

# Answer\_2\_Bank\_Notes\_Classification

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## 1 PATTERN RECOGNITION ASSIGNMENT 1

## 2 CO-324

### 2.1 2021 Semester VI

### 2.2 Submitted to: Sh. Anurag Goel

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## 3 ANSWER 2: BANK NOTES CLASSIFICATION

### 3.1 Required Libraries:

### 3.2 Numpy

NumPy is the fundamental package for scientific computing in Python. It is a Python library that provides a multidimensional array object, various derived objects (such as masked arrays and matrices), and an assortment of routines for fast operations on arrays, including mathematical, logical, shape manipulation, sorting, selecting, I/O, discrete Fourier transforms, basic linear algebra, basic statistical operations, random simulation and much more.

Documentation Link: <https://numpy.org/doc/stable/contents.html>

#### 3.2.1 Pandas

pandas is an open source, BSD-licensed library providing high-performance, easy-to-use data structures and data analysis tools for the Python programming language.

Documentation Link: <https://pandas.pydata.org/docs/>

#### 3.2.2 Sci-Kit Learn

Scikit-learn is an open source machine learning library that supports supervised and unsupervised learning. It also provides various tools for model fitting, data preprocessing, model selection and evaluation, and many other utilities.

Documentation Link: <https://scikit-learn.org/stable/>

```
[21]: import numpy as np
import matplotlib.pyplot as plt
from sklearn.naive_bayes import GaussianNB
from sklearn.metrics import confusion_matrix
from sklearn import metrics
import pandas as pd
from sklearn.model_selection import train_test_split
```

### About the Dataset

The data is available in .csv file where each line corresponds to a bank note and the five values, separated by commas, are, in order, the four features (variance, skewness and kurtosis of Wavelet Transformed image and the entropy of the bank note image) and the class label, an integer with values 0 for real bank notes and 1 for fake bank notes.

```
[22]: url='https://raw.githubusercontent.com/killer4639/bank-note-authentication/
↪master/data.csv'
df=pd.read_csv(url)
```

```
[23]: df.head()
```

```
[23]:    0.37637  -0.82358  0.78543  0.74524  1
0  3.24030  -3.70820  5.28040  0.41291  0
1  3.58290   1.44230  1.02190  1.40080  0
2  0.86202   2.69630  4.29080  0.54739  0
3 -0.21661   8.03290  1.88480 -3.88530  0
4  0.11806   0.39108 -0.98223  0.42843  1
```

### 3.2.3 For Priori = [0.1,0.9]

```
[24]: train, test = train_test_split(df, test_size=0.5)
```

```
[25]: x_train=train.iloc[:,-1]
x_train
```

```
[25]:    0.37637  -0.82358  0.78543  0.74524
310  4.36840   9.67180 -3.96060 -3.162500
1318 -4.14290   2.77490  0.68261 -0.719840
1055  0.33565   6.83690  0.69718 -0.556910
513   0.74307  11.17000 -1.38240 -4.072800
1262  2.61400   8.00810 -3.72580 -1.306900
...      ...      ...      ...      ...
```

```

982 -2.36750 -0.43663 1.69200 -0.430180
953 2.80840 11.30450 -3.33940 -4.419400
323 4.34350 3.32950 0.83598 0.649550
227 1.16400 3.91300 -4.55440 -3.867200
726 5.85190 5.39050 -2.40370 -0.061652

```

[685 rows x 4 columns]

```
[26]: y_train=train.iloc[:,4]
      y_train
```

```

[26]: 310      0
      1318     1
      1055     0
      513     0
      1262     0
      ..
      982     1
      953     0
      323     0
      227     1
      726     0
      Name: 1, Length: 685, dtype: int64

```

```
[27]: x_test=test.iloc[:, :-1]
      y_test=test.iloc[:, 4]
```

```
[28]: x_train.to_numpy()
      x_test.to_numpy()
      y_train.to_numpy()
      y_test.to_numpy()
```

```

[28]: array([0, 0, 0, 0, 0, 1, 0, 1, 0, 0, 0, 0, 1, 1, 0, 0, 1, 0, 1, 0, 1, 0,
            0, 0, 0, 1, 0, 0, 0, 0, 1, 0, 0, 1, 0, 1, 1, 0, 1, 0, 0, 1, 1, 1,
            0, 0, 0, 1, 0, 1, 0, 1, 0, 1, 1, 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, 0,
            0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 1, 1, 0, 0, 1, 1, 1, 1, 0, 1, 1,
            1, 1, 1, 1, 0, 1, 1, 0, 0, 0, 1, 1, 1, 1, 1, 0, 1, 0, 0, 1, 1, 1,
            0, 1, 1, 0, 0, 1, 1, 1, 0, 1, 0, 0, 0, 1, 1, 0, 1, 0, 1, 1, 0, 0,
            0, 0, 1, 0, 0, 1, 1, 0, 1, 1, 0, 1, 1, 1, 0, 1, 0, 1, 0, 1, 0, 1,
            0, 1, 0, 0, 0, 0, 1, 1, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 0, 0, 1, 0,
            1, 0, 1, 0, 0, 0, 0, 0, 0, 0, 1, 1, 0, 0, 0, 0, 0, 0, 1, 0, 1, 0, 0,
            0, 0, 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, 1, 1, 0, 0, 1, 0, 0, 1, 0, 0,
            1, 1, 1, 0, 1, 0, 0, 1, 1, 0, 0, 1, 0, 0, 0, 0, 1, 0, 0, 1, 0, 1,
            0, 1, 0, 1, 1, 1, 1, 1, 0, 0, 1, 0, 0, 1, 0, 0, 1, 0, 0, 0, 0, 0,
            1, 0, 1, 0, 0, 1, 0, 1, 1, 1, 1, 0, 0, 1, 0, 1, 0, 1, 0, 1, 1, 1,
            0, 0, 1, 1, 0, 0, 0, 1, 1, 0, 0, 1, 1, 0, 1, 0, 0, 1, 1, 0, 1, 1,
            0, 1, 1, 1, 1, 0, 0, 0, 1, 0, 1, 0, 0, 0, 0, 0, 0, 1, 1, 0, 1, 1,

