

VISVESVARAYA TECHNOLOGICAL UNIVERSITY

“JnanaSangama”, Belgaum -590014, Karnataka.



LAB REPORT on

MACHINE LEARNING (20CS6PCMAL)

Submitted by

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in partial fulfillment for the award of the degree of
BACHELOR OF ENGINEERING
in
COMPUTER SCIENCE AND ENGINEERING



B.M.S. COLLEGE OF ENGINEERING
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Department of Computer Science and Engineering



CERTIFICATE

This is to certify that the Lab work entitled “**MACHINE LEARNING**” carried out by **Ruben Mathew(1BM19CS207)**, who is bonafide student of **B. M. S. College of Engineering**. It is in partial fulfillment for the award of **Bachelor of Engineering in Computer Science and Engineering** of the Visvesvaraya Technological University, Belgaum during the year 2022. The Lab report has been approved as it satisfies the academic requirements in respect of a **Machine Learning- (20CS6PCMAL)** work prescribed for the said degree.

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LAB PROGRAM 1:

Implement and demonstrate the FIND-S algorithm for finding the most specific hypothesis based on a given set of training data samples.

Code:

i.

```
import
csv

def updateHypothesis(x,h):
    if h==[]:
        return x

    for i in range(0,len(h)):
        if x[i].upper()!=h[i].upper():
            h[i] = '?'

    return h

if __name__ == "__main__":
    data = []
    h = []

    # reading csv file
    with open('data.csv', 'r') as file:
        reader = csv.reader(file)
        print("Data: ")
        for row in reader:
            data.append(row)
            print(row)

    if data:
        for x in data:
            if x[-1].upper()=="YES":
                x.pop() # removing last field
                h = updateHypothesis(x,h)
```

```
print("\nHypothesis: ",h)
```

ii.

```
In [1]: import pandas as pd
import numpy as np
```

```
In [2]: n=int(input("Enter number of rows:"))
columns=['Time','Weather','Temperature','humidity','Enjoying?']
ds=[]
print("Enter the data:\n")
for i in range(n):
    print("Enter Hypothesis:",i+1,"\n")
    temp=[]
    for x in columns:
        t=input("Enter value for: "+x+" : ")
        temp.append(t)
    d.append(temp)
```

Enter number of rows:3

Enter the data:

Enter Hypothesis: 1

Enter value for: Time: eve

Enter value for: Weather: sunny

Enter value for: Temperature: warm

Enter value for: humidity: mild

Enter value for: Enjoying?: yes

Enter Hypothesis: 2

Enter value for: Time: eve

Enter value for: Weather: rainy

Enter value for: Temperature: cold

Enter value for: humidity: less

Enter value for: Enjoying?: yes

Enter Hypothesis: 3

Enter value for: Time: eve

Enter value for: Weather: sunny

Enter value for: Temperature: warm

Enter value for: humidity: mild

Enter value for: Enjoying?: no

```
In [ ]: for x in d:
        print(x)
```

Enter value for: Time: eve
Enter value for: Weather: rainy
Enter value for: Temperature: cold
Enter value for: humidity: less
Enter value for: Enjoying?: yes
Enter Hypothesis: 3

Enter value for: Time: eve
Enter value for: Weather: sunny
Enter value for: Temperature: warm
Enter value for: humidity: mild
Enter value for: Enjoying?: no

```
In [ ]: for x in d:  
        print(x)  
        hypo=[]  
        for i in range(len(d[0])):  
            hypo.append("?")  
        for i in range(len(d)):  
            if d[i][len(d[0])-1]=='yes':  
                hypo=d[i]
```

```
In [ ]: for i in range(len(d)):  
        if d[i][len(d[0])-1]=='yes':  
            for j in range(len(d[0])):  
                if d[i][j]!=hypo[j]:  
                    hypo[j]="?"
```

```
In [ ]: print(hypo)
```

```
In [ ]:
```

```
In [ ]:
```

1	sky	air temp	humidity	wind	water	forecast	enjoy sport
2	sunny	warm	normal	strong	warm	same	yes
3	sunny	warm	high	strong	warm	same	yes
4	rainy	cold	high	strong	warm	change	no
5	sunny	warm	high	strong	cool	change	yes

LAB PROGRAM 2:

For a given set of training data examples stored in a .CSV file, implement and demonstrate the Candidate-Elimination algorithm to output a description of the set of all hypotheses consistent with the training examples.

