```
In [1]:
        #Import the Packages
         import numpy as np
         import pandas as pd
In [2]:
        #Read the data
         df = pd.read_excel(r"C:\Users\SANKHA\OneDrive\Documents\PR_assignment(VOWEL Data).x
        #Show the data
In [3]:
         df
                    f2
                         f3 vowel class
Out[3]:
                                     1
          0 700 1500 2600
           1 550 1550 2400
                                     1
          2 700 1500 2600
                                     1
          3 700 1600 2700
                                     1
          4 550 1600 2600
                                     1
        866 500 1050 2900
                                     6
        867 500 1000 3000
                                     6
        868 500 1000 2800
                                     6
             500
                   900 2800
        869
                                     6
        870 500
                   950 2700
                                     6
        871 rows × 4 columns
        from sklearn.model_selection import train_test_split
In [4]:
```

Implementation of MDC Classifier

```
In [5]: #Initialize accuracy list
        accuracy_lst= []
        #Define test sizes
        test_size_lst = [0.2, 0.3, 0.4]
        #Loop through different testsizes
        for ele in test_size_lst:
            #Loop through 10 iterations
            for i in range(10):
                # Split data into train and test sets for each vowel class
                df1 = df[df['vowel class']==1]
                X_1 = df1.drop(columns=['vowel class'])
                y_1 = df1['vowel class']
                X1_train,X1_test,y1_train,y1_test = train_test_split(X_1,y_1,test_size=ele)
                df2 = df[df['vowel class']==2]
                X_2 = df2.drop(columns=['vowel class'])
                y_2 = df2['vowel class']
                X2_train,X2_test,y2_train,y2_test = train_test_split(X_2,y_2,test_size=ele)
                df3 = df[df['vowel class']==3]
                X_3 = df3.drop(columns=['vowel class'])
```

```
y 3 = df3['vowel class']
X3_train,X3_test,y3_train,y3_test = train_test_split(X_3,y_3,test_size=ele)
df4 = df[df['vowel class']==4]
X_4 = df4.drop(columns=['vowel class'])
y_4 = df4['vowel class']
X4_train,X4_test,y4_train,y4_test = train_test_split(X_4,y_4,test_size=ele)
df5 = df[df['vowel class']==5]
X_5 = df5.drop(columns=['vowel class'])
y_5 = df5['vowel class']
X5_train,X5_test,y5_train,y5_test = train_test_split(X_5,y_5,test_size=ele)
df6 = df[df['vowel class']==6]
X 6 = df6.drop(columns=['vowel class'])
y_6 = df6['vowel class']
X6_train,X6_test,y6_train,y6_test = train_test_split(X_6,y_6,test_size=ele)
X_1_ = X1_train.join(y1_train)
X_2 = X2_{train.join(y2_{train)}}
X_3 = X_3 
X_4_ = X4_{\text{train.join}}(y4_{\text{train}})
X_5 = X5_{train.join(y5_{train)}}
X_6_ = X6_{\text{train.join}}(y6_{\text{train}})
# Concatenate train sets and prepare train data
train_final = pd.concat([X_1_,X_2_,X_3_,X_4_,X_5_,X_6_])
train_final
X_train = train_final.drop(columns='vowel class')
print(X train)
y train = pd.DataFrame(train final['vowel class'])
print(y_train)
# Concatenate test sets and prepare test data
X_test = pd.concat([X1_test,X2_test,X3_test,X4_test,X5_test,X6_test])
print(X_test)
y test = pd.concat([y1 test,y2 test,y3 test,y4 test,y5 test,y6 test])
print(y_test)
m1 =np.array(X1_train.mean())
m2 =np.array(X2_train.mean())
m3 =np.array(X3_train.mean())
m4 =np.array(X4_train.mean())
m5 =np.array(X5 train.mean())
m6 =np.array(X6_train.mean())
#Function to calculate Euclidean Distance
def euclidean_distance(x,y):
        return np.sqrt(np.sum((x-y)**2))
#Perform Minimum Distance Classifier
y_pred = []
for testpoint in np.array(X_test):
        d1 = euclidean_distance(testpoint,m1)
        d2 = euclidean_distance(testpoint,m2)
        d3 = euclidean_distance(testpoint,m3)
        d4 = euclidean_distance(testpoint,m4)
```

```
d5 = euclidean_distance(testpoint,m5)
        d6 = euclidean_distance(testpoint,m6)
        1 = [d1, d2, d3, d4, d5, d6]
        m = min(1)
        i = 1.index(m)
        pred_class = i+1
        y_pred.append(pred_class)
    print(y_pred)
    y_pred_df = pd.DataFrame({'Pred_class':y_pred})
    print(y_pred_df)
    y_test_df= pd.DataFrame(y_test)
    y_test_df.reset_index(inplace=True)
    print(y_test_df)
    df_forprediction = y_test_df.join(y_pred_df).drop(columns=['index'])
    print(df_forprediction)
    #Calculating Accuracy
    true_pred = df_forprediction[df_forprediction['vowel class']==df_forpredict
    accuracy = (true_pred.shape[0]/df_forprediction.shape[0])*100
    accuracy_lst.append(accuracy)
print(accuracy_lst)
```

```
f1
            f2
32
     500
          1350
                2360
70
     650
          1600
                2300
          1300
58
     700
                2300
50
     700
          1750
                2300
     550
          1800
13
                2600
           . . .
. .
     . . .
                  . . .
772
     600
          1300
                2800
     500
865
          1050
                3000
778
     550
          1050
                2560
779
     500
          1000
                2560
808
     500
          1000
                2300
[694 rows x 3 columns]
     vowel class
32
               1
70
               1
58
               1
50
               1
13
               1
772
               6
865
               6
778
               6
779
               6
               6
808
[694 rows x 1 columns]
            f2
      f1
                   f3
55
     700
          1400
                2300
9
     600
          1600
                2600
27
     500
          1400
                2360
1
     550
          1550
                2400
24
     600
          1200
                2300
     . . .
           . . .
                  . . .
827
     400
          1000
                2400
780
     500
           850
                2560
852
     400
           800
                2700
775
     500
          1000
                 2560
705
     400
          1160
                2600
[177 rows x 3 columns]
55
       1
9
       1
27
       1
1
       1
24
       1
827
       6
780
       6
852
       6
775
       6
705
Name: vowel class, Length: 177, dtype: int64
[1, 1, 1, 1, 2, 1, 2, 1, 1, 1, 1, 5, 1, 2, 1, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 6, 2,
2, 2, 2, 2, 2, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3,
3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 1, 4, 4, 4, 4, 4, 6, 6, 4, 4, 6, 6, 4, 4,
4, 4, 4, 4, 4, 4, 6, 6, 4, 4, 4, 4, 4, 4, 4, 4, 4, 3, 3, 5, 1, 1, 3, 6, 5, 5,
3, 3, 1, 2, 3, 5, 5, 3, 1, 1, 6, 5, 5, 3, 5, 3, 3, 1, 6, 3, 3, 5, 1, 1, 5, 5, 1,
3, 5, 5, 5, 1, 5, 6, 6, 6, 4, 4, 2, 6, 6, 2, 6, 4, 4, 6, 6, 6, 4, 6, 2, 2, 2, 1,
6, 6, 6, 6, 6, 2, 6, 6, 6, 6, 4, 4, 4, 6, 6]
     Pred class
0
              1
1
```

2	1
3	1
4	2
• •	
172	4
173	4
174	4
175	6
176	6
_	

[177 rows x 1 columns] index vowel class

[177 rows x 2 columns] vowel class Pred_class

```
[177 rows x 2 columns]
      f1
            f2
                   f3
26
     600
          1400
                 2300
24
     600
          1200
                 2300
     550
67
          1500
                 2300
13
     550
          1800
                 2600
64
     500
          1900
                 2300
744
     500
          1200
                 2300
797
     550
          1050
                 2500
810
     400
          1000
                 2300
798
     550
          1000
                 2600
792
     500
          1000
                 2600
```

[694 rows x 3 columns]

[0]	10W3 X 3	COTAMINA
	vowel cla	ass
26		1
24		1
67		1
13		1
64		1
		• • •
744		6
797		6
810		6
798		6

```
[694 rows x 1 columns]
            f2
      f1
                  f3
14
     600
          1400
                2600
59
     650
          1300
                2300
23
     400
          1200
                2400
54
     600
          1350
                2300
0
     700
          1500
                2600
     . . .
           . . .
                 . . .
. .
701
          1150
                2700
     600
833
     450
           950
                2100
790
     500
          1000
                2600
748
     450
          1000 2350
813
     400
          1050 2300
[177 rows x 3 columns]
14
       1
59
       1
23
       1
54
       1
0
       1
      . .
701
       6
833
       6
790
       6
748
813
Name: vowel class, Length: 177, dtype: int64
[1, 2, 6, 1, 1, 1, 5, 1, 5, 2, 1, 1, 1, 1, 1, 2, 2, 2, 6, 2, 2, 2, 2, 2, 2, 6, 2,
1, 2, 1, 2, 2, 2, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 5, 3, 3, 3, 3, 3, 3, 1, 3,
3, 3, 5, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 4, 2, 4, 6, 4, 4, 4, 2, 4, 6, 4, 4, 4,
4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 4, 6, 4, 4, 6, 6, 5, 1, 1, 3, 5, 3, 3, 1, 5,
1, 5, 6, 5, 5, 5, 5, 5, 3, 3, 5, 5, 5, 5, 5, 5, 6, 3, 3, 5, 6, 5, 3, 1, 1, 5, 5,
5, 3, 5, 5, 3, 5, 6, 2, 6, 6, 4, 1, 6, 2, 6, 4, 6, 2, 6, 6, 4, 2, 6, 6, 6, 6, 4,
6, 6, 6, 4, 6, 6, 6, 6, 6, 6, 6, 4, 6, 6, 4]
     Pred_class
0
              1
              2
1
2
              6
3
              1
4
              1
172
              6
173
              4
174
              6
175
              6
176
[177 rows x 1 columns]
     index vowel class
0
                       1
        14
1
        59
                       1
2
        23
                       1
3
        54
                       1
4
         0
                       1
172
       701
                       6
173
       833
                       6
174
       790
                       6
175
       748
                       6
176
       813
```

	I	mpleme	ntation o	f 'Baye
0	vowe:	l clas	1	ed_cl
1			1	
2			1	
3 4			1 1	
• •				
172			6	
173			6	
174			6	
175 176			6 6	
				_
[177	rows f1	x 2 c	olumn: f3	s]
30		1200		
16		1600	2600	
58	700	1300	2300	
67	550	1500		
57	700	1300	2300	
 763	500	1000	 2700	
783	450	900	2250	
745	400	1200	2400	
857	450	900		
	400	1150		
[694		x 3 c l clas		s]
30			1	
16			1	
58			1	
67			1	
57			1	
763		• •	6	
783			6	
745			6	
857			6	
704			6	
[694	rows f1	x 1 c	olumn f3	s]
47	650		2000	
36	500	1450		
51		1300		
13	550	1800	2600	
4	550	1600	2600	
 798	· · · · 550	1000	 2600	
712	500	1200	2300	
849	550	1100	2850	
703	400	1000	2200	
773	550	1100	2800	
[177	rows	x 3 c	olumn	s l
47	1	5	, _ +	- 1
36	1			
51	1			
13	1			
4	1			
798	6			
712	6			

```
849
       6
703
       6
773
       6
Name: vowel class, Length: 177, dtype: int64
[2, 1, 2, 5, 5, 1, 5, 1, 1, 1, 1, 5, 1, 1, 5, 2, 2, 2, 2, 1, 2, 2, 2, 2, 2, 2, 2,
1, 2, 2, 2, 2, 2, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3,
3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 1, 6, 4, 4, 4, 6, 4, 6, 4, 6, 4, 6, 4, 6, 4, 6,
4, 4, 6, 4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 4, 4, 4, 5, 5, 3, 5, 5, 5, 1, 3, 5,
3, 1, 5, 3, 1, 1, 5, 1, 5, 1, 3, 5, 3, 5, 1, 3, 3, 3, 5, 5, 5, 5, 5, 5, 5, 3, 1, 5,
3, 5, 5, 1, 5, 5, 2, 6, 4, 6, 6, 2, 4, 6, 6, 6, 6, 6, 6, 6, 4, 2, 4, 6, 6, 6, 6, 6,
6, 2, 6, 6, 1, 4, 6, 2, 2, 6, 6, 2, 6, 4, 6]
     Pred_class
0
1
               1
2
               2
3
               5
4
               5
             . . .
. .
172
              6
173
               2
174
              6
175
              4
               6
176
[177 rows x 1 columns]
     index vowel class
        47
                       1
1
        36
                       1
2
        51
                       1
3
        13
                       1
4
         4
                       1
172
       798
                       6
173
       712
                       6
174
                       6
       849
175
       703
                       6
176
       773
                       6
[177 rows x 2 columns]
     vowel class Pred class
0
                1
                             2
1
                1
                             1
2
                             2
                1
3
                1
                             5
                             5
4
                1
              . . .
172
                6
                             6
                             2
173
                6
174
                6
                             6
                             4
175
                6
176
                6
                             6
[177 rows x 2 columns]
            f2
      f1
                   f3
60
     700
          1350
                 2300
45
     650
          1350
                 2100
57
     700
          1300
                 2300
7
     550
          1700
                 2600
11
     500
          1750
                 2600
          1050
                 2700
695
     600
852
     400
           800
                 2700
863
     500
           900
                 2800
```

```
764 400
          950 2700
[694 rows x 3 columns]
    vowel class
60
              1
45
              1
57
              1
7
              1
11
              1
. .
            . . .
695
              6
852
              6
863
              6
753
              6
764
              6
[694 rows x 1 columns]
     f1
           f2
                 f3
65
    700
         1300
               2300
38
    550
         1400
               2300
48
    600
         1800 2300
55
         1400
    700
               2300
     550
         1550 2400
1
          . . .
                . . .
. .
     . . .
832
    400
         1000
               2300
742
    600
         1200 2300
846
    500
         1000
               2750
722
    400
         1000
               2300
816
    500
          950 2300
[177 rows x 3 columns]
65
      1
38
      1
48
      1
55
      1
832
      6
742
      6
846
      6
722
      6
Name: vowel class, Length: 177, dtype: int64
[2, 1, 1, 1, 1, 1, 1, 2, 1, 6, 1, 2, 1, 2, 2, 2, 2, 2, 2, 2, 2, 6, 6, 1, 2, 2, 6,
1, 2, 1, 2, 2, 2, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 5, 5, 5, 3, 3, 1, 3,
3, 3, 3, 5, 3, 1, 5, 3, 3, 5, 3, 3, 3, 4, 4, 6, 4, 4, 6, 4, 4, 4, 4, 4, 6, 4,
4, 4, 4, 4, 2, 4, 4, 4, 4, 6, 4, 4, 6, 4, 2, 4, 1, 4, 5, 5, 5, 5, 1, 5, 5, 5, 5,
5, 5, 3, 5, 3, 5, 1, 5, 3, 5, 5, 3, 5, 5, 5, 1, 5, 1, 5, 5, 3, 1, 5, 5, 1, 5,
2, 6, 6, 6, 6, 6, 6, 6, 4, 6, 4, 2, 6, 4, 6]
    Pred class
0
             2
1
             1
2
             1
3
             1
4
             1
172
             4
173
             2
174
             6
175
             4
176
```

[177 rows x 1 columns]

	index	vowel class
0	65	1
1	38	1
2	48	1
3	55	1
4	1	1
172	832	6
173	742	6
174	846	6
175	722	6
176	816	6
Γ177	rows v	2 columns1

[177 rows x 2 columns]

	vowel clas	s Pred	_class
0		1	2
1		1	1
2		1	1
3		1	1
4		1	1
172		6	4
173		6	2
174		6	6
175		6	4
176		6	6

[177 rows x 2 columns] f1 f2 f3 650 1200 2300 68 27 500 1400 2360 11 500 1750 2600 26 600 1400 2300 62 700 1400 2300 768 600 1100 2700 845 500 1000 2700 696 450 1100 2700 734 500 1250 2300 799 500 1000 2300

[694 rows x 3 columns]

	vowel	class	
68		1	
27		1	
11		1	
26		1	
62		1	
768		6	
845		6	
696		6	
734		6	
799		6	

[694	rows	x 1 c	olumns]
	f1	f2	f3
13	550	1800	2600
3	700	1600	2700
64	500	1900	2300
31	550	1200	2360
23	400	1200	2400
732	600	1200	2300

```
739
    500
         1100
               2250
844
    500
         1000 2900
795
     500
          900 2500
         1200 2300
742
    600
[177 rows x 3 columns]
13
      1
3
      1
64
      1
31
23
      1
      . .
732
      6
739
      6
844
      6
795
      6
742
      6
Name: vowel class, Length: 177, dtype: int64
[5, 5, 5, 2, 6, 5, 2, 6, 1, 1, 1, 5, 5, 5, 5, 6, 2, 2, 2, 6, 6, 2, 2, 6, 6, 2, 1, 2,
1, 2, 2, 6, 2, 2, 5, 3, 3, 3, 5, 3, 3, 3, 3, 3, 1, 3, 3, 3, 3, 5, 5, 3, 3, 3,
3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 5, 4, 4, 4, 4, 4, 6, 2, 4, 6, 4, 4, 4, 4,
3, 3, 3, 3, 5, 3, 1, 5, 5, 3, 5, 1, 5, 5, 5, 1, 5, 1, 5, 5, 5, 1, 5, 5, 5, 1, 5,
5, 3, 1, 3, 1, 5, 4, 6, 4, 6, 4, 6, 2, 2, 6, 6, 6, 6, 4, 4, 6, 4, 6, 6, 2, 4, 6,
6, 4, 4, 4, 2, 6, 2, 6, 6, 6, 2, 2, 6, 4, 2]
    Pred_class
0
             5
             5
1
             5
2
3
             2
4
             6
172
             2
173
             2
174
             6
175
             4
176
             2
[177 rows x 1 columns]
     index vowel class
0
       13
                     1
1
        3
                     1
2
       64
                     1
3
       31
                     1
4
       23
                     1
       . . .
172
      732
                     6
173
      739
                     6
174
      844
                     6
175
      795
                     6
176
      742
                     6
[177 rows x 2 columns]
     vowel class Pred_class
0
              1
                          5
1
              1
                          5
2
              1
                          5
                          2
3
              1
4
              1
                          6
                        . . .
                          2
172
              6
                          2
173
              6
174
              6
                          6
```

```
176
[177 rows x 2 columns]
           f2
     f1
                 f3
48
     600
         1800
               2300
15
    550
         1400
               2600
         1400
44
    650
               2100
25
         1350
    600
               2300
    550
22
         1600
               2200
     . . .
          . . .
. .
                . . .
799
    500
         1000
               2300
797
    550
         1050
               2500
814
    450
          900
               2300
855
    450
         1000
               2700
758
    500
         1150
              2720
[694 rows x 3 columns]
     vowel class
48
              1
15
              1
44
              1
25
              1
22
              1
. .
             . . .
799
              6
797
              6
814
              6
855
              6
758
              6
[694 rows x 1 columns]
           f2
     f1
                 f3
59
    650
         1300
               2300
32
    500
         1350
               2360
29
    550
         1300
               2300
58
    700
         1300
               2300
42
    600
         1400
               2360
. .
     . . .
           . . .
699
    450
         1100
               2700
805
    450
         1200
               2300
720
    550
         1100
               2300
    450
          900
851
               2750
    450
710
         1150
              2300
[177 rows x 3 columns]
59
      1
32
      1
29
      1
58
      1
42
      1
699
      6
805
      6
720
      6
851
710
Name: vowel class, Length: 177, dtype: int64
[2, 1, 2, 2, 1, 1, 2, 1, 5, 1, 2, 1, 1, 5, 1, 2, 2, 2, 2, 2, 2, 6, 2, 2, 2, 2, 1, 2,
2, 2, 2, 2, 2, 3, 3, 5, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3,
3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 4, 6, 4, 6, 4, 6, 2, 4, 4, 4, 4, 4, 6,
4, 4, 4, 4, 4, 4, 4, 4, 6, 6, 4, 4, 4, 6, 6, 4, 5, 3, 5, 6, 5, 5, 5, 1, 3,
5, 5, 5, 3, 3, 5, 4, 4, 2, 4, 6, 4, 1, 6, 2, 4, 6, 6, 1, 6, 2, 6, 4, 6, 2, 6,
4, 4, 4, 4, 2, 4, 2, 6, 6, 2, 6, 2, 2, 6, 6]
```

