

EE5907 CA1 Programming Assignment

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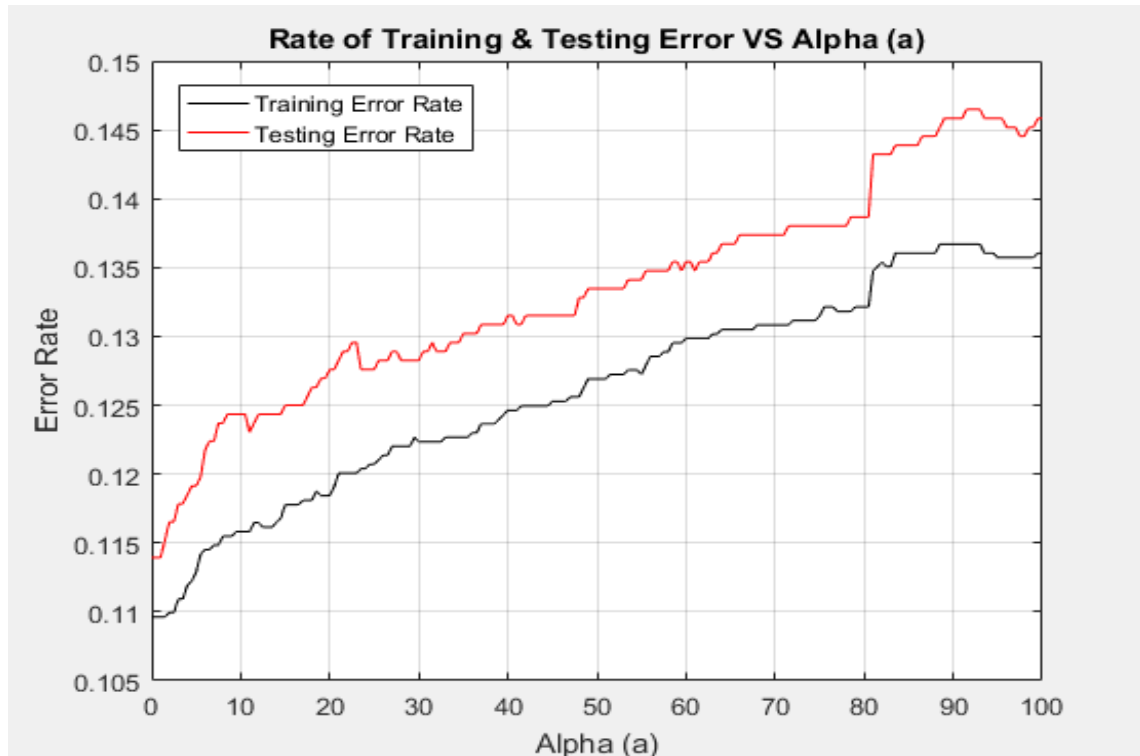
Matric Number: A0224460N

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Q1. Beta-binomial Naïve Bayes

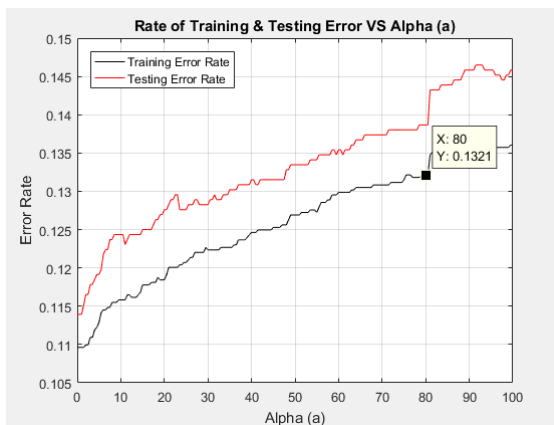
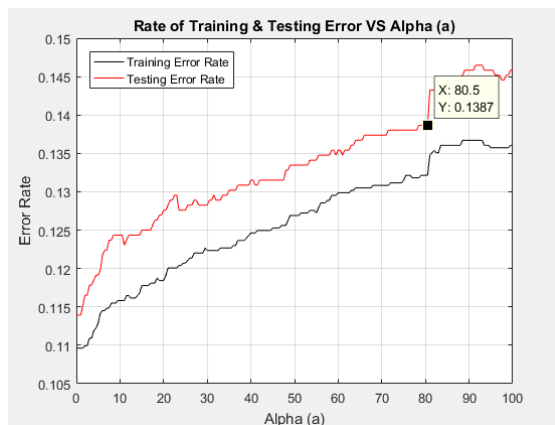
1 Plots of training and test error rates versus α .