CODE:

```
import numpy as np
import pandas as pd

data = pd.read_csv("testdemo.csv")
concepts = np.array(data.iloc[:,0:-1])
print("\nInstances are:\n",concepts)
target = np.array(data.iloc[:,-1])
print("\nTarget Values are: ",target)
def learn(concepts, target):
    specific_h = concepts[0].copy()
    print("\nSpecific Boundary: ", specific_h)
    general_h = [['?' for i in range(len(specific_h))] for i in
range(len(specific_h))]
    print("\nGeneric Boundary: ",general_h)

    for i, h in enumerate(concepts):
        print("\nInstance", i+1 , "is ", h)
        if target[i] == "yes":
            for x in range(len(specific_h)):
                if h[x]!= specific_h[x]:
                    specific_h[x] ='?'
                    general_h[x][x] ='?'

        if target[i] == "no":
            for x in range(len(specific_h)):
                if h[x]!= specific_h[x]:
                    general_h[x][x] = specific_h[x]
                else:
                    general_h[x][x] = '?'

    print("Specific Boundary = ", specific_h)
    print("Generic Boundary = ", general_h)
    print("\n")

    indices = [i for i, val in enumerate(general_h) if val == ['?', '?', '?',
'?', '?', '?']]
    for i in indices:
        general_h.remove(['?', '?', '?', '?', '?', '?'])
    return specific_h, general_h
```

```
s_final, g_final = learn(concepts, target)

print(" The Final Specific_h : ", s_final, sep="\n")
print("The Final General_h : ", g_final, sep="\n")
```

1	sky	airtemp	humidity	wind	water	forecast	enjoysport
2	sunny	warm	normal	strong	warm	same	yes
3	sunny	warm	high	strong	warm	same	yes
4	rainy	cold	high	strong	warm	change	no
5	sunny	warm	high	strong	cool	change	yes

In [1]:

```
import numpy as np
import pandas as pd

data = pd.read_csv("testdemo.csv")
concepts = np.array(data.iloc[:,0:-1])
print("\nInstances are:\n",concepts)
target = np.array(data.iloc[:,-1])
print("\nTarget Values are: ",target)
```

Instances are:

```
[[ 'sunny' 'warm' 'normal' 'strong' 'warm' 'same' ]
 [ 'sunny' 'warm' 'high' 'strong' 'warm' 'same' ]
 [ 'rainy' 'cold' 'high' 'strong' 'warm' 'change' ]
 [ 'sunny' 'warm' 'high' 'strong' 'cool' 'change' ]]
```

Target Values are: ['yes' 'yes' 'no' 'yes']