```

```

0, 1, 0, 1, 0, 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, 1, 0, 0, 1, 0,
0, 0, 0, 1, 1, 0, 1, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 1, 1, 0, 0,
1, 1, 0, 1, 1, 1, 0, 0, 0, 0, 1, 0, 1, 1, 1, 0, 0, 1, 0, 1, 0, 0,
0, 1, 0, 1, 0, 0, 1, 1, 0, 0, 0, 1, 0, 0, 0, 0, 0, 1, 0, 1, 1, 1,
0, 1, 0, 1, 1, 0, 0, 1, 1, 1, 0, 0, 0, 0, 1, 0, 0, 1, 1, 1, 0, 1,
1, 1, 1, 0, 0, 0, 1, 1, 0, 0, 1, 0, 1, 1, 0, 1, 1, 0, 1, 0, 0, 0,
0, 0, 0, 0, 0, 0, 1, 1, 0, 0, 0, 1, 1, 1, 0, 0, 0, 1, 1, 1, 0, 0,
0, 1, 0, 0, 1, 0, 1, 0, 1, 0, 0, 0, 1, 0, 1, 0, 0, 1, 0, 0, 0, 1,
0, 0, 0, 1, 0, 0, 1, 1, 0, 0, 0, 1, 1, 0, 1, 0, 0, 0, 1, 0, 1, 1,
1, 1, 1, 1, 0, 0, 1, 1, 0, 1, 1, 1, 1, 1, 0, 1, 0, 0, 0, 0, 0, 0,
1, 0, 1, 1, 1, 0, 1, 0, 0, 0, 1, 1, 1, 0, 1, 0, 1, 1, 1, 1, 0, 1,
1, 0, 0, 1, 0, 1, 1, 0, 0, 1, 1, 0, 0, 0, 0, 1, 0, 1, 0, 0, 1, 0,
1, 0, 1, 0, 1, 0, 1, 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0,
1, 1, 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, 1, 0, 0, 0, 1, 0, 1, 1, 1, 1,
0, 0, 0, 1, 0, 0, 0, 0, 1, 0, 0, 1, 0, 0, 0, 1, 0, 0, 1, 1, 1, 0,
0, 0, 1, 0, 0, 1, 0, 1, 0, 0, 1, 0, 0, 1, 0, 0, 1, 1, 0, 0, 1, 1,
1, 1, 1, 1])

```

```
[29]: nb_model=GaussianNB(priors=[0.1,0.9])
```

```
[30]: fit_nb=nb_model.fit(x_train,y_train)
```

```
[31]: prediction=fit_nb.predict(x_test)
con_matrix=confusion_matrix(y_test,prediction)
print(con_matrix)
```

```

[[255 136]
 [  1 294]]

```

```
[32]: def diagonal_sum(con_matrix):
    sum=0
    totalSum=0
    for i in range(2):
        for j in range(2):
            totalSum+=con_matrix[i][j]
            if i==j:
                sum+=con_matrix[i][j]
    return sum,totalSum
```

