

## Program-5

Program - 5

(Naive - Bayesian Classifier)

```
def splitDataset(dataset, splitRatio):  
    testSize = int(len(dataset) * splitRatio);  
    trainSet = list(dataset);  
    testSet = []  
    while len(testSet) < testSize:  
        index = randrange(len(trainSet));  
        testSet.append(trainSet.pop(index))  
    return [trainSet, testSet]
```

```
import random, math  
import statistics as st
```

```
def estimateProbability(x, mean, stdev):  
    exponent = math.exp(-(math.pow(x-mean, 2)  
        / (2 * math.pow(stdev, 2))))  
    return (1 / (math.sqrt(2 * math.pi) * stdev)) *  
        exponent
```

```
def calculateClassProbabilities(summaries, testVector):  
    p = {}  
    for classValue, classSummaries in summaries.items():  
        p[classValue] = 1  
        for i in range(len(classSummaries)):  
            mean, stdev = classSummaries[i]  
            x = testVector[i]  
            p[classValue] *= estimateProbability(x, mean,  
                stdev)  
    return p
```

```

def predict(summaries, testVector):
    all_probs = calculateClassProbabilities(summaries, testVector)
    print("All Probabilities")
    print(all_probs)
    bestLabel, bestProb = None, -1
    for lbl, p in all_probs.items():
        if bestLabel is None or p > bestProb:
            bestProb = p
            bestLabel = lbl

```

```

    return bestLabel

def performClassification(summaries, testSet):
    predictions = []
    for i in range(len(testSet)):
        result = predict(summaries, testSet[i])
        predictions.append(result)
    return predictions

```

```

def computeMeanStd(dataset):
    mean_std = [(st.mean(attribute), st.stdev(attributes))
                for attribute in zip(*dataset)]
    del mean_std[-1]
    return mean_std

```

```

def getAccuracy(testSet, predictions):
    correct = 0
    for i in range(len(testSet)):
        if testSet[i][0] == predictions[i]:
            correct += 1
    return (correct / float(len(testSet))) * 100.0

```

```

def separateByClass(dataset):
    separated = {}
    for i in range(len(dataset)):
        x = dataset[i]
        if (x[-1]) not in separated:
            separated[x[-1]] = []

```



```

separated[x[-1]].append(x)
return separated

def summarizeByClass(dataset):
    separated = separateByClass(dataset);
    print("separated by 0 & 1. class\n")
    print(separated)
    summary = {}
    for classValue, instances in separated.items():
        summary[classValue] = computeMeanStd(instances)
    print("Summary of mean and standard deviation")
    print(summary)
    return summary

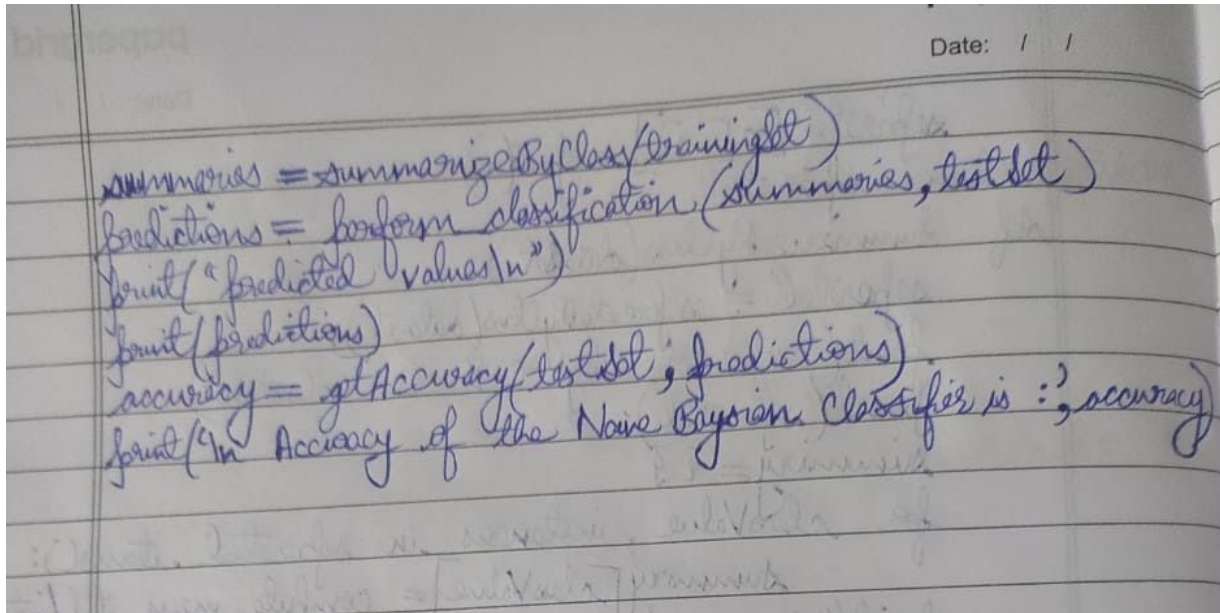
def loadCsv(filename):
    lines = csv.reader(open(filename, "r"));
    dataset = list(lines)
    for i in range(len(dataset)):
        dataset[i] = [float(x) for x in dataset[i]]
    return dataset

import numpy as np
import pandas as pd
import csv

dataset = local.loadCsv('data5.csv');
print('Pima Indian Diabetes Dataset loaded...')
print('Total instances available:', len(dataset))
print('Total attributes present:', len(dataset[0]) - 1)
print('First five instances of dataset:')
for i in range(5):
    print(i+1, ': ', dataset[i])

splitRatio = 0.2
trainSet, testSet = splitDataset(dataset, splitRatio)
print('Data set is split into training and testing set.')
print('Training set size, len(trainSet)')
print('Test set size, len(testSet)')