	Implementation of 'Bayes Clas
0 1 2 3 4 172 173 174 175	Pred_class 2 1 2 2 1 6 2 2 6 6
[177 0 1 2 3 4 172 173 174 175 176	rows x 1 columns] index vowel class 59 1 32 1 29 1 58 1 42 1 699 6 805 6 720 6 851 6 710 6
[177 0 1 2 3 4 172 173 174 175 176	rows x 2 columns] vowel class
[177 40 68 18 67 56 767 777 843 700 863	rows x 2 columns] f1 f2 f3 550 1500 2360 650 1200 2300 600 1400 2600 550 1500 2300 600 1400 2300 500 1100 2700 500 1000 2700 400 1200 2700 500 900 2800
[694 40 68 18 67 56	rows x 3 columns] vowel class 1 1 1 1

```
777
843
               6
700
               6
               6
863
[694 rows x 1 columns]
            f2
      f1
                  f3
         1900
63
     500
               2300
57
     700
          1300
               2300
44
     650
          1400
               2100
24
     600
          1200
               2300
65
     700
          1300
               2300
           . . .
. .
     . . .
                 . . .
791
          950
    500
               2600
722
     400
          1000
               2300
737
     400
          1000
               2300
746
     450
          1000
               2350
822
     500
           850 2300
[177 rows x 3 columns]
       1
57
       1
44
       1
24
       1
65
       1
791
       6
722
       6
737
       6
746
       6
822
Name: vowel class, Length: 177, dtype: int64
[5, 2, 1, 2, 2, 2, 1, 5, 2, 6, 6, 1, 5, 1, 1, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 1, 2, 2,
2, 1, 2, 2, 2, 6, 5, 3, 3, 3, 5, 3, 3, 3, 5, 3, 3, 3, 3, 3, 5, 3, 5, 3, 5, 3, 5, 3,
4, 4, 4, 2, 4, 4, 4, 4, 4, 4, 4, 4, 6, 4, 6, 4, 4, 4, 5, 3, 5, 1, 6, 5, 5, 3, 3,
3, 5, 5, 3, 1, 5, 5, 1, 3, 5, 1, 3, 1, 5, 5, 1, 5, 5, 3, 5, 5, 5, 1, 5, 5, 5, 5,
3, 5, 3, 5, 5, 1, 4, 6, 6, 6, 2, 6, 6, 2, 6, 4, 6, 4, 2, 6, 2, 6, 4, 4, 6, 6, 6,
2, 2, 4, 4, 4, 4, 6, 6, 6, 6, 6, 6, 4, 4, 4, 4]
     Pred class
0
1
              2
2
              1
3
              2
4
              2
172
              6
173
              4
              4
174
              4
175
176
[177 rows x 1 columns]
     index vowel class
0
        63
                     1
1
        57
                      1
2
        44
                      1
3
        24
                      1
4
        65
                      1
       . . .
172
       791
                      6
173
       722
                      6
174
       737
                      6
175
       746
                      6
```

176 822	176	822		
---------	-----	-----	--	--

1/6	022	<u> </u>		O
[177			olumns s Pre] d class
0			1	5
1			1	2
2			_ 1	1
3			1	2
4			1	2
••				• • •
172			6	6
173			6	4
174			6	4
175			6	4
176			6	4
			Ü	•
[177			olumns]
47	f1	f2	f3	
47		1400		
70		1600		
32		1350		
21	600			
31	550	1200	2360	
847	500	1000		
850	500	1000	2800	
731	600	1200	2300	
740	400	1100	2300	
746	450	1000	2350	
[694			olumns]
47	vowe.	l clas	s 1	
47 70			1	
32			1	
21			1	
31			1	
••				
847			6	
850			6	
731			6	
740			6	
746			6	
[604	nous	v 1 c	olumne	1
L 034	f1	f2	olumns f3	1
37		1550		
		1400		
38	550			
50	700		2300	
13	550	1800		
	• • •			
752			2250	
782	500		2560	
739	500	1100	2250	
783	450	900	2250	
816		950		
ra		3	-1.	7
_		x 3 c	olumns]
37	1			
56	1			
38	1			
50	1			
13	1			

```
752
       6
782
       6
739
       6
783
       6
816
Name: vowel class, Length: 177, dtype: int64
[1, 1, 1, 1, 5, 1, 1, 1, 2, 1, 5, 1, 2, 1, 5, 1, 2, 2, 2, 2, 1, 2, 2, 6, 1, 2, 6,
2, 2, 6, 2, 2, 2, 3, 3, 3, 3, 3, 3, 5, 3, 5, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3,
3, 3, 3, 3, 3, 5, 5, 5, 3, 3, 3, 3, 3, 4, 4, 4, 4, 1, 4, 4, 4, 4, 4, 4, 4, 4, 4,
4, 6, 4, 6, 4, 4, 4, 4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 1, 5, 5, 5, 1, 1, 5, 3, 5,
5, 5, 5, 1, 5, 5, 3, 5, 6, 3, 3, 5, 6, 1, 5, 1, 5, 5, 3, 5, 6, 5, 5, 2, 3, 1, 3,
3, 5, 3, 3, 3, 6, 6, 6, 6, 6, 6, 6, 4, 4, 4, 4, 6, 2, 4, 6, 6, 6, 6, 6, 6, 6, 6,
6, 4, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6]
     Pred class
0
1
              1
2
              1
3
              1
4
              5
172
              6
173
              6
174
              6
175
              4
176
              6
[177 rows x 1 columns]
     index vowel class
0
        37
                       1
1
        56
                       1
2
        38
                       1
3
        50
                       1
4
        13
                       1
       . . .
172
       752
                       6
173
       782
                       6
174
       739
                       6
175
       783
                       6
176
       816
[177 rows x 2 columns]
     vowel class Pred_class
0
                1
1
                1
                            1
2
                            1
                1
3
                1
                            1
                            5
4
                1
172
                6
                            6
173
                6
                            6
174
                6
                            6
175
                6
                            4
176
                6
                            6
[177 rows x 2 columns]
      f1
            f2
                   f3
15
     550
          1400
                 2600
10
     550
          2000
                 2700
27
     500
          1400
                 2360
     550
          1400
8
                 2550
70
     650
          1600
                 2300
           . . .
718
     400
          1100
                 2300
```

```
735
   500 1000
            2300
774
   450
       1250 2850
704
   400
       1150 2200
859
   550 1100 2750
[694 rows x 3 columns]
    vowel class
15
            1
10
            1
27
            1
8
            1
70
            1
. .
          . . .
718
            6
735
            6
774
            6
704
            6
            6
859
[694 rows x 1 columns]
    f1
         f2
              f3
45
    650
       1350 2100
47
    650
       1400
            2000
56
   600
        1400
            2300
36
   500
       1450
            2400
   750
       1250 2300
71
. .
        . . .
             . . .
    . . .
868
   500
       1000
            2800
            2560
780
   500
        850
746
   450
        1000
            2350
783
   450
        900 2250
762
   500
       1000 2600
[177 rows x 3 columns]
45
     1
47
     1
56
     1
36
     1
71
     1
868
     6
780
     6
746
     6
783
762
     6
Name: vowel class, Length: 177, dtype: int64
1, 6, 1, 2, 2, 2, 3, 3, 3, 3, 3, 3, 3, 5, 5, 5, 3, 3, 5, 3, 3, 3, 5, 3, 3, 3,
3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 4, 4, 4,
3, 6, 5, 3, 5, 3, 5, 1, 5, 5, 5, 5, 5, 5, 5, 6, 5, 6, 1, 6, 6, 5, 6, 1, 3, 5,
6, 6, 4, 4, 6, 6, 6, 2, 6, 4, 6, 4, 6, 4, 6]
   Pred_class
0
           2
1
           2
2
           1
3
           1
4
           2
172
           6
173
           4
174
           6
175
```

[177	rows x	1 columns]
	index	vowel class
0	45	1
1	47	1
2	56	1
3	36	1
4	71	1
• •	• • •	• • •
172	868	6
173	780	6
174	746	6
175	783	6
176	762	6

[177 rows x 2 columns]

	vowel	class	Pred_class
0		1	2
1		1	2
2		1	1
3		1	1
4		1	2
172		6	6
173		6	4
174		6	6
175		6	4
176		6	6

[177 rows x 2 columns] f1 f2 f3 700 1400 2300 1200 2400 . . . 1100 2250 1100 2300

[694 rows x 3 columns]

	vowel	class	
62		1	
23		1	
13		1	
35		1	
60		1	
• •			
748		6	
760		6	
735		6	
739		6	
740		6	

[694 rows x 1 columns] f1 f2 f3

```
56
    600 1400
               2300
. .
     . . .
          . . .
                . . .
786
    500
         1900
               2250
709
    400
         1300
               2300
858
    500
         1000
               2800
     500
          950
782
               2560
853
    600
         1050 2850
[177 rows x 3 columns]
54
11
      1
70
      1
55
      1
56
      1
786
      6
709
      6
858
      6
782
      6
853
Name: vowel class, Length: 177, dtype: int64
[1, 5, 1, 1, 1, 2, 1, 1, 5, 1, 1, 1, 1, 1, 2, 2, 6, 2, 2, 2, 6, 2, 2, 2, 2, 2, 6,
3, 3, 5, 5, 5, 3, 5, 3, 3, 3, 3, 3, 3, 4, 4, 4, 4, 4, 4, 6, 4, 6, 4, 1, 6, 4,
4, 4, 4, 4, 4, 4, 4, 4, 4, 4, 4, 2, 4, 4, 4, 4, 4, 5, 5, 5, 5, 1, 1, 5, 5, 3, 6,
1, 5, 5, 1, 5, 5, 5, 3, 5, 1, 5, 1, 1, 5, 5, 5, 5, 5, 5, 5, 5, 3, 3, 5, 5, 1, 5, 6,
3, 3, 5, 5, 5, 5, 6, 6, 5, 6, 6, 2, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 2, 6, 4, 6, 6,
6, 6, 2, 6, 6, 6, 6, 6, 6, 5, 1, 6, 6, 6]
    Pred_class
0
1
             5
2
             1
3
             1
4
             1
172
             5
173
             1
174
             6
175
             6
176
             6
[177 rows x 1 columns]
     index vowel class
0
       54
                     1
1
       11
                     1
2
       70
                     1
3
       55
                     1
4
       56
                     1
       . . .
172
      786
                     6
173
      709
                     6
174
      858
                     6
175
      782
                     6
176
      853
                     6
[177 rows x 2 columns]
     vowel class Pred_class
0
              1
                          1
1
              1
                          5
2
              1
                          1
3
              1
                          1
4
              1
                          1
```

```
173
174
                6
                             6
175
                6
                             6
176
                6
                             6
[177 rows x 2 columns]
[67.79661016949152, 70.05649717514125, 70.05649717514125, 70.62146892655367, 59.88
7005649717516, 67.79661016949152, 63.2768361581921, 70.62146892655367, 70.62146892
655367, 74.57627118644068]
      f1
            f2
                   f3
14
     600
          1400
                 2600
19
     700
          1350
                 2600
11
     500
          1750
                 2600
18
     600
          1400
                2600
44
     650
          1400
                2100
           . . .
     . . .
                  . . .
726
     400
          1100
                 2300
759
     600
          1100
                 2720
814
     450
           900
                 2300
868
     500
          1000 2800
710
     450
          1150 2300
[607 rows x 3 columns]
     vowel class
14
                1
19
                1
11
                1
18
                1
44
                1
              . . .
. .
               6
726
                6
759
814
                6
                6
868
710
                6
[607 rows x 1 columns]
      f1
            f2
                   f3
3
     700
          1600
                 2700
23
     400
          1200
                 2400
15
     550
          1400
                 2600
58
     700
          1300
                 2300
22
     550
          1600
                 2200
           . . .
853
     600
          1050
                 2850
711
     600
          1200
                 2300
720
     550
          1100
                 2300
741
     500
          1200
                 2300
863
     500
           900
                 2800
[264 rows x 3 columns]
3
       1
23
       1
15
       1
58
       1
22
       1
853
       6
711
       6
720
       6
741
       6
Name: vowel class, Length: 264, dtype: int64
[5, 6, 1, 2, 1, 1, 2, 5, 6, 6, 2, 5, 1, 5, 1, 1, 1, 1, 1, 1, 2, 2, 2, 6, 2, 2, 2,
```

```
2, 2, 2, 2, 2, 1, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 6, 6, 2, 2, 3, 3, 3, 3, 3,
3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 5, 3, 3, 3, 5, 5, 5, 3, 3, 3, 3, 3, 3, 3, 1,
3, 3, 3, 5, 3, 5, 5, 5, 5, 5, 3, 5, 3, 3, 5, 3, 3, 3, 3, 5, 6, 4, 4, 4, 4, 4, 4,
6, 4, 4, 1, 4, 4, 4, 4, 4, 4, 4, 4, 6, 4, 6, 4, 4, 6, 4, 4, 6, 4, 4, 6, 4, 4, 4,
     6,
         2,
           4, 4,
                 5, 5, 6, 5, 1, 5, 5, 5, 1, 5, 5, 6, 5, 3, 3, 5, 5, 3,
  1, 3,
        5,
           3,
               5,
                  5,
                    3,
                       3,
                 5, 5, 6, 6, 3, 5, 1, 1, 3, 1, 5, 5, 5, 5, 3, 4, 6, 6, 4, 6, 4,
1, 5, 1, 1, 5, 3,
6, 4, 6, 2, 6, 4, 6, 4, 2, 6, 2, 2, 6, 4, 6, 6, 2, 4, 6, 6, 6, 6, 6, 4, 6, 4, 6,
4, 6, 6, 6, 6, 4, 6, 6, 6, 4, 2, 6, 6, 4, 6, 6, 6, 2, 2, 2, 6]
     Pred_class
0
1
              6
2
              1
3
              2
4
              1
259
              6
              2
260
              2
261
              2
262
263
              6
[264 rows x 1 columns]
     index vowel class
0
        3
                      1
1
        23
                      1
2
        15
3
        58
                      1
4
        22
                      1
       . . .
. .
259
       853
                      6
260
       711
                      6
261
       720
                      6
262
       741
                      6
263
       863
                      6
[264 rows x 2 columns]
     vowel class Pred_class
0
               1
                           5
1
               1
                           6
2
               1
                           1
3
               1
                           2
4
               1
                           1
             . . .
259
              6
                           6
                           2
260
               6
261
               6
                           2
                           2
262
               6
263
               6
[264 rows x 2 columns]
      f1
            f2
                  f3
49
     750
          1350
                2100
47
     650
          1400
                2000
9
     600
          1600
                2600
64
     500
          1900
                2300
34
     700
          1400
                2360
           . . .
787
     500
           900
                2700
729
     400
         1300
                2300
819
     450
          1000
                2300
```

```
[607 rows x 3 columns]
    vowel class
49
47
             1
9
             1
             1
64
34
             1
787
             6
729
             6
             6
819
803
             6
800
             6
[607 rows x 1 columns]
     f1
          f2
                f3
39
    750
        1500
              2360
28
    500
        1400
              2360
48
    600
        1800
              2300
37
    700
        1550
              2360
15
    550
        1400
              2600
          . . .
. .
    . . .
               . . .
    500
         900
              2800
838
813
    400
         1050
              2300
750
    450
         950
              2100
796
    500
        1000
              2400
    500
        1000 2720
756
[264 rows x 3 columns]
39
      1
28
      1
48
      1
37
      1
15
      1
838
      6
813
      6
750
      6
796
      6
756
      6
Name: vowel class, Length: 264, dtype: int64
[1, 1, 5, 1, 1, 1, 1, 5, 1, 1, 5, 1, 1, 1, 1, 1, 2, 5, 2, 1, 5, 2, 1, 2, 2, 6, 2, 2,
2, 1, 2, 2, 2, 2, 2, 2, 2, 2, 1, 2, 2, 2, 6, 2, 2, 1, 2, 6, 5, 5, 3, 3, 3,
6, 4, 4, 4, 6, 4, 4, 4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 6, 6, 4,
4, 6, 4, 4, 4,
                       4, 4, 6, 5, 5, 6, 1, 5, 3, 5, 5, 3, 1, 3, 5, 5, 5, 5,
          4,
             4,
                4,
                  4,
                     4,
5, 1, 1, 5, 1, 5, 5, 1, 5, 5, 1, 5, 5, 3, 1, 3, 5, 5, 5, 3, 5, 5, 5, 5, 5, 5, 1,
5, 3, 1, 1, 5, 1, 1, 3, 5, 5, 5, 5, 5, 5, 6, 1, 5, 5, 1, 3, 6, 6, 6, 6, 6, 6,
6, 4, 6, 6, 2, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 4, 6, 4, 4, 6, 6, 6, 6,
4, 2, 6, 6, 2, 6, 6, 2, 6, 6, 2, 6, 6, 4, 6, 6, 6, 4, 4, 6, 6]
    Pred class
0
            1
            1
1
2
            5
3
            1
4
            1
259
            6
260
            4
            4
261
262
            6
263
            6
```