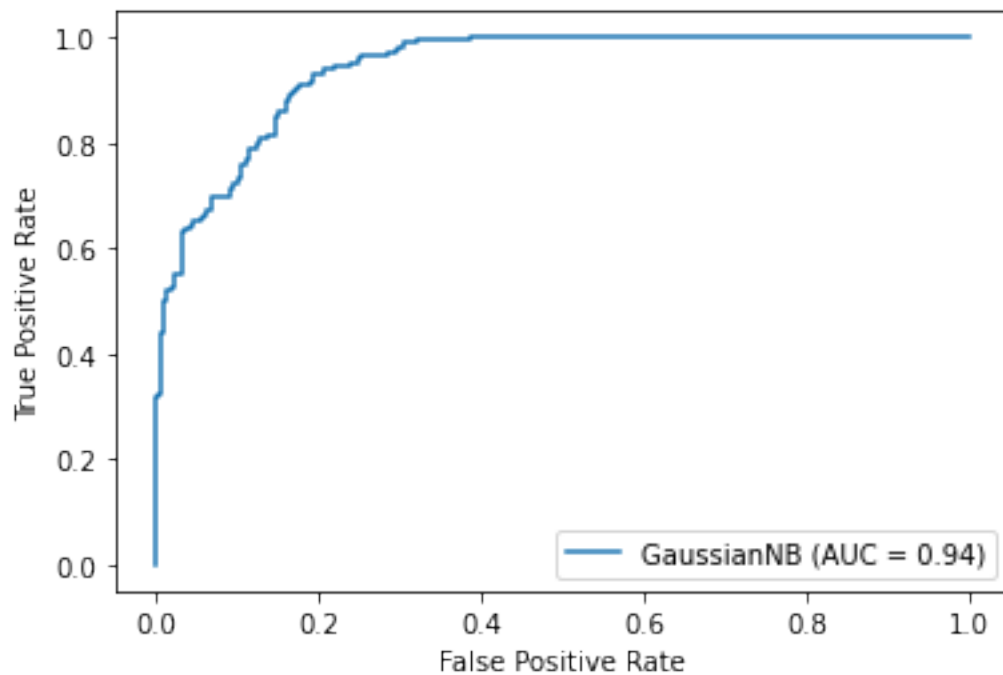
```
[33]: sum,totalSum=diagonal_sum(con_matrix)
print(sum,totalSum)
```

```
549 686
```

```
[34]: print(f'Accuracy % : {sum/totalSum}')
```

```
Accuracy % : 0.8002915451895044
```

```
[35]: metrics.plot_roc_curve(fit_nb, x_test, y_test)
plt.show()
```



### 3.2.4 For Priori = [0.5,0.5]

```
[36]: url='https://raw.githubusercontent.com/killer4639/bank-note-authentication/
↳master/data.csv'
df1=pd.read_csv(url)
```

```
[37]: df1.head()
```

```
[37]:    0.37637  -0.82358  0.78543  0.74524  1
0  3.24030  -3.70820  5.28040  0.41291  0
1  3.58290   1.44230  1.02190  1.40080  0
2  0.86202   2.69630  4.29080  0.54739  0
3 -0.21661   8.03290  1.88480 -3.88530  0
4  0.11806   0.39108 -0.98223  0.42843  1
```

```
[38]: train, test = train_test_split(df1, test_size=0.2)
```

```
[39]: x_train=train.iloc[:, :-1]
x_train
```

```
[39]:      0.37637  -0.82358  0.78543  0.74524
      785    1.53560   9.17720 -2.27180 -0.735350
      528   -0.69572   8.61650  1.84190 -4.328900
      255    1.01350   8.45510 -1.67200 -2.081500
      489    3.62440   1.46090  1.35010  1.928400
      740    0.60050   0.99945 -2.21260  0.097399
      ...
      271   -2.29870  -5.22700  5.63000  0.917220
     1102   4.99230   7.86530 -2.35150 -0.719840
      122    0.31803  -0.99326  1.09470  0.886190
      517    3.52880   0.71596  1.95070  1.937500
      311    1.83840   6.06300  0.54723  0.512480
```

[1096 rows x 4 columns]

```
[40]: y_train=train.iloc[:,4]
      y_train
```

```
[40]: 785      0
      528      0
      255      0
      489      0
      740      1
      ..
      271      1
     1102      0
      122      1
      517      0
      311      0
      Name: 1, Length: 1096, dtype: int64
```

```
[41]: x_test=test.iloc[:, :-1]
      y_test=test.iloc[:,4]
```

```
[42]: x_train.shape
```

```
[42]: (1096, 4)
```

```
[43]: nb_model=GaussianNB(priors=[0.5,0.5])
```

```
[44]: fit_nb=nb_model.fit(x_train,y_train)
```

```
[45]: prediction=fit_nb.predict(x_test)
      con_matrix=confusion_matrix(y_test,prediction)
      print(con_matrix)
```

```
[[120  22]
```

```
[ 19 114]]
```

```
[46]: def diagonal_sum(con_matrix):  
    sum=0  
    totalSum=0  
    for i in range(2):  
        for j in range(2):  
            totalSum+=con_matrix[i][j]  
            if i==j:  
                sum+=con_matrix[i][j]  
    return sum,totalSum
```

```
[47]: sum,totalSum=diagonal_sum(con_matrix)  
    print(sum,totalSum)
```

```
234 275
```

```
[48]: print(f'Accuracy % : {sum/totalSum}')
```

```
Accuracy % : 0.850909090909091
```

```
[49]: metrics.plot_roc_curve(fit_nb, x_test, y_test)  
    plt.show()
```