```



## OUTPUT

```

In [1]: def splitDataset(dataset, splitRatio):
testSize = int(len(dataset) * splitRatio);
trainSet = list(dataset);
testSet = []
while len(testSet) < testSize:
    #randomly pick an instance from training data
    index = random.randrange(len(trainSet));
    testSet.append(trainSet.pop(index))
return [trainSet, testSet]

In [2]: import random, math
import statistics as st

In [3]: def estimateProbability(x, mean, stdev):
exponent = math.exp(-(math.pow(x-mean,2)/(2*math.pow(stdev,2))))
return (1 / (math.sqrt(2*math.pi) * stdev)) * exponent

In [4]: def calculateClassProbabilities(summaries, testVector):
p = {}
#class and attribute information as mean and sd
for classValue, classSummaries in summaries.items():
    p[classValue] = 1
    for i in range(len(classSummaries)):
        mean, stdev = classSummaries[i]
        x = testVector[i] #testVector's first attribute
        #use normal distribution
        p[classValue] *= estimateProbability(x, mean, stdev)
return p

```

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```
In [5]: def predict(summaries, testVector):
        all_p = calculateClassProbabilities(summaries, testVector)
        print("All Probabilities\n")
        print(all_p)
        bestLabel, bestProb = None, -1
        for lbl, p in all_p.items(): # assigns that class which has the highest prob
            if bestLabel is None or p > bestProb:
                bestProb = p
                bestLabel = lbl
        return bestLabel

In [6]: def perform_classification(summaries, testSet):
        predictions = []
        for i in range(len(testSet)):
            result = predict(summaries, testSet[i])
            predictions.append(result)
        return predictions

In [7]: def compute_mean_std(dataset):
        mean_std = [(st.mean(attribute), st.stdev(attribute)) for attribute in zip(*dataset)]; #zip(*res) transposes a matrix (2-d to 1-d)
        del mean_std[-1] # Exclude Label
        return mean_std

In [8]: def getAccuracy(testSet, predictions):
        correct = 0
        for i in range(len(testSet)):
            if testSet[i][1] == predictions[i]:
                correct += 1
        return (correct/float(len(testSet))) * 100.0
```

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```
In [9]: def separateByClass(dataset):
        separated = {}
        for i in range(len(dataset)):
            x = dataset[i]
            if (x[-1] not in separated):
                separated[x[-1]] = []
            separated[x[-1]].append(x)
        return separated

In [10]: def summarizeByClass(dataset):
        separated = separateByClass(dataset);
        print("separated by 0 and 1 class\n")
        print(separated)
        summary = {} # to store mean and std of +ve and -ve instances
        for classValue, instances in separated.items():
            # summaries is a dictionary of tuples(mean, std) for each class value
            summary[classValue] = compute_mean_std(instances)
        print("Summary of mean and standard deviation")
        print(summary)
        return summary

In [11]: def loadCsv(filename):
        lines = csv.reader(open(filename, "r"));
        dataset = list(lines)
        for i in range(len(dataset)):
            dataset[i] = [float(x) for x in dataset[i]]
        return dataset

In [12]: import numpy as np
import pandas as pd
```