	I	mplemer	ntation of	'Bayes Clas
[264 0		x 1 c	olumns el cla]
1 2 3 4	28 48 37 1!	8 7 5		1 1 1
259 260 261 262 263	756 756	3 3 9	•	6 6 6 6
[264 0 1 2 3 4 259 260 261 262 263		l clas	olumns s Pre 1 1 1 1 6 6 6 6	d_class 1 5 1 6 4 4 6
[264	rows f1	x 2 c	olumns f3]
862 842 776	600 400 700 550 500 400 500 500	1700 1200 1500 1700	2300 2400 2600 2600 2300 2300 2900 2700 2560	
[607		x 3 c	olumns s]
46 23 2 17 63			1 1 1 1	
813 862 842 776 834			6 6 6 6	
28 13 38	f1 500 550 550 500	x 1 c f2 1400 1800 1400 1400 1900	2600 2300 2360]

```
840
   500
         900
             2750
713
    550
        1250
             2300
829
    450
        1050
             2300
735
    500
        1000
             2300
770
    600
        1100 2750
[264 rows x 3 columns]
28
      1
13
      1
38
27
      1
64
      1
     . .
840
     6
713
829
      6
735
      6
770
      6
Name: vowel class, Length: 264, dtype: int64
[1, 5, 1, 1, 5, 2, 1, 1, 1, 2, 1, 1, 2, 2, 2, 1, 1, 1, 1, 6, 1, 5, 2, 1, 2, 6, 2,
3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 5, 5, 5, 5, 3, 3, 5, 5, 3, 3, 2, 4, 4, 4, 4, 4, 4,
               4, 4, 6, 4, 4,
            6, 4, 4, 4, 4, 4, 4, 1, 3, 5, 1, 5, 1, 5, 3, 5, 5, 5, 1, 3, 5,
1, 1, 6, 3, 5, 5, 5, 5, 5, 3, 1, 5, 5, 5, 5, 3, 5, 5, 5, 3, 3, 5, 1, 6, 5, 3, 5,
5, 5, 3, 1, 5, 5, 1, 3, 5, 3, 1, 1, 1, 1, 5, 5, 5, 5, 5, 3, 5, 3, 4, 6, 6, 4, 6, 6,
6, 6, 4, 6, 4, 4, 4, 4, 6, 6, 6, 2, 2, 6, 6, 6, 6, 6, 6, 6, 2, 4, 6, 6, 6, 6, 6,
6, 6, 6, 6, 4, 6, 2, 4, 6, 4, 4, 6, 6, 4, 2, 6, 6, 2, 6, 6, 6]
    Pred_class
0
            1
            5
1
2
            1
3
            1
            5
4
. .
259
            6
260
            2
261
            6
262
            6
263
            6
[264 rows x 1 columns]
    index vowel class
0
      28
                  1
1
      13
                   1
2
      38
                   1
3
      27
                  1
4
      64
                   1
      . . .
259
      840
                   6
260
      713
                   6
261
      829
                   6
262
      735
                   6
263
      770
[264 rows x 2 columns]
    vowel class Pred class
0
            1
                       1
1
            1
                       5
2
            1
                       1
3
             1
                       1
                       5
4
             1
```

```
259
                             2
260
                6
261
                6
                             6
262
                6
                             6
263
                6
                             6
[264 rows x 2 columns]
             f2
                   f3
      f1
20
     550
          1350
                 2200
9
     600
          1600
                 2600
42
     600
          1400
                 2360
45
     650
          1350
                 2100
29
     550
          1300
                 2300
. .
856
     500
          1100
                 2800
699
     450
          1100
                 2700
728
     450
          1100
                 2300
745
     400
          1200
                 2400
837
     600
          1000
                2700
[607 rows x 3 columns]
     vowel class
20
                1
                1
9
42
                1
45
                1
29
                1
. .
              . . .
856
                6
699
                6
728
                6
                6
745
837
                6
[607 rows x 1 columns]
      f1
             f2
                   f3
22
     550
          1600
                 2200
38
     550
          1400
                 2300
39
     750
          1500
                 2360
16
     650
          1600
                 2600
53
     550
          1500
                 2600
            . . .
                  . . .
. .
     . . .
823
     400
            900
                 2300
818
     400
            850
                 2300
829
     450
           1050
                 2300
739
     500
           1100
                 2250
721
     400
            900
                 2300
[264 rows x 3 columns]
22
       1
38
       1
39
       1
16
       1
53
       1
823
       6
818
       6
829
       6
739
       6
721
Name: vowel class, Length: 264, dtype: int64
[1, 1, 1, 1, 1, 2, 5, 1, 1, 2, 5, 1, 5, 1, 1, 1, 1, 1, 5, 2, 2, 1, 2, 2, 2, 2, 1,
2, 2, 2, 1, 2, 2, 2, 2, 2, 6, 2, 2, 6, 2, 2, 2, 2, 2, 2, 2, 6, 6, 3, 3, 3, 3, 3,
5, 3, 3, 5, 3, 3, 3, 1, 3, 3, 3, 3, 3, 5, 3, 5, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3,
```

```
3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 6, 6, 4, 4, 4, 4, 6,
4, 4, 4, 4, 4, 4, 4, 6, 4, 4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 6, 4, 4, 6,
4, 6, 4, 4, 4, 4, 4, 4, 6, 4, 4, 5, 5, 5, 1, 1, 3, 5, 5, 5, 5, 5, 1, 3, 5, 5, 1,
3, 3, 5, 5, 5, 1, 5, 3, 5, 1, 5, 1, 3, 5, 3, 5, 6, 5, 5, 5, 5, 5, 5, 5, 3, 3, 5,
5, 5, 1, 5, 5, 5, 5, 5, 5, 5, 3, 5, 1, 5, 1, 5, 5, 5, 5, 5, 2, 1, 5, 6, 4, 6, 4, 6, 2,
6, 6, 6, 2, 1, 6, 6, 6, 6, 4, 2, 4, 6, 6, 6, 6, 2, 6, 4, 6, 6, 6, 6, 6, 6, 6, 4,
6, 4, 6, 2, 4, 2, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 4, 6, 6, 4]
     Pred_class
0
1
              1
2
              1
3
               1
. .
259
260
261
              6
262
              6
263
[264 rows x 1 columns]
     index vowel class
0
        22
                       1
1
        38
                       1
2
        39
                       1
3
        16
                       1
        53
       . . .
259
       823
                       6
260
       818
                       6
261
       829
                       6
       739
262
                       6
263
       721
[264 rows x 2 columns]
     vowel class Pred_class
0
               1
                            1
1
               1
                            1
2
               1
                            1
3
               1
                            1
               1
4
                            1
              . . .
. .
                           . . .
                            4
259
               6
260
               6
                            4
               6
                            6
261
262
               6
                            6
263
               6
                            4
[264 rows x 2 columns]
      f1
            f2
                   f3
50
     700
          1750
                2300
3
     700
          1600
                2700
29
     550
          1300
                 2300
20
     550
          1350
                 2200
61
     650
          1600
                2300
     . . .
           . . .
. .
823
     400
           900
                2300
776
     500
          1000
                2560
824
     500
          1050
                2300
782
     500
           950
                2560
     550
778
          1050
                2560
```

[607 rows x 3 columns]
 vowel class

```
50
3
           1
29
           1
           1
20
61
           1
. .
          . . .
823
           6
           6
776
           6
824
782
           6
778
           6
[607 rows x 1 columns]
         f2
    f1
              f3
14
    600
       1400
            2600
39
   750
       1500
            2360
32
    500
       1350
            2360
4
    550
       1600
            2600
43
   650
       1350
            2360
792
   500
       1000
            2600
862
   500
       1000
            2900
717
    500
       1200
            2300
704
   400
       1150
            2200
702
   450
       1150
            2700
[264 rows x 3 columns]
14
     1
39
     1
32
     1
4
     1
43
     1
792
     6
862
     6
717
     6
704
     6
702
     6
Name: vowel class, Length: 264, dtype: int64
[1, 1, 1, 5, 2, 2, 6, 1, 1, 2, 1, 1, 5, 5, 6, 1, 1, 1, 1, 5, 2, 5, 2, 1, 6, 6, 2,
2, 2, 2, 2, 2, 2, 2, 2, 6, 2, 6, 2, 2, 2, 2, 6, 6, 6, 6, 2, 2, 3, 3, 3, 5,
4, 4, 6, 6, 6, 4, 4, 4, 4, 4, 4, 4, 4, 4, 6, 4, 4, 6, 6, 6, 4, 4, 4,
         4,
4, 4, 4,
      4,
           4,
             4, 4, 6, 4, 1, 4, 5, 5, 5, 1, 3, 3, 5, 5, 3, 1, 1, 6, 5, 5, 5,
                  5, 5, 6,
      5,
         1,
           1,
              5, 5,
           5,
        5,
             5, 3, 5, 3, 5, 3, 5, 5, 5, 5, 5, 1, 3, 5, 4, 4, 6, 4, 6, 4,
5, 5, 5, 5,
6, 4, 6, 6, 6, 6, 6, 2, 4, 2, 6, 6, 6, 2, 6, 6, 6, 2, 6, 6]
   Pred class
           1
0
1
           1
2
           1
3
           5
4
           2
259
           6
260
           6
261
           2
262
           6
263
           6
```

[264 rows x 1 columns]
 index vowel class

0	14	1
1	39	1
2	32	1
3	4	1
4	43	1
• •	• • •	
259	792	6
260	862	6
261	717	6
262	704	6
263	702	6

[264 rows x 2 columns]

	vowel	class	Pred_class
0		1	1
1		1	1
2		1	1
3		1	5
4		1	2
259		6	6
260		6	6
261		6	2
262		6	6
263		6	6

[264 rows x 2 columns] f1 f2 f3 1800 2300 1400 2300 1300 2300 . . . 1000 2700

[607 rows x 3 columns]

_			
	vowel	class	
68		1	
46		1	
48		1	
38		1	
65		1	
756		6	
709		6	
724		6	
787		6	
847		6	

[607	rows	x 1 c	olumns]
	f1	f2	f3
64	500	1900	2300
58	700	1300	2300
9	600	1600	2600
62	700	1400	2300
8	550	1400	2550
749	450	1100	2300
812	500	1050	2300

```
771
    550
        1500
836
    500
        1100 2760
851
    450
         900 2750
[264 rows x 3 columns]
64
      1
58
      1
9
      1
62
      1
8
      1
749
      6
812
      6
771
      6
836
      6
851
      6
Name: vowel class, Length: 264, dtype: int64
[5, 2, 1, 1, 1, 1, 1, 1, 1, 5, 5, 5, 1, 6, 5, 1, 1, 1, 2, 1, 2, 5, 2, 1, 2, 2, 2,
2, 2, 2, 6, 2, 2, 6, 2, 2, 6, 6, 2, 2, 2, 6, 6, 2, 2, 2, 6, 3, 3, 3, 3, 3,
3, 3, 3, 3, 3, 3, 3, 1, 3, 3, 3, 3, 3, 3, 3, 3, 1, 3, 3, 4, 4, 4, 4, 4, 4, 6,
4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 6, 4, 6, 4, 4, 4, 4, 4, 4, 4, 4, 6, 2, 2, 6,
             4, 4, 4, 4, 6, 4, 2, 5, 1, 3, 5, 1, 5, 5, 1, 3, 5, 5, 3, 3, 5, 5,
          1,
             5,
               5, 5, 5, 5, 5, 1, 1, 1, 5, 5, 3, 3, 5, 5, 1, 5, 3, 5, 5, 6, 5,
3, 5, 1, 1, 5, 5, 6, 3, 1, 5, 1, 5, 5, 5, 5, 5, 1, 1, 1, 5, 5, 6, 6, 6, 6, 6, 6,
2, 6, 4, 4, 6, 4, 6, 6, 2, 6, 6, 6, 6, 6, 6, 6, 6, 6, 5, 6, 4]
    Pred_class
            5
0
1
            2
2
            1
3
            1
4
            1
259
            6
260
            6
261
            5
262
            6
263
[264 rows x 1 columns]
    index vowel class
0
       64
                   1
1
       58
                    1
       9
2
                   1
3
       62
                   1
4
       8
                    1
      . . .
259
      749
                   6
260
      812
                    6
261
      771
                   6
262
      836
                   6
263
      851
[264 rows x 2 columns]
    vowel class
               Pred class
0
                        5
             1
                        2
1
             1
2
             1
                        1
3
             1
                        1
4
             1
                        1
259
             6
                        6
260
             6
                        6
```

```
261
262
               6
                           6
263
               6
                           4
[264 rows x 2 columns]
           f2
     f1
                  f3
3
     700
         1600
               2700
     600
48
         1800
               2300
70
     650
         1600
               2300
36
     500
         1450
               2400
35
     450
         1650
               2400
. .
           . . .
                 . . .
     . . .
727
    400
         1000
               2300
800
    450
         1200
               2300
715
     500
         1000
               2300
735
     500
         1000
               2300
801
     500
         1050
               2300
[607 rows x 3 columns]
     vowel class
3
48
               1
70
               1
36
               1
35
               1
727
               6
800
               6
715
               6
735
               6
801
               6
[607 rows x 1 columns]
           f2
     f1
                  f3
23
     400
         1200
               2400
41
     500
         1500
               2360
53
     550
         1500
               2600
55
     700
         1400
               2300
11
     500
         1750
               2600
           . . .
709
     400
          1300
               2300
808
     500
         1000
               2300
724
     450
         1050
               2300
868
     500
         1000
                2800
752
     500
         1100
               2250
[264 rows x 3 columns]
23
       1
41
       1
53
       1
55
       1
11
       1
      . .
709
       6
808
       6
724
       6
868
       6
752
Name: vowel class, Length: 264, dtype: int64
[6, 1, 1, 2, 5, 5, 2, 1, 2, 5, 1, 2, 1, 2, 2, 2, 2, 5, 2, 2, 6, 2, 6, 2, 6, 2, 6, 2,
2, 2, 2, 2, 6, 2, 6, 2, 6, 6, 2, 6, 6, 2, 6, 2, 2, 2, 2, 2, 2, 1, 2, 5, 3, 3, 3,
3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 6, 4, 4, 4, 4, 2, 4,
6, 6, 4, 4, 4, 4, 6, 4, 6, 4, 4, 4, 4, 6, 6, 6, 4, 4, 4, 4, 4, 4, 4, 6, 6, 6,
```

```
4, 4, 4, 6, 4, 6, 4, 4, 4, 4, 4, 5, 5, 1, 5, 1, 3, 5, 1, 5, 5, 5, 5, 5, 5, 5,
1, 5, 5, 3, 5, 5, 5, 3, 5, 5, 5, 3, 5, 5, 3, 5, 3, 3, 5, 5, 5, 5, 3, 1, 3, 5, 5,
5, 5, 1, 3, 3, 3, 5, 3, 5, 5, 5, 5, 5, 5, 1, 5, 1, 5, 5, 3, 5, 6, 2, 2, 6, 6, 4,
2, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 4, 4, 6, 6, 1, 6, 6, 6]
    Pred_class
0
1
             1
2
             1
3
             2
             5
4
259
             1
260
             6
261
262
             6
263
[264 rows x 1 columns]
     index vowel class
0
       23
                     1
1
       41
                     1
2
       53
                     1
       55
3
                     1
       11
                     1
       . . .
259
      709
                     6
260
      808
                     6
261
      724
                     6
262
      868
                     6
263
      752
[264 rows x 2 columns]
     vowel class Pred_class
0
              1
1
              1
                          1
2
              1
                          1
                          2
3
              1
                          5
4
              1
259
              6
                          1
260
              6
                          6
              6
261
                          6
262
              6
                          6
263
              6
                          6
[264 rows x 2 columns]
           f2
     f1
                 f3
     650
         1600
               2600
16
26
         1400
               2300
     600
5
     600
         1250
               2700
61
     650
         1600
               2300
70
     650
         1600
               2300
          . . .
. .
     . . .
                . . .
719
    500
         1200
               2300
751
     500
         1000
               2300
862
     500
         1000
               2900
728
    450
         1100
               2300
725
    400
         1000
               2300
[607 rows x 3 columns]
     vowel class
```

```
5
61
              1
70
              1
. .
            . . .
719
              6
751
              6
              6
862
728
              6
725
              6
[607 rows x 1 columns]
     f1
           f2
                f3
32
    500
         1350
              2360
23
    400
         1200
              2400
50
    700
         1750
              2300
6
    550
         1200
              2500
56
    600
         1400
              2300
. .
    . . .
          . . .
                . . .
787
    500
          900
              2700
732
    600
         1200
              2300
699
    450
         1100
              2700
843
    500
         1000
              2700
848
    400
         1000
              2800
[264 rows x 3 columns]
32
      1
23
      1
50
      1
6
      1
56
      1
787
      6
732
      6
699
      6
843
      6
848
Name: vowel class, Length: 264, dtype: int64
6, 2, 2, 2, 1, 2, 2, 2, 2, 2, 2, 6, 2, 2, 2, 6, 2, 2, 6, 2, 2, 3, 3, 3, 3, 3,
     3,
        3,
           3,
             3,
                3, 3,
                      3,
                        3, 3, 3, 5, 3, 3, 3, 3, 3, 5, 5, 3, 3, 3, 5, 5, 3,
        3,
           3,
             3,
                3,
                   3,
                      3,
                         5,
                           3,
                              3,
                                 3,
                                    3,
                                      3,
                                         3,
                                            3,
                                               5, 3, 3, 4, 4, 4, 4, 4, 4, 4,
          4,
                           4, 4, 4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 6, 4, 4,
6, 4, 4,
        2,
             4,
                4,
                   4,
                      4,
                        6,
                              4, 5, 3, 3, 1, 5, 5, 5, 3, 5, 5, 5, 5, 5, 5, 5,
           4,
             4,
                4,
                   4,
                      4,
                        4,
                           4,
5, 3, 5, 5, 3, 5, 3, 3, 1, 3,
                           5, 5, 5, 5, 3, 5, 5, 1, 3, 6, 5, 1, 3, 5, 5, 1, 5,
3, 5, 5, 3, 3, 5, 1, 1, 5, 6, 5, 1, 3, 3, 5, 3, 3, 3, 6, 3, 5, 6, 6, 6, 2, 6, 4,
6, 6, 6, 4, 6, 6, 6, 6, 6, 6, 6, 6, 4, 6, 6, 4, 2, 6, 2, 6, 6, 4]
    Pred_class
0
             1
             6
1
2
             1
3
             6
4
             1
. .
259
             6
260
             2
261
             6
             6
262
263
             4
[264 rows x 1 columns]
    index vowel class
0
       32
                    1
1
       23
                    1
```

2	50	1
3	6	1
4	56	1
• •	• • •	
259	787	6
260	732	6
261	699	6
262	843	6
263	848	6

[264 rows x 2 columns]

	vowel	class	Pred_class
0		1	1
1		1	6
2		1	1
3		1	6
4		1	1
• •			
259		6	6
260		6	2
261		6	6
262		6	6
263		6	4

[264 rows x 2 columns] f1 f2 f3 550 1700 2600 3 700 1600 2700 10 550 2000 2700 69 600 1850 2300 65 700 1300 2300 739 500 1100 2250 768 600 1100 2700 753 600 1200 2300 712 500 1200 2300

[607 rows x 3 columns]

400 1000 2300

	vowel	class	
17		1	
3		1	
10		1	
69		1	
65		1	
739		6	
768		6	
753		6	
712		6	
716		6	