In [1]:

```
def learn(concepts, target):
    specific_h = concepts[0].copy()
    print("\nSpecific Boundary: ", specific_h)
    general_h = [['?' for i in range(len(specific_h))] for i in range(len(specific_h))]
    print("\nGeneric Boundary: ",general_h)

    for i, h in enumerate(concepts):
        print("\nInstance", i+1, "is ", h)
        if target[i] == "yes":
            for x in range(len(specific_h)):
                if h[x] != specific_h[x]:
                    specific_h[x] = '?'
                    general_h[x][x] = '?'

        if target[i] == "no":
            for x in range(len(specific_h)):
                if h[x] != specific_h[x]:
                    general_h[x][x] = specific_h[x]
            else:
                general_h[x][x] = '?'

    print("Specific Boundary = ", specific_h)
    print("Generic Boundary = ", general_h)
    print("\n")

    indices = [i for i, val in enumerate(general_h) if val == ['?', '?', '?', '?', '?', '?']]
```

```

In [1]: def learn(concepts, target):
        specific_h = concepts[0].copy()
        print("\nSpecific Boundary: ", specific_h)
        general_h = [["?" for i in range(len(specific_h))] for i in range(len(specific_h))]
        print("\nGeneric Boundary: ", general_h)

        for i, h in enumerate(concepts):
            print("\nInstance", i+1, "is ", h)
            if target[i] == "yes":
                for x in range(len(specific_h)):
                    if h[x] != specific_h[x]:
                        specific_h[x] = '?'
                        general_h[x][x] = '?'

            if target[i] == "no":
                for x in range(len(specific_h)):
                    if h[x] != specific_h[x]:
                        general_h[x][x] = specific_h[x]
                    else:
                        general_h[x][x] = '?'

        print("Specific Boundary = ", specific_h)
        print("Generic Boundary = ", general_h)
        print("\n")

        indices = [i for i, val in enumerate(general_h) if val == ['?', '?', '?', '?', '?', '?']]
        for i in indices:
            general_h.remove(['?', '?', '?', '?', '?', '?'])
        return specific_h, general_h

s_final, g_final = learn(concepts, target)

print(" The Final Specific_h : ", s_final, sep="\n")
print("The Final General_h : ", g_final, sep="\n")

```


LAB PROGRAM 3:

Write a program to demonstrate the working of the decision tree based ID3 algorithm. Use an appropriate data set for building the decision tree and apply this knowledge to classify a new sample.

Code:

```
import
math

import csv
def load_csv(filename):
    lines=csv.reader(open(filename,"r"));
    dataset = list(lines)
    headers = dataset.pop(0)
    return dataset,headers

class Node:
    def __init__(self,attribute):
        self.attribute=attribute
        self.children=[]
        self.answer=""

def subtables(data,col,delete):
    dic={}
    coldata=[row[col] for row in data]
    attr=list(set(coldata))

    counts=[0]*len(attr)
    r=len(data)
    c=len(data[0])
    for x in range(len(attr)):
        for y in range(r):
            if data[y][col]==attr[x]:
                counts[x]+=1

    for x in range(len(attr)):
        dic[attr[x]]=[[0 for i in range(c)] for j in range(counts[x])]
        pos=0
        for y in range(r):
            if data[y][col]==attr[x]:
                if delete:
                    del data[y][col]
                dic[attr[x]][pos]=data[y]
                pos+=1
    return attr,dic

def entropy(S):
    attr=list(set(S))
    if len(attr)==1:
        return 0
```

```

counts=[0,0]
for i in range(2):
    counts[i]=sum([1 for x in S if attr[i]==x])/(len(S)*1.0)

sums=0
for cnt in counts:
    sums+=-1*cnt*math.log(cnt,2)
return sums

def compute_gain(data,col):
    attr,dic = subtables(data,col,delete=False)

    total_size=len(data)
    entropies=[0]*len(attr)
    ratio=[0]*len(attr)

    total_entropy=entropy([row[-1] for row in data])
    for x in range(len(attr)):
        ratio[x]=len(dic[attr[x]])/(total_size*1.0)
        entropies[x]=entropy([row[-1] for row in dic[attr[x]]])
        total_entropy-=ratio[x]*entropies[x]
    return total_entropy

def build_tree(data,features):
    lastcol=[row[-1] for row in data]
    if(len(set(lastcol)))==1:
        node=Node("")
        node.answer=lastcol[0]
        return node

    n=len(data[0])-1
    gains=[0]*n
    for col in range(n):
        gains[col]=compute_gain(data,col)
    split=gains.index(max(gains))
    node=Node(features[split])
    fea = features[:split]+features[split+1:]

    attr,dic=subtables(data,split,delete=True)

    for x in range(len(attr)):
        child=build_tree(dic[attr[x]],fea)
        node.children.append((attr[x],child))
    return node

def print_tree(node,level):
    if node.answer!="":
        print("  "*level,node.answer)
    return