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Python 3

```
In [12]: import numpy as np
import pandas as pd
import csv
dataset = loadCsv('data5.csv');
print('Pima Indian Diabetes Dataset loaded...')
print('Total instances available :',len(dataset))

Pima Indian Diabetes Dataset loaded...
Total instances available : 768

In [13]: print('Total attributes present :',len(dataset[0])-1)
print('First Five instances of dataset:')
for i in range(5):
    print(i+1, ': ', dataset[i])

Total attributes present : 8
First Five instances of dataset:
1 : [6.0, 148.0, 72.0, 35.0, 0.0, 33.6, 0.627, 50.0, 1.0]
2 : [1.0, 85.0, 66.0, 29.0, 0.0, 26.6, 0.351, 31.0, 0.0]
3 : [8.0, 183.0, 64.0, 0.0, 0.0, 23.3, 0.672, 32.0, 1.0]
4 : [1.0, 89.0, 66.0, 23.0, 94.0, 28.1, 0.167, 21.0, 0.0]
5 : [0.0, 137.0, 40.0, 35.0, 168.0, 43.1, 2.288, 33.0, 1.0]

In [14]: splitRatio = 0.2
trainingSet, testSet = splitDataset(dataset, splitRatio)
print('\nDataset is split into training and testing set.')
print('Training Set Size',len(trainingSet))
print('Testing Set Size',len(testSet))
```