[607	rows	x 1 c	olumns]
	f1	f2	f3
24	600	1200	2300
68	650	1200	2300
54	600	1350	2300
0	700	1500	2600
19	700	1350	2600
• •		• • •	
732	600	1200	2300
858	500	1000	2800
822	500	850	2300
842	500	1000	2700

```
831 450 1100 2300
[264 rows x 3 columns]
24
    1
68
    1
54
    1
0
    1
19
    1
732
    6
858
    6
822
    6
842
    6
831
    6
Name: vowel class, Length: 264, dtype: int64
[2, 2, 2, 1, 1, 2, 2, 6, 5, 1, 1, 1, 1, 2, 1, 1, 2, 2, 6, 2, 1, 1, 2, 1, 2, 2, 2,
3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3,
4, 4, 4, 4, 4, 4, 4, 4, 6, 4, 6, 5, 5, 5, 5, 5, 5, 5, 5, 5, 5, 5, 5, 6, 3, 2, 1,
6, 5, 3, 5, 3, 5, 5, 1, 5, 5, 1, 3, 3, 1, 5, 5, 1, 5, 6, 1, 5, 2, 4, 6, 2, 6, 6,
4, 6, 6, 6, 6, 6, 6, 6, 2, 6, 6, 4, 6, 6, 6, 6, 6, 2, 6, 4, 6, 6]
   Pred_class
0
         2
1
         2
         2
2
3
         1
4
         1
259
         2
260
         6
         4
261
262
         6
263
         6
[264 rows x 1 columns]
   index vowel class
0
     24
               1
1
     68
               1
2
     54
               1
3
      0
               1
4
     19
               1
     . . .
259
    732
               6
260
    858
               6
261
    822
               6
262
    842
               6
263
    831
               6
[264 rows x 2 columns]
   vowel class Pred_class
0
          1
                   2
1
          1
                   2
2
          1
                   2
3
          1
                   1
4
          1
                   1
         . . .
259
          6
                   2
260
          6
                   6
```

```
263
[264 rows x 2 columns]
            f2
      f1
                   f3
63
     500
          1900
                2300
30
     650
          1200
                2300
          1200
68
     650
                 2300
     400
          1200
23
                 2400
     550
          2000
10
                 2700
     . . .
           . . .
. .
                  . . .
767
     500
          1100
                 2700
703
     400
          1000
                 2200
848
     400
          1000
                 2800
734
     500
          1250
                2300
756
     500
          1000
                2720
[607 rows x 3 columns]
     vowel class
63
               1
30
               1
68
                1
23
               1
10
               1
. .
              . . .
767
               6
               6
703
848
                6
734
                6
756
                6
[607 rows x 1 columns]
            f2
      f1
                   f3
19
     700
          1350
                 2600
21
     600
          1400
                 2200
4
     550
          1600
                 2600
39
     750
          1500
                 2360
69
     600
          1850
                 2300
     . . .
           . . .
809
     400
          1000
                 2300
706
     400
          1100
                 2300
813
     400
          1050
                 2300
     500
           950
816
                 2300
733
     500
          1200
                2300
[264 rows x 3 columns]
19
       1
21
       1
4
       1
39
       1
69
       1
809
       6
706
       6
813
       6
816
       6
733
Name: vowel class, Length: 264, dtype: int64
[1, 1, 5, 1, 5, 2, 1, 1, 1, 1, 2, 1, 6, 2, 5, 5, 1, 1, 1, 1, 1, 5, 6, 2, 1, 2, 2,
2, 6, 1, 2, 2, 6, 2, 2, 2, 2, 2, 2, 2, 2, 6, 6, 2, 2, 2, 2, 6, 3, 3, 3, 3, 3,
3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 1, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3,
3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 6, 2, 4, 4, 4, 4, 4,
4, 4, 4, 4, 4, 4, 2, 4, 4, 4, 4, 4, 4, 4, 6, 4, 6, 4, 6, 4, 6, 4, 4, 4, 4, 6,
4, 6, 2, 4, 4, 6, 4, 4, 4, 4, 4, 5, 5, 5, 6, 5, 3, 3, 5, 5, 3, 5, 5, 3, 3, 5,
5, 3, 6, 3, 5, 5, 5, 5, 5, 1, 5, 5, 5, 1, 6, 5, 5, 3, 1, 1, 5, 1, 5, 3, 1, 5, 5,
```

```
5, 5, 5, 5, 3, 5, 1, 5, 5, 5, 5, 1, 3, 5, 5, 5, 5, 5, 5, 5, 5, 5, 5, 6, 6, 6, 6, 6, 2,
6, 6, 4, 2, 6, 6, 4, 6, 6, 6, 6, 6, 6, 4, 6, 4, 4, 6, 6, 6, 2]
    Pred_class
0
           1
1
2
           5
3
           1
           5
259
           4
260
           6
261
           6
262
           6
263
[264 rows x 1 columns]
    index vowel class
```

.

[264 rows x 2 columns]

	vowel	class	Pred_class
0		1	1
1		1	1
2		1	5
3		1	1
4		1	5
• •			
259		6	4
260		6	6
261		6	6
262		6	6
263		6	2

[264 rows x 2 columns]

[67.79661016949152, 70.05649717514125, 70.05649717514125, 70.62146892655367, 59.88 7005649717516, 67.79661016949152, 63.2768361581921, 70.62146892655367, 70.62146892 655367, 74.57627118644068, 66.28787878787878, 73.10606060606061, 71.2121212121212 2, 71.5909090909091, 69.6969696969697, 71.21212121212122, 67.42424242424242, 73.10 606060606061, 75.0, 72.72727272727273]

```
f1
            f2
                   f3
13
     550
          1800
                2600
35
     450
          1650
                2400
24
     600
          1200
                2300
28
     500
          1400
                2360
15
     550
          1400
                2600
           . . .
691
    400
           900
                2700
815
     400
           850
                2300
785
     500
          1100
                2500
765
     500
          1000
                2650
698
     500
          1250
               2700
```

[521 rows x 3 columns]

```
vowel class
13
             1
35
             1
24
             1
28
             1
             1
15
. .
            . . .
691
             6
             6
815
785
             6
             6
765
698
             6
[521 rows x 1 columns]
     f1
           f2
                f3
         1500
0
    700
              2600
50
    700
         1750
              2300
55
    700
         1400
              2300
9
    600
         1600
              2600
26
    600
         1400
              2300
    . . .
          . . .
                . . .
787
    500
          900
              2700
732
    600
         1200
              2300
859
    550
         1100
              2750
716
    400
         1000
              2300
845
    500
         1000
              2700
[350 rows x 3 columns]
0
      1
50
      1
55
      1
9
      1
26
      1
787
      6
732
      6
859
      6
716
      6
845
      6
Name: vowel class, Length: 350, dtype: int64
[1, 1, 1, 1, 1, 2, 1, 1, 6, 2, 1, 1, 1, 1, 1, 2, 1, 1, 2, 1, 2, 1, 5, 1, 2, 1, 6,
3,
             3,
                1,
                   3,
                      3,
                         3,
                           5, 3, 3, 3, 3, 3, 3, 5, 3, 1, 3, 3, 3, 3, 3,
     3,
        3,
           5,
             3,
                3,
                      3,
                                                       5,
3, 3,
                   3,
                         3,
                           3, 3, 3, 3, 3, 3, 3, 3, 3,
                                                          5, 3, 3, 3, 3, 4,
     6,
                           4, 4, 4, 4, 4, 4, 4, 4, 4, 4, 4, 4, 4, 6, 4,
                4,
                   4,
                      4,
                         4,
                                            6,
                           4,
                              4, 6, 4,
                                      6, 4,
                                              4,
                                                 4,
                                                    6,
                                                       4,
                                                          4, 4,
     6,
                4,
                   6,
                      4,
                        4,
        4,
             4,
                5,
                   5,
                     5,
           2,
                        5, 5, 5, 5, 3, 5, 3, 5, 3, 3, 1, 5, 5, 1, 5, 5,
6, 3, 1,
             5,
                5, 5, 3, 1, 3, 3, 6, 5, 2, 5, 5, 1, 3, 1, 1, 1, 1, 5, 5, 5, 5,
        3,
          3,
             1,
                5, 1, 3, 5, 1, 3, 3, 5, 3, 5, 5, 5, 5, 1, 5, 5, 3, 5, 5, 5,
        5,
             5,
                3, 5, 4, 6, 6, 4, 6, 4, 1, 6, 4, 4, 2, 6, 2, 4, 2, 6, 2, 2, 6,
     5,
           3,
  6, 6, 4, 6, 4,
                1, 6, 4, 2, 6, 6, 6, 6, 4, 4, 5, 6, 6, 4, 2, 4, 2, 6, 2, 6, 6,
  6, 6, 6, 2, 4, 4, 6, 6, 6, 6, 2, 6, 2, 6, 4, 6, 6, 6, 6, 6, 2, 6, 4, 6]
    Pred_class
0
             1
1
             1
2
             1
3
             1
4
             1
345
             6
346
             2
347
             6
348
             4
```

[350	rows x	1 columns]
	index	vowel class
0	0	1
1	50	1
2	55	1
3	9	1
4	26	1
• •	• • •	• • •
345	787	6
346	732	6
347	859	6
348	716	6
349	845	6

[350 rows x 2 columns]

	vowel	class	Pred_class
0		1	1
1		1	1
2		1	1
3		1	1
4		1	1
345		6	6
346		6	2
347		6	6
348		6	4
349		6	6

[350 rows x 2 columns] f1 f2 f3 1700 2300 1200 2500 . . .

[521 rows x 3 columns]

	vower	crass	
52		1	
6		1	
59		1	
18		1	
66		1	
764		6	
745		6	
722		6	
705		6	
750		6	

[521 rows x 1 columns] f1 f2 f3

```
49
     750 1350
                2100
. .
           . . .
                 . . .
825
    450
          1000
                2350
843
     500
          1000
                2700
762
     500
          1000
                2600
694
     500
          1100
                2700
862
     500
          1000 2900
[350 rows x 3 columns]
16
       1
41
       1
10
       1
49
       1
825
       6
843
       6
762
       6
694
       6
862
Name: vowel class, Length: 350, dtype: int64
[1, 1, 1, 5, 2, 2, 2, 5, 1, 5, 1, 1, 2, 1, 1, 5, 1, 2, 5, 1, 1, 1, 1, 1, 1, 2, 1, 1,
1, 1, 2, 2, 6, 2, 2, 2, 2, 2, 2, 6, 2, 2, 1, 2, 2, 6, 2, 2, 2, 2, 2, 2, 2, 2, 6,
     2,
         2,
            2,
               2,
                  1,
                     2,
                        2, 1, 6, 3, 3, 5, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3,
3, 3, 3, 3,
           3, 3,
                  3, 3, 3, 3, 3, 5, 3, 5, 3, 3, 3, 3, 3, 5, 3, 5, 3, 3, 3,
3, 3, 3, 3, 3, 3, 5, 5, 5, 3, 5, 5, 3, 5, 3, 3, 3, 3, 3, 3, 1, 3, 3, 3, 3, 3, 6,
4, 4, 4, 4, 4, 4, 4, 4, 2, 4, 6, 4, 4, 6, 4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 4, 4,
            4,
                     4,
               4,
     4,
         4,
                  6,
                        2, 6, 4, 4, 4, 4, 4, 4, 4, 4, 6, 4, 4, 4, 6,
                                           5, 1,
                                                 3, 5, 5, 5, 3, 3, 3, 3, 5, 3, 5,
      6,
         4,
            4,
               4,
                  5,
                     5,
                        5,
                            5,
                               5,
                                  3,
                                     1,
                                        3,
      5,
         5,
            3,
               5,
                  5,
                     5,
                        5,
                           5,
                              5, 5, 3, 5, 5, 5, 5, 5, 3, 5, 5, 5, 5, 5, 5, 5, 5,
           5,
                  3, 1, 6, 1, 1, 5, 5, 3, 5, 5, 5, 1, 1, 5, 5, 1, 1, 5, 6, 3, 5,
3, 5, 3, 5,
              5,
5, 5, 5, 3, 1, 3, 1, 3, 6, 6, 6, 6, 1, 6, 6, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6,
6, 6, 5, 4, 6, 6, 2, 6, 6, 6, 4, 4, 6, 6, 6, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6,
4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 2, 6, 4, 5, 6, 6, 6, 6, 6, 6, 6, 6, 4]
     Pred_class
0
1
              1
2
              1
3
              5
4
              2
345
              6
346
              6
347
              6
348
              6
349
              4
[350 rows x 1 columns]
     index vowel class
0
        39
                      1
1
        16
                      1
2
        41
                      1
3
        10
                      1
4
        49
                      1
345
       825
                      6
346
       843
                      6
347
       762
                      6
348
       694
                      6
349
       862
[350 rows x 2 columns]
     vowel class
                 Pred_class
               1
```

```
1
2
                 1
3
                 1
4
                 1
345
                 6
346
                 6
347
                 6
348
                 6
349
                 6
[350 rows x 2 columns]
      f1
             f2
                    f3
4
     550
           1600
                  2600
55
     700
           1400
                  2300
35
     450
           1650
                  2400
70
     650
           1600
                  2300
30
     650
           1200
                  2300
. .
      . . .
             . . .
                    . . .
828
     450
           1050
                  2300
805
     450
           1200
                  2300
746
     450
           1000
                  2350
821
      500
           1000
                  2300
767
     500
           1100
                  2700
[521 rows x 3 columns]
     vowel class
4
                 1
55
                 1
35
                 1
70
                 1
30
                 1
                 6
828
805
                 6
746
                 6
821
                 6
                 6
767
[521 rows x 1 columns]
      f1
             f2
                    f3
38
     550
           1400
                  2300
58
     700
           1300
                  2300
60
     700
           1350
                  2300
21
      600
           1400
                  2200
37
     700
           1550
                  2360
             . . .
                    . . .
. .
      . . .
869
            900
     500
                  2800
743
     550
           1100
                  2300
856
      500
           1100
                  2800
860
     500
            950
                  2700
825
     450
           1000
                  2350
[350 rows x 3 columns]
38
        1
58
        1
60
        1
21
        1
37
        1
869
        6
743
        6
856
        6
```

```
825
       6
Name: vowel class, Length: 350, dtype: int64
[1, 2, 2, 1, 1, 1, 1, 2, 1, 2, 1, 5, 2, 6, 2, 1, 1, 2, 1, 1, 5, 1, 1, 1, 5, 2, 5,
1, 1, 2, 2, 2, 2, 1, 1, 2, 2, 2, 2, 6, 2, 6, 2, 1, 2, 2, 2, 2, 2, 2, 2, 2, 6, 2,
     1, 6, 1, 2, 2, 2, 2, 2, 2, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3,
         3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3,
3, 3, 3,
        3,
           3,
              3,
                  3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 4,
               6,
                  4,
                     4,
                        4, 6, 4, 4, 4, 4, 4, 4, 4, 6, 6, 6, 6, 6, 4, 6, 6, 4,
4, 4, 4, 4, 4, 4, 4, 4, 6, 4, 6, 4, 4, 4, 4, 4, 4, 4, 6, 4, 4, 4, 6, 4,
         4, 4, 4, 6, 5, 6, 5, 3, 5, 5, 5, 1, 6, 5, 5, 3, 3, 5, 3, 5, 5, 3, 5, 1,
                     3, 1, 1, 5, 5, 1, 1, 3, 5, 5, 1, 6, 3, 3, 3, 3, 5, 5, 5, 5,
      1,
                  5,
                     5,
                        5, 5, 5, 1, 3, 5, 5, 1, 5, 5, 3, 5, 3, 5, 3, 5, 3, 5, 5,
           5,
              3,
                  5, 1, 6, 6, 6, 4, 6, 6, 2, 6, 6, 4, 6, 6, 2, 6, 6, 6, 4, 6, 4,
6, 6, 4, 4, 6, 4, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 4, 6, 6, 6, 6, 6, 2, 2,
2, 6, 6, 4, 4, 2, 2, 2, 6, 4, 6, 6, 6, 6, 6, 4, 6, 4, 6, 4, 6, 6, 2, 6, 6, 4]
     Pred class
0
              1
              2
1
              2
2
3
              1
4
              1
345
              6
346
              2
347
              6
348
              6
349
[350 rows x 1 columns]
     index vowel class
0
        38
                      1
1
        58
                      1
2
        60
                      1
3
        21
                      1
4
        37
                      1
       . . .
. .
                     . . .
345
       869
                      6
346
       743
                       6
347
       856
                      6
348
       860
                      6
349
       825
                       6
[350 rows x 2 columns]
     vowel class
                 Pred class
0
               1
                            2
1
               1
2
               1
                            2
3
               1
                            1
4
               1
                            1
345
               6
                            6
                            2
346
               6
347
               6
                            6
348
               6
                            6
               6
349
[350 rows x 2 columns]
            f2
                  f3
      f1
     650
          1600
                2600
16
32
     500
          1350
                2360
19
     700
          1350
                2600
68
     650
          1200
                2300
5
     600
          1250
                2700
```

```
797
     550
          1050
                2500
756
     500
          1000
                2720
719
     500
          1200
                2300
          1100
831
     450
                2300
804
     450 1150 2300
[521 rows x 3 columns]
     vowel class
16
               1
32
               1
19
               1
68
               1
               1
. .
             . . .
797
               6
756
               6
719
               6
831
               6
804
               6
[521 rows x 1 columns]
            f2
      f1
                  f3
35
     450
          1650
                2400
14
     600
          1400
                2600
     600
          1600
                2600
28
     500
          1400
                2360
27
     500
          1400
                2360
     . . .
           . . .
                 . . .
832
     400
          1000
                2300
814
     450
          900
                2300
777
     500
         1050 2560
739
     500
         1100 2250
734
     500 1250 2300
[350 rows x 3 columns]
       1
14
       1
9
       1
28
       1
27
       1
832
       6
814
       6
777
       6
739
       6
734
Name: vowel class, Length: 350, dtype: int64
[1, 1, 1, 1, 1, 1, 1, 5, 6, 2, 1, 1, 1, 1, 1, 1, 5, 1, 1, 5, 2, 1, 1, 1, 1, 5, 1,
1, 2, 2, 2, 1, 2, 2, 1, 2, 2, 6, 2, 2, 2, 2, 2, 6, 2, 2, 1, 2, 2, 1, 2, 6, 2, 2,
2, 2, 2, 1, 2, 1, 2, 2, 2, 2, 2, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3,
3, 3,
               3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3,
      3,
         3,
            3,
3, 3,
                                 3, 3, 3,
                                          3,
                                             3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 4,
     3,
         3,
            3,
               3,
                  3,
                     3,
                        3,
                           3,
                              3,
           4,
                  4,
                     4,
                           4,
                              4, 4, 4, 4, 4, 4, 4, 4,
                                                       4, 4, 4, 4, 4, 6, 4,
               4,
                        6,
           4,
              4,
                  4,
                        4,
4, 4, 4,
        4,
                     4,
                           4,
                              4, 4, 6, 4, 4, 4, 4, 4, 6, 4, 4, 4, 4, 4, 4,
6, 4, 6, 6,
           6,
              6,
                 5, 3, 5, 1, 5, 3, 3, 5, 3, 5, 5, 3, 3, 1, 5, 5, 5, 3, 3, 5, 5,
     5,
         5, 1,
               3, 3, 5, 5, 3, 5, 5, 5, 5, 3, 3, 5, 3, 5, 5, 5, 5, 5, 5, 1, 5, 3, 6,
           5, 5, 5, 5, 5, 1, 1, 5, 1, 5, 3, 6, 5, 5, 5, 5, 5, 1, 1, 5, 3, 5, 3,
     5, 1,
5, 5, 1, 5, 5, 1, 5, 5, 5, 6, 6, 6, 6, 6, 4, 6, 6, 4, 6, 6, 4, 6, 4, 6, 2, 6,
6, 4, 6, 6, 6, 6, 6, 2, 4, 6, 2, 4, 6, 6, 6, 6, 6, 4, 4, 6, 4, 4, 6, 6, 6, 4,
6, 6, 2, 6, 2, 6, 6, 6, 6, 4, 6, 6, 6, 6, 6, 2, 6, 2, 6, 2, 6, 4, 4, 6, 2, 2]
     Pred_class
0
              1
              1
1
              1
```

3	1
4	1
• •	
345	4
346	4
347	6
348	2
349	2

[350 rows x 1 columns]

	index	vowel	class
0	35		1
1	14		1
2	9		1
3	28		1
4	27		1
345	832		6
346	814		6
347	777		6
348	739		6
349	734		6

[350 rows x 2 columns]