```

```

    print("  "*level,node.attribute)
    for value,n in node.children:
        print("  "*(level+1),value)
        print_tree(n,level+2)

def classify(node,x_test,features):
    if node.answer!="":
        print(node.answer)
        return
    pos=features.index(node.attribute)
    for value, n in node.children:
        if x_test[pos]==value:
            classify(n,x_test,features)

'''Main program'''
dataset,features=load_csv("id3.csv")
node1=build_tree(dataset,features)

print("The decision tree for the dataset using ID3 algorithm is")
print_tree(node1,0)
testdata,features=load_csv("id3_test_1.csv")

for xtest in testdata:
    print("The test instance:",xtest)
    print("The label for test instance:")
    classify(node1,xtest,features)

```

```
In [1]: import math
import csv
```

```
In [2]: def load_csv(filename):
    lines=csv.reader(open(filename,"r"));
    dataset = list(lines)
    headers = dataset.pop(0)
    return dataset,headers

class Node:
    def __init__(self,attribute):
        self.attribute=attribute
        self.children=[]
        self.answer=""
```

```
In [3]: def subtables(data,col,delete):
    dic={}
    coldata=[row[col] for row in data]
    attr=list(set(coldata))

    counts=[0]*len(attr)
    r=len(data)
    c=len(data[0])
    for x in range(len(attr)):
        for y in range(r):
            if data[y][col]==attr[x]:
                counts[x]+=1
    for x in range(len(attr)):
        dic[attr[x]]=[[0 for i in range(c)] for j in range(counts[x])]
        pos=0
        for y in range(r):
            if data[y][col]==attr[x]:
                if delete:
                    del data[y][col]
                dic[attr[x]][pos]=data[y]
                pos+=1
    return attr,dic
```

```
In [4]: def entropy(S):
        attr=list(set(S))
        if len(attr)==1:
            return 0

        counts=[0,0]
        for i in range(2):
            counts[i]=sum([1 for x in S if attr[i]==x])/(len(S)*1.0)

        sums=0
        for cnt in counts:
            sums+=-1*cnt*math.log(cnt,2)
        return sums
```

```
In [5]: def compute_gain(data,col):
        attr,dic = subtables(data,col,delete=False)

        total_size=len(data)
        entropies=[0]*len(attr)
        ratios=[0]*len(attr)

        total_entropy=entropy([row[-1] for row in data])
        for x in range(len(attr)):
            ratio[x]=len(dic[attr[x]])/(total_size*1.0)
            entropies[x]=entropy([row[-1] for row in dic[attr[x]]])
            total_entropy-=ratio[x]*entropies[x]
        return total_entropy
```

```
In [6]: def build_tree(data,features):
        lastcol=[row[-1] for row in data]
        if(len(set(lastcol))!=1:
            node=Node("")
            node.answer=lastcol[0]
            return node

        n=len(data[0])-1
        gains=[0]*n
        for col in range(n):
            gains[col]=compute_gain(data,col)
        split=gains.index(max(gains))
        node=Node(features[split])
        fea = features[:split]+features[split+1:]
```

```

for col in range(n):
    gains[col]=compute_gain(data,col)
split=gains.index(max(gains))
node=Node(features[split])
fea = features[:split]+features[split+1:]
attr,dic=subtables(data,split,delete=True)

for x in range(len(attr)):
    child=build_tree(dic[attr[x]],fea)
    node.children.append((attr[x],child))
return node

```

```

In [7]: def print_tree(node,level):
        if node.answer!="":
            print(" %*level,node.answer"
            return

        print(" %*level,node.attribute)
        for value,n in node.children:
            print(" %*(level+1),value)
            print_tree(n,level+2)