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Python 3

```
Dataset is split into training and testing set.
Training Set Size 615
Testing Set Size 153

In [15]: summaries = summarizeByClass(trainingSet)

separated by 0 and 1 class

{1.0: [[6.0, 148.0, 72.0, 35.0, 0.0, 33.6, 0.627, 50.0, 1.0], [8.0, 183.0, 64.0, 0.0, 0.0, 23.3, 0.672, 32.0, 1.0], [0.0, 137.0, 40.0, 35.0, 168.0, 43.1, 2.288, 33.0, 1.0], [3.0, 78.0, 50.0, 32.0, 88.0, 31.0, 0.248, 26.0, 1.0], [8.0, 125.0, 96.0, 0.0, 0.0, 0.0, 0.232, 54.0, 1.0], [5.0, 166.0, 72.0, 19.0, 175.0, 25.8, 0.587, 51.0, 1.0], [7.0, 100.0, 0.0, 0.0, 0.0, 30.0, 0.0, 0.0, 0.0], [0.0, 118.0, 84.0, 47.0, 230.0, 45.8, 0.551, 31.0, 1.0], [7.0, 107.0, 74.0, 0.0, 0.0, 29.6, 0.254, 31.0, 1.0], [1.0, 115.0, 70.0, 30.0, 96.0, 34.6, 0.529, 32.0, 1.0], [7.0, 196.0, 90.0, 0.0, 0.0, 39.8, 0.451, 41.0, 1.0], [9.0, 119.0, 80.0, 35.0, 0.0, 29.0, 0.263, 29.0, 1.0], [11.0, 143.0, 94.0, 33.0, 146.0, 36.6, 0.254, 51.0, 1.0], [10.0, 125.0, 70.0, 2.6, 0.0, 31.1, 0.285, 41.0, 1.0], [7.0, 147.0, 76.0, 0.0, 0.0, 39.4, 0.257, 43.0, 1.0], [3.0, 158.0, 76.0, 36.0, 245.0, 3.1, 0.851, 28.0, 1.0], [2.0, 90.0, 68.0, 42.0, 0.0, 38.2, 0.503, 27.0, 1.0], [4.0, 111.0, 72.0, 47.0, 207.0, 37.1, 1.39, 56.0, 1.0], [0.0, 180.0, 66.0, 39.0, 0.0, 42.0, 1.893, 25.0, 1.0], [7.0, 103.0, 66.0, 32.0, 0.0, 39.1, 0.344, 31.0, 1.0], [8.0, 176.0, 90.0, 34.0, 300.0, 33.7, 0.467, 58.0, 1.0], [7.0, 187.0, 68.0, 39.0, 304.0, 37.7, 0.254, 41.0, 1.0], [8.0, 133.0, 72.0, 0.0, 0.0, 32.9, 0.27, 39.0, 1.0], [7.0, 114.0, 66.0, 0.0, 0.0, 32.8, 0.258, 42.0, 1.0], [2.0, 100.0, 66.0, 20.0, 90.0, 32.9, 0.867, 28.0, 1.0], [13.0, 126.0, 90.0, 0.0, 0.0, 43.4, 0.583, 42.0, 1.0], [0.0, 131.0, 0.0, 0.0, 0.0, 43.2, 0.27, 26.0, 1.0], [5.0, 137.0, 188.0, 0.0, 0.0, 48.8, 0.227, 37.0, 1.0], [15.0, 136.0, 70.0, 32.0, 110.0, 37.1, 0.153, 43.0, 1.0], [4.0, 13.4, 72.0, 0.0, 0.0, 23.8, 0.277, 60.0, 1.0], [1.0, 122.0, 90.0, 51.0, 220.0, 49.7, 0.325, 31.0, 1.0], [1.0, 163.0, 72.0, 0.0, 0.0, 39.0, 1.222, 33.0, 1.0], [0.0, 95.0, 85.0, 25.0, 36.0, 37.4, 0.247, 24.0, 1.0], [3.0, 171.0, 72.0, 33.0, 135.0, 33.3, 0.199, 24.0, 1.0], [8.0, 155.0, 62.0, 26.0, 495.0, 34.0, 0.543, 46.0, 1.0], [7.0, 160.0, 54.0, 32.0, 175.0, 30.5, 0.588, 39.0, 1.0], [4.0, 146.0, 92.0, 0.0, 0.0, 31.2, 0.539, 61.0, 1.0], [5.0, 124.0, 74.0, 0.0, 0.0, 34.0, 0.22, 38.0, 1.0], [0.0, 16.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0]]]

In [16]: predictions = perform_classification(summaries, testSet)
print("predicted values\n")
print(predictions)
```

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```
summary = summaries[0:10000, :]
summary = summary.astype('float32').ravel()

0, 0.0], [10.0, 94.0, 72.0, 18.0, 0.0, 23.1, 0.595, 56.0, 0.0], [1.0, 108.0, 60.0, 46.0, 178.0, 35.5, 0.415, 24.0, 0.0], [1.0, 114.0, 66.0, 36.0, 200.0, 38.1, 0.289, 21.0, 0.0], [5.0, 117.0, 86.0, 30.0, 105.0, 39.1, 0.251, 42.0, 0.0], [1.0, 111.0, 94.0, 0.0, 0.0, 32.8, 0.265, 45.0, 0.0], [4.0, 112.0, 78.0, 40.0, 0.0, 39.4, 0.236, 38.0, 0.0], [1.0, 116.0, 78.0, 29.0, 180.0, 36.1, 0.496, 25.0, 0.0], [0.0, 141.0, 84.0, 26.0, 0.0, 32.4, 0.433, 22.0, 0.0], [2.0, 92.0, 52.0, 0.0, 0.0, 30.1, 0.141, 22.0, 0.0], [2.0, 105.0, 75.0, 0.0, 0.0, 23.3, 0.556, 53.0, 0.0], [4.0, 95.0, 60.0, 32.0, 0.0, 35.4, 0.284, 28.0, 0.0], [0.0, 126.0, 86.0, 27.0, 120.0, 27.4, 0.515, 21.0, 0.0], [8.0, 65.0, 72.0, 23.0, 0.0, 32.0, 0.6, 42.0, 0.0], [2.0, 99.0, 60.0, 17.0, 160.0, 36.6, 0.453, 21.0, 0.0], [1.0, 109.0, 58.0, 18.0, 116.0, 28.5, 0.219, 22.0, 0.0], [13.0, 153.0, 88.0, 37.0, 140.0, 40.6, 1.174, 39.0, 0.0], [12.0, 100.0, 84.0, 33.0, 105.0, 30.0, 0.488, 46.0, 0.0], [1.0, 81.0, 74.0, 41.0, 57.0, 46.3, 1.096, 32.0, 0.0], [1.0, 121.0, 78.0, 39.0, 74.0, 39.0, 0.261, 28.0, 0.0], [3.0, 108.0, 62.0, 24.0, 0.0, 26.0, 0.223, 25.0, 0.0], [7.0, 137.0, 90.0, 41.0, 0.0, 32.0, 0.391, 39.0, 0.0], [1.0, 106.0, 76.0, 0.0, 0.0, 37.5, 0.197, 26.0, 0.0], [10.0, 101.0, 76.0, 48.0, 180.0, 32.9, 0.171, 63.0, 0.0], [2.0, 122.0, 70.0, 27.0, 0.0, 36.8, 0.34, 27.0, 0.0], [1.0, 93.0, 70.0, 31.0, 0.0, 30.4, 0.315, 23.0, 0.0]]