_		-
	vowel class	Pred_class
0	1	1
1	1	1
2	1	1
3	1	1
4	1	1
345	6	4
346	6	4
347	6	6
348	6	2
349	6	2

[350 rows x 2 columns] f1 f2 f3

	f1	f2	f3
38	550	1400	2300
31	550	1200	2360
35	450	1650	2400
43	650	1350	2360
42	600	1400	2360
			0000
799	500	1000	2300
799 751	500 500	1000 1000	2300
	500		
751	500	1000	2300
751 779	500 500	1000	2300 2560

[521 rows x 3 columns]

	TOWS X 2 COTUMINS
	vowel class
38	1
31	1
35	1
43	1
42	1
	• • •
799	6
751	6
779	6
805	6
754	6

```
[521 rows x 1 columns]
     f1
          f2
        1250
    600
             2700
30
    650
        1200
              2300
55
    700
        1400
              2300
62
    700
        1400
              2300
16
    650
        1600
              2600
         . . .
               . . .
789
        1050
    500
              2600
703
    400
        1000
              2200
827
    400
        1000
              2400
823
    400
         900
              2300
791
    500
         950
             2600
[350 rows x 3 columns]
5
      1
30
      1
55
      1
62
      1
16
      1
789
      6
703
      6
827
      6
823
      6
791
Name: vowel class, Length: 350, dtype: int64
[6, 2, 2, 2, 1, 1, 2, 2, 2, 1, 1, 1, 1, 1, 1, 5, 2, 5, 1, 1, 1, 1, 6, 1, 2, 1, 1,
6, 1, 2, 6, 2, 2, 2, 6, 2, 2, 6, 2, 2, 2, 2, 6, 2, 6, 2, 2, 2, 2, 2, 6, 2, 2, 1,
4, 4, 6, 4, 6, 6, 4, 4, 6, 4, 6, 4, 4, 4, 4, 4, 4, 4, 4, 2,
6, 4, 1, 4,
          4,
            4,
                       6, 4, 4, 4, 4, 6, 4, 4, 6, 2, 6, 4, 4, 4, 4, 6,
4, 6, 4, 4,
                 4,
                    4,
            6,
               3,
                  1,
                    3,
                       3,
                         3, 5, 3, 5, 1, 1, 5, 5, 3, 6,
                                                    5, 6, 5, 5, 5,
               1, 5, 3, 5, 3, 5, 5, 5, 1, 5, 1, 5, 5, 3, 5, 5, 5, 5, 5, 5, 1,
5, 1, 5, 5,
         5,
            1,
3, 3, 5, 5, 5, 5, 6, 5, 5, 3, 3, 5, 6, 3, 1, 3, 5, 3, 5, 1, 5, 1, 5, 5, 1, 5, 5,
2, 3, 1, 3, 3, 5, 5, 3, 6, 6, 6, 2, 6, 6, 4, 4, 6, 6, 2, 4, 6, 6, 6, 6, 6, 6, 6,
  6, 4, 4, 4, 6, 6, 6, 2, 4, 6, 6, 4, 6, 6, 4, 6, 6, 2, 6, 6, 4, 6, 4, 4, 6,
6, 4, 2, 4, 2, 4, 6, 6, 6, 6, 6, 6, 6, 2, 6, 4, 4, 6, 6, 4, 6, 6, 4, 4, 4, 6]
    Pred class
0
            6
1
            2
            2
2
            2
3
4
            1
345
            6
346
            4
347
            4
348
            4
349
[350 rows x 1 columns]
    index vowel class
0
       5
                   1
1
       30
                   1
2
       55
                   1
3
       62
                   1
4
       16
                   1
      . . .
345
      789
                   6
346
      703
                   6
```

	I	mplemer	ntation of '	Bayes Clas
347 348 349	823 823 793	3		6 6 6
[350			olumns]	
0 1 2 3 4 345 346 347 348 349	vowe.		1 1 1 1	d_class 6 2 2 2 1 6 4 4 4 6
[350	rows	x 2 c	olumns]
50 36 21 24 14	600 600	1450 1400 1200 1400	2400 2200 2300 2600	
766 779 860 803 732	550 500 500 400 600	1250 1000 950 1000 1200	2560 2700 2300	
[521 50 36 21 24 14 766 779 860 803 732		l clas	1 1 1 1	
38 28 34 15 40 723 765	f1 550 500	f2 1400 1400 1400 1400 1500 	2360 2360 2600 2360	
822	500	850	2300 olumns]

```
15
40
       1
723
       6
765
       6
696
       6
858
       6
822
       6
Name: vowel class, Length: 350, dtype: int64
[1, 1, 1, 1, 1, 5, 1, 1, 5, 5, 5, 1, 5, 1, 1, 2, 5, 2, 2, 1, 1, 5, 5, 1, 1, 2, 5,
1, 1, 6, 2, 2, 2, 2, 2, 6, 2, 6, 2, 2, 2, 2, 1, 2, 2, 2, 1, 6, 6, 1, 2, 2, 2, 6,
            2,
               2,
                  1,
                     1,
                        2, 2, 2, 3, 3, 5, 3, 3, 3, 3, 3, 5, 3, 5, 3, 5, 3, 3, 3,
     3,
         5,
            5,
               5,
                  3,
                     3,
                        3, 3, 3, 3, 3, 3, 3, 5, 3, 5, 3, 3, 3, 3, 5,
3, 5, 3, 3,
           3,
               3,
                  3, 3, 3, 3, 3, 1, 3, 3, 3, 3, 5, 3, 5, 3, 3, 3, 3, 5, 3, 4,
                  4, 6, 4, 4, 4, 2, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 6, 6, 6, 4, 4,
         6,
               6,
                            1,
                               4, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 2, 4, 4, 4,
                  4,
                      6,
                         4,
                                     5,
                                        5,
                                               5,
                                                        3, 3,
                         5,
                            5,
                               3,
                                  6,
                                           1,
                                                  5, 5,
                                                               3,
                                                                  5, 5, 1,
               4,
                  1,
                      3,
                                     5,
                                           5,
                                              5,
               5,
                  5,
                      5,
                         1,
                            5,
                               5,
                                  3,
                                        3,
                                                  1,
                                                     1,
                                                        5, 1,
                                                              5, 5, 1, 5, 5, 6, 3,
         5,
            3,
               5,
                  5,
                     3,
                        5,
                           5,
                              5, 5, 5, 3, 3, 5, 5, 5, 3, 6, 5, 5, 5, 3, 5, 5, 5,
3, 1, 3, 5, 5, 5, 1, 5, 6, 4, 4, 6, 4, 6, 5, 2, 6, 6, 5, 4, 4, 1, 6, 4, 2, 6, 6,
6, 2, 6, 4, 6, 4, 6, 6, 6, 4, 4, 4, 6, 2, 6, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 2,
6, 2, 6, 6, 2, 6, 6, 4, 6, 6, 6, 6, 6, 2, 6, 6, 2, 6, 6, 2, 2, 6, 6, 6, 6, 4]
     Pred class
0
1
              1
2
              1
3
              1
4
              1
345
              6
346
              6
347
              6
348
              6
349
              4
[350 rows x 1 columns]
     index vowel class
0
        38
                       1
1
        28
                       1
2
        34
                       1
3
        15
                       1
4
        40
                       1
345
       723
                       6
346
       765
                       6
347
       696
                       6
348
       858
                       6
349
       822
                       6
[350 rows x 2 columns]
     vowel class
                  Pred class
0
               1
                            1
1
               1
                            1
2
               1
                            1
3
               1
                            1
4
               1
                            1
345
               6
                            6
346
               6
                            6
347
               6
                            6
348
               6
                            6
349
               6
                            4
```

[350 rows x 2 columns]

```
f1
     500
               2360
27
         1400
47
     650
         1400
               2000
         1600
70
     650
               2300
52
     550
         1700
               2300
40
     550
         1500
               2360
           . . .
                 . . .
. .
     . . .
     550
757
         1250
               2720
     400
781
           800
               2560
     500
           950
               2700
860
831
     450
         1100
               2300
754
     500
         1200
               2300
[521 rows x 3 columns]
     vowel class
27
              1
47
               1
70
               1
52
               1
40
               1
757
              6
781
               6
860
              6
831
               6
754
              6
[521 rows x 1 columns]
           f2
     f1
                 f3
51
     600
         1300
               1900
5
     600
         1250
               2700
35
    450
         1650
               2400
29
     550
         1300
               2300
14
     600
         1400
               2600
     . . .
           . . .
                 . . .
. .
836
    500
         1100
               2760
727
    400
         1000
               2300
841
     500
         1000
               2800
737
     400
         1000
                2300
734
     500
         1250
               2300
[350 rows x 3 columns]
51
       1
5
       1
35
       1
29
       1
14
       1
836
       6
727
       6
841
       6
737
       6
734
Name: vowel class, Length: 350, dtype: int64
[2, 6, 1, 2, 1, 2, 1, 1, 1, 2, 5, 1, 1, 1, 2, 2, 5, 1, 1, 5, 1, 1, 2, 5, 5, 5, 2,
1, 2, 2, 2, 2, 2, 2, 2, 2, 2, 6, 6, 2, 2, 2, 6, 2, 6, 2, 6, 6, 2, 6, 2, 6, 2, 2,
2, 2, 2, 6, 2, 2, 2, 2, 2, 2, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 5, 3, 5,
5, 3, 5, 3, 3, 5, 3, 3, 5, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 4,
3, 3, 5, 3, 3,
              3,
4, 4, 4, 4, 4, 6, 4, 4, 6, 4, 4, 4, 4, 4, 4, 4, 4, 6, 6, 4, 4, 4, 4, 4, 2,
4, 4, 4, 4, 4, 6, 4, 4, 6, 6, 6, 6, 4, 6, 4, 4, 4, 4, 4, 4, 4, 4, 4, 6, 4, 6,
4, 4, 4, 6, 4, 4, 1, 3, 5, 5, 3, 5, 5, 1, 5, 5, 5, 3, 1, 3, 5, 5, 3, 3, 5, 6, 3,
5, 5,
     5, 3, 3, 6, 1, 1, 3, 5, 5, 5, 5, 5, 5, 1, 5, 1, 6, 3, 1, 5, 3, 6, 5, 5, 1,
3, 1, 5, 1, 5, 5, 5, 5, 1, 3, 3, 5, 5, 3, 5, 1, 5, 5, 3, 1, 5, 1, 5, 5, 3, 3, 5,
```

```
5, 5, 5, 3, 5, 5, 5, 6, 4, 6, 6, 6, 2, 6, 6, 6, 4, 6, 4, 6, 1, 6, 6, 6, 4, 6,
6, 6, 6, 4, 6, 2, 4, 6, 6, 6, 4, 1, 6, 6, 6, 6, 4, 6, 6, 2, 6, 4, 4, 6, 6, 2, 6,
6, 6, 6, 6, 6, 6, 6, 6, 4, 4, 6, 4, 6, 4, 6, 4, 2, 6, 4, 4, 6, 4, 6, 4, 2]
     Pred_class
0
               2
1
               6
2
               1
3
               2
4
               1
345
               6
346
               4
347
               6
348
               4
349
[350 rows x 1 columns]
     index vowel class
0
        51
                       1
        5
1
                       1
2
        35
                       1
3
        29
                       1
4
        14
                       1
       . . .
. .
                      . . .
345
       836
                       6
346
       727
                       6
347
       841
                       6
348
       737
                       6
349
       734
[350 rows x 2 columns]
     vowel class Pred_class
0
                1
1
                1
                             6
2
                1
                             1
3
                1
                             2
4
                1
                             1
              . . .
345
                6
                             6
346
                6
                             4
347
                             6
                6
348
                6
                             4
                6
                             2
349
[350 rows x 2 columns]
            f2
      f1
                   f3
68
     650
          1200
                 2300
          1350
19
     700
                 2600
39
     750
          1500
                 2360
35
     450
          1650
                 2400
15
     550
          1400
                 2600
. .
     . . .
            . . .
776
     500
          1000
                 2560
758
     500
          1150
                 2720
746
     450
          1000
                 2350
778
     550
          1050
                 2560
774
     450
          1250
                 2850
[521 rows x 3 columns]
     vowel class
68
                1
                1
19
```

```
15
. .
              . . .
776
               6
758
               6
746
               6
778
                6
                6
774
[521 rows x 1 columns]
            f2
                   f3
      f1
56
     600
          1400
                2300
69
     600
          1850
                2300
10
     550
          2000
                2700
64
          1900
     500
                2300
28
     500
          1400
                2360
           . . .
     . . .
                  . . .
755
     500
          1050
                2720
709
     400
          1300
                2300
780
     500
           850
                2560
772
     600
          1300
                2800
745
     400
          1200
                2400
[350 rows x 3 columns]
56
       1
69
       1
10
       1
64
28
       1
755
       6
709
       6
780
       6
772
       6
745
       6
Name: vowel class, Length: 350, dtype: int64
[1, 5, 5, 5, 1, 1, 1, 1, 1, 1, 5, 1, 5, 2, 5, 1, 1, 1, 1, 1, 1, 1, 1, 6, 2, 2, 1,
1, 1, 2, 2, 2, 2, 2, 1, 1, 2, 6, 2, 2, 2, 2, 2, 2, 1, 2, 6, 2, 2, 2, 1, 2,
2, 2, 2, 6, 2, 2, 6, 2, 6, 6, 2, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 5, 3, 3, 5, 3, 3,
3, 3, 3, 3, 3, 3, 5, 3, 3, 5, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 5, 3,
      3,
         3,
            3,
               3,
                   3,
                      5,
                         3,
                            3,
                               3,
                                  3,
                                      5,
                                        3,
                                            3,
                                               3, 5, 3, 3, 3,
                                                               5, 3,
                                                                      5, 3, 3,
                                                                               3, 4,
               4,
         4,
            4,
                   4,
                      2,
                         4,
                            4,
                               1,
                                  4, 4, 4,
                                            6, 4,
                                                  4,
                                                     4,
                                                        4,
                                                            2,
                                                               1, 4, 4, 4, 4, 4,
                                                  4,
                                                     4,
            6,
               4,
                                  4, 4, 4, 4, 4,
  4, 4,
         4,
                  4,
                     4,
                         4,
                            4,
                               2,
                                                        6, 4, 4, 4, 4, 4,
                                                                            4,
                           6, 5, 5, 1, 1, 5, 6, 5, 3, 3, 1, 1, 5, 5, 3, 5, 5, 5,
            6,
               4,
                   5,
                     5,
                         5,
               3,
                   3,
                      6,
                         5,
                            5,
                               5, 1, 3, 1, 5, 3, 1, 3, 5, 5, 5, 5, 5, 5, 5, 5, 5,
            1,
      3,
         5,
            3,
               6,
                   5,
                      3,
                         5,
                            5, 5, 5, 3, 3, 1, 5, 1, 5, 5, 1, 1, 3, 5, 5, 1, 5, 3,
                  1, 3, 6, 6, 6, 6, 6, 6, 6, 4, 4, 6, 4, 6, 6, 6, 6, 6, 6, 6,
  2, 5,
         5,
            5,
               5,
                  4, 6, 4, 4, 4, 6, 2, 6, 4, 6, 2, 6, 6, 6, 5, 6, 6, 2, 6, 6, 6,
  2, 4, 6, 4, 4,
4, 4, 4, 6, 6, 4, 6, 4, 6, 4, 6, 6, 6, 6, 2, 6, 6, 6, 6, 6, 6, 6, 6, 1, 4, 6, 6]
     Pred class
0
              1
               5
1
2
              5
              5
3
4
              1
345
              6
346
              1
              4
347
348
              6
349
              6
[350 rows x 1 columns]
     index vowel class
        56
```

1	69	1
2	10	1
3	64	1
4	28	1
345	755	6
346	709	6
347	780	6
348	772	6
349	745	6

[350 rows x 2 columns]

	vowel	class	Pred_class
0		1	1
1		1	5
2		1	5
3		1	5
4		1	1
345		6	6
346		6	1
347		6	4
348		6	6
349		6	6

[350 rows x 2 columns]

[]] [1 0 1 3	^ _	COTAIIII
	f1	f2	f3
71	750	1250	2300
56	600	1400	2300
46	600	1700	2300
68	650	1200	2300
59	650	1300	2300
785	500	1100	2500
860	500	950	2700
729	400	1300	2300
806	450	1200	2300
830	450	1000	2350

[521 rows x 3 columns]

L		
	vowel cla	SS
71		1
56		1
46		1
68		1
59		1
785		6
860		6
729		6
806		6
830		6

[521 rows x 1 columns]

	f1	f2	f3
32	500	1350	2360
7	550	1700	2600
15	550	1400	2600
25	600	1350	2300
12	650	1600	2700
• •			
808	500	1000	2300
754	500	1200	2300
844	500	1000	2900

```
804
    450 1150 2300
846
    500
       1000 2750
[350 rows x 3 columns]
32
      1
7
      1
15
      1
25
      1
12
      1
808
      6
754
      6
844
      6
804
      6
846
Name: vowel class, Length: 350, dtype: int64
[1, 5, 1, 2, 5, 6, 2, 1, 2, 1, 1, 1, 6, 1, 1, 1, 1, 1, 1, 2, 1, 2, 1, 1, 2, 1, 5, 1,
2, 2, 2, 2, 1, 2, 2, 2, 6, 2, 1, 6, 1, 1, 6, 2, 6, 2, 2, 6, 2, 2, 2, 2, 2, 2,
3, 3, 5, 5, 5, 3, 3, 3, 3, 3, 3, 5, 5, 5, 3, 5, 3, 3, 3, 3, 3, 5, 5, 3, 3, 4,
4, 4, 4, 4, 4, 4, 2, 4, 4, 4, 4, 4, 4, 6, 4, 6, 4, 4, 6, 4, 4, 6, 4, 4, 6, 6,
                 6, 6, 4, 4, 4, 6, 4, 4, 6, 6, 6, 4, 4, 4, 6, 4, 4, 4, 4,
               4,
          2,
            1,
               5,
                  3,
                    5, 6, 1, 5, 3, 6, 5, 1, 1, 5, 5, 5, 6, 5, 1, 5, 3, 5, 5,
5, 5, 1, 5,
          5,
            5,
               3, 5, 5, 5, 3, 5, 5, 5, 3, 3, 5, 5, 5, 5, 5, 3, 1, 5, 5, 5, 1, 6,
3, 1, 5, 3, 3, 5, 3, 5, 6, 5, 5, 5, 5, 1, 5, 5, 1, 3, 6, 5, 5, 5, 5, 5, 3, 3, 5, 5,
5, 6, 5, 6, 3, 5, 5, 5, 6, 6, 4, 6, 6, 4, 6, 6, 6, 2, 6, 2, 4, 6, 6, 6, 2, 2, 6,
5, 6, 6, 6, 6, 6, 6, 2, 6, 6, 2, 6, 6, 6, 6, 6, 6, 4, 6, 4, 6, 6, 6, 6, 6, 6, 6, 6,
Pred_class
0
            1
            5
1
2
            1
3
            2
            5
4
. .
345
            6
346
            2
347
            6
348
            6
349
            6
[350 rows x 1 columns]
    index vowel class
0
       32
                   1
       7
1
                   1
2
      15
                   1
3
       25
                   1
4
      12
                   1
      . . .
345
      808
                   6
346
      754
                   6
347
      844
                   6
348
      804
                   6
349
      846
[350 rows x 2 columns]
    vowel class Pred class
0
             1
                       1
1
             1
                       5
2
             1
                       1
                       2
3
             1
                       5
4
             1
```

```
345
                             2
346
                6
347
                6
                             6
348
                6
                             6
349
                6
                             6
[350 rows x 2 columns]
             f2
                   f3
      f1
48
     600
          1800
                 2300
61
     650
          1600
                 2300
42
     600
          1400
                 2360
57
     700
          1300
                 2300
37
     700
           1550
                 2360
. .
728
     450
          1100
                 2300
734
     500
          1250
                 2300
870
     500
            950
                 2700
730
     450
          1150
                 2300
787
     500
            900
                 2700
[521 rows x 3 columns]
     vowel class
48
                1
                1
61
42
                1
57
                1
37
                1
              . . .
728
                6
734
                6
870
                6
                6
730
787
                6
[521 rows x 1 columns]
      f1
             f2
                   f3
36
     500
          1450
                 2400
38
     550
          1400
                 2300
45
     650
          1350
                 2100
3
     700
          1600
                 2700
59
     650
          1300
                 2300
            . . .
. .
     . . .
                  . . .
693
     450
          1200
                 2700
737
     400
           1000
                 2300
764
     400
            950
                 2700
755
     500
          1050
                 2720
854
     550
          1000
                 2800
[350 rows x 3 columns]
36
       1
38
       1
45
       1
3
       1
59
       1
693
       6
737
       6
764
       6
755
       6
854
Name: vowel class, Length: 350, dtype: int64
[1, 1, 2, 5, 2, 1, 1, 1, 5, 1, 6, 2, 1, 2, 1, 1, 1, 1, 1, 5, 5, 1, 1, 1, 5, 6, 1,
5, 1, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 6, 2, 2, 6, 2, 1, 2, 2, 1, 2, 6, 1,
2, 6, 2, 6, 2, 6, 2, 2, 2, 2, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 1, 3, 5,
```

```
3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 1, 3, 3, 3, 3, 3, 3, 3, 3, 3, 4,
4, 4, 4, 6, 4, 4, 4, 2, 6, 4, 4, 4, 4, 4, 4, 4, 6, 6, 4, 6, 4, 4, 4, 4, 4, 4,
4, 4, 4, 4, 4, 6, 5, 1, 3, 3, 5, 1, 5, 5, 1, 5, 6, 6, 5, 5, 3, 5, 5, 5, 5, 5, 5, 3,
            5, 3, 1, 5, 5, 5, 5, 5, 5, 1, 3, 5, 5, 5, 3, 3, 3, 5, 5,
    3,
       1,
         5,
          1,
     3,
       2,
         5, 5, 1, 3, 5, 5, 5, 1, 6, 4, 4, 4, 4, 6, 6, 6, 6, 6, 6, 6, 4, 2, 2, 6, 6, 4, 6,
Pred_class
```

[350 rows x 1 columns] index vowel class . . .

