

## **ASSIGNMENT 3**

### **MACHINE LEARNING**

#### **QUESTION 2(b)**

##### **RANDOM FOREST:**

##### **ASSUMPTIONS:**

1. The decision tree considered is a 2 layer decision tree. The program works for only 2 layered trees and does not scale up.
2. The algorithm used, selects one feature at random till the number of features considered is less than  $N = 10$  and checks if the feature is already selected and chooses a new one till the value of  $N$  is reached. After 10 trees all the features are selected and one goes without repetition.  
This is done to ignore the features on which splitting cannot be done that is in our case feature 2 has all zeros and splitting with that feature is not possible and hence we have to eliminate such features when we are selecting only one feature at random and this condition is checked.  
For more than 1 class the information gain principle will not allow such a feature to be selected and hence the condition check can be ignored.  
The algorithm uses first described method till 10 variables and then resorts to the second method.
3. The results taken here are taken for 5 values at a time. This is done just for convenience and the size of vector  $B$  can be varied.
4. The graph plotted here are the mean and standard deviation plot done in excel. The plot is not done using MATLAB.

##### **RESULTS**

##### **For first 5 Values: (1-5 samples)**

```
>> myRForest2('ionosphere3.txt',[1 2 3 4 5],10)
```

Train Error for fold 1 with 100 base class: 0.148148

Test Error for fold 1 with 100 base class: 0.216216

Train Error for fold 2 with 100 base class: 0.194444

Test Error for fold 2 with 100 base class: 0.270270

Train Error for fold 3 with 100 base class: 0.191358

Test Error for fold 3 with 100 base class: 0.243243

Train Error for fold 4 with 100 base class: 0.222222

Test Error for fold 4 with 100 base class: 0.216216

Train Error for fold 5 with 100 base class: 0.364198

Test Error for fold 5 with 100 base class: 0.216216

Train Error for fold 6 with 100 base class: 0.271605

Test Error for fold 6 with 100 base class: 0.189189

Train Error for fold 7 with 100 base class: 0.250000

Test Error for fold 7 with 100 base class: 0.351351

Train Error for fold 8 with 100 base class: 0.209877

Test Error for fold 8 with 100 base class: 0.216216

Train Error for fold 9 with 100 base class: 0.179012

Test Error for fold 9 with 100 base class: 0.216216

Train Error for fold 10 with 100 base class: 0.265432

Test Error for fold 10 with 100 base class: 0.189189

Mean Train error 10 fold 100 base class is 0.229630  
Std Train error 10 fold 100 base class is 0.061388

Mean Test error 10 fold 100 base class is 0.232432  
Std Test error 10 fold 100 base class is 0.048010

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Train Error for fold 1 with 100 base class: 0.219136  
Test Error for fold 1 with 100 base class: 0.270270  
Train Error for fold 2 with 100 base class: 0.308642  
Test Error for fold 2 with 100 base class: 0.270270  
Train Error for fold 3 with 100 base class: 0.197531  
Test Error for fold 3 with 100 base class: 0.162162  
Train Error for fold 4 with 100 base class: 0.222222  
Test Error for fold 4 with 100 base class: 0.054054  
Train Error for fold 5 with 100 base class: 0.237654  
Test Error for fold 5 with 100 base class: 0.324324  
Train Error for fold 6 with 100 base class: 0.243827  
Test Error for fold 6 with 100 base class: 0.216216  
Train Error for fold 7 with 100 base class: 0.234568  
Test Error for fold 7 with 100 base class: 0.324324  
Train Error for fold 8 with 100 base class: 0.203704  
Test Error for fold 8 with 100 base class: 0.243243  
Train Error for fold 9 with 100 base class: 0.271605  
Test Error for fold 9 with 100 base class: 0.216216  
Train Error for fold 10 with 100 base class: 0.182099  
Test Error for fold 10 with 100 base class: 0.189189

Mean Train error 10 fold 100 base class is 0.232099  
Std Train error 10 fold 100 base class is 0.037060

Mean Test error 10 fold 100 base class is 0.227027  
Std Test error 10 fold 100 base class is 0.080780

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Train Error for fold 1 with 100 base class: 0.172840  
Test Error for fold 1 with 100 base class: 0.216216  
Train Error for fold 2 with 100 base class: 0.268519  
Test Error for fold 2 with 100 base class: 0.270270  
Train Error for fold 3 with 100 base class: 0.200617  
Test Error for fold 3 with 100 base class: 0.243243  
Train Error for fold 4 with 100 base class: 0.265432  
Test Error for fold 4 with 100 base class: 0.135135  
Train Error for fold 5 with 100 base class: 0.219136  
Test Error for fold 5 with 100 base class: 0.216216  
Train Error for fold 6 with 100 base class: 0.225309  
Test Error for fold 6 with 100 base class: 0.243243  
Train Error for fold 7 with 100 base class: 0.209877  
Test Error for fold 7 with 100 base class: 0.135135  
Train Error for fold 8 with 100 base class: 0.185185  
Test Error for fold 8 with 100 base class: 0.297297  
Train Error for fold 9 with 100 base class: 0.268519

Test Error for fold 9 with 100 base class: 0.216216  
Train Error for fold 10 with 100 base class: 0.290123  
Test Error for fold 10 with 100 base class: 0.216216

Mean Train error 10 fold 100 base class is 0.230556  
Std Train error 10 fold 100 base class is 0.040164

Mean Test error 10 fold 100 base class is 0.218919  
Std Test error 10 fold 100 base class is 0.051674

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Train Error for fold 1 with 100 base class: 0.265432  
Test Error for fold 1 with 100 base class: 0.216216  
Train Error for fold 2 with 100 base class: 0.182099  
Test Error for fold 2 with 100 base class: 0.108108  
Train Error for fold 3 with 100 base class: 0.234568  
Test Error for fold 3 with 100 base class: 0.162162  
Train Error for fold 4 with 100 base class: 0.191358  
Test Error for fold 4 with 100 base class: 0.216216  
Train Error for fold 5 with 100 base class: 0.243827  
Test Error for fold 5 with 100 base class: 0.270270  
Train Error for fold 6 with 100 base class: 0.231481  
Test Error for fold 6 with 100 base class: 0.135135  
Train Error for fold 7 with 100 base class: 0.231481  
Test Error for fold 7 with 100 base class: 0.216216  
Train Error for fold 8 with 100 base class: 0.237654  
Test Error for fold 8 with 100 base class: 0.297297  
Train Error for fold 9 with 100 base class: 0.209877  
Test Error for fold 9 with 100 base class: 0.270270  
Train Error for fold 10 with 100 base class: 0.234568  
Test Error for fold 10 with 100 base class: 0.216216

Mean Train error 10 fold 100 base class is 0.226235  
Std Train error 10 fold 100 base class is 0.024949

Mean Test error 10 fold 100 base class is 0.210811  
Std Test error 10 fold 100 base class is 0.060836

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Train Error for fold 1 with 100 base class: 0.253086  
Test Error for fold 1 with 100 base class: 0.189189  
Train Error for fold 2 with 100 base class: 0.212963  
Test Error for fold 2 with 100 base class: 0.162162  
Train Error for fold 3 with 100 base class: 0.219136  
Test Error for fold 3 with 100 base class: 0.162162  
Train Error for fold 4 with 100 base class: 0.222222  
Test Error for fold 4 with 100 base class: 0.270270  
Train Error for fold 5 with 100 base class: 0.237654  
Test Error for fold 5 with 100 base class: 0.189189  
Train Error for fold 6 with 100 base class: 0.225309  
Test Error for fold 6 with 100 base class: 0.243243  
Train Error for fold 7 with 100 base class: 0.250000  
Test Error for fold 7 with 100 base class: 0.135135

Train Error for fold 8 with 100 base class: 0.228395  
Test Error for fold 8 with 100 base class: 0.324324  
Train Error for fold 9 with 100 base class: 0.280864  
Test Error for fold 9 with 100 base class: 0.243243  
Train Error for fold 10 with 100 base class: 0.265432  
Test Error for fold 10 with 100 base class: 0.270270

Mean Train error 10 fold 100 base class is 0.239506  
Std Train error 10 fold 100 base class is 0.022171

Mean Test error 10 fold 100 base class is 0.218919  
Std Test error 10 fold 100 base class is 0.060367

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**FOR Next 5 Values: (6- 10 Samples)**

**>> myRForest2('ionoshpere3.txt',[6 7 8 9 10],10)**

Train Error for fold 1 with 100 base class: 0.179012  
Test Error for fold 1 with 100 base class: 0.243243  
Train Error for fold 2 with 100 base class: 0.320988  
Test Error for fold 2 with 100 base class: 0.324324  
Train Error for fold 3 with 100 base class: 0.237654  
Test Error for fold 3 with 100 base class: 0.162162  
Train Error for fold 4 with 100 base class: 0.240741  
Test Error for fold 4 with 100 base class: 0.297297  
Train Error for fold 5 with 100 base class: 0.237654  
Test Error for fold 5 with 100 base class: 0.189189  
Train Error for fold 6 with 100 base class: 0.243827  
Test Error for fold 6 with 100 base class: 0.189189  
Train Error for fold 7 with 100 base class: 0.253086  
Test Error for fold 7 with 100 base class: 0.216216  
Train Error for fold 8 with 100 base class: 0.246914  
Test Error for fold 8 with 100 base class: 0.216216  
Train Error for fold 9 with 100 base class: 0.222222  
Test Error for fold 9 with 100 base class: 0.270270  
Train Error for fold 10 with 100 base class: 0.209877  
Test Error for fold 10 with 100 base class: 0.378378

Mean Train error 10 fold 100 base class is 0.239198  
Std Train error 10 fold 100 base class is 0.036118

Mean Test error 10 fold 100 base class is 0.248649  
Std Test error 10 fold 100 base class is 0.068374

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Train Error for fold 1 with 100 base class: 0.268519  
Test Error for fold 1 with 100 base class: 0.162162  
Train Error for fold 2 with 100 base class: 0.259259  
Test Error for fold 2 with 100 base class: 0.243243  
Train Error for fold 3 with 100 base class: 0.283951  
Test Error for fold 3 with 100 base class: 0.405405  
Train Error for fold 4 with 100 base class: 0.197531

Test Error for fold 4 with 100 base class: 0.297297  
Train Error for fold 5 with 100 base class: 0.237654  
Test Error for fold 5 with 100 base class: 0.216216  
Train Error for fold 6 with 100 base class: 0.290123  
Test Error for fold 6 with 100 base class: 0.324324  
Train Error for fold 7 with 100 base class: 0.277778  
Test Error for fold 7 with 100 base class: 0.189189  
Train Error for fold 8 with 100 base class: 0.172840  
Test Error for fold 8 with 100 base class: 0.162162  
Train Error for fold 9 with 100 base class: 0.200617  
Test Error for fold 9 with 100 base class: 0.324324  
Train Error for fold 10 with 100 base class: 0.287037  
Test Error for fold 10 with 100 base class: 0.270270

Mean Train error 10 fold 100 base class is 0.247531  
Std Train error 10 fold 100 base class is 0.042910

Mean Test error 10 fold 100 base class is 0.259459  
Std Test error 10 fold 100 base class is 0.079769

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Train Error for fold 1 with 100 base class: 0.283951  
Test Error for fold 1 with 100 base class: 0.189189  
Train Error for fold 2 with 100 base class: 0.320988  
Test Error for fold 2 with 100 base class: 0.243243  
Train Error for fold 3 with 100 base class: 0.234568  
Test Error for fold 3 with 100 base class: 0.405405  
Train Error for fold 4 with 100 base class: 0.283951  
Test Error for fold 4 with 100 base class: 0.189189  
Train Error for fold 5 with 100 base class: 0.228395  
Test Error for fold 5 with 100 base class: 0.297297  
Train Error for fold 6 with 100 base class: 0.253086  
Test Error for fold 6 with 100 base class: 0.378378  
Train Error for fold 7 with 100 base class: 0.203704  
Test Error for fold 7 with 100 base class: 0.378378  
Train Error for fold 8 with 100 base class: 0.277778  
Test Error for fold 8 with 100 base class: 0.216216  
Train Error for fold 9 with 100 base class: 0.250000  
Test Error for fold 9 with 100 base class: 0.270270  
Train Error for fold 10 with 100 base class: 0.231481  
Test Error for fold 10 with 100 base class: 0.324324

Mean Train error 10 fold 100 base class is 0.256790  
Std Train error 10 fold 100 base class is 0.034730

Mean Test error 10 fold 100 base class is 0.289189  
Std Test error 10 fold 100 base class is 0.080629

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Train Error for fold 1 with 100 base class: 0.290123  
Test Error for fold 1 with 100 base class: 0.324324  
Train Error for fold 2 with 100 base class: 0.216049  
Test Error for fold 2 with 100 base class: 0.243243

Train Error for fold 3 with 100 base class: 0.231481  
Test Error for fold 3 with 100 base class: 0.243243  
Train Error for fold 4 with 100 base class: 0.243827  
Test Error for fold 4 with 100 base class: 0.135135  
Train Error for fold 5 with 100 base class: 0.219136  
Test Error for fold 5 with 100 base class: 0.243243  
Train Error for fold 6 with 100 base class: 0.246914  
Test Error for fold 6 with 100 base class: 0.270270  
Train Error for fold 7 with 100 base class: 0.203704  
Test Error for fold 7 with 100 base class: 0.270270  
Train Error for fold 8 with 100 base class: 0.246914  
Test Error for fold 8 with 100 base class: 0.189189  
Train Error for fold 9 with 100 base class: 0.240741  
Test Error for fold 9 with 100 base class: 0.189189  
Train Error for fold 10 with 100 base class: 0.209877  
Test Error for fold 10 with 100 base class: 0.243243

Mean Train error 10 fold 100 base class is 0.234877  
Std Train error 10 fold 100 base class is 0.025093

Mean Test error 10 fold 100 base class is 0.235135  
Std Test error 10 fold 100 base class is 0.052608

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Train Error for fold 1 with 100 base class: 0.123457  
Test Error for fold 1 with 100 base class: 0.216216  
Train Error for fold 2 with 100 base class: 0.101852  
Test Error for fold 2 with 100 base class: 0.108108  
Train Error for fold 3 with 100 base class: 0.129630  
Test Error for fold 3 with 100 base class: 0.135135  
Train Error for fold 4 with 100 base class: 0.080247  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.145062  
Test Error for fold 5 with 100 base class: 0.135135  
Train Error for fold 6 with 100 base class: 0.154321  
Test Error for fold 6 with 100 base class: 0.189189  
Train Error for fold 7 with 100 base class: 0.129630  
Test Error for fold 7 with 100 base class: 0.081081  
Train Error for fold 8 with 100 base class: 0.095679  
Test Error for fold 8 with 100 base class: 0.189189  
Train Error for fold 9 with 100 base class: 0.123457  
Test Error for fold 9 with 100 base class: 0.216216  
Train Error for fold 10 with 100 base class: 0.135802  
Test Error for fold 10 with 100 base class: 0.189189

Mean Train error 10 fold 100 base class is 0.121914  
Std Train error 10 fold 100 base class is 0.022924

Mean Test error 10 fold 100 base class is 0.156757  
Std Test error 10 fold 100 base class is 0.049014

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**FOR Next 5 values : (11-15 Samples)**

**>> myRForest2('ionoshpere3.txt',[11 12 13 14 15],10)**

Train Error for fold 1 with 100 base class: 0.083333  
Test Error for fold 1 with 100 base class: 0.108108  
Train Error for fold 2 with 100 base class: 0.104938  
Test Error for fold 2 with 100 base class: 0.162162  
Train Error for fold 3 with 100 base class: 0.092593  
Test Error for fold 3 with 100 base class: 0.162162  
Train Error for fold 4 with 100 base class: 0.092593  
Test Error for fold 4 with 100 base class: 0.135135  
Train Error for fold 5 with 100 base class: 0.117284  
Test Error for fold 5 with 100 base class: 0.243243  
Train Error for fold 6 with 100 base class: 0.095679  
Test Error for fold 6 with 100 base class: 0.135135  
Train Error for fold 7 with 100 base class: 0.089506  
Test Error for fold 7 with 100 base class: 0.135135  
Train Error for fold 8 with 100 base class: 0.067901  
Test Error for fold 8 with 100 base class: 0.243243  
Train Error for fold 9 with 100 base class: 0.070988  
Test Error for fold 9 with 100 base class: 0.081081  
Train Error for fold 10 with 100 base class: 0.067901  
Test Error for fold 10 with 100 base class: 0.243243

Mean Train error 10 fold 100 base class is 0.088272

Std Train error 10 fold 100 base class is 0.016215

Mean Test error 10 fold 100 base class is 0.164865

Std Test error 10 fold 100 base class is 0.059007

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Train Error for fold 1 with 100 base class: 0.104938  
Test Error for fold 1 with 100 base class: 0.081081  
Train Error for fold 2 with 100 base class: 0.132716  
Test Error for fold 2 with 100 base class: 0.135135  
Train Error for fold 3 with 100 base class: 0.111111  
Test Error for fold 3 with 100 base class: 0.108108  
Train Error for fold 4 with 100 base class: 0.101852  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.108025  
Test Error for fold 5 with 100 base class: 0.081081  
Train Error for fold 6 with 100 base class: 0.095679  
Test Error for fold 6 with 100 base class: 0.081081  
Train Error for fold 7 with 100 base class: 0.098765  
Test Error for fold 7 with 100 base class: 0.189189  
Train Error for fold 8 with 100 base class: 0.117284  
Test Error for fold 8 with 100 base class: 0.189189  
Train Error for fold 9 with 100 base class: 0.117284  
Test Error for fold 9 with 100 base class: 0.162162  
Train Error for fold 10 with 100 base class: 0.086420  
Test Error for fold 10 with 100 base class: 0.027027

Mean Train error 10 fold 100 base class is 0.107407  
Std Train error 10 fold 100 base class is 0.013078

Mean Test error 10 fold 100 base class is 0.116216  
Std Test error 10 fold 100 base class is 0.052608

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Train Error for fold 1 with 100 base class: 0.135802  
Test Error for fold 1 with 100 base class: 0.000000  
Train Error for fold 2 with 100 base class: 0.080247  
Test Error for fold 2 with 100 base class: 0.081081  
Train Error for fold 3 with 100 base class: 0.111111  
Test Error for fold 3 with 100 base class: 0.135135  
Train Error for fold 4 with 100 base class: 0.098765  
Test Error for fold 4 with 100 base class: 0.162162  
Train Error for fold 5 with 100 base class: 0.120370  
Test Error for fold 5 with 100 base class: 0.162162  
Train Error for fold 6 with 100 base class: 0.120370  
Test Error for fold 6 with 100 base class: 0.081081  
Train Error for fold 7 with 100 base class: 0.092593  
Test Error for fold 7 with 100 base class: 0.054054  
Train Error for fold 8 with 100 base class: 0.080247  
Test Error for fold 8 with 100 base class: 0.135135  
Train Error for fold 9 with 100 base class: 0.080247  
Test Error for fold 9 with 100 base class: 0.135135  
Train Error for fold 10 with 100 base class: 0.098765  
Test Error for fold 10 with 100 base class: 0.162162

Mean Train error 10 fold 100 base class is 0.101852  
Std Train error 10 fold 100 base class is 0.019520

Mean Test error 10 fold 100 base class is 0.110811  
Std Test error 10 fold 100 base class is 0.054726

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Train Error for fold 1 with 100 base class: 0.111111  
Test Error for fold 1 with 100 base class: 0.189189  
Train Error for fold 2 with 100 base class: 0.104938  
Test Error for fold 2 with 100 base class: 0.027027  
Train Error for fold 3 with 100 base class: 0.092593  
Test Error for fold 3 with 100 base class: 0.054054  
Train Error for fold 4 with 100 base class: 0.117284  
Test Error for fold 4 with 100 base class: 0.162162  
Train Error for fold 5 with 100 base class: 0.077160  
Test Error for fold 5 with 100 base class: 0.270270  
Train Error for fold 6 with 100 base class: 0.077160  
Test Error for fold 6 with 100 base class: 0.081081  
Train Error for fold 7 with 100 base class: 0.098765  
Test Error for fold 7 with 100 base class: 0.081081  
Train Error for fold 8 with 100 base class: 0.086420  
Test Error for fold 8 with 100 base class: 0.162162  
Train Error for fold 9 with 100 base class: 0.108025  
Test Error for fold 9 with 100 base class: 0.081081



Train Error for fold 10 with 100 base class: 0.077160  
Test Error for fold 10 with 100 base class: 0.081081

Mean Train error 10 fold 100 base class is 0.095062  
Std Train error 10 fold 100 base class is 0.015176

Mean Test error 10 fold 100 base class is 0.118919  
Std Test error 10 fold 100 base class is 0.074508

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Train Error for fold 1 with 100 base class: 0.135802  
Test Error for fold 1 with 100 base class: 0.081081  
Train Error for fold 2 with 100 base class: 0.086420  
Test Error for fold 2 with 100 base class: 0.216216  
Train Error for fold 3 with 100 base class: 0.108025  
Test Error for fold 3 with 100 base class: 0.189189  
Train Error for fold 4 with 100 base class: 0.120370  
Test Error for fold 4 with 100 base class: 0.081081  
Train Error for fold 5 with 100 base class: 0.098765  
Test Error for fold 5 with 100 base class: 0.054054  
Train Error for fold 6 with 100 base class: 0.101852  
Test Error for fold 6 with 100 base class: 0.081081  
Train Error for fold 7 with 100 base class: 0.098765  
Test Error for fold 7 with 100 base class: 0.108108  
Train Error for fold 8 with 100 base class: 0.083333  
Test Error for fold 8 with 100 base class: 0.162162  
Train Error for fold 9 with 100 base class: 0.104938  
Test Error for fold 9 with 100 base class: 0.189189  
Train Error for fold 10 with 100 base class: 0.126543  
Test Error for fold 10 with 100 base class: 0.081081

Mean Train error 10 fold 100 base class is 0.106481  
Std Train error 10 fold 100 base class is 0.016795

Mean Test error 10 fold 100 base class is 0.124324  
Std Test error 10 fold 100 base class is 0.058662

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**FOR Next 5 values(16-20)**

**>> myRForest2('ionoshpere3.txt',[16 17 18 19 20],10)**

Train Error for fold 1 with 100 base class: 0.104938  
Test Error for fold 1 with 100 base class: 0.108108  
Train Error for fold 2 with 100 base class: 0.129630  
Test Error for fold 2 with 100 base class: 0.081081  
Train Error for fold 3 with 100 base class: 0.098765  
Test Error for fold 3 with 100 base class: 0.162162  
Train Error for fold 4 with 100 base class: 0.077160  
Test Error for fold 4 with 100 base class: 0.081081  
Train Error for fold 5 with 100 base class: 0.077160  
Test Error for fold 5 with 100 base class: 0.108108  
Train Error for fold 6 with 100 base class: 0.077160  
Test Error for fold 6 with 100 base class: 0.108108

Train Error for fold 7 with 100 base class: 0.111111  
Test Error for fold 7 with 100 base class: 0.054054  
Train Error for fold 8 with 100 base class: 0.123457  
Test Error for fold 8 with 100 base class: 0.027027  
Train Error for fold 9 with 100 base class: 0.086420  
Test Error for fold 9 with 100 base class: 0.108108  
Train Error for fold 10 with 100 base class: 0.141975  
Test Error for fold 10 with 100 base class: 0.162162

Mean Train error 10 fold 100 base class is 0.102778  
Std Train error 10 fold 100 base class is 0.023598

Mean Test error 10 fold 100 base class is 0.100000  
Std Test error 10 fold 100 base class is 0.042352

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Train Error for fold 1 with 100 base class: 0.104938  
Test Error for fold 1 with 100 base class: 0.189189  
Train Error for fold 2 with 100 base class: 0.067901  
Test Error for fold 2 with 100 base class: 0.135135  
Train Error for fold 3 with 100 base class: 0.083333  
Test Error for fold 3 with 100 base class: 0.108108  
Train Error for fold 4 with 100 base class: 0.080247  
Test Error for fold 4 with 100 base class: 0.081081  
Train Error for fold 5 with 100 base class: 0.095679  
Test Error for fold 5 with 100 base class: 0.189189  
Train Error for fold 6 with 100 base class: 0.126543  
Test Error for fold 6 with 100 base class: 0.108108  
Train Error for fold 7 with 100 base class: 0.083333  
Test Error for fold 7 with 100 base class: 0.135135  
Train Error for fold 8 with 100 base class: 0.092593  
Test Error for fold 8 with 100 base class: 0.162162  
Train Error for fold 9 with 100 base class: 0.092593  
Test Error for fold 9 with 100 base class: 0.108108  
Train Error for fold 10 with 100 base class: 0.098765  
Test Error for fold 10 with 100 base class: 0.189189

Mean Train error 10 fold 100 base class is 0.092593  
Std Train error 10 fold 100 base class is 0.015938

Mean Test error 10 fold 100 base class is 0.140541  
Std Test error 10 fold 100 base class is 0.039885

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Train Error for fold 1 with 100 base class: 0.098765  
Test Error for fold 1 with 100 base class: 0.216216  
Train Error for fold 2 with 100 base class: 0.120370  
Test Error for fold 2 with 100 base class: 0.027027  
Train Error for fold 3 with 100 base class: 0.070988  
Test Error for fold 3 with 100 base class: 0.162162  
Train Error for fold 4 with 100 base class: 0.104938  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.114198

Test Error for fold 5 with 100 base class: 0.108108  
Train Error for fold 6 with 100 base class: 0.108025  
Test Error for fold 6 with 100 base class: 0.135135  
Train Error for fold 7 with 100 base class: 0.098765  
Test Error for fold 7 with 100 base class: 0.000000  
Train Error for fold 8 with 100 base class: 0.067901  
Test Error for fold 8 with 100 base class: 0.108108  
Train Error for fold 9 with 100 base class: 0.120370  
Test Error for fold 9 with 100 base class: 0.027027  
Train Error for fold 10 with 100 base class: 0.145062  
Test Error for fold 10 with 100 base class: 0.135135

Mean Train error 10 fold 100 base class is 0.104938  
Std Train error 10 fold 100 base class is 0.023051

Mean Test error 10 fold 100 base class is 0.102703  
Std Test error 10 fold 100 base class is 0.067176

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Train Error for fold 1 with 100 base class: 0.117284  
Test Error for fold 1 with 100 base class: 0.135135  
Train Error for fold 2 with 100 base class: 0.108025  
Test Error for fold 2 with 100 base class: 0.162162  
Train Error for fold 3 with 100 base class: 0.098765  
Test Error for fold 3 with 100 base class: 0.243243  
Train Error for fold 4 with 100 base class: 0.114198  
Test Error for fold 4 with 100 base class: 0.054054  
Train Error for fold 5 with 100 base class: 0.108025  
Test Error for fold 5 with 100 base class: 0.162162  
Train Error for fold 6 with 100 base class: 0.104938  
Test Error for fold 6 with 100 base class: 0.054054  
Train Error for fold 7 with 100 base class: 0.117284  
Test Error for fold 7 with 100 base class: 0.162162  
Train Error for fold 8 with 100 base class: 0.064815  
Test Error for fold 8 with 100 base class: 0.243243  
Train Error for fold 9 with 100 base class: 0.104938  
Test Error for fold 9 with 100 base class: 0.108108  
Train Error for fold 10 with 100 base class: 0.117284  
Test Error for fold 10 with 100 base class: 0.162162

Mean Train error 10 fold 100 base class is 0.105556  
Std Train error 10 fold 100 base class is 0.015657

Mean Test error 10 fold 100 base class is 0.148649  
Std Test error 10 fold 100 base class is 0.065276

---

Train Error for fold 1 with 100 base class: 0.052469  
Test Error for fold 1 with 100 base class: 0.108108  
Train Error for fold 2 with 100 base class: 0.080247  
Test Error for fold 2 with 100 base class: 0.162162  
Train Error for fold 3 with 100 base class: 0.172840  
Test Error for fold 3 with 100 base class: 0.081081

Train Error for fold 4 with 100 base class: 0.108025  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.126543  
Test Error for fold 5 with 100 base class: 0.162162  
Train Error for fold 6 with 100 base class: 0.083333  
Test Error for fold 6 with 100 base class: 0.135135  
Train Error for fold 7 with 100 base class: 0.111111  
Test Error for fold 7 with 100 base class: 0.108108  
Train Error for fold 8 with 100 base class: 0.104938  
Test Error for fold 8 with 100 base class: 0.108108  
Train Error for fold 9 with 100 base class: 0.114198  
Test Error for fold 9 with 100 base class: 0.054054  
Train Error for fold 10 with 100 base class: 0.089506  
Test Error for fold 10 with 100 base class: 0.135135

Mean Train error 10 fold 100 base class is 0.104321  
Std Train error 10 fold 100 base class is 0.032101

Mean Test error 10 fold 100 base class is 0.116216  
Std Test error 10 fold 100 base class is 0.033829

---

**FOR Next 5 Values: (21-25)**

>> myRForest2('ionoshpere3.txt',[21 22 23 24 25],10)

Train Error for fold 1 with 100 base class: 0.095679  
Test Error for fold 1 with 100 base class: 0.135135  
Train Error for fold 2 with 100 base class: 0.141975  
Test Error for fold 2 with 100 base class: 0.108108  
Train Error for fold 3 with 100 base class: 0.126543  
Test Error for fold 3 with 100 base class: 0.108108  
Train Error for fold 4 with 100 base class: 0.086420  
Test Error for fold 4 with 100 base class: 0.081081  
Train Error for fold 5 with 100 base class: 0.117284  
Test Error for fold 5 with 100 base class: 0.108108  
Train Error for fold 6 with 100 base class: 0.108025  
Test Error for fold 6 with 100 base class: 0.081081  
Train Error for fold 7 with 100 base class: 0.111111  
Test Error for fold 7 with 100 base class: 0.081081  
Train Error for fold 8 with 100 base class: 0.104938  
Test Error for fold 8 with 100 base class: 0.189189  
Train Error for fold 9 with 100 base class: 0.135802  
Test Error for fold 9 with 100 base class: 0.081081  
Train Error for fold 10 with 100 base class: 0.104938  
Test Error for fold 10 with 100 base class: 0.189189

Mean Train error 10 fold 100 base class is 0.113272  
Std Train error 10 fold 100 base class is 0.017402

Mean Test error 10 fold 100 base class is 0.116216  
Std Test error 10 fold 100 base class is 0.042352

---

Train Error for fold 1 with 100 base class: 0.117284  
Test Error for fold 1 with 100 base class: 0.108108  
Train Error for fold 2 with 100 base class: 0.145062  
Test Error for fold 2 with 100 base class: 0.054054  
Train Error for fold 3 with 100 base class: 0.101852  
Test Error for fold 3 with 100 base class: 0.135135  
Train Error for fold 4 with 100 base class: 0.086420  
Test Error for fold 4 with 100 base class: 0.081081  
Train Error for fold 5 with 100 base class: 0.086420  
Test Error for fold 5 with 100 base class: 0.162162  
Train Error for fold 6 with 100 base class: 0.111111  
Test Error for fold 6 with 100 base class: 0.108108  
Train Error for fold 7 with 100 base class: 0.080247  
Test Error for fold 7 with 100 base class: 0.108108  
Train Error for fold 8 with 100 base class: 0.120370  
Test Error for fold 8 with 100 base class: 0.027027  
Train Error for fold 9 with 100 base class: 0.129630  
Test Error for fold 9 with 100 base class: 0.135135  
Train Error for fold 10 with 100 base class: 0.089506  
Test Error for fold 10 with 100 base class: 0.108108

Mean Train error 10 fold 100 base class is 0.106790  
Std Train error 10 fold 100 base class is 0.021492

Mean Test error 10 fold 100 base class is 0.102703  
Std Test error 10 fold 100 base class is 0.039885

---

Train Error for fold 1 with 100 base class: 0.135802  
Test Error for fold 1 with 100 base class: 0.135135  
Train Error for fold 2 with 100 base class: 0.114198  
Test Error for fold 2 with 100 base class: 0.108108  
Train Error for fold 3 with 100 base class: 0.092593  
Test Error for fold 3 with 100 base class: 0.135135  
Train Error for fold 4 with 100 base class: 0.067901  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.126543  
Test Error for fold 5 with 100 base class: 0.081081  
Train Error for fold 6 with 100 base class: 0.117284  
Test Error for fold 6 with 100 base class: 0.135135  
Train Error for fold 7 with 100 base class: 0.154321  
Test Error for fold 7 with 100 base class: 0.162162  
Train Error for fold 8 with 100 base class: 0.111111  
Test Error for fold 8 with 100 base class: 0.081081  
Train Error for fold 9 with 100 base class: 0.098765  
Test Error for fold 9 with 100 base class: 0.135135  
Train Error for fold 10 with 100 base class: 0.120370  
Test Error for fold 10 with 100 base class: 0.081081

Mean Train error 10 fold 100 base class is 0.113889  
Std Train error 10 fold 100 base class is 0.023883

Mean Test error 10 fold 100 base class is 0.116216  
Std Test error 10 fold 100 base class is 0.028631

---

Train Error for fold 1 with 100 base class: 0.083333  
Test Error for fold 1 with 100 base class: 0.162162  
Train Error for fold 2 with 100 base class: 0.104938  
Test Error for fold 2 with 100 base class: 0.135135  
Train Error for fold 3 with 100 base class: 0.126543  
Test Error for fold 3 with 100 base class: 0.108108  
Train Error for fold 4 with 100 base class: 0.101852  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.148148  
Test Error for fold 5 with 100 base class: 0.027027  
Train Error for fold 6 with 100 base class: 0.123457  
Test Error for fold 6 with 100 base class: 0.189189  
Train Error for fold 7 with 100 base class: 0.098765  
Test Error for fold 7 with 100 base class: 0.189189  
Train Error for fold 8 with 100 base class: 0.123457  
Test Error for fold 8 with 100 base class: 0.189189  
Train Error for fold 9 with 100 base class: 0.132716  
Test Error for fold 9 with 100 base class: 0.162162  
Train Error for fold 10 with 100 base class: 0.101852  
Test Error for fold 10 with 100 base class: 0.162162

Mean Train error 10 fold 100 base class is 0.114506  
Std Train error 10 fold 100 base class is 0.019436

Mean Test error 10 fold 100 base class is 0.143243  
Std Test error 10 fold 100 base class is 0.051042

---

Train Error for fold 1 with 100 base class: 0.129630  
Test Error for fold 1 with 100 base class: 0.162162  
Train Error for fold 2 with 100 base class: 0.101852  
Test Error for fold 2 with 100 base class: 0.243243  
Train Error for fold 3 with 100 base class: 0.114198  
Test Error for fold 3 with 100 base class: 0.108108  
Train Error for fold 4 with 100 base class: 0.135802  
Test Error for fold 4 with 100 base class: 0.081081  
Train Error for fold 5 with 100 base class: 0.092593  
Test Error for fold 5 with 100 base class: 0.108108  
Train Error for fold 6 with 100 base class: 0.157407  
Test Error for fold 6 with 100 base class: 0.081081  
Train Error for fold 7 with 100 base class: 0.117284  
Test Error for fold 7 with 100 base class: 0.108108  
Train Error for fold 8 with 100 base class: 0.095679  
Test Error for fold 8 with 100 base class: 0.108108  
Train Error for fold 9 with 100 base class: 0.104938  
Test Error for fold 9 with 100 base class: 0.135135  
Train Error for fold 10 with 100 base class: 0.111111  
Test Error for fold 10 with 100 base class: 0.135135

Mean Train error 10 fold 100 base class is 0.116049  
Std Train error 10 fold 100 base class is 0.020013

Mean Test error 10 fold 100 base class is 0.127027  
Std Test error 10 fold 100 base class is 0.047756

---

**FOR Next 5 Values: (26-30)**

**>> myRForest2('ionoshpere3.txt',[26 27 28 29 30],10)**

Train Error for fold 1 with 100 base class: 0.114198  
Test Error for fold 1 with 100 base class: 0.189189  
Train Error for fold 2 with 100 base class: 0.067901  
Test Error for fold 2 with 100 base class: 0.270270  
Train Error for fold 3 with 100 base class: 0.145062  
Test Error for fold 3 with 100 base class: 0.081081  
Train Error for fold 4 with 100 base class: 0.086420  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.114198  
Test Error for fold 5 with 100 base class: 0.270270  
Train Error for fold 6 with 100 base class: 0.114198  
Test Error for fold 6 with 100 base class: 0.135135  
Train Error for fold 7 with 100 base class: 0.114198  
Test Error for fold 7 with 100 base class: 0.081081  
Train Error for fold 8 with 100 base class: 0.064815  
Test Error for fold 8 with 100 base class: 0.027027  
Train Error for fold 9 with 100 base class: 0.098765  
Test Error for fold 9 with 100 base class: 0.135135  
Train Error for fold 10 with 100 base class: 0.120370  
Test Error for fold 10 with 100 base class: 0.108108

Mean Train error 10 fold 100 base class is 0.104012  
Std Train error 10 fold 100 base class is 0.024822

Mean Test error 10 fold 100 base class is 0.140541  
Std Test error 10 fold 100 base class is 0.080377

---

Train Error for fold 1 with 100 base class: 0.061728  
Test Error for fold 1 with 100 base class: 0.189189  
Train Error for fold 2 with 100 base class: 0.104938  
Test Error for fold 2 with 100 base class: 0.135135  
Train Error for fold 3 with 100 base class: 0.172840  
Test Error for fold 3 with 100 base class: 0.135135  
Train Error for fold 4 with 100 base class: 0.092593  
Test Error for fold 4 with 100 base class: 0.135135  
Train Error for fold 5 with 100 base class: 0.089506  
Test Error for fold 5 with 100 base class: 0.108108  
Train Error for fold 6 with 100 base class: 0.077160  
Test Error for fold 6 with 100 base class: 0.108108  
Train Error for fold 7 with 100 base class: 0.077160  
Test Error for fold 7 with 100 base class: 0.189189  
Train Error for fold 8 with 100 base class: 0.141975

Test Error for fold 8 with 100 base class: 0.135135  
Train Error for fold 9 with 100 base class: 0.135802  
Test Error for fold 9 with 100 base class: 0.243243  
Train Error for fold 10 with 100 base class: 0.111111  
Test Error for fold 10 with 100 base class: 0.162162

Mean Train error 10 fold 100 base class is 0.106481  
Std Train error 10 fold 100 base class is 0.034561

Mean Test error 10 fold 100 base class is 0.154054  
Std Test error 10 fold 100 base class is 0.042352

---

Train Error for fold 1 with 100 base class: 0.111111  
Test Error for fold 1 with 100 base class: 0.135135  
Train Error for fold 2 with 100 base class: 0.080247  
Test Error for fold 2 with 100 base class: 0.135135  
Train Error for fold 3 with 100 base class: 0.098765  
Test Error for fold 3 with 100 base class: 0.108108  
Train Error for fold 4 with 100 base class: 0.108025  
Test Error for fold 4 with 100 base class: 0.054054  
Train Error for fold 5 with 100 base class: 0.108025  
Test Error for fold 5 with 100 base class: 0.189189  
Train Error for fold 6 with 100 base class: 0.080247  
Test Error for fold 6 with 100 base class: 0.081081  
Train Error for fold 7 with 100 base class: 0.126543  
Test Error for fold 7 with 100 base class: 0.081081  
Train Error for fold 8 with 100 base class: 0.104938  
Test Error for fold 8 with 100 base class: 0.135135  
Train Error for fold 9 with 100 base class: 0.141975  
Test Error for fold 9 with 100 base class: 0.162162  
Train Error for fold 10 with 100 base class: 0.117284  
Test Error for fold 10 with 100 base class: 0.108108

Mean Train error 10 fold 100 base class is 0.107716  
Std Train error 10 fold 100 base class is 0.018940

Mean Test error 10 fold 100 base class is 0.118919  
Std Test error 10 fold 100 base class is 0.040690

---

Train Error for fold 1 with 100 base class: 0.126543  
Test Error for fold 1 with 100 base class: 0.135135  
Train Error for fold 2 with 100 base class: 0.135802  
Test Error for fold 2 with 100 base class: 0.135135  
Train Error for fold 3 with 100 base class: 0.089506  
Test Error for fold 3 with 100 base class: 0.189189  
Train Error for fold 4 with 100 base class: 0.104938  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.095679  
Test Error for fold 5 with 100 base class: 0.189189  
Train Error for fold 6 with 100 base class: 0.117284  
Test Error for fold 6 with 100 base class: 0.108108



Train Error for fold 7 with 100 base class: 0.135802  
Test Error for fold 7 with 100 base class: 0.216216  
Train Error for fold 8 with 100 base class: 0.111111  
Test Error for fold 8 with 100 base class: 0.054054  
Train Error for fold 9 with 100 base class: 0.120370  
Test Error for fold 9 with 100 base class: 0.162162  
Train Error for fold 10 with 100 base class: 0.123457  
Test Error for fold 10 with 100 base class: 0.000000

Mean Train error 10 fold 100 base class is 0.116049  
Std Train error 10 fold 100 base class is 0.015751

Mean Test error 10 fold 100 base class is 0.129730  
Std Test error 10 fold 100 base class is 0.065957

---

Train Error for fold 1 with 100 base class: 0.120370  
Test Error for fold 1 with 100 base class: 0.135135  
Train Error for fold 2 with 100 base class: 0.108025  
Test Error for fold 2 with 100 base class: 0.081081  
Train Error for fold 3 with 100 base class: 0.117284  
Test Error for fold 3 with 100 base class: 0.189189  
Train Error for fold 4 with 100 base class: 0.111111  
Test Error for fold 4 with 100 base class: 0.081081  
Train Error for fold 5 with 100 base class: 0.157407  
Test Error for fold 5 with 100 base class: 0.108108  
Train Error for fold 6 with 100 base class: 0.080247  
Test Error for fold 6 with 100 base class: 0.108108  
Train Error for fold 7 with 100 base class: 0.074074  
Test Error for fold 7 with 100 base class: 0.054054  
Train Error for fold 8 with 100 base class: 0.101852  
Test Error for fold 8 with 100 base class: 0.162162  
Train Error for fold 9 with 100 base class: 0.126543  
Test Error for fold 9 with 100 base class: 0.108108  
Train Error for fold 10 with 100 base class: 0.138889  
Test Error for fold 10 with 100 base class: 0.081081

Mean Train error 10 fold 100 base class is 0.113580  
Std Train error 10 fold 100 base class is 0.025023

Mean Test error 10 fold 100 base class is 0.110811  
Std Test error 10 fold 100 base class is 0.041186

---

**For 31,32 and 33:**

**>> myRForest2('ionoshpere3.txt',[31 32 33],10)**

Train Error for fold 1 with 100 base class: 0.120370  
Test Error for fold 1 with 100 base class: 0.054054  
Train Error for fold 2 with 100 base class: 0.111111  
Test Error for fold 2 with 100 base class: 0.189189  
Train Error for fold 3 with 100 base class: 0.104938  
Test Error for fold 3 with 100 base class: 0.270270  
Train Error for fold 4 with 100 base class: 0.108025

Test Error for fold 4 with 100 base class: 0.216216  
Train Error for fold 5 with 100 base class: 0.179012  
Test Error for fold 5 with 100 base class: 0.054054  
Train Error for fold 6 with 100 base class: 0.108025  
Test Error for fold 6 with 100 base class: 0.162162  
Train Error for fold 7 with 100 base class: 0.117284  
Test Error for fold 7 with 100 base class: 0.135135  
Train Error for fold 8 with 100 base class: 0.108025  
Test Error for fold 8 with 100 base class: 0.108108  
Train Error for fold 9 with 100 base class: 0.141975  
Test Error for fold 9 with 100 base class: 0.135135  
Train Error for fold 10 with 100 base class: 0.132716  
Test Error for fold 10 with 100 base class: 0.135135

Mean Train error 10 fold 100 base class is 0.123148  
Std Train error 10 fold 100 base class is 0.023026

Mean Test error 10 fold 100 base class is 0.145946  
Std Test error 10 fold 100 base class is 0.067658

---

Train Error for fold 1 with 100 base class: 0.117284  
Test Error for fold 1 with 100 base class: 0.108108  
Train Error for fold 2 with 100 base class: 0.086420  
Test Error for fold 2 with 100 base class: 0.108108  
Train Error for fold 3 with 100 base class: 0.141975  
Test Error for fold 3 with 100 base class: 0.081081  
Train Error for fold 4 with 100 base class: 0.163580  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.145062  
Test Error for fold 5 with 100 base class: 0.108108  
Train Error for fold 6 with 100 base class: 0.104938  
Test Error for fold 6 with 100 base class: 0.189189  
Train Error for fold 7 with 100 base class: 0.120370  
Test Error for fold 7 with 100 base class: 0.108108  
Train Error for fold 8 with 100 base class: 0.101852  
Test Error for fold 8 with 100 base class: 0.189189  
Train Error for fold 9 with 100 base class: 0.104938  
Test Error for fold 9 with 100 base class: 0.162162  
Train Error for fold 10 with 100 base class: 0.108025  
Test Error for fold 10 with 100 base class: 0.108108

Mean Train error 10 fold 100 base class is 0.119444  
Std Train error 10 fold 100 base class is 0.023732

Mean Test error 10 fold 100 base class is 0.127027  
Std Test error 10 fold 100 base class is 0.038328

---

Train Error for fold 1 with 100 base class: 0.114198  
Test Error for fold 1 with 100 base class: 0.027027  
Train Error for fold 2 with 100 base class: 0.111111  
Test Error for fold 2 with 100 base class: 0.216216

Train Error for fold 3 with 100 base class: 0.138889  
Test Error for fold 3 with 100 base class: 0.135135  
Train Error for fold 4 with 100 base class: 0.117284  
Test Error for fold 4 with 100 base class: 0.108108  
Train Error for fold 5 with 100 base class: 0.141975  
Test Error for fold 5 with 100 base class: 0.135135  
Train Error for fold 6 with 100 base class: 0.101852  
Test Error for fold 6 with 100 base class: 0.135135  
Train Error for fold 7 with 100 base class: 0.123457  
Test Error for fold 7 with 100 base class: 0.135135  
Train Error for fold 8 with 100 base class: 0.141975  
Test Error for fold 8 with 100 base class: 0.081081  
Train Error for fold 9 with 100 base class: 0.129630  
Test Error for fold 9 with 100 base class: 0.189189  
Train Error for fold 10 with 100 base class: 0.108025  
Test Error for fold 10 with 100 base class: 0.081081

Mean Train error 10 fold 100 base class is 0.122840  
Std Train error 10 fold 100 base class is 0.014680

Mean Test error 10 fold 100 base class is 0.124324  
Std Test error 10 fold 100 base class is 0.054354

---

#### **For the last value 34**

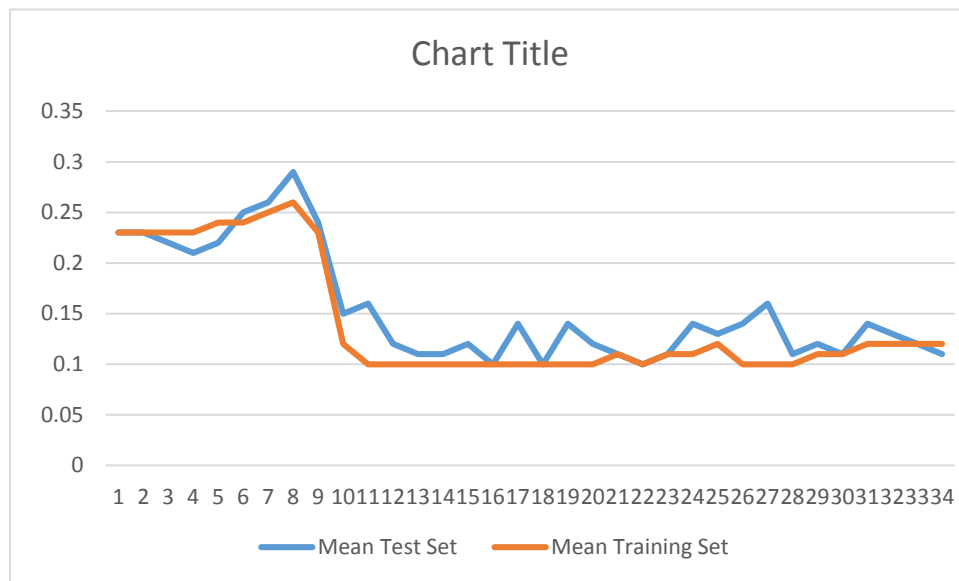
**>> myRForest2('ionoshpere3.txt',[34],10)**

Train Error for fold 1 with 100 base class: 0.129630  
Test Error for fold 1 with 100 base class: 0.108108  
Train Error for fold 2 with 100 base class: 0.151235  
Test Error for fold 2 with 100 base class: 0.189189  
Train Error for fold 3 with 100 base class: 0.114198  
Test Error for fold 3 with 100 base class: 0.081081  
Train Error for fold 4 with 100 base class: 0.089506  
Test Error for fold 4 with 100 base class: 0.216216  
Train Error for fold 5 with 100 base class: 0.111111  
Test Error for fold 5 with 100 base class: 0.189189  
Train Error for fold 6 with 100 base class: 0.117284  
Test Error for fold 6 with 100 base class: 0.108108  
Train Error for fold 7 with 100 base class: 0.108025  
Test Error for fold 7 with 100 base class: 0.189189  
Train Error for fold 8 with 100 base class: 0.095679  
Test Error for fold 8 with 100 base class: 0.108108  
Train Error for fold 9 with 100 base class: 0.123457  
Test Error for fold 9 with 100 base class: 0.216216  
Train Error for fold 10 with 100 base class: 0.132716  
Test Error for fold 10 with 100 base class: 0.162162

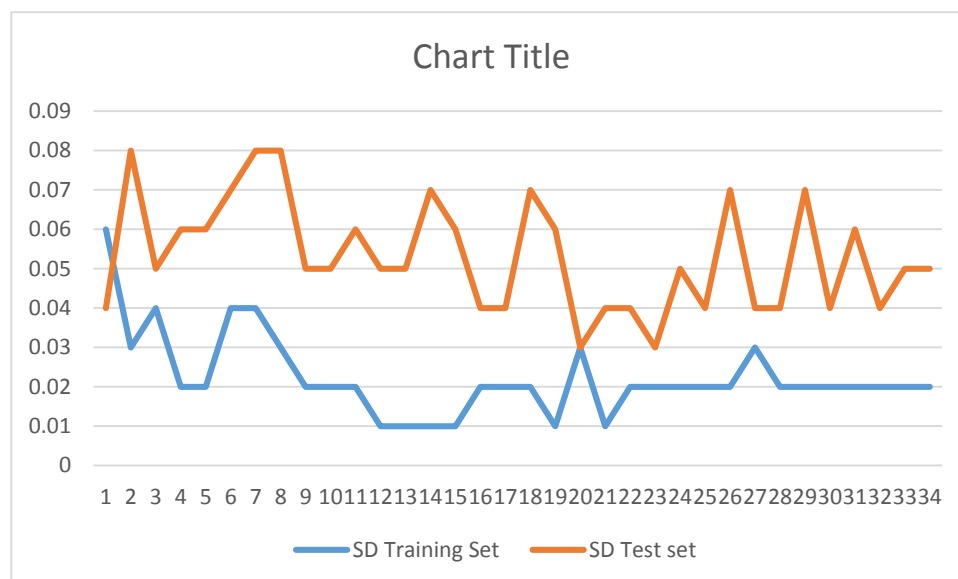
Mean Train error 10 fold 100 base class is 0.117284  
Std Train error 10 fold 100 base class is 0.018114

Mean Test error 10 fold 100 base class is 0.156757  
Std Test error 10 fold 100 base class is 0.050643

GRAPH PLOTTED FOR ALL MEAN VALUES:



GRAPH PLOTTED FOR ALL STANDARD DEVIATION:



### ANALYSIS :

From the graph we can see that the mean value of the test errors is always greater than that of the training error this makes sense because the training error is the data that is used to derive the results .

The errors start falls as the number of features are increased that is true because if I have access to all features I will choose the best 3 but if I made to choose at random the probability that we will end up selecting the best feature is less.

The error rate stablizes after some value this is because as the number of samples increase the probability of selecting the best three features also increases.

## 2(a) BAGGING :

The values are taken in two batch that is 1<sup>ST</sup> five values are run first and then the next 5 are run. The algorithm will work for any vectro size this was done for convinience.

### RESULTS

#### FOR 5,10,15,20, 25

```
>> myBagging2('ionoshpere3.txt',[5 10 15 20 25],10)
```

Train Error for fold 1 with 5 base class: 0.129630

Test Error for fold 1 with 5 base class: 0.162162

Train Error for fold 2 with 5 base class: 0.114198

Test Error for fold 2 with 5 base class: 0.135135

Train Error for fold 3 with 5 base class: 0.129630

Test Error for fold 3 with 5 base class: 0.243243

Train Error for fold 4 with 5 base class: 0.086420

Test Error for fold 4 with 5 base class: 0.135135

Train Error for fold 5 with 5 base class: 0.135802

Test Error for fold 5 with 5 base class: 0.081081

Train Error for fold 6 with 5 base class: 0.129630

Test Error for fold 6 with 5 base class: 0.135135

Train Error for fold 7 with 5 base class: 0.132716

Test Error for fold 7 with 5 base class: 0.081081

Train Error for fold 8 with 5 base class: 0.154321

Test Error for fold 8 with 5 base class: 0.081081

Train Error for fold 9 with 5 base class: 0.101852

Test Error for fold 9 with 5 base class: 0.108108

Train Error for fold 10 with 5 base class: 0.077160

Test Error for fold 10 with 5 base class: 0.162162

Mean Train error 10 fold 5 base class is 0.119136

Std Train error 10 fold 5 base class is 0.024005

Mean Test error 10 fold 5 base class is 0.132432

Std Test error 10 fold 5 base class is 0.050079

---

Train Error for fold 1 with 10 base class: 0.089506

Test Error for fold 1 with 10 base class: 0.108108

Train Error for fold 2 with 10 base class: 0.120370

Test Error for fold 2 with 10 base class: 0.054054

Train Error for fold 3 with 10 base class: 0.095679

Test Error for fold 3 with 10 base class: 0.162162

Train Error for fold 4 with 10 base class: 0.095679

Test Error for fold 4 with 10 base class: 0.081081

Train Error for fold 5 with 10 base class: 0.114198

Test Error for fold 5 with 10 base class: 0.000000

Train Error for fold 6 with 10 base class: 0.111111

Test Error for fold 6 with 10 base class: 0.216216

Train Error for fold 7 with 10 base class: 0.074074

Test Error for fold 7 with 10 base class: 0.162162

Train Error for fold 8 with 10 base class: 0.111111

Test Error for fold 8 with 10 base class: 0.054054

Train Error for fold 9 with 10 base class: 0.074074  
Test Error for fold 9 with 10 base class: 0.189189  
Train Error for fold 10 with 10 base class: 0.148148  
Test Error for fold 10 with 10 base class: 0.108108

Mean Train error 10 fold 10 base class is 0.103395  
Std Train error 10 fold 10 base class is 0.022505

Mean Test error 10 fold 10 base class is 0.113514  
Std Test error 10 fold 10 base class is 0.068374

---

Train Error for fold 1 with 15 base class: 0.163580  
Test Error for fold 1 with 15 base class: 0.081081  
Train Error for fold 2 with 15 base class: 0.104938  
Test Error for fold 2 with 15 base class: 0.081081  
Train Error for fold 3 with 15 base class: 0.120370  
Test Error for fold 3 with 15 base class: 0.162162  
Train Error for fold 4 with 15 base class: 0.129630  
Test Error for fold 4 with 15 base class: 0.189189  
Train Error for fold 5 with 15 base class: 0.120370  
Test Error for fold 5 with 15 base class: 0.081081  
Train Error for fold 6 with 15 base class: 0.101852  
Test Error for fold 6 with 15 base class: 0.162162  
Train Error for fold 7 with 15 base class: 0.132716  
Test Error for fold 7 with 15 base class: 0.081081  
Train Error for fold 8 with 15 base class: 0.117284  
Test Error for fold 8 with 15 base class: 0.135135  
Train Error for fold 9 with 15 base class: 0.117284  
Test Error for fold 9 with 15 base class: 0.108108  
Train Error for fold 10 with 15 base class: 0.083333  
Test Error for fold 10 with 15 base class: 0.054054

Mean Train error 10 fold 15 base class is 0.119136  
Std Train error 10 fold 15 base class is 0.021244

Mean Test error 10 fold 15 base class is 0.113514  
Std Test error 10 fold 15 base class is 0.045582

---

Train Error for fold 1 with 20 base class: 0.123457  
Test Error for fold 1 with 20 base class: 0.162162  
Train Error for fold 2 with 20 base class: 0.104938  
Test Error for fold 2 with 20 base class: 0.135135  
Train Error for fold 3 with 20 base class: 0.111111  
Test Error for fold 3 with 20 base class: 0.216216  
Train Error for fold 4 with 20 base class: 0.098765  
Test Error for fold 4 with 20 base class: 0.162162  
Train Error for fold 5 with 20 base class: 0.086420  
Test Error for fold 5 with 20 base class: 0.081081  
Train Error for fold 6 with 20 base class: 0.083333  
Test Error for fold 6 with 20 base class: 0.027027  
Train Error for fold 7 with 20 base class: 0.104938

Test Error for fold 7 with 20 base class: 0.135135  
Train Error for fold 8 with 20 base class: 0.129630  
Test Error for fold 8 with 20 base class: 0.216216  
Train Error for fold 9 with 20 base class: 0.083333  
Test Error for fold 9 with 20 base class: 0.189189  
Train Error for fold 10 with 20 base class: 0.160494  
Test Error for fold 10 with 20 base class: 0.108108

Mean Train error 10 fold 20 base class is 0.108642  
Std Train error 10 fold 20 base class is 0.024163

Mean Test error 10 fold 20 base class is 0.143243  
Std Test error 10 fold 20 base class is 0.059827

---

Train Error for fold 1 with 25 base class: 0.101852  
Test Error for fold 1 with 25 base class: 0.162162  
Train Error for fold 2 with 25 base class: 0.111111  
Test Error for fold 2 with 25 base class: 0.054054  
Train Error for fold 3 with 25 base class: 0.145062  
Test Error for fold 3 with 25 base class: 0.081081  
Train Error for fold 4 with 25 base class: 0.070988  
Test Error for fold 4 with 25 base class: 0.108108  
Train Error for fold 5 with 25 base class: 0.148148  
Test Error for fold 5 with 25 base class: 0.216216  
Train Error for fold 6 with 25 base class: 0.101852  
Test Error for fold 6 with 25 base class: 0.135135  
Train Error for fold 7 with 25 base class: 0.111111  
Test Error for fold 7 with 25 base class: 0.081081  
Train Error for fold 8 with 25 base class: 0.154321  
Test Error for fold 8 with 25 base class: 0.108108  
Train Error for fold 9 with 25 base class: 0.117284  
Test Error for fold 9 with 25 base class: 0.216216  
Train Error for fold 10 with 25 base class: 0.101852  
Test Error for fold 10 with 25 base class: 0.189189

Mean Train error 10 fold 25 base class is 0.116358  
Std Train error 10 fold 25 base class is 0.025866

Mean Test error 10 fold 25 base class is 0.135135  
Std Test error 10 fold 25 base class is 0.058385

---

## NEXT SET OF CLASSIFIERS

**>> myBagging2('ionoshpere3.txt',[30 35 40 45 50],10)**

Train Error for fold 1 with 30 base class: 0.098765  
Test Error for fold 1 with 30 base class: 0.162162  
Train Error for fold 2 with 30 base class: 0.123457  
Test Error for fold 2 with 30 base class: 0.108108  
Train Error for fold 3 with 30 base class: 0.089506  
Test Error for fold 3 with 30 base class: 0.162162  
Train Error for fold 4 with 30 base class: 0.135802

Test Error for fold 4 with 30 base class: 0.135135  
Train Error for fold 5 with 30 base class: 0.120370  
Test Error for fold 5 with 30 base class: 0.108108  
Train Error for fold 6 with 30 base class: 0.098765  
Test Error for fold 6 with 30 base class: 0.081081  
Train Error for fold 7 with 30 base class: 0.101852  
Test Error for fold 7 with 30 base class: 0.108108  
Train Error for fold 8 with 30 base class: 0.098765  
Test Error for fold 8 with 30 base class: 0.054054  
Train Error for fold 9 with 30 base class: 0.129630  
Test Error for fold 9 with 30 base class: 0.108108  
Train Error for fold 10 with 30 base class: 0.114198  
Test Error for fold 10 with 30 base class: 0.108108

Mean Train error 10 fold 30 base class is 0.111111  
Std Train error 10 fold 30 base class is 0.015670

Mean Test error 10 fold 30 base class is 0.113514  
Std Test error 10 fold 30 base class is 0.033224

---

Train Error for fold 1 with 35 base class: 0.141975  
Test Error for fold 1 with 35 base class: 0.054054  
Train Error for fold 2 with 35 base class: 0.129630  
Test Error for fold 2 with 35 base class: 0.081081  
Train Error for fold 3 with 35 base class: 0.098765  
Test Error for fold 3 with 35 base class: 0.081081  
Train Error for fold 4 with 35 base class: 0.163580  
Test Error for fold 4 with 35 base class: 0.162162  
Train Error for fold 5 with 35 base class: 0.098765  
Test Error for fold 5 with 35 base class: 0.054054  
Train Error for fold 6 with 35 base class: 0.111111  
Test Error for fold 6 with 35 base class: 0.081081  
Train Error for fold 7 with 35 base class: 0.117284  
Test Error for fold 7 with 35 base class: 0.216216  
Train Error for fold 8 with 35 base class: 0.148148  
Test Error for fold 8 with 35 base class: 0.108108  
Train Error for fold 9 with 35 base class: 0.126543  
Test Error for fold 9 with 35 base class: 0.135135  
Train Error for fold 10 with 35 base class: 0.120370  
Test Error for fold 10 with 35 base class: 0.135135

Mean Train error 10 fold 35 base class is 0.125617  
Std Train error 10 fold 35 base class is 0.021037

Mean Test error 10 fold 35 base class is 0.110811  
Std Test error 10 fold 35 base class is 0.051674

---

Train Error for fold 1 with 40 base class: 0.108025  
Test Error for fold 1 with 40 base class: 0.135135  
Train Error for fold 2 with 40 base class: 0.117284  
Test Error for fold 2 with 40 base class: 0.162162



Train Error for fold 3 with 40 base class: 0.111111  
Test Error for fold 3 with 40 base class: 0.054054  
Train Error for fold 4 with 40 base class: 0.148148  
Test Error for fold 4 with 40 base class: 0.081081  
Train Error for fold 5 with 40 base class: 0.077160  
Test Error for fold 5 with 40 base class: 0.162162  
Train Error for fold 6 with 40 base class: 0.095679  
Test Error for fold 6 with 40 base class: 0.162162  
Train Error for fold 7 with 40 base class: 0.083333  
Test Error for fold 7 with 40 base class: 0.135135  
Train Error for fold 8 with 40 base class: 0.120370  
Test Error for fold 8 with 40 base class: 0.135135  
Train Error for fold 9 with 40 base class: 0.077160  
Test Error for fold 9 with 40 base class: 0.081081  
Train Error for fold 10 with 40 base class: 0.132716  
Test Error for fold 10 with 40 base class: 0.108108

Mean Train error 10 fold 40 base class is 0.107099  
Std Train error 10 fold 40 base class is 0.023865

Mean Test error 10 fold 40 base class is 0.121622  
Std Test error 10 fold 40 base class is 0.038749

---

Train Error for fold 1 with 45 base class: 0.135802  
Test Error for fold 1 with 45 base class: 0.135135  
Train Error for fold 2 with 45 base class: 0.104938  
Test Error for fold 2 with 45 base class: 0.108108  
Train Error for fold 3 with 45 base class: 0.101852  
Test Error for fold 3 with 45 base class: 0.189189  
Train Error for fold 4 with 45 base class: 0.089506  
Test Error for fold 4 with 45 base class: 0.189189  
Train Error for fold 5 with 45 base class: 0.101852  
Test Error for fold 5 with 45 base class: 0.243243  
Train Error for fold 6 with 45 base class: 0.080247  
Test Error for fold 6 with 45 base class: 0.054054  
Train Error for fold 7 with 45 base class: 0.104938  
Test Error for fold 7 with 45 base class: 0.135135  
Train Error for fold 8 with 45 base class: 0.135802  
Test Error for fold 8 with 45 base class: 0.135135  
Train Error for fold 9 with 45 base class: 0.098765  
Test Error for fold 9 with 45 base class: 0.135135  
Train Error for fold 10 with 45 base class: 0.117284  
Test Error for fold 10 with 45 base class: 0.108108

Mean Train error 10 fold 45 base class is 0.107099  
Std Train error 10 fold 45 base class is 0.018000

Mean Test error 10 fold 45 base class is 0.143243  
Std Test error 10 fold 45 base class is 0.052608

---

Train Error for fold 1 with 50 base class: 0.089506

Test Error for fold 1 with 50 base class: 0.108108  
Train Error for fold 2 with 50 base class: 0.083333  
Test Error for fold 2 with 50 base class: 0.135135  
Train Error for fold 3 with 50 base class: 0.095679  
Test Error for fold 3 with 50 base class: 0.162162  
Train Error for fold 4 with 50 base class: 0.129630  
Test Error for fold 4 with 50 base class: 0.189189  
Train Error for fold 5 with 50 base class: 0.101852  
Test Error for fold 5 with 50 base class: 0.135135  
Train Error for fold 6 with 50 base class: 0.135802  
Test Error for fold 6 with 50 base class: 0.081081  
Train Error for fold 7 with 50 base class: 0.129630  
Test Error for fold 7 with 50 base class: 0.081081  
Train Error for fold 8 with 50 base class: 0.135802  
Test Error for fold 8 with 50 base class: 0.027027  
Train Error for fold 9 with 50 base class: 0.126543  
Test Error for fold 9 with 50 base class: 0.162162  
Train Error for fold 10 with 50 base class: 0.095679  
Test Error for fold 10 with 50 base class: 0.216216

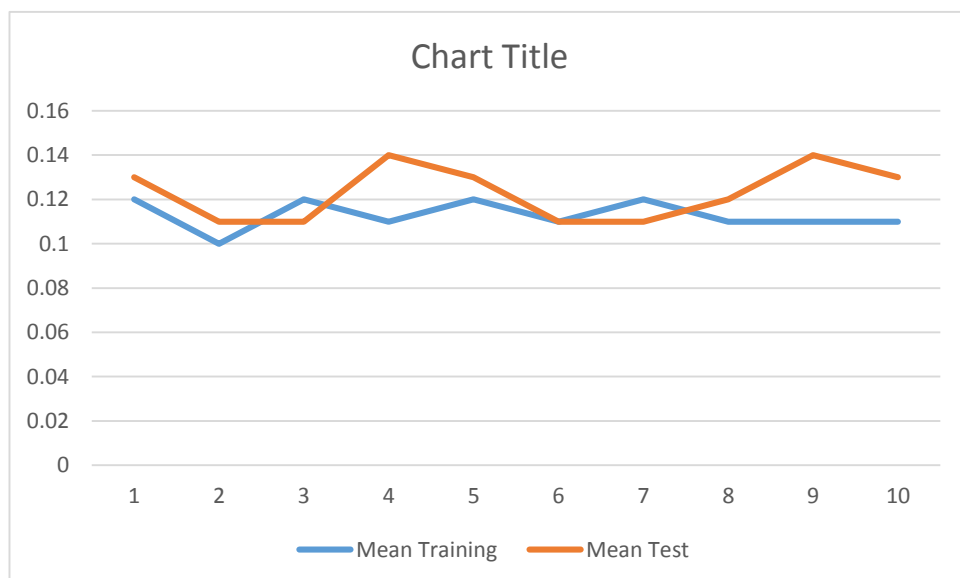
Mean Train error 10 fold 50 base class is 0.112346  
Std Train error 10 fold 50 base class is 0.020893

Mean Test error 10 fold 50 base class is 0.129730  
Std Test error 10 fold 50 base class is 0.056692

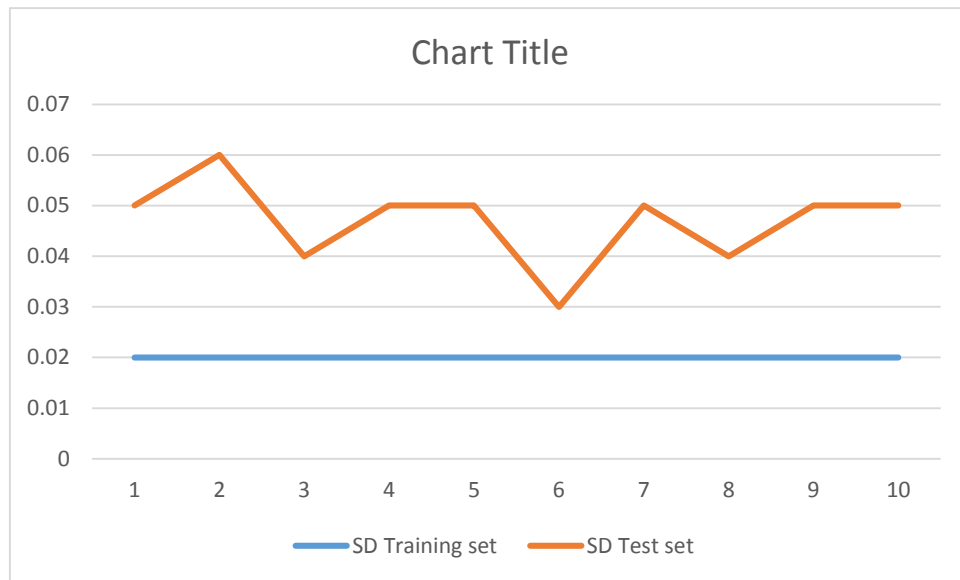
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## GRAPH

### FOR MEAN ERROR ANALYSIS:



### FOR STANDARD DEVIATION OF ERRORS:



### ANALYSIS:

It can be seen from the graph that the train set errors are almost same for the varying number of decision tree used.

As explained in the class adding weak trees does not make much of an improvement in performance.

The last output of the random forest is the output for bagging with 100 trees. As seen in the value even after adding 100 trees the error rate is about 0.1 and hence we can say that it stabilises at that point.