Summary of mean and standard deviation
1.0: [(5.023584905660377, 3.8298417149377393), (141.72641509433961, 32.18077876131496), (70.41509433962264, 22.63699439318159), (21.44811320754717, 18.287647560448562), (95.93396226415095, 131.15619781384464), (35.23443396226415, 7.665624205817336), (0.5545094339622642, 0.3873311341649635), (37.5, 11.07984806643825)], 0.0: [(3.3424317617866004, 3.092578347915159), (109.63523573200993, 26.063326040817657), (67.65508684863524, 19.10387011610047), (19.47394540942928, 14.978465174113696), (69.03970223325062, 95.83305037506487), (30.338461538461537, 7.6668471642298804), (0.4284863523573201, 0.2880348180434413), (31.59305210918114, 11.788060042557028)]]

In [16]: predictions = perform_classification(summaries, testSet)
print("predicted values\n")
print(predictions)

All Probabilities

{1.0: 2.0294624357397167e-13, 0.0: 2.0706772931893e-12}
All Probabilities
```

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```
In [16]: predictions = perform_classification(summaries, testSet)
print("predicted values\n")
print(predictions)

All Probabilities

{1.0: 2.3342605912882394e-13, 0.0: 1.1838772926831941e-12}
All Probabilities

{1.0: 4.4709056380903254e-13, 0.0: 9.927056481709797e-13}
All Probabilities

{1.0: 1.0348342514823991e-12, 0.0: 9.889850044353876e-13}
All Probabilities

{1.0: 1.5875566066843367e-15, 0.0: 1.199376164018765e-16}
All Probabilities

{1.0: 2.4750927017444546e-13, 0.0: 2.2108161357620938e-12}
All Probabilities

{1.0: 4.727786998254915e-15, 0.0: 4.0016147307919965e-15}
All Probabilities

In [17]: accuracy = getAccuracy(testSet, predictions)
print('\nAccuracy of the Naive Bayesian Classifier is :', accuracy)

Accuracy of the Naive Bayesian Classifier is : 76.47058823529412
```

### OUTPUT For Iris Dataset





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```
In [8]: def getAccuracy(testSet, predictions):
        correct = 0
        for i in range(len(testSet)):
            if testSet[i][1] == predictions[i]:
                correct += 1
        return (correct/float(len(testSet))) * 100.0

In [9]: def separateByClass(dataset):
        separated = {}
        for i in range(len(dataset)):
            x = dataset[i]
            if (x[-1] not in separated):
                separated[x[-1]] = []
            separated[x[-1]].append(x)
        return separated

In [10]: def summarizeByClass(dataset):
        separated = separateByClass(dataset);
        print("separated by 0,1,2 class\n")
        print(separated)
        summary = {} # to store mean and std of +ve and -ve instances
        for classValue, instances in separated.items():
            #summary is a dictionary of tuples(mean,std) for each class value
            summary[classValue] = compute_mean_std(instances)
        print("Summary of mean and standard deviation")
        print(summary)
        return summary