[350 rows x 2 columns]

_			-
	vowel	class	Pred_class
0		1	1
1		1	1
2		1	2
3		1	5
4		1	2
345		6	6
346		6	4
347		6	4
348		6	6
349		6	6

[350 rows x 2 columns]

[67.79661016949152, 70.05649717514125, 70.05649717514125, 70.62146892655367, 59.88 7005649717516, 67.79661016949152, 63.2768361581921, 70.62146892655367, 70.62146892 655367, 74.57627118644068, 66.28787878787878, 73.10606060606061, 71.2121212121212 2, 71.5909090909091, 69.6969696969697, 71.21212121212122, 67.42424242424242, 73.10 606060606061, 75.0, 72.72727272727273, 69.14285714285714, 73.14285714285714, 68.28 571428571428, 74.28571428571429, 67.42857142857143, 67.71428571428572, 68.57142857142857, 71.71428571428572, 74.0]

```
In [6]: df_a_mdc = pd.DataFrame({'Test_size = 0.2':np.array(accuracy_lst[:10])})
print(df_a_mdc)
```

```
Test_size = 0.2
        0
                  67.796610
        1
                  70.056497
        2
                  70.056497
        3
                  70.621469
                  59.887006
        4
        5
                  67.796610
        6
                  63,276836
        7
                  70.621469
        8
                  70.621469
                  74.576271
        df_b_mdc = pd.DataFrame({'Test_size = 0.3':np.array(accuracy_lst[10:20])})
In [7]:
         print(df_b_mdc)
            Test_size = 0.3
        0
                  66.287879
                  73.106061
        1
        2
                  71.212121
        3
                  71.590909
        4
                  69.696970
        5
                  71.212121
        6
                  67.424242
        7
                  73.106061
        8
                  75.000000
                  72.727273
        df_c_mdc = pd.DataFrame({'Test_size = 0.4':np.array(accuracy_lst[20:])})
         print(df_c_mdc)
            Test_size = 0.4
        0
                  69.142857
        1
                  73.142857
        2
                  68.285714
        3
                  74.285714
        4
                  67.428571
        5
                  67.714286
        6
                  67.714286
        7
                  68.571429
        8
                  71.714286
                  74.000000
```

Accuracy of Bayes Classifier for different test sizes for 10 iterations

```
result_mdc= df_a_mdc.join([df_b_mdc,df_c_mdc])
print(result_mdc)
  Test_size = 0.2 Test_size = 0.3 Test_size = 0.4
0
        67.796610
                        66.287879
                                         69.142857
1
        70.056497
                         73.106061
                                          73.142857
2
        70.056497
                         71.212121
                                          68.285714
3
        70.621469
                         71.590909
                                          74.285714
4
                         69.696970
                                          67.428571
        59.887006
5
        67.796610
                         71.212121
                                          67.714286
6
                         67.424242
        63.276836
                                          67.714286
7
        70.621469
                         73.106061
                                          68.571429
8
        70.621469
                         75.000000
                                          71.714286
9
                                          74.000000
        74.576271
                         72.727273
```

Mean Accuracy of MDC Classifier for different test sizes

Implementation of Bayes Classifier

```
In [12]: #Initialize accuracy list
                     accuracy_lst= []
                     #Define test sizes
                     test_size_lst = [0.2,0.3,0.4]
                     #Loop through different testsizes
                     for ele in test_size_lst:
                                #Loop through 10 iterations
                              for i in range(10):
                                       # Split data into train and test sets for each vowel class
                                       df1 = df[df['vowel class']==1]
                                       X_1 = df1.drop(columns=['vowel class'])
                                       y_1 = df1['vowel class']
                                       X1_train,X1_test,y1_train,y1_test = train_test_split(X_1,y_1,test_size=ele)
                                       df2 = df[df['vowel class']==2]
                                       X_2 = df2.drop(columns=['vowel class'])
                                       y_2 = df2['vowel class']
                                       X2_train,X2_test,y2_train,y2_test = train_test_split(X_2,y_2,test_size=ele)
                                       df3 = df[df['vowel class']==3]
                                       X_3 = df3.drop(columns=['vowel class'])
                                       y_3 = df3['vowel class']
                                       X3_train,X3_test,y3_train,y3_test = train_test_split(X_3,y_3,test_size=ele)
                                       df4 = df[df['vowel class']==4]
                                       X 4 = df4.drop(columns=['vowel class'])
                                       y_4 = df4['vowel class']
                                       X4_train,X4_test,y4_train,y4_test = train_test_split(X_4,y_4,test_size=ele)
                                       df5 = df[df['vowel class']==5]
                                       X_5 = df5.drop(columns=['vowel class'])
                                       y 5 = df5['vowel class']
                                       X5_train,X5_test,y5_train,y5_test = train_test_split(X_5,y_5,test_size=ele)
                                       df6 = df[df['vowel class']==6]
                                       X_6 = df6.drop(columns=['vowel class'])
                                       y_6 = df6['vowel class']
                                       X6_train,X6_test,y6_train,y6_test = train_test_split(X_6,y_6,test_size=ele)
                                       X_1_ = X1_train.join(y1_train)
                                       X_2_ = X2_{train.join(y2_{train)}}
                                       X_3 = X_3 
                                       X 4 = X4 train.join(y4 train)
                                       X_5_ = X5_{train.join(y5_{train)}}
                                       X_6_ = X6_train.join(y6_train)
                                       # Concatenate train sets and prepare train data
                                       X_{\text{train}} = \text{pd.concat}([X_1, X_2, X_3, X_4, X_5, X_6])
                                       print(X train resultant)
                                       X train = X train resultant.drop(columns='vowel class')
```

```
print(X train)
y_train = pd.DataFrame(X_train_resultant['vowel class'])
print(y_train)
X_t1 = X1_test.join(y1_test)
X_t2 = X2_{test.join(y2_{test)}}
X_t3 = X3_{test.join(y3_{test)}}
X_t4 = X4_{test.join(y4_{test)}}
X_{t5} = X5_{test.join(y5_{test)}}
X_t6 = X6_{test.join(y6_{test)}}
# Concatenate test sets and prepare test data
X_t = pd.concat([X_t1, X_t2, X_t3, X_t4, X_t5, X_t6])
X test resultant = X t.drop(columns='vowel class')
y_test_resultant = X_t['vowel class']
#Function to calculate class conditional probability
def class_conditional_prob(x,mu,cov):
    exponent = (-0.5) * np.dot(np.dot((x - mu).T, np.linalg.inv(cov)), (x
    normalization = 1 / ((2 * np.pi) ** (3 / 2) * np.linalg.det(cov) ** 0.5
    probability = normalization * np.exp(exponent)
    return probability
#Calculating mean vector and variance-covariance matrix of different traini
m1 =np.array( X1_train.mean())
m2 =np.array( X2_train.mean())
m3 =np.array( X3_train.mean())
m4 =np.array( X4_train.mean())
m5 =np.array( X5_train.mean())
m6 =np.array( X6_train.mean())
cov1 = np.array(X1_train.cov())
cov2 = np.array(X2_train.cov())
cov3 = np.array(X3_train.cov())
cov4 = np.array(X4_train.cov())
cov5 = np.array(X5_train.cov())
cov6 = np.array(X6_train.cov())
#Calculating Prior Probabilities
P1 = X1 train.shape[0]/X train resultant.shape[0]
P2 = X2_train.shape[0]/X_train_resultant.shape[0]
P3 = X3_train.shape[0]/X_train_resultant.shape[0]
P4 = X4_train.shape[0]/X_train_resultant.shape[0]
P5 = X5_train.shape[0]/X_train_resultant.shape[0]
P6 = X6_train.shape[0]/X_train_resultant.shape[0]
#Performing Bayes Classification
y_pred = []
for testpoint in np.array(X_test_resultant):
    p1 = class_conditional_prob(testpoint,m1,cov1)
    p2 = class_conditional_prob(testpoint,m2,cov2)
    p3 = class_conditional_prob(testpoint,m3,cov3)
    p4 = class_conditional_prob(testpoint,m4,cov4)
    p5 = class_conditional_prob(testpoint,m5,cov5)
    p6 = class_conditional_prob(testpoint,m6,cov6)
    1 = [p1*P1,p2*P2,p3*P3,p4*P4,p5*P5,p6*P6]
    m = max(1)
    i = 1.index(m)
    pred_class = i+1
```

```
y_pred.append(pred_class)
print(y_pred)

y_pred_df = pd.DataFrame({'Pred_class':y_pred})
y_test = pd.DataFrame(y_test_resultant)
y_test.reset_index(inplace=True)

df_forprediction = y_test.join(y_pred_df).drop(columns=['index'])
print(df_forprediction)

#Calculating Accuracy
true_pred = df_forprediction[df_forprediction['vowel class']==df_forpredictioncuracy = (true_pred.shape[0]/df_forprediction.shape[0])*100
#print(accuracy)
accuracy_lst.append(accuracy)
print(accuracy_lst)
```

```
f1
              f3
                 vowel class
       1600
            2600
4
    550
48
    600
       1800
            2300
                         1
       1350
54
    600
            2300
                         1
57
    700
       1300
            2300
                         1
33
    500
       1200
            2300
                         1
. .
    . . .
        . . .
             . . .
                        . . .
860
    500
        950
            2700
                         6
    500
868
       1000
            2800
                         6
    400
            2300
                         6
815
        850
                         6
826
    400
       1000
            2300
805
    450
       1200
            2300
                         6
[694 rows x 4 columns]
    f1
         f2
              f3
       1600
4
    550
            2600
48
   600
       1800
            2300
54
    600
       1350
            2300
57
   700
       1300
            2300
33
    500
       1200
            2300
. .
    . . .
        . . .
             . . .
860
   500
        950
            2700
868
   500
       1000
            2800
815
   400
        850
            2300
826
   400
       1000
            2300
           2300
805
   450
       1200
[694 rows x 3 columns]
    vowel class
4
           1
48
           1
           1
54
57
           1
33
           1
          . . .
860
           6
868
           6
815
           6
826
           6
805
           6
[694 rows x 1 columns]
2, 2, 2, 2, 2, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3,
5, 5, 5, 5, 5, 5, 3, 5, 3, 5, 5, 1, 5, 5, 5, 3, 3, 1, 5, 3, 1, 5, 3, 5, 5, 5, 5, 5,
6, 6, 6, 5, 6, 4, 4, 4, 6, 6, 4, 6, 6, 4, 6]
    vowel class Pred class
0
                     5
           1
1
           1
                     2
2
           1
                     5
3
                     1
           1
                     5
4
           1
          . . .
172
           6
                     4
173
           6
                     6
174
           6
                     6
175
           6
                     4
            6
176
                     6
[177 rows x 2 columns]
    f1
         f2
              f3 vowel class
```

```
38
   550 1400
           2300
54
   600
      1350
           2300
                      1
62
   700
      1400
           2300
                      1
50
      1750
   700
           2300
                      1
55
   700
      1400
           2300
                      1
       . . .
           . . .
. .
   . . .
                     . . .
775
   500
      1000
           2560
                      6
   400
       1000
727
           2300
                      6
   400
                      6
707
       1000
           2300
802
   450
       1000
           2300
                      6
                      6
866
   500
      1050
           2900
[694 rows x 4 columns]
    f1
        f2
            f3
38
   550
      1400
          2300
54
   600
      1350
           2300
62
   700
      1400
           2300
50
   700
      1750
           2300
55
   700
       1400
           2300
       . . .
775
   500
       1000
           2560
727
   400
      1000
           2300
707
   400
       1000
           2300
802
   450
       1000
           2300
866
   500
      1050 2900
[694 rows x 3 columns]
   vowel class
38
          1
54
          1
62
          1
50
          1
55
          1
         . . .
775
          6
727
          6
707
          6
802
          6
866
          6
[694 rows x 1 columns]
2, 2, 2, 2, 1, 2, 3, 3, 3, 3, 5, 5, 3, 3, 3, 5, 5, 3, 3, 3, 3, 3, 5, 3, 3, 3,
6, 6, 6, 6, 4, 6, 6, 6, 6, 6, 6, 6, 6, 2]
   vowel class Pred class
0
          1
1
          1
                   5
2
          1
                   1
3
          1
                   2
                   2
4
          1
         . . .
172
          6
                   6
173
          6
                   6
174
          6
                   6
175
          6
                   6
176
          6
                   2
[177 rows x 2 columns]
        f2
            f3 vowel class
    f1
   550
      1350
           2200
```

```
41
    500
        1500
             2360
21
    600
        1400
             2200
                            1
18
    600
        1400
             2600
                            1
        1400
14
    600
             2600
                            1
. .
    . . .
         . . .
              . . .
                          . . .
708
    450
        1100
             2300
                            6
        1150
758
    500
             2720
                            6
        1000
820
    500
             2300
                           6
833
    450
                            6
         950
             2100
706
    400
        1100
             2300
                            6
[694 rows x 4 columns]
     f1
          f2
               f3
    550
        1350
             2200
20
41
    500
        1500
             2360
21
    600
        1400
             2200
18
    600
        1400
             2600
14
    600
        1400
              2600
. .
    . . .
         . . .
              . . .
708
    450
        1100
             2300
758
    500
        1150
             2720
        1000
820
    500
             2300
833
    450
         950
             2100
706
    400
        1100 2300
[694 rows x 3 columns]
    vowel class
20
             1
41
             1
21
             1
18
             1
14
             1
           . . .
708
             6
758
             6
820
             6
833
             6
             6
706
[694 rows x 1 columns]
[1, 1, 5, 2, 6, 2, 1, 2, 5, 5, 1, 5, 2, 1, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 6, 2,
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4, 4, 4, 6, 6, 4, 4, 6, 6, 6, 6, 6, 6, 6, 6]
    vowel class Pred_class
0
             1
                       1
             1
                       1
1
2
             1
                       5
3
             1
                       2
4
             1
                       6
. .
           . . .
                      . . .
172
             6
                       6
173
             6
                       6
174
             6
                       6
175
                       2
             6
176
             6
[177 rows x 2 columns]
     f1
          f2
               f3
                   vowel class
47
    650
        1400
              2000
                            1
27
    500
        1400
              2360
                            1
```

```
60
   700 1350
            2300
65
   700
       1300
            2300
                         1
13
   550
       1800
            2600
                         1
        . . .
             . . .
. .
    . . .
                       . . .
741
   500
       1200
            2300
                         6
740
   400
       1100
            2300
                         6
       1000
                         6
763
   500
            2700
   550
                         6
859
       1100
            2750
   500
                         6
780
        850 2560
[694 rows x 4 columns]
    f1
         f2
              f3
47
   650
       1400
            2000
27
       1400
            2360
   500
60
   700
       1350 2300
65
   700
       1300
            2300
13
   550
       1800
            2600
        . . .
. .
    . . .
             . . .
741
   500
       1200
            2300
740
   400
       1100
            2300
763
   500
       1000
            2700
859
   550
       1100
            2750
780
   500
        850
           2560
[694 rows x 3 columns]
   vowel class
47
           1
27
           1
60
           1
65
           1
13
           1
741
           6
740
           6
763
           6
859
           6
780
           6
[694 rows x 1 columns]
2, 2, 2, 2, 1, 2, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5,
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4, 4, 4, 4, 4,
6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4]
   vowel class Pred class
0
           1
                     5
1
           1
                     5
2
                     1
           1
3
           1
                     5
4
           1
                     2
          . . .
                   . . .
172
           6
                     6
173
           6
                     6
174
           6
                     6
175
           6
                     6
176
                     4
           6
[177 rows x 2 columns]
    f1
         f2
              f3
                 vowel class
11
    500
       1750
            2600
                         1
52
    550
       1700
            2300
                         1
53
    550
       1500
            2600
                         1
```

```
13
    550 1800
              2600
49
    750
        1350 2100
                             1
          . . .
              . . .
         1000
              2300
817
    400
                             6
839
    400
         900
              2700
                             6
798
    550
         1000
                             6
              2600
845
         1000
                             6
    500
              2700
                             6
732
    600
         1200
              2300
[694 rows x 4 columns]
          f2
     f1
                f3
11
    500
         1750
              2600
52
    550
         1700
              2300
53
        1500 2600
    550
13
    550
        1800 2600
49
    750
        1350 2100
    . . .
          . . .
817
    400
         1000
              2300
839
    400
         900
              2700
798
    550
         1000
              2600
845
    500
         1000 2700
732 600 1200 2300
[694 rows x 3 columns]
    vowel class
11
             1
52
             1
53
             1
13
             1
49
             1
. .
            . . .
817
             6
839
             6
798
             6
845
             6
732
             6
[694 rows x 1 columns]
[5, 1, 1, 2, 5, 5, 6, 1, 2, 1, 2, 5, 1, 1, 5, 1, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 1, 1,
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3, 3, 3, 3, 3,
             3, 3, 3, 3, 3, 3, 3, 5, 4, 4, 4, 6, 4, 6, 4, 4, 4, 4, 4, 4,
5, 3, 5, 3, 5, 5, 6, 4, 6, 6, 6, 6, 4, 4, 6, 6, 6, 2, 6, 4, 4, 4, 6, 6, 6, 6, 6,
5, 6, 6, 4, 6, 6, 6, 6, 6, 6, 6, 6, 4, 6, 6, 4]
    vowel class Pred_class
0
             1
1
             1
                        1
2
             1
                        1
3
                        2
             1
4
             1
                        5
            . . .
                       . . .
172
             6
                        6
                        4
173
             6
174
             6
                        6
175
             6
                        6
176
             6
[177 rows x 2 columns]
     f1
          f2
              f3 vowel class
    700
         1300
                             1
65
              2300
13
    550
         1800
              2600
                             1
18
    600
         1400
              2600
                             1
31
    550
         1200
              2360
                             1
```

```
25
    600 1350
             2300
. .
    . . .
         . . .
              . . .
                         . . .
715
    500
        1000
            2300
                           6
774
    450
        1250 2850
                           6
832
    400
        1000
             2300
                           6
826
    400
        1000
                           6
             2300
    400
         900 2300
                           6
721
[694 rows x 4 columns]
     f1
          f2
               f3
    700
65
        1300
             2300
13
    550
        1800
             2600
18
    600
        1400
             2600
31
    550
        1200 2360
25
    600
        1350 2300
         . . .
    . . .
              . . .
715
    500
        1000
             2300
774
    450
        1250
             2850
832
    400
        1000
             2300
826
    400
        1000 2300
721
    400
         900 2300
[694 rows x 3 columns]
    vowel class
65
            1
13
            1
18
            1
31
            1
25
            1
. .
           . . .
            6
715
774
            6
832
            6
826
            6
721
            6
[694 rows x 1 columns]
6, 2, 2, 2, 1, 2, 3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3,
3, 3, 3,
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0
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                       1
1
            1
                       2
2
                       2
            1
3
            1
                       1
            1
                       5
4
           . . .
172
            6
                      4
173
            6
                       6
                       4
174
            6
175
            6
                       6
176
            6
                       6
[177 rows x 2 columns]
     f1
         f2
             f3 vowel class
16
    650
        1600
             2600
                           1
                           1
52
    550
        1700
             2300
9
    600
        1600
             2600
                           1
        1600
61
    650
             2300
                           1
37
    700
        1550
             2360
                           1
```

```
709
    400
        1300
              2300
                            6
730
    450
         1150
              2300
                             6
         1000
765
    500
              2650
                             6
699
    450
        1100
              2700
                             6
807
    500
        1000
              2300
                             6
[694 rows x 4 columns]
          f2
     f1
                f3
16
    650
        1600
              2600
    550
        1700
              2300
52
9
    600
         1600
              2600
61
    650
        1600
              2300
37
    700
        1550
              2360
    . . .
          . . .
               . . .
709
    400
        1300
              2300
730
    450
         1150
              2300
765
    500
         1000
              2650
699
    450
        1100 2700
807
    500
        1000 2300
[694 rows x 3 columns]
    vowel class
16
             1
52
             1
9
             1
61
             1
37
             1
709
             6
730
             6
             6
765
699
             6
807
             6
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    vowel class Pred class
0
             1
                        2
1
             1
2
             1
                        1
                        5
3
             1
4
             1
                        5
172
             6
                        6
173
                        6
             6
174
             6
                        4
175
             6
                        6
             6
176
[177 rows x 2 columns]
          f2
                f3 vowel class
     f1
    400
         1200
              2400
23
                             1
40
    550
        1500
              2360
                             1
         1850
                             1
69
    600
              2300
57
    700
         1300
              2300
                             1
65
    700
         1300
              2300
                             1
```

```
790
  500 1000
            2600
823
   400
        900
            2300
                         6
777
    500
       1050
            2560
                         6
       1050
812
   500
            2300
                         6
857
   450
        900 2900
                         6
[694 rows x 4 columns]
         f2
    f1
              f3
23
   400
       1200
            2400
40
   550
       1500
            2360
69
   600
       1850
            2300
57
   700
       1300
            2300
65
   700
       1300
            2300
. .
        . . .
790
   500
       1000
            2600
823
   400
        900
            2300
777
   500
       1050
            2560
812
    500
       1050
            2300
857
   450
        900
           2900
[694 rows x 3 columns]
   vowel class
23
           1
40
           1
69
           1
57
           1
65
           1
. .
          . . .
790
           6
823
           6
777
           6
           6
812
857
           6
[694 rows x 1 columns]
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6, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6]
   vowel class Pred class
0
           1
                     1
1
           1
2
                     1
           1
3
           1
                     5
                     2
4
           1
172
           6
                     6
173
                     4
           6
174
           6
                     6
175
           6
                     6
176
           6
                     6
[177 rows x 2 columns]
    f1
         f2
             f3 vowel class
36
    500
       1450
            2400
                         1
40
   550
       1500
            2360
                         1
   700
65
       1300
            2300
                         1
71
   750
       1250
                         1
            2300
27
    500
       1400
            2360
                         1
        . . .
             . . .
707
    400
       1000
            2300
                         6
```

```
770
   600
       1100
            2750
700
   400
       1200 2700
                         6
854
    550
       1000
            2800
                         6
   500
       1050 2720
                         6
755
[694 rows x 4 columns]
         f2
    f1
              f3
    500
36
       1450
            2400
40
    550
       1500
            2360
   700
       1300
            2300
65
71
    750
       1250
            2300
27
    500
       1400
            2360
        . . .
. .
    . . .
             . . .
707
       1000
   400
            2300
770
    600
       1100
            2750
700
   400
       1200
            2700
    550
       1000
            2800
854
755
    500
       1050 2720
[694 rows x 3 columns]
    vowel class
36
           1
40
           1
65
           1
71
           1
27
           1
          . . .
707
           6
770
           6
700
           6
854
           6
755
           6
[694 rows x 1 columns]
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6, 4, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6]
    vowel class Pred class
0
           1
1
           1
                     1
2
                     6
           1
                     5
3
           1
4
           1
                     1
                    . . .
. .
          . . .
172
           6
                     6
173
           6
                     6
174
           6
                     6
175
           6
                     6
176
           6
                     6
[177 rows x 2 columns]
    f1
         f2
              f3 vowel class
66
    700
       1400
            2300
                         1
31
    550
       1200
            2360
                         1
0
    700
       1500
            2600
                         1
6
    550
       1200
            2500
                         1
44
    650
       1400
            2100
                         1
        . . .
             . . .
868
    500
        1000
            2800
                         6
822
    500
        850
            2300
                         6
```

```
Implementation of 'Bayes Classifier', 'Minimum Distance Classifier' and 'K-NN Classifier' on Vowel Data Set
734
   500
       1250
            2300
783
   450
        900 2250
                        6
808
   500 1000 2300
                        6
[694 rows x 4 columns]
    f1
         f2
              f3
   700
       1400
66
            2300
       1200
            2360
31
   550
0
   700
       1500
            2600
    550
       1200
            2500
6
   650
44
       1400
            2100
    . . .
        . . .
             . . .
868
   500
       1000
            2800
822
   500
        850
            2300
734
   500
       1250 2300
783
   450
        900 2250
808
   500 1000 2300
[694 rows x 3 columns]
   vowel class
66
31
           1
0
           1
6
           1
44
           1
868
           6
822
           6
734
           6
783
           6
808
           6
[694 rows x 1 columns]
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6, 6, 6, 2, 6, 6, 4, 6, 4, 6, 6, 6, 6, 6]
   vowel class Pred class
0
           1
                     1
1
           1
                     1
2
           1
                     2
                     5
3
           1
4
                     6
           1
          . . .
                   . . .
172
           6
                     6
           6
                     6
173
174
           6
                     6
175
           6
                     6
176
           6
                     6
[177 rows x 2 columns]
```