2 What do you observe about the training and test errors as α change?

From the observation shown above, both the training and test error rates will increase proportionally to α at a similar trend.

Generally speaking, the testing error rate is higher than the training error rate. Both the training and test error rates fluctuate while increasing and increased sharply at the beginning from $\alpha = 0$ to $\alpha = 10$, as well as at $\alpha = 80$ (the screenshots for the coordinates are showing in the figures below). Therefore we can know if we have sufficient training, or whether we have chosen a suitable value of α to reduce the error rate by observing these trends.



3 Training and testing error rates for $\alpha = 1, 10, \text{ and } 100$.

α	Training Error Rate	Testing Error Rate
1	0.109625	0.113932
10	0.115824	0.124349
100	0.136052	0.145833

```
Command Window
New to MATLAB? See resources for Getting Started.

a= 1,   Traing Error Rate=10.9625 %, Test Error Rate=11.3932 %
a= 10,  Traing Error Rate=11.5824 %, Test Error Rate=12.4349 %
a= 100, Traing Error Rate=13.6052 %, Test Error Rate=14.5833 %
fx >>
```

Q2. Gaussian Naïve Bayes

1 Training and testing error rates for the log-transformed data.

	Training Error Rate	Testing Error Rate
Log Transformed Data	0.166721	0.183594

```
Command Window
New to MATLAB? See resources for Getting Started.

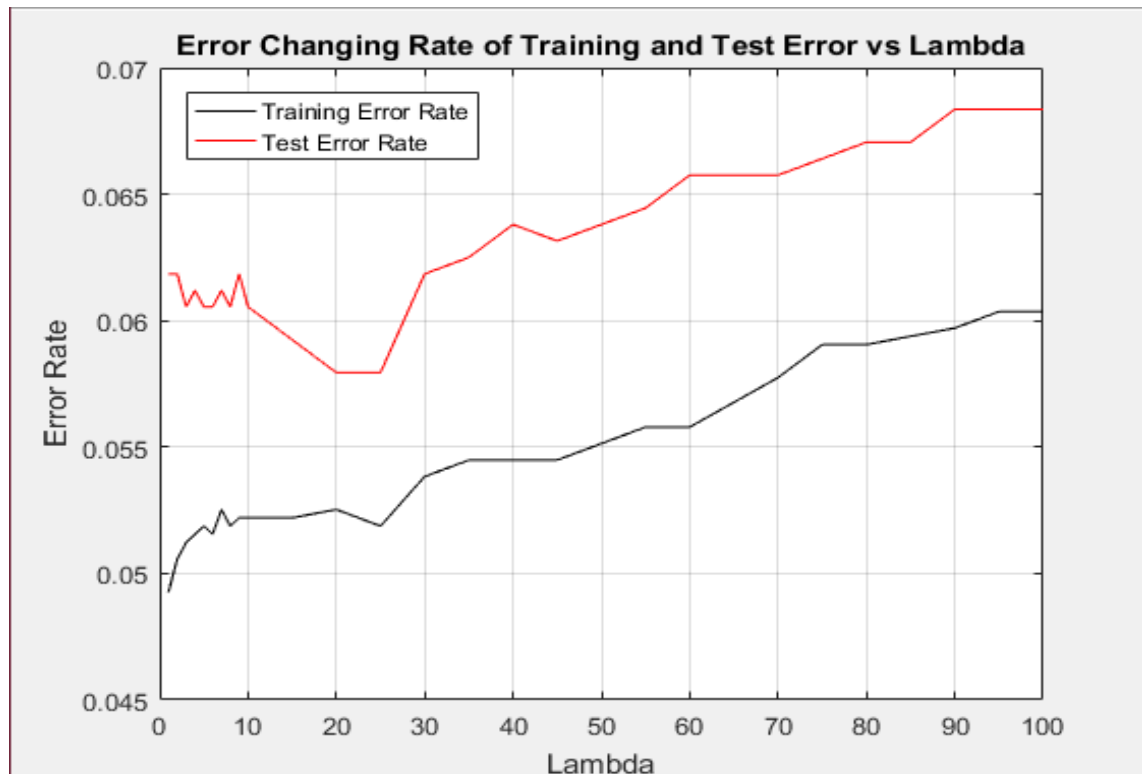
Traing Error Rate = 16.6721 %
Test Error Rate   = 18.3594 %
fx >>
```