```

```

In [8]: def classify(node,x_test,features):
        if node.answer!="":
            print(node.answer)
            return
        pos=features.index(node.attribute)
        for value, n in node.children:
            if x_test[pos]==value:
                classify(n,x_test,features)

```

```

In [9]: '''Main program'''
dataset,features=load_csv("id3.csv")
model=build_tree(dataset,features)

print("The decision tree for the dataset using ID3 algorithm is")
print_tree(model,0)
testdata,features=load_csv("id3_test_1.csv")
for xtest in testdata:
    print("The test instance:",xtest)
    print("The label for test instance:",end=" ")
    classifv(model.xtest.features)

```

```
In [9]: '''Main program'''
dataset, features = load_csv("id3.csv")
node1 = build_tree(dataset, features)

print("The decision tree for the dataset using ID3 algorithm is")
print_tree(node1, 0)
testdata, features = load_csv("id3_test_1.csv")
for xtest in testdata:
    print("The test instance:", xtest)
    print("The label for test instance:", end=" ")
    classify(node1, xtest, features)
```

The decision tree for the dataset using ID3 algorithm is

Outlook

overcast

yes

sunny

Humidity

high

no

normal

yes

rain

Wind

strong

no

weak

yes

The test instance: ['rain', 'cool', 'normal', 'strong']

The label for test instance: no

The test instance: ['sunny', 'mild', 'normal', 'strong']

The label for test instance: yes

In []:

In []:

1	Outlook	Temperature	Humidity	Wind	Answer
2	sunny	hot	high	weak	no
3	sunny	hot	high	strong	no
4	overcast	hot	high	weak	yes
5	rain	mild	high	weak	yes
6	rain	cool	normal	weak	yes
7	rain	cool	normal	strong	no
8	overcast	cool	normal	strong	yes
9	sunny	mild	high	weak	no
10	sunny	cool	normal	weak	yes
11	rain	mild	normal	weak	yes
12	sunny	mild	normal	strong	yes
13	overcast	mild	high	strong	yes
14	overcast	hot	normal	weak	yes
15	rain	mild	high	strong	no

LAB PROGRAM 4:

Implement the Linear Regression algorithm in order to fit data points. Select appropriate data set for your experiment and draw graphs.

```
In [8]: import numpy as np
import matplotlib.pyplot as plt
import pandas as pd
```

```
In [9]: dataset = pd.read_csv('salary_data.csv')
X = dataset.iloc[:, :-1].values
y = dataset.iloc[:, 1].values
```

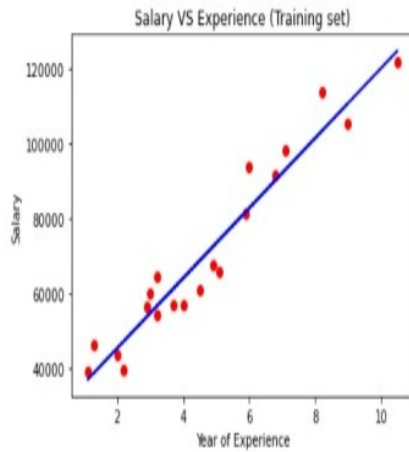
```
In [10]: from sklearn.model_selection import train_test_split
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=1/3, random_state=0)
```

```
In [11]: # Fitting Simple Linear Regression to the Training set
from sklearn.linear_model import LinearRegression
regressor = LinearRegression()
regressor.fit(X_train, y_train)
```