[77.40112994350282, 80.7909604519774, 77.96610169491525, 82.48587570621469, 81.355 93220338984, 76.27118644067797, 78.53107344632768, 82.48587570621469, 82.485875706 21469, 81.92090395480226]

	f1	f2	f3	vowel	class
22	550	1600	2200		1
20	550	1350	2200		1
9	600	1600	2600		1
58	700	1300	2300		1
37	700	1550	2360		1

```
859
    550 1100
               2750
791
    500
          950
               2600
                              6
808
    500
         1000
               2300
                              6
737
    400
         1000
               2300
                              6
722
    400
         1000 2300
                              6
[607 rows x 4 columns]
           f2
     f1
                 f3
22
    550
         1600
               2200
20
         1350
               2200
    550
9
    600
         1600
               2600
58
    700
         1300
               2300
37
    700
         1550
               2360
. .
                . . .
859
    550
         1100
               2750
791
    500
          950
               2600
808
    500
         1000
               2300
737
    400
         1000
               2300
722
    400
         1000
              2300
[607 rows x 3 columns]
    vowel class
22
              1
20
              1
9
              1
58
              1
37
              1
            . . .
859
              6
791
              6
808
              6
              6
737
722
              6
[607 rows x 1 columns]
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           4,
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                            4,
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              5,
                5,
                   5,
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6, 6, 6, 2, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 4, 6, 6, 6, 6, 5, 6, 6, 6, 6, 6, 4,
vowel class Pred_class
0
              1
1
              1
                          1
2
              1
                          1
3
                          5
              1
4
              1
                          5
            . . .
                        . . .
259
              6
                          6
                          5
260
              6
261
              6
                          6
262
              6
                          4
263
              6
                          4
[264 rows x 2 columns]
     f1
           f2
                f3
                    vowel class
    700
                              1
60
         1350
               2300
39
    750
         1500
               2360
                              1
57
    700
         1300
               2300
                              1
41
    500
         1500
               2360
                              1
```

```
11
    500 1750
              2600
. .
    . . .
          . . .
               . . .
                           . . .
761
    500
         1100
              2720
                             6
819
    450
         1000
              2300
                             6
759
    600
         1100
              2720
                             6
746
    450
         1000
                             6
              2350
                             6
731
    600
         1200
             2300
[607 rows x 4 columns]
     f1
          f2
                f3
    700
         1350
60
              2300
39
    750
         1500
              2360
57
    700
         1300
              2300
41
         1500
    500
              2360
11
    500
         1750
              2600
    . . .
          . . .
               . . .
. .
761
    500
         1100
              2720
819
    450
         1000
              2300
759
    600
         1100
              2720
746
    450
         1000
             2350
731
    600
         1200
             2300
[607 rows x 3 columns]
    vowel class
60
             1
39
             1
57
             1
41
             1
11
             1
. .
            . . .
761
             6
819
             6
759
             6
746
             6
731
             6
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    vowel class Pred_class
0
                        5
             1
             1
                        1
1
2
             1
                        2
3
             1
                        1
4
             1
                        1
. .
            . . .
                       . . .
259
             6
                        6
260
             6
                        6
261
             6
                        2
                        4
262
             6
263
             6
[264 rows x 2 columns]
     f1
           f2
                f3
                    vowel class
9
    600
         1600
              2600
                             1
54
    600
         1350
              2300
                             1
```

```
19
   700
       1350
            2600
   650
44
       1400
            2100
                        1
28
   500
       1400
            2360
                        1
        . . .
. .
    . . .
             . . .
                       . . .
853
   600
       1050
            2850
                        6
       1200
731
   600
            2300
                        6
729
                        6
   400
       1300
            2300
   450
       1150
                        6
730
            2300
   500
                        6
816
        950 2300
[607 rows x 4 columns]
    f1
         f2
             f3
9
   600
       1600
            2600
54
       1350
            2300
   600
19
   700
       1350 2600
44
   650
       1400
            2100
28
   500
       1400
            2360
. .
    . . .
        . . .
             . . .
853
   600
       1050
            2850
731
   600
       1200
            2300
729
   400
       1300
            2300
730
   450
       1150
            2300
816
   500
        950
           2300
[607 rows x 3 columns]
   vowel class
9
           1
54
           1
19
           1
44
           1
           1
28
853
           6
731
           6
729
           6
730
           6
816
           6
[607 rows x 1 columns]
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6, 6, 2, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 6, 6, 5, 6, 6, 4, 6, 6,
vowel class Pred class
0
           1
                     1
1
           1
                     1
2
           1
                     2
3
           1
                     1
                     5
4
           1
          . . .
259
           6
                     6
260
           6
                     6
261
           6
                     6
262
           6
                     6
           6
263
                     6
[264 rows x 2 columns]
```

f3 vowel class

f1

f2

```
22
    550 1600
             2200
4
    550 1600
             2600
                           1
38
    550
        1400
             2300
                           1
        1350
20
    550
             2200
                           1
36
    500
        1450 2400
                           1
         . . .
. .
    . . .
              . . .
                          . . .
828
    450
        1050
             2300
                           6
    450
        1250
774
             2850
                           6
    500
                           6
755
        1050
             2720
    550
        1000
             2500
                           6
784
                           6
766
    550
        1250
             2600
[607 rows x 4 columns]
     f1
          f2
               f3
22
    550
       1600
             2200
4
    550
        1600
             2600
38
    550
        1400
             2300
20
    550
        1350
             2200
36
    500
        1450
             2400
         . . .
              . . .
828
    450
        1050
             2300
774
    450
        1250
             2850
755
    500
        1050
             2720
784
    550
        1000
             2500
766
    550
        1250 2600
[607 rows x 3 columns]
    vowel class
22
             1
4
             1
38
             1
20
             1
36
             1
           . . .
828
             6
774
             6
755
             6
784
             6
766
             6
[607 rows x 1 columns]
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            4,
               4, 4,
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          4,
            4,
               4,
                 4,
                    4,
                      4,
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6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 6, 4, 6, 4, 2, 4, 6, 6]
    vowel class Pred class
0
             1
                       5
                       5
1
             1
                       2
2
             1
3
             1
                       5
4
             1
                       2
           . . .
                     . . .
259
                       4
            6
260
             6
                       2
                       4
             6
261
262
             6
                       6
263
             6
                       6
```

```
[264 rows x 2 columns]
         f2
              f3 vowel class
    f1
34
    700
       1400
            2360
        1350
25
    600
            2300
70
    650
        1600
            2300
                          1
71
    750
        1250
            2300
                          1
6
    550
        1200
            2500
                          1
         . . .
746
    450
        1000
            2350
                          6
711
        1200
            2300
    600
                          6
                          6
854
    550
        1000
            2800
782
    500
        950
             2560
                          6
810
    400
        1000
            2300
[607 rows x 4 columns]
    f1
         f2
              f3
34
    700
        1400
            2360
25
    600
        1350
            2300
70
    650
        1600
            2300
71
    750
        1250
            2300
6
    550
        1200
            2500
         . . .
. .
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746
   450
        1000
            2350
711
    600
        1200
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854
    550
        1000
            2800
    500
782
        950
            2560
810
    400
       1000
            2300
[607 rows x 3 columns]
    vowel class
34
            1
25
            1
70
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71
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6
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. .
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746
            6
711
            6
854
            6
782
            6
            6
810
[607 rows x 1 columns]
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    vowel class Pred_class
0
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                      2
1
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2
            1
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3
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4
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                    . . .
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259
            6
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260
            6
                      6
261
            6
                      6
262
            6
                      5
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[264 rows x 2 columns]
     f1
          f2
                f3 vowel class
54
    600
        1350
              2300
                            1
31
    550
        1200
              2360
                            1
        1200
                            1
23
    400
              2400
26
    600
        1400
              2300
                            1
15
    550
        1400
              2600
                            1
         . . .
. .
    . . .
               . . .
                           . . .
762
    500
        1000
              2600
                            6
849
    550
        1100
              2850
                            6
747
    400
        1000
              2400
                            6
                            6
695
    600
        1050
              2700
702
    450
        1150
             2700
                            6
[607 rows x 4 columns]
     f1
          f2
                f3
54
    600
        1350
              2300
31
    550
        1200
              2360
23
    400
        1200
              2400
        1400
26
    600
              2300
15
    550
        1400
              2600
          . . .
               . . .
. .
    . . .
762
    500
        1000
              2600
849
    550
        1100
              2850
747
    400
        1000
              2400
695
    600
        1050
              2700
702
    450
        1150 2700
[607 rows x 3 columns]
    vowel class
54
31
             1
23
             1
26
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15
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. .
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762
             6
849
             6
747
             6
695
             6
702
             6
[607 rows x 1 columns]
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               Pred class
0
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1
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                        2
2
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3
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4
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           . . .
259
             6
                        4
260
             6
                        6
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261
262
             6
                       6
263
             6
                       6
[264 rows x 2 columns]
     f1
          f2
               f3 vowel class
    500
        1200
33
             2300
                            1
23
    400
        1200
             2400
                            1
                            1
56
    600
        1400
             2300
30
        1200
             2300
                            1
    650
53
    550
        1500
             2600
                            1
. .
         . . .
              . . .
    . . .
                          . . .
830
    450
        1000
             2350
                            6
787
         900
             2700
    500
                            6
862
    500
        1000
             2900
                            6
819
    450
        1000
             2300
                            6
691
    400
         900 2700
                            6
[607 rows x 4 columns]
     f1
          f2
               f3
33
    500
        1200
             2300
        1200
23
    400
             2400
56
    600
        1400
             2300
30
    650
        1200
              2300
53
    550
        1500
             2600
830
    450
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             2350
787
    500
         900
             2700
862
    500
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819
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             2300
    400
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691
[607 rows x 3 columns]
    vowel class
33
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830
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787
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862
819
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691
             6
[607 rows x 1 columns]
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0
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2
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3
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4
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259
260
             6
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261
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             6
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262
263
             6
                       6
[264 rows x 2 columns]
          f2
     f1
               f3 vowel class
55
    700
        1400
             2300
27
    500
        1400
              2360
                            1
        1900
             2300
63
    500
                            1
64
    500
        1900
              2300
                            1
2
    700
        1500
              2600
                            1
. .
         . . .
               . . .
                          . . .
743
    550
        1100
              2300
                            6
844
    500
        1000
             2900
                            6
750
    450
         950
             2100
                            6
711
    600
        1200
              2300
                            6
787
    500
         900
             2700
                            6
[607 rows x 4 columns]
          f2
     f1
               f3
55
             2300
    700
        1400
27
    500
        1400
              2360
63
    500
        1900
             2300
64
    500
        1900
             2300
2
    700
        1500
             2600
         . . .
    . . .
              . . .
743
    550
        1100
             2300
844
    500
        1000
              2900
750
    450
         950
             2100
711
    600
        1200
            2300
787
    500
         900 2700
[607 rows x 3 columns]
    vowel class
55
             1
27
             1
63
             1
64
             1
             1
2
. .
           . . .
743
             6
844
             6
             6
750
711
             6
787
             6
[607 rows x 1 columns]
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               Pred_class
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1
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2
                       5
             1
3
             1
                       5
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4
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259
             6
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260
             6
261
             6
                       6
262
             6
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             6
                       6
263
[264 rows x 2 columns]
          f2
               f3 vowel class
     f1
    550
29
        1300
              2300
26
    600
        1400
              2300
                            1
71
    750
        1250
              2300
                            1
67
    550
        1500
              2300
                            1
49
    750
        1350
              2100
                            1
    . . .
         . . .
               . . .
                          . . .
    450
        1100
              2300
831
                            6
870
    500
         950
              2700
                            6
767
    500
        1100
              2700
                            6
786
    500
        1900
              2250
                            6
755
    500
        1050
             2720
                            6
[607 rows x 4 columns]
     f1
          f2
               f3
29
    550
        1300
              2300
26
    600
        1400
              2300
71
    750
        1250
              2300
67
    550
        1500
              2300
49
    750
        1350
              2100
. .
    . . .
         . . .
               . . .
    450
        1100
831
              2300
870
    500
         950
             2700
767
    500
        1100
              2700
786
    500
        1900
             2250
    500
        1050 2720
755
[607 rows x 3 columns]
    vowel class
29
             1
26
             1
             1
71
67
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49
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           . . .
831
             6
870
             6
767
             6
786
             6
755
             6
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    vowel class
               Pred class
0
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1
             1
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2
3
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4
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                      2
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259
            6
                      6
260
            6
                      6
                      6
261
            6
262
            6
                      6
263
            6
                      6
[264 rows x 2 columns]
    f1
         f2
              f3 vowel class
47
    650
        1400
             2000
                          1
70
        1600
             2300
                          1
    650
7
    550
        1700
             2600
                          1
46
    600
        1700
             2300
                          1
26
    600
        1400
             2300
                          1
. .
    . . .
         . . .
              . . .
                         . . .
825
    450
        1000
                          6
             2350
852
    400
         800
             2700
                          6
746
    450
        1000
             2350
                          6
702
    450
        1150
             2700
                          6
                          6
731
    600
        1200
             2300
[607 rows x 4 columns]
    f1
         f2
              f3
47
    650
        1400
             2000
70
    650
        1600
             2300
7
    550
        1700
             2600
46
    600
        1700
             2300
        1400
             2300
26
    600
         . . .
    . . .
825
    450
        1000
             2350
852
    400
         800
             2700
746
    450
        1000
             2350
702
    450
        1150
             2700
731
    600
        1200
             2300
[607 rows x 3 columns]
    vowel class
47
            1
70
            1
            1
7
46
            1
26
            1
825
            6
852
            6
746
            6
            6
702
731
            6
[607 rows x 1 columns]
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6, 6, 6, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 4, 6, 6, 4, 6]
    vowel class Pred_class
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0	1	5
1	1	2
2	1	6
3	1	1
4	1	5
• •	• • •	• • •
 259	6	4
 259 260	 6 6	 4 6
260	6	6

[264 rows x 2 columns]

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	f1	f2	f3	vowel	class
3	700	1600	2700		1
12	650	1600	2700		1
58	700	1300	2300		1
49	750	1350	2100		1
36	500	1450	2400		1
734	500	1250	2300		6
722	400	1000	2300		6
746	450	1000	2350		6
695	600	1050	2700		6
835	450	1050	2760		6

[521 rows x 4 columns]

