Machine Learning: Assignment #2 Name:杨朔柳 Stu ID:21721078

1. A Walk Through Linear Models

(a) Perceptron

(i)

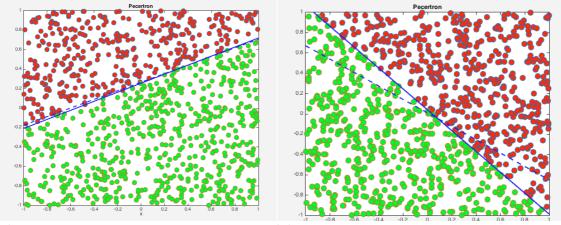
| | Train error | Test error |
|---------------------------|-------------|------------|
| nTrain= 10, nTest = 1000 | 0 | 0.111 |
| nTrain = 100 ,nTest =1000 | 0 | 0.014 |

(ii)

| | Average Iterations |
|--------------|--------------------|
| nTrain = 10 | 10 |
| nTrain = 100 | 452 |

(iii)

The algorithm won't stop.

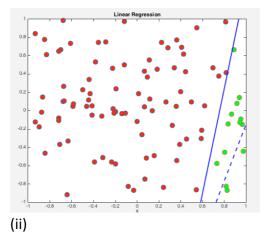


(1)100 train samples and 1000 test sample (2)10 train samples and 1000 test sample

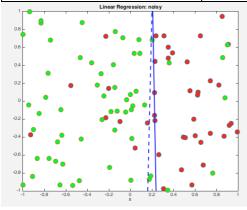
(b) Linear Regreesion

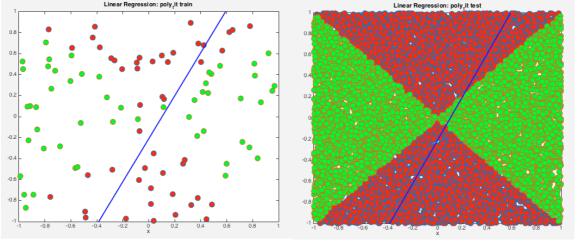
(i)

| | Test error |
|--------------------------|------------|
| nTrain = 100 nTest = 100 | 0.048 |



| | Training error | Test error |
|--------------------------|----------------|------------|
| nTrain = 100 nTest = 100 | 0.136 | 0.149 |



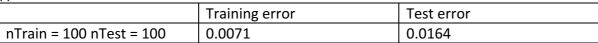


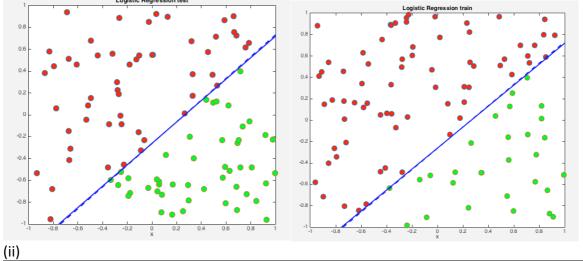
(iv)After trainsformation

| | Training error | Test error |
|-----------------------------|----------------|------------|
| nTrain = poly_train,nTest = | 0.05 | 0.066 |
| poly_tset | | |

(C)Logistic Regression

(i)



