

PROGRAMMING ASSIGNMENT 3 – CLASSIFICATION AND REGRESSION

***CSE 574
Fall 2021 - Introduction to
Machine Learning***

Group Number : 15

Submitted By :

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Binary Logistic Regression (BLR) :

| Type | Accuracy | Error |
|------------|----------|-------|
| Testing | 91.94% | 8.06% |
| Training | 92.66% | 7.34% |
| Validation | 91.46% | 8.54% |

These are the results after running Binary Logistic Regression on Testing, Training, Validation Data.

- We observe that the Training error is less than the Testing error.
- We can infer that this Linear model performs better on the seen data, but when it gets the unseen dataset it gives a little more error.

Multi-class Logistic Regression (MLR) :

| Type | Accuracy | Error |
|------------|----------|-------|
| Testing | 92.51% | 7.49% |
| Training | 93.17% | 6.83% |
| Validation | 92.46% | 7.54% |

These are the results after running Multi-class Logistic Regression on Testing, Training, Validation Data.

- We observe that the Training error is slightly less than the Testing error.
- We can infer that this Linear model performs better on the seen data, but when it gets the unseen dataset it gives a little more error.

Performance between MLR and BLR:

| Type | MLR | BLR |
|---------------------|--------|--------|
| Testing Accuracy | 92.51% | 91.94% |
| Training Accuracy | 93.17% | 92.66% |
| Validation Accuracy | 92.46% | 91.46% |

- In multiclass logistic regression we classify all the ten classes of MNIST dataset at once, whereas in BLR we only classify one class with respect to all other at a particular given time, so multiclass has less time complexity and has less chances of overlapping.
- It is observed the accuracy of the Multiclass was better than the BLR classification. That's because parameters are estimated independently in multiclass which helps to prevent wrong classification.

Support Vector Machine :

Linear Kernel :

| Type | Accuracy |
|------------|----------|
| Testing | 91.41% |
| Training | 92.37% |
| Validation | 91.49% |

So, we can infer from the above results that the Linear Kernel operates like a linear model, as the results are very similar to the previous linear model we trained.

Radial Basis Function :

1. RBF when Gamma = 1

| Type | Accuracy |
|------------|----------|
| Testing | 19.03% |
| Training | 100.0% |
| Validation | 17.96% |

This particular setting gives bad results on the test data as this high value of gamma helps in overfitting the training data and we can get that from the 100% Training accuracy.

2. RBF when setting Gamma to default :

| Type | Accuracy |
|------------|----------|
| Testing | 92.23% |
| Training | 92.04% |
| Validation | 91.97% |

This particular setting gives good results on the test data as the gamma is set to default.

3. RBF when Gamma is default but setting different values for C (C=1,10,20,30,40,50,60,70,80,90,100):

We iterate through the C values and record the optimum setting and then we test the entire data on that setting. This C variable controls the importance we are giving to the Slack variable.

Below are the results for Different Values of C on Testing, Training and Validation data:

| C | Testing Accuracy | Training Accuracy | Validation Accuracy |
|-----|------------------|-------------------|---------------------|
| 1 | 96.26% | 96.535% | 96.17% |
| 10 | 96.93% | 97.224% | 96.86% |
| 20 | 96.91% | 97.223% | 96.85% |
| 30 | 96.91% | 97.223% | 96.85% |
| 40 | 96.91% | 97.223% | 96.85% |
| 50 | 96.91% | 97.223% | 96.85% |
| 60 | 96.91% | 97.223% | 96.85% |
| 70 | 96.91% | 97.223% | 96.85% |
| 80 | 96.91% | 97.223% | 96.85% |
| 90 | 96.91% | 97.223% | 96.85% |
| 100 | 96.91% | 97.223% | 96.85% |

We can conclude that we get the best results when gamma is set to default and C =10.

| Kernel | C | Testing Accuracy | Training Accuracy | Validation Accuracy |
|----------------------------------|----|------------------|-------------------|---------------------|
| RBF (Gamma is set to default) | 10 | 97.23% | 97.421% | 96.89% |

Accuracy obtained on each of the training, testing and validation with different values of C is plotted below :