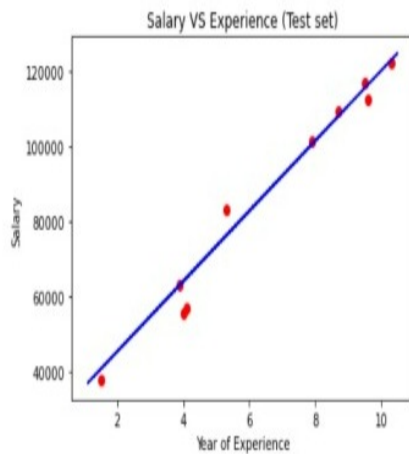
```
Out[11]: LinearRegression()
```

```
In [12]: # Predicting the Test set results
y_pred = regressor.predict(X_test)
```

```
In [13]: # Visualizing the Training set results
viz_train = plt
viz_train.scatter(X_train, y_train, color='red')
viz_train.plot(X_train, regressor.predict(X_train), color='blue')
viz_train.title('Salary VS Experience (Training set)')
viz_train.xlabel('Year of Experience')
viz_train.ylabel('Salary')
viz_train.show()
```



```
In [14]: # Visualizing the Test set results
viz_test = plt
viz_test.scatter(X_test, y_test, color='red')
viz_test.plot(X_train, regressor.predict(X_train), color='blue')
viz_test.title('Salary VS Experience (Test set)')
viz_test.xlabel('Year of Experience')
viz_test.ylabel('Salary')
viz_test.show()
```



1	YearsExperience	Salary
2	1.1	39343
3	1.3	46205
4	1.5	37731
5	2.0	43525
6	2.2	39091
7	2.9	56642
8	3.0	60150
9	3.2	54445
10	3.2	64445
11	3.7	57109
12	3.9	63218
13	4.0	55794
14	4.0	56957
15	4.1	57081
16	4.5	61111
17	4.9	67938
18	5.1	66029
19	5.3	83008
20	5.9	81563
21	6.0	93940
22	6.6	91738
23	7.1	98273
24	7.9	101302
25	8.2	113812
26	8.7	109431
27	9.0	105582
28	9.5	116969
29	9.6	112635
30	10.3	122391
31	10.5	121872

PROGRAM 5:

Write a program to implement the naïve Bayesian classifier for a sample training data set stored as a .CSV file. Compute the accuracy of the classifier, considering few test data sets

Code:

```
import pandas as pd

from sklearn.model_selection import train_test_split

from sklearn.naive_bayes import GaussianNB

from sklearn import metrics

df = pd.read_csv("pima_indian.csv")
```

```

feature_col_names = ['num_preg', 'glucose_conc', 'diastolic_bp', 'thickness', 'insulin', 'bmi',
'diab_pred', 'age']

predicted_class_names = ['diabetes']

X = df[feature_col_names].values # these are factors for the prediction
y = df[predicted_class_names].values # this is what we want to predict

#splitting the dataset into train and test data
xtrain,xtest,ytrain,ytest=train_test_split(X,y,test_size=0.33)

print ("\n the total number of Training Data :",ytrain.shape)
print ("\n the total number of Test Data :",ytest.shape)

# Training Naive Bayes (NB) classifier on training data.clf = GaussianNB().fit(xtrain,ytrain.ravel())

predicted = clf.predict(xtest)

predictTestData= clf.predict([[6,148,72,35,0,33.6,0.627,50]])

#printing Confusion matrix, accuracy, Precision and Recall

print("\n Confusion matrix')

print(metrics.confusion_matrix(ytest,predicted))

print("\n Accuracy of the classifier is',metrics.accuracy_score(ytest,predicted))

print("\n The value of Precision', metrics.precision_score(ytest,predicted))

print("\n The value of Recall', metrics.recall_score(ytest,predicted))

print("Predicted Value for individual Test Data:", predictTestData)