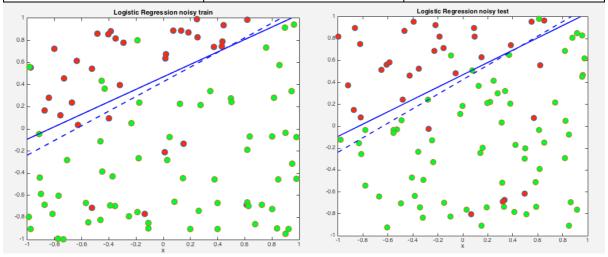


Training error Test error

nTrain = 100 nTest = 100

0.228

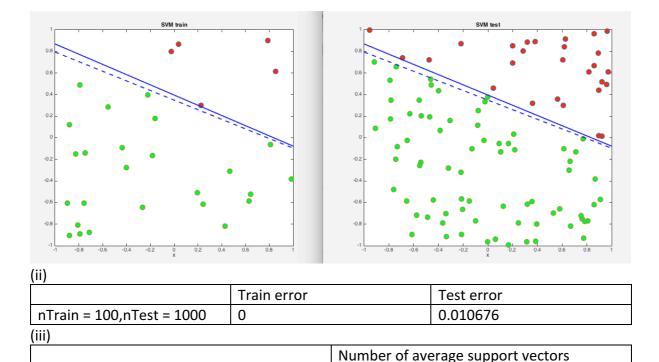
0.2464



(d)Support Vector Machine

(i)

| | Train error | Test error |
|--------------------------|-------------|------------|
| nTrain = 30 ,nTest = 100 | 0 | 0.03187 |



2. Regularization and Cross-Validation

(a)

(i)lambda = 100

```
(ii) | |w| | = 1.025064 when lambda = 0
```

nTrain = 100, nTest = 1000

In Ridge Regression, when lambda = 0.001000, $E_{val} = 106.723834$ wTw = 1.024248.

2.676

In Ridge Regression, when lambda = 0.010000, E_val = 106.602073 wTw = 1.022136.

In Ridge Regression, when lambda = 0.100000, E_val = 105.415992 wTw = 1.001634.

In Ridge Regression, when lambda = 0.000000, E_val = 106.737399 wTw = 1.024483.

In Ridge Regression, when lambda = 1.000000, E_val = 96.007857 wTw = 0.843664.

In Ridge Regression, when lambda = 10.000000, E_val = 66.866969 wTw = 0.407475. In Ridge Regression, when lambda = 100.000000, E_val = 46.491760 wTw = 0.133258.

In Ridge Regression, when lambda = 1000.000000, E_val = 63.829109 wTw = 0.033679.

Ridge Regression lambda chosed by LOOCV is 100.000000

when lambda = 0. wTw = 1.025604

(iii)

| <u>\'</u> ''') | | |
|-----------------------|-------------|------------|
| | Train error | Test error |
| Lambda = 100,nTrain = | 0 | 0.059 |
| 200,nTest = 1991 | | |
| Lambda = 0 nTrain = | 0 | 0.126067 |
| 200,nTest = 1991 | | |

(b)

| | Train error | Test error |
|-----------------------------------|-------------|------------|
| Lambda=0.01,nTrain=200,nTest=1991 | 0.025 | 0.1160 |
| Lambda=0,nTrain=200,nTest=1991 | 0.51 | 0.1145 |

Lambda = 0.01

```
In logistic Regression with Reg,when lambda = 0.001000, E_val = 20.000000 In logistic Regression with Reg,when lambda = 0.010000, E_val = 19.000000 In logistic Regression with Reg,when lambda = 0.100000, E_val = 21.000000 In logistic Regression with Reg,when lambda = 0.000000, E_val = 20.000000 In logistic Regression with Reg,when lambda = 1.000000, E_val = 21.000000 In logistic Regression with Reg,when lambda = 10.000000, E_val = 25.000000 In logistic Regression with Reg,when lambda = 100.000000, E_val = 84.000000 In logistic Regression with Reg,when lambda = 1000.000000, E_val = 107.000000 Logistic:lambda chosed by LOOCV is 0.010000
```

(best lambda floats among 0.01~0.0)

3. Bias Variance Trade-off

(a)

- (i) False. If adding more training example, the test error will decrease first and then increase.
- (ii)False. Model with high variance is overfitting. It works badly on test samples, which is more important for our task.
- (iii)True. Model with more parameters could be a very complicated, and it is more prone to overfitting
- (iv)False. Regularization is aim at working well on test dataset, not training dataset.
- (v)False. Large λ will lead to underfitting. On the contrary, Small λ will lead to overfitting, (vi)False. Too Small or too large λ won't benefit our model.