From the observation of the error rate for the log-transformed data using the Gaussian Naïve Bayes classifier (training error rate = 16.67% and testing error rate = 18.36%) is higher than the result error rates from the beta-binomial Naïve Bayes classifier in the worst scenario (when $\alpha=100$, training error rate = 13.60% and testing error rate = 14.58%).

Therefore, by comparing questions one and two, we know that Beta-Binomial Naïve Bayes Classifier is better for this case.

Q3. Logistic Regression

1 The plot of training and test error rates versus λ

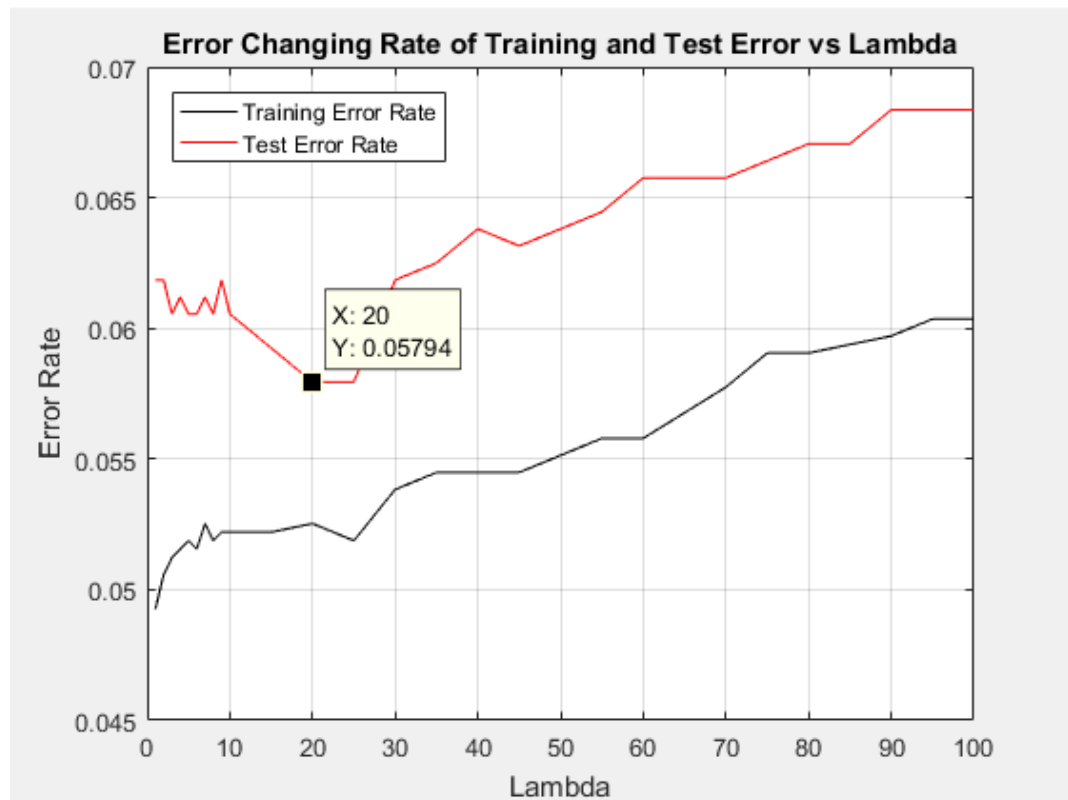


2 What do you observe about the training and test errors as λ change?

From the observation of the plot above, generally speaking, the error rate of test data is higher than the training data and both of them are remaining less than 7.00%.

While λ is increasing, the difference between Training and testing error rate forms 2 trends:

- 1) When $0 \leq \lambda \leq 20$ (coordinate is indicated in the plot below), the difference between training and the test error rate is gradually decreasing, the training error rate is increased proportionally to λ with fluctuation, while the testing error rate has a huge spike of fluctuation $\lambda \leq 10$, and then decreased proportionally to λ