```

```
In [18]: import pandas as pd
from sklearn.model_selection import train_test_split
from sklearn.naive_bayes import GaussianNB
from sklearn import metrics
```

```
In [24]: df = pd.read_csv("pima_indian.csv")
col_names = ['num_preg', 'glucose_conc', 'diastolic_bp', 'thickness', 'insulin', 'bmi', 'diab_pred', 'age']
predicted_class = ['diabetes']
```

df

```
Out[24]:
```

	num_preg	glucose_conc	diastolic_bp	thickness	insulin	bmi	diab_pred	age	diabetes
0	6	148	72	35	0	33.6	0.627	50	1
1	1	85	66	29	0	26.6	0.351	31	0
2	0	183	64	0	0	23.3	0.672	32	1
3	1	89	66	23	94	28.1	0.167	21	0
4	0	137	40	35	168	43.1	2.288	33	1
...
763	10	101	76	48	180	32.9	0.171	63	0
764	2	122	70	27	0	36.8	0.340	27	0
765	5	121	72	23	112	26.2	0.245	30	0
766	1	126	60	0	0	30.1	0.349	47	1
767	1	93	70	31	0	30.4	0.315	23	0

768 rows x 9 columns

```
In [25]: X = df[col_names].values
y = df[predicted_class].values
```

```
In [26]: print(df.head)
xtrain,xtest,ytrain,ytest=train_test_split(X,y,test_size=0.4)
print ('\n the total number of Training Data :',ytrain.shape)
```

```
In [25]: X = df[col_names].values
y = df[predicted_class].values
```

```
In [26]: print(df.head)
xtrain,xtest,ytrain,ytest=train_test_split(X,y,test_size=0.4)

print ('\n the total number of Training Data :',ytrain.shape)
print ('\n the total number of Test Data :',ytest.shape)
```

```
<bound method NDFrame.head of      num_preg  glucose_conc  diastolic_bp  thickness  insulin  bmi \
0         6         148         72         35         0  33.6
1         1         85         66         29         0  26.6
2         8        183         64         0         0  23.3
3         1         89         66         23         94  28.1
4         0        137         48         35        168  43.1
..      ...      ...      ...      ...      ...      ...
763       10        101         76         48        180  32.9
764         2        122         70         27         0  36.8
765         5        121         72         23        112  26.2
766         1        126         60         0         0  30.1
767         1         93         70         31         0  30.4
```

```
      diab_pred  age  diabetes
0      0.627  50      1
1      0.351  31      0
2      0.672  32      1
3      0.167  21      0
4      2.288  33      1
..      ...  ...      ...
763     0.171  63      0
764     0.340  27      0
765     0.245  30      0
766     0.349  47      1
767     0.315  23      0
```

```
[768 rows x 9 columns]>
```

```
the total number of Training Data : (460, 1)
```

```
the total number of Test Data : (308, 1)
```

```
In [27]: clf = GaussianNB().fit(xtrain,ytrain.ravel())
predicted = clf.predict(xtest)
predictTestData= clf.predict([[6,148,72,35,0,33.6,0.627,50]])
```

```
In [28]: print('\n Confusion matrix')
print(metrics.confusion_matrix(ytest,predicted))
```

```
[768 rows x 9 columns]>
```

```
the total number of Training Data : (460, 1)
```

```
the total number of Test Data : (308, 1)
```

```
In [27]: clf = GaussianNB().fit(xtrain,ytrain.ravel())
predicted = clf.predict(xtest)
predictTestData= clf.predict([[6,148,72,35,0,33.6,0.627,50]])
```

```
In [28]: print('\n Confusion matrix')
print(metrics.confusion_matrix(ytest,predicted))

print('\n Accuracy of the classifier is',metrics.accuracy_score(ytest,predicted))

print('\n The value of Precision', metrics.precision_score(ytest,predicted))

print('\n The value of Recall', metrics.recall_score(ytest,predicted))

print("Predicted Value for individual Test Data:", predictTestData)
```

```
Confusion matrix
```

```
[[177  22]
 [ 45  64]]
```

```
Accuracy of the classifier is 0.7824675324675324
```

```
The value of Precision 0.7441860465116279
```

```
The value of Recall 0.5871559633027523
```

```
Predicted Value for individual Test Data: [1]
```

```
In [ ]:
```