SVC
      from sklearn.metrics import confusion_matrix,accuracy_score
      from sklearn.metrics import classification_report
      knn=KNeighborsClassifier(n_neighbors=7)
      nvb=BernoulliNB()
      sv=SVC()
      lst=[knn,nvb,sv]
[18]: for i in lst:
       print("\n Model-:")
        print(i)
       print("-"*30)
        i.fit(x_train,y_train)
        print("Predicted value -")
       y_pred=i.predict(x_test)
       print(y pred)
       print("\n Confusion matrix -")
       print(confusion matrix(y test,y pred))
        print("\n Accuracy Score - ")
       print(accuracy_score(y_test,y_pred))
       print("\n Classification report - ")
       print(classification_report(y_test,y_pred))
        print('*'*50)
```

Model-:
KNeighborsClassifier(n\_neighbors=7)

-----

Predicted value - [0 0 0 ... 0 0 0]

Confusion matrix -

[[1443 1]

[ 88 1]]

Accuracy Score - 0.9419439008480104

Classification report -

	precision	recall	f1-score	support
0	0.94	1.00	0.97	1444
1	0.50	0.01	0.02	89
accuracy			0.94	1533
macro avg	0.72	0.51	0.50	1533
weighted avg	0.92	0.94	0.92	1533

\*\*\*\*\*\*\*\*\*\*\*\*\*\*\*\*

Model-:

BernoulliNB()

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Predicted value - [0 0 0 ... 0 0 0]

Confusion matrix -

[[1444 0]

[ 89 0]]

Accuracy Score - 0.9419439008480104

Classification report -

	precision	recall	f1-score	support
0	0.94	1.00	0.97	1444
1	0.00	0.00	0.00	89
accuracy			0.94	1533
macro avg	0.47 0.89	0.50 0.94	0.49 0.91	1533 1533
weighted avg	0.09	0.94	0.91	1555

\*\*\*\*\*\*\*\*\*\*\*\*\*\*\*\*\*

Model-: SVC()

\_\_\_\_\_

Predicted value -

[0 0 0 ... 0 0 0]

Confusion matrix -

[[1444 0]

[89 0]]

Accuracy Score -

0.9419439008480104

Classification report -

	precision	recall	f1-score	support
0	0.94	1.00	0.97	1444
1	0.00	0.00	0.00	89
accuracy			0.94	1533
macro avg	0.47	0.50	0.49	1533
weighted avg	0.89	0.94	0.91	1533

\*\*\*\*\*\*\*\*\*\*\*\*\*\*\*\*