```
f1
            f2
                  f3
3
     700 1600
                2700
12
     650
         1600
                2700
     700
          1300
                2300
49
    750
         1350
                2100
36
     500
          1450
                2400
     . . .
           . . .
                 . . .
734
     500
          1250
                2300
722
     400
          1000
                2300
746
     450
          1000
                2350
695
     600
          1050 2700
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[521 rows x 3 columns]

835 450 1050 2760

vowel class

[521 rows x 1 columns]

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1
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                       1
2
             1
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3
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            1
                       1
4
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345
                       5
            6
                       6
346
            6
347
            6
                       6
348
            6
                       6
349
             6
                       4
[350 rows x 2 columns]
     f1
         f2 f3 vowel class
70
    650
        1600
             2300
    550
        1200 2500
                           1
6
32
    500
        1350 2360
34
    700
        1400
             2360
                           1
        1400
15
    550
             2600
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    . . .
         . . .
              . . .
                          . . .
706
    400
        1100
             2300
                           6
845
    500 1000 2700
                           6
710
    450
        1150 2300
                           6
                           6
815
    400
         850 2300
                           6
696
    450
        1100 2700
[521 rows x 4 columns]
     f1
          f2
               f3
70
    650
       1600 2300
6
    550
        1200
             2500
32
    500
        1350
             2360
34
    700
        1400
             2360
15
    550
        1400
             2600
         . . .
              . . .
706
    400
        1100
             2300
845
    500
             2700
        1000
710
    450
        1150
             2300
815
    400
         850
             2300
696
    450
        1100
            2700
[521 rows x 3 columns]
    vowel class
70
             1
             1
6
32
             1
34
             1
15
             1
706
             6
845
             6
             6
710
815
             6
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[521 rows x 3 columns]
   vowel class
53
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866
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801
[521 rows x 1 columns]
3, 3, 5, 3, 3, 3, 3, 3, 3, 3, 3, 5, 3, 3, 3, 3,
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6, 6, 6, 6, 6, 6, 6, 4, 6, 6, 4, 6, 6, 6, 6, 2, 6, 6, 6, 6, 6, 6, 6, 6, 6]
   vowel class Pred class
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345
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[350 rows x 2 columns]
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            f3
               vowel class
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   500
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       1400
           2100
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44
   650
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       1200
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37
   700
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           2360
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[521 rows x 4 columns]
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36
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[521 rows x 3 columns]
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[521 rows x 1 columns]
[6, 5, 5, 5, 2, 5, 1, 6, 1, 1, 2, 1, 2, 5, 5, 5, 2, 5, 2, 2, 1, 1, 1, 1, 1, 1, 5,
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    vowel class Pred class
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345
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346
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347
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348
            6
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                      4
349
[350 rows x 2 columns]
```

localhost:8888/nbconvert/html/Implementation of 'Bayes Classifier' %2C 'Minimum Distance Classifier' and 'K-NN Classifier' on Vowel Data Set...

f3 vowel class

f1

f2

```
3
    700
        1600
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17
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761
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             2720
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778
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[521 rows x 4 columns]
    f1
          f2
               f3
3
    700
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             2700
17
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             2600
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744
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761
    500
        1100
             2720
778
    550
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            2560
[521 rows x 3 columns]
    vowel class
3
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778
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[521 rows x 1 columns]
[5, 5, 1, 2, 2, 5, 1, 1, 1, 6, 2, 5, 1, 5, 2, 1, 1, 4, 1, 5, 6, 5, 2, 2, 2, 1, 2,
1, 1, 6, 2, 2, 2, 2, 2, 2, 2, 1, 2, 2, 2, 2, 2, 1, 2, 2, 2, 1, 2, 2, 2, 1, 2,
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vowel class
              Pred class
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            1
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345
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346
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347
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```

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348
         349
         [350 rows x 2 columns]
         [77.40112994350282, 80.7909604519774, 77.96610169491525, 82.48587570621469, 81.355
         93220338984, 76.27118644067797, 78.53107344632768, 82.48587570621469, 82.485875706
         21469, 81.92090395480226, 81.81818181818183, 79.1666666666666, 81.81818181818183,
         77.651515151516, 80.68181818181817, 77.651515151516, 80.68181818181817, 81.060
         60606060606, 76.1363636363634, 78.409090909090, 82.28571428571428, 78.0, 79.7142
         8571428572, 79.42857142857143, 82.0, 77.71428571428571, 78.28571428571428, 80.2857
         1428571428, 80.57142857142857, 79.71428571428572]
         df_a_bayes = pd.DataFrame({'Test_size = 0.2':np.array(accuracy_lst[:10])})
In [13]:
          print(df_a_bayes)
            Test_size = 0.2
         0
                  77.401130
                  80.790960
         1
         2
                  77.966102
         3
                  82.485876
                  81.355932
         4
         5
                  76.271186
         6
                  78.531073
         7
                  82.485876
         8
                  82.485876
                  81.920904
In [14]:
         df b bayes = pd.DataFrame({'Test size = 0.3':np.array(accuracy lst[10:20])})
          print(df_b_bayes)
            Test_size = 0.3
         0
                  81.818182
         1
                  79.166667
         2
                  81.818182
         3
                  77.651515
         4
                  80.681818
         5
                  77.651515
         6
                  80.681818
         7
                  81,060606
         8
                  76.136364
                  78.409091
         df_c_bayes = pd.DataFrame({'Test_size = 0.4':np.array(accuracy_lst[20:])})
In [15]:
          print(df_c_bayes)
            Test_size = 0.4
         0
                  82.285714
         1
                  78.000000
         2
                  79,714286
         3
                  79.428571
                  82.000000
         5
                  77.714286
         6
                  78.285714
         7
                  80.285714
         8
                  80.571429
```

Accuracy of MDC Classifier for different test sizes for 10 iterations

79.714286

```
In [16]: result_bayes= df_a_bayes.join([df_b_bayes,df_c_bayes])
    print(result_bayes)
```

```
Test_size = 0.2 Test_size = 0.3 Test_size = 0.4
       77.401130
                       81.818182
0
                                      82.285714
1
        80.790960
                       79.166667
                                      78.000000
2
       77.966102
                      81.818182
                                      79.714286
3
       82.485876
                      77.651515
                                      79.428571
                      80.681818
4
       81.355932
                                      82.000000
        76.271186
                      77.651515
5
                                      77.714286
6
       78.531073
                     80.681818
                                     78.285714
7
        82.485876
                     81.060606
                                     80.285714
8
        82.485876
                       76.136364
                                      80.571429
        81.920904
                       78.409091
                                      79.714286
```

Mean Accuracy of Bayes Classifier for different test sizes

```
In [17]: result_bayes.mean()
                      Test size = 0.2
                                                                     80.169492
Out[17]:
                      Test_size = 0.3
                                                                    79.507576
                       Test_size = 0.4
                                                                     79.800000
                       dtype: float64
In [20]: k_{values} = [3, 5, 7]
                       accuracy_results = {}
                       test_size_lst = [0.2, 0.3, 0.4]
                       for k in k_values:
                                 accuracy_lst= []
                                 for testsize in test_size_lst:
                                          for i in range(10):
                                                    df1 = df[df['vowel class']==1]
                                                    X_1 = df1.drop(columns=['vowel class'])
                                                    y_1 = df1['vowel class']
                                                    X1_train,X1_test,y1_train,y1_test = train_test_split(X_1,y_1,test_size=
                                                    df2 = df[df['vowel class']==2]
                                                    X_2 = df2.drop(columns=['vowel class'])
                                                    y_2 = df2['vowel class']
                                                    X2_train,X2_test,y2_train,y2_test = train_test_split(X_2,y_2,test_size
                                                    df3 = df[df['vowel class']==3]
                                                    X_3 = df3.drop(columns=['vowel class'])
                                                    y_3 = df3['vowel class']
                                                    X3_train,X3_test,y3_train,y3_test = train_test_split(X_3,y_3,test_size=
                                                    df4 = df[df['vowel class']==4]
                                                    X_4 = df4.drop(columns=['vowel class'])
                                                    y 4 = df4['vowel class']
                                                    X4_train,X4_test,y4_train,y4_test = train_test_split(X_4,y_4,test_size=
                                                    df5 = df[df['vowel class']==5]
                                                    X_5 = df5.drop(columns=['vowel class'])
                                                    y 5 = df5['vowel class']
                                                    X5_train,X5_test,y5_train,y5_test = train_test_split(X_5,y_5,test_size=
                                                    df6 = df[df['vowel class']==6]
                                                    X_6 = df6.drop(columns=['vowel class'])
                                                    y_6 = df6['vowel class']
                                                    X6_train,X6_test,y6_train,y6_test = train_test_split(X_6,y_6,test_size=
                                                    X_1_ = X1_train.join(y1_train)
                                                    X 2 = X2 train.join(y2 train)
                                                    X_3 = X_3 
                                                    X_4_ = X4_{\text{train.join}}(y4_{\text{train}})
                                                    X_5_ = X5_train.join(y5_train)
```

```
X_6_ = X6_train.join(y6_train)
            train_final = pd.concat([X_1_,X_2_,X_3_,X_4_,X_5_,X_6_])
            #print(train_final)
            X_train = train_final.drop(columns='vowel class')
            #print(X train)
            y_train = pd.DataFrame(train_final['vowel class'])
            #print(y_train)
            X_test = pd.concat([X1_test,X2_test,X3_test,X4_test,X5_test,X6_test])
            #print(X_test)
            y_test = pd.concat([y1_test,y2_test,y3_test,y4_test,y5_test,y6_test])
            #print(y test)
            def euclidean_distance(x,y):
                return np.sqrt(np.sum((x-y)**2))
            y_pred = []
            for testpoint in np.array(X_test):
                distance_list = [euclidean_distance(testpoint,x) for x in np.array(
                df_dist = pd.DataFrame({'dist': distance_list, 'vowel class': y_tra
                df_dist = df_dist.sort_values(by='dist', ascending=True)
                df_knn = df_dist.iloc[:k]
                most_common_label = df_knn['vowel class'].mode().iloc[0]
                y_pred.append(most_common_label)
            #print(y_pred)
            y_pred_df = pd.DataFrame({'Pred_class':y_pred})
            #print(y_pred_df)
            y test df= pd.DataFrame(y test)
            y_test_df.reset_index(inplace=True)
            #print(y_test_df)
            df_foraccuracy = y_test_df.join(y_pred_df).drop(columns=['index'])
            #print(df_foraccuracy)
            #Calculating Accuracy
            true_pred = df_foraccuracy[df_foraccuracy['vowel class']==df_foraccurac
            accuracy = (true_pred.shape[0]/df_foraccuracy.shape[0])*100
            #print(accuracy)
            accuracy_lst.append(accuracy)
    accuracy_results[k] = accuracy_lst
for k, accuracies in accuracy results.items():
    print(f"Accuracy results for k={k}: {accuracies}")
```

Accuracy results for k=3: [86.4406779661017, 89.26553672316385, 84.18079096045197, 86.4406779661017, 85.31073446327684, 81.92090395480226, 82.48587570621469, 81.9209 0395480226, 82.48587570621469, 85.31073446327684, 84.0909090909091, 87.8787878787878, 85.22727272727273, 88.63636363636364, 86.74242424242425, 85.22727272727273, 84.0909090909091, 86.74242424242425, 84.848484848484, 87.87878787878787888, 85.71428571428571, 83.71428571428572, 85.42857142857143, 86.571428571428571428571, 83.42857142857143, 86.5714285

Mean Accuracy of kNN Classifier for different test sizes, where k = 3

```
In [24]: k_3_accuracy_lst = accuracy_results[3]
         df_a_k_3nn = pd.DataFrame({'Test_size = 0.2':np.array(k_3_accuracy_lst[:10])})
         df_b_k_3nn = pd.DataFrame({'Test_size = 0.3':np.array(k_3_accuracy_lst[10:20])})
         df_c_k_3nn = pd.DataFrame({'Test_size = 0.4':np.array(k_3_accuracy_lst[20:])})
         result_k_3nn= df_a_k_3nn.join([df_b_k_3nn,df_c_k_3nn])
         print(result_k_3nn)
         print(result_k_3nn.mean())
           Test_size = 0.2 Test_size = 0.3 Test_size = 0.4
                                84.090909
                 86.440678
                                                 85.714286
         1
                 89.265537
                                87.878788
                                                 83.714286
         2
                 84.180791
                                85.227273
                                                85.428571
         3
                 86.440678
                                88.636364
                                                 86.571429
```

```
4
                    86.742424
                                   84.285714
      85.310734
5
      81.920904
                    85.227273
                                   86.000000
6
      82.485876
                    84.090909
                                   83.428571
7
      81.920904
                    86.742424
                                   86.571429
8
       82.485876
                     84.848485
                                    83.714286
       85.310734
                     87.878788
                                     87.142857
Test_size = 0.2 84.576271
Test size = 0.3 86.136364
Test_size = 0.4 85.257143
```

dtype: float64

Mean Accuracy of kNN Classifier for different test sizes, where k = 5

```
In [25]: k_5_accuracy_lst = accuracy_results[5]
    df_a_k_5nn = pd.DataFrame({'Test_size = 0.2':np.array(k_5_accuracy_lst[:10])})
    df_b_k_5nn = pd.DataFrame({'Test_size = 0.3':np.array(k_5_accuracy_lst[10:20])})
    df_c_k_5nn = pd.DataFrame({'Test_size = 0.4':np.array(k_5_accuracy_lst[20:])})
    result_k_5nn = df_a_k_5nn.join([df_b_k_5nn,df_c_k_5nn])
    print(result_k_5nn)
    print(result_k_5nn.mean())
```

```
Test_size = 0.2 Test_size = 0.3 Test_size = 0.4
0
         87.570621 87.121212 86.571429
        89.830508 86.742424
87.005650 82.954545
1
                                             83.428571
2
                                             84.571429
                        82.954545

85.606061

87.878788

88.257576

86.742424

83.712121

85.606061
        87.570621
3
                                            83.142857
        87.005650
                                             85.714286
4
                                           84.000000
84.857143
88.000000
        84.180791
5
       89.265537
6
7
        85.875706
8
                                             86.857143
        88.135593
                         85.984848
                                             87.428571
        82.485876
Test_size = 0.2 86.892655
Test_size = 0.3 86.060606
Test_size = 0.4 85.457143
dtype: float64
```

Mean Accuracy of kNN Classifier for different test sizes, where k = 7

```
In [27]: k_7_accuracy_lst = accuracy_results[7]
               df_a_k_7nn = pd.DataFrame({'Test_size = 0.2':np.array(k_7_accuracy_lst[:10])})
               df_b_k_7nn = pd.DataFrame({'Test_size = 0.3':np.array(k_7_accuracy_lst[10:20])})
               df_c_k_7nn = pd.DataFrame({'Test_size = 0.4':np.array(k_7_accuracy_lst[20:])})
               result_k_7nn= df_a_k_7nn.join([df_b_k_7nn,df_c_k_7nn])
               print(result_k_7nn)
               print(result_k_7nn.mean())
                   Test_size = 0.2 Test_size = 0.3 Test_size = 0.4

      87.005650
      85.606061
      85.428571

      90.960452
      89.015152
      86.571429

      88.135593
      83.333333
      88.285714

               0
               1
               2
                           88.135593
               3
                           78.531073
                                                    86.742424
                                                                                88.285714

      87.005650
      86.363636
      84.571429

      81.920904
      86.363636
      86.857143

      87.005650
      85.227273
      84.857143

      86.440678
      85.227273
      85.428571

      84.745763
      81.439394
      89.428571

      87.570621
      86.742424
      84.857143

                           87.005650
               4
                            81.920904
               5
               6
               7
               Test size = 0.2 85.932203
               Test_size = 0.3 85.606061
               Test size = 0.4 86.457143
               dtype: float64
```

Remark:

In Vowel data set , there are six classes and each class have different no. of instances.It's an imbalaced dataset. So,instead of doing train_test_split on the whole dataset, we first split the whole dataset based on the differnt classses and then do train_test_split on each of the 6 parts of the data test and from that we construct our finalized trining set and test set. After performing three classifications namely 'Minimum Distance Classification', 'Bayes Classification', 'K-NN Classification' and observing their average accuracy over different test sizes , we conclude that: i) KNN classifier takes a lot of time to perform compare to other algorithims. It's like a lazy algorithm. ii) Based on the performance on this particular dataset we can order this three classifiers as follows: MDC < Bayes Classifier < K-NN

Classifier iii) But it doesn't conclude that K-NN classifier always performs best compare to other classifiers.