In [11]: def loadCsv(filename):
        lines = csv.reader(open(filename, "r"));
```

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```
In [11]: def loadCsv(filename):
        lines = csv.reader(open(filename, "r"));
        dataset = list(lines)
        for i in range(len(dataset)):
            dataset[i] = [float(x) for x in dataset[i]]
        return dataset

In [12]: import numpy as np
import pandas as pd
import csv
dataset = loadCsv('iris.csv');
print('Iris Dataset loaded...')
print('Total instances available :',len(dataset))

Iris Dataset loaded...
Total instances available : 150

In [13]: print('Total attributes present :',len(dataset[0])-1)
print("First Five instances of dataset:")
for i in range(5):
    print(i+1, ': ', dataset[i])

Total attributes present : 4
First Five instances of dataset:
1 : [5.1, 3.5, 1.4, 0.2, 1.0]
2 : [4.9, 3.0, 1.4, 0.2, 1.0]
3 : [4.7, 3.2, 1.3, 0.2, 1.0]
4 : [4.6, 3.1, 1.5, 0.2, 1.0]
5 : [5.0, 3.6, 1.4, 0.2, 1.0]
```

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In [14]:

```
splitRatio = 0.2
trainingSet, testSet = splitDataset(dataset, splitRatio)
print('\nDataset is split into training and testing set.')
print('Training Set Size',len(trainingSet))
print('Testing Set Size',len(testSet))
```

Dataset is split into training and testing set.  
Training Set Size 120  
Testing Set Size 30

In [15]:

```
summaries = summarizeByClass(trainingSet)
```

separated by 0,1,2 class

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MLL/ x Untitled4 - Jupyter x MLL-5 - Jupyter N x MLL-5-Iris - Jupyter x Mrs Varalakshmi x MLL-5 - Google D x (11) WhatsApp x + -

localhost:8888/notebooks/MLL/MLL-5-Iris.ipynb#

jupyter MLL-5-Iris Last Checkpoint: 8 hours ago (autosaved) Logout

File Edit View Insert Cell Kernel Widgets Help Trusted Python 3

```
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```

Summary of mean and standard deviation

```
{1:0: [(4.9625, 0.33869091877630625), (3.4275, 0.33740145759872403), (1.4725, 0.1782931898263687), (0.23500000000000001, 0.10265700920278915)], 2:0: [(5.95, 0.5381399396017681), (2.768421052631579, 0.3353942924927314), (4.302631578947368, 0.4945578653899472), (1.3447368421052632, 0.203612467654495)], 3:0: [(6.5476190476190474, 0.6306164600042876), (2.9833333333333334, 0.3385166110177746), (5.511904761904762, 0.5583959522498049), (2.0357142857142856, 0.2809577943926189)]}
```



MLL/ x | Untitled4 - Jupyter x | MLL-5 - Jupyter N x | MLL-5-Iris - Jupyter x | Mrs Varalakshmi x | MLL-5 - Google D x | (11) WhatsApp x | + -

localhost:8888/notebooks/MLL/MLL-5-Iris.ipynb#

jupyter MLL-5-Iris Last Checkpoint: 8 hours ago (autosaved) Logout

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In [16]:

```
predictions = perform_classification(summaries, testSet)
print("predicted values\n")
print(predictions)
```

All Probabilities

```
{1.0: 3.43156629086456e-188, 2.0: 5.348584079315069e-07, 3.0: 0.10631861854523009}
All Probabilities
{1.0: 1.4231536944691792, 2.0: 3.154740705303499e-13, 3.0: 1.825226520428173e-20}
All Probabilities
{1.0: 6.136215586095264e-96, 2.0: 0.44974971247317946, 3.0: 0.004533802122085477}
All Probabilities
{1.0: 6.067619704369969e-37, 2.0: 0.0033800352915031493, 3.0: 2.127784393712095e-09}
All Probabilities
{1.0: 0.009183847069992092, 2.0: 2.647805860999311e-16, 3.0: 1.1543431015077508e-24}
All Probabilities
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All Probabilities
{1.0: 7.474120988684165e-70, 2.0: 1.0803836461661434, 3.0: 0.00042142334311851833}
All Probabilities
{1.0: 4.5449444782301686e-82, 2.0: 0.8880088713079701, 3.0: 0.0021969992338884375}
All Probabilities
{1.0: 3.852424747274754e-109, 2.0: 2.854959338096642e-06, 3.0: 0.43652102581387947}
```

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ENG IN 19:04 25-11-2020

MLL/ x Untitled4 - Jupyter x MLL-5 - Jupyter N x MLL-5-Iris - Jupyter x Mrs Varalakshmi x MLL-5 - Google D x (11) WhatsApp x + -

localhost:8888/notebooks/MLL/MLL-5-Iris.ipynb#

jupyter MLL-5-Iris Last Checkpoint: 8 hours ago (autosaved) Logout

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```
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All Probabilities

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All Probabilities

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All Probabilities

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All Probabilities

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All Probabilities

{1.0: 5.20513608025665e-142, 2.0: 0.024473772359715706, 3.0: 0.23887476144434996}
All Probabilities

{1.0: 2.813803989552072, 2.0: 4.987311674138759e-17, 3.0: 1.8352973471892824e-24}
All Probabilities

{1.0: 3.644290766234613, 2.0: 7.113232482235426e-15, 3.0: 1.4061357935646838e-22}
All Probabilities

{1.0: 1.096377647629938e-85, 2.0: 0.8001159673295936, 3.0: 0.004582421214162276}
All Probabilities

{1.0: 3.2324830969407943e-214, 2.0: 6.250745381116599e-07, 3.0: 0.3938345570819019}
All Probabilities

{1.0: 8.444620474562774e-215, 2.0: 1.2098458997358836e-06, 3.0: 0.13389589461366982}
predicted values
```

Type here to search

ENG IN 19:04 25-11-2020

MLL/ x Untitled4 - Jupyter x MLL-5 - Jupyter N x MLL-5-Iris - Jupyter x Mrs Varalakshmi x MLL-5 - Google D x (11) WhatsApp x + -

localhost:8888/notebooks/MLL/MLL-5-Iris.ipynb#

jupyter MLL-5-Iris Last Checkpoint: 8 hours ago (autosaved) Logout

File Edit View Insert Cell Kernel Widgets Help Trusted Python 3

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All Probabilities

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All Probabilities

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All Probabilities

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All Probabilities

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All Probabilities

{1.0: 3.538241074262375, 2.0: 2.540296587643565e-16, 3.0: 5.0949501840891655e-23}
All Probabilities
```

Type here to search

ENG IN 19:04 25-11-2020

MLL/ x | Untitled4 - Jupyter x | MLL-5 - Jupyter N x | MLL-5-Iris - Jupyter x | Mrs Varalakshmi 7 x | MLL-5 - Google D x | (11) WhatsApp x | + -

localhost:8888/notebooks/MLL/MLL-5-Iris.ipynb#

jupyter MLL-5-Iris Last Checkpoint: 8 hours ago (autosaved) Logout

File Edit View Insert Cell Kernel Widgets Help Trusted Python 3

+ %> Run C Code

```
{1.0: 3.644290766234613, 2.0: 7.113232482235426e-15, 3.0: 1.4061357935646838e-22}
All Probabilities

{1.0: 1.906377647629938e-85, 2.0: 0.8001159673295936, 3.0: 0.004582421214162276}
All Probabilities

{1.0: 3.2324830969407943e-214, 2.0: 6.250745381116599e-07, 3.0: 0.3938345570819019}
All Probabilities

{1.0: 4.844620474562774e-215, 2.0: 1.2098458997358836e-06, 3.0: 0.13389589461366982}
predicted values

[3.0, 1.0, 2.0, 2.0, 1.0, 3.0, 2.0, 2.0, 3.0, 2.0, 1.0, 2.0, 2.0, 1.0, 2.0, 3.0, 2.0, 1.0, 1.0, 2.0, 1.0, 2.0, 3.0, 1.0, 3.0,
1.0, 1.0, 2.0, 3.0, 3.0]
```

In [17]: `accuracy = getAccuracy(testSet, predictions)`  
`print('\nAccuracy of the Naive Bayesian Classifier is :', accuracy)`

Accuracy of the Naive Bayesian Classifier is : 100.0

In [ ]:

Type here to search

19:04 25-11-2020