

I.Dataset Url:

<http://archive.ics.uci.edu/ml/machine-learning-databases/breast-cancer-wisconsin/breast-cancer-wisconsin.data>

II.Preprocessing :

There were no NA or the empty values in the data. So, it was not required to remove them.

1. Normalized all the values between 0 and 1

Pseudocode:

```
numFolds = 10
classifiers = {Decision Trees, Perceptron, Neural Net, Deep Learning, SVM, naïve Bayes,
Logistic Regression, k-Nearest Neighbors, Bagging, Random Forests, AdaBoost, Gradient
Boosting} // list of n classifiers with best parameters
split the data into 10 folds d[1...10]
for i in 1 to 10
// create training dataset by combining all folds except d[i]
train = {d[1] + d[2] + ... + d[i-1] + d[i+1] + ... + d[10]}
// create test dataset using d[i]
test = d[i]
for c in classifiers classifiers
// create a model of type c using train
model <- createModel(c, train)
// find accuracy of model of type c on test
for classifier c: accuracy[i] <- findAccuracy(model, test)
for classifier c: other_parameter[i] <- findEvaluation(model, test)
next c
next i
print average accuracies
print precisions
```

Evaluation Metrics used:

1. Accuracy
2. Precision

III.Finding best classifier parameters:

| Experiment# | Classifier | CrossValidation fold | Parameter1 | Parameter2 | Parameter3 | Parameter4 | Average Accuracy of 10 folds |
|-------------|----------------|----------------------|----------------------|-----------------|---------------|-------------|------------------------------|
| 1 | Decision Trees | 10 | maxDepth:30 | Cp: 0.01 | Minbucket: 10 | Minsplit: 3 | 78.5 |
| | Decision Trees | 10 | maxDepth:30 | Cp: 0.01 | Minbucket: 1 | Minsplit: 3 | 84.5 |
| | Decision Trees | 10 | maxDepth:30 | Cp: 0.001 | Minbucket: 1 | Minsplit: 3 | 94.5 |
| 2 | Perceptron | 10 | Threshold: 500 | | | | 55.92 |
| | Perceptron | 10 | Threshold:100 | | | | 87.3 |
| | Perceptron | 10 | Threshold:10 | | | | 98.6 |
| 3 | Neural Net | 10 | #of Hidden layers:3 | Nodes: (3,3,3) | Threshold:10 | | 65.02 |
| | Neural Net | 10 | #of Hidden layers:4 | Nodes:(4,4,4,4) | Threshold:10 | | 62.9 |
| | Neural Net | 10 | #of Hidden layers:3 | Nodes :(4,4,4) | Threshold:1 | | 98.1 |
| 4 | Deep Learning | 10 | #of Hidden layers:7 | Nodes : 10 each | Threshold:10 | | 65.0 |
| | Deep Learning | 10 | #of Hidden layers:9 | Nodes :10 each | Threshold:0.1 | | 93.9 |
| | Deep Learning | 10 | #of Hidden layers:12 | Nodes :10 each | Threshold:0.1 | | 98.24 |
| 5 | SVM | 10 | Kernel: radial | | | | 88.17 |
| | SVM | 10 | Kernel: | | | | 65.02 |

| | | | | | | | |
|----|------------------------|----|----------------------|---------------------|----------------------------|--|-------|
| | | | polynomial | | | | |
| | SVM | 10 | Kernel: sigmoid | | | | 66.34 |
| 6 | naïve Bayes | 10 | | | | | 96.3 |
| 7 | Logistic Regression | 10 | maxit=10 | trace= true | | | 96.75 |
| | Logistic Regression | 10 | | | | | |
| 8 | k-Nearest Neighbors | 10 | K = 2 | | | | 55.5 |
| | k-Nearest Neighbors | 10 | k=50 | | | | 63.6 |
| | k-Nearest Neighbors | 10 | k=300 | | | | 65 |
| 9 | Bagging | 10 | Nb bag: 0.1 | coob=true | | | 96.0 |
| | Bagging | 10 | Nb bag: 100 | coob=true | | | 96.3 |
| | Bagging | 10 | Nb bag: 100 | coob=false | | | 95.9 |
| 10 | Random Forests | 10 | Importance: true | Proximity: true | Ntree: 1 | | 94 |
| | Random Forests | 10 | Importance: false | Proximity: false | Ntree: 100 | | 96 |
| | Random Forests | 10 | Importance: true | Proximity: true | Ntree: 500 | | 97.3 |
| 11 | AdaBoost | 10 | Iter: 20 | Nu: 1 | | | 96.7 |
| | AdaBoost | 10 | Iter: 2 | Nu: 1 | | | 94 |
| | AdaBoost | 10 | Iter: 20 | Nu: 2 | | | 94.2 |
| 12 | Gradient Boosting | 10 | Minobsinnode: 1 | Trees: 1 | Distribution: gaussian | | 74.3 |
| | Gradient Boosting | 10 | Minobsinnode: 1 | Trees: 1 | Distribution: bernoulli | | 84.6 |

| | | | | | | | |
|--|-------------------|----|-----------------|------------|-------------------------|--|------|
| | Gradient Boosting | 10 | Minobsinnode: 1 | Trees: 100 | Distribution: bernoulli | | 71.3 |
|--|-------------------|----|-----------------|------------|-------------------------|--|------|

of instances in dataset: 699

of attributes in dataset: 10

10 fold cross-validation performed

IV.Results with best parameters:

| Classifier | Best Parameters | Accuracy | Precision |
|---------------------|--|----------|-----------|
| Decision Trees | maxDepth:30 Cp: 0.001 Minbucket: 1 Minsplit: 3 | 94.5 | 89.5 |
| Perceptron | Threshold:10 | 98.6 | 97.8 |
| Neural Net | #of Hidden layers:3 Nodes :(4,4,4) Threshold:1 | 98.1 | 98.2 |
| Deep Learning | #of Hidden layers:12 Nodes :10 each Threshold:0.1 | 98.24 | 97.9 |
| SVM | Kernel: radial | 88.17 | 169.2 |
| naïve Bayes | | 96.3 | 96.5 |
| Logistic Regression | maxit=10 trace= true | 96.75 | 95.6 |
| k-Nearest Neighbors | k=300 | 65 | 169.6 |
| Bagging | Nb bag: 100 coob=true | 96.3 | 179.12 |
| Random Forests | Importance: true Proximity: true Ntree: 500 | 97.3 | 96 |
| AdaBoost | Iter: 20 Nu: 1 | 96.7 | 96.9 |
| Gradient Boosting | Minobsinnode:1 Trees: 1 Distribution: bernoulli | 84.6 | 73.8 |

Analysis:

1. The algorithm working majorly depends on the data we select.
2. Perceptron and Neural Net gave the best results on the data where SVM, Gradient boost were not effective on this data.
3. Accuracy gave the best measure of the correctness. Though we were able to identify the precision of the classifier, it didn't give a clear picture of the correctness.
4. On contrary to theory, the number of nodes in the neural net or in deep learning did not change the accuracy too much as the data is scaled between 0&1 and weights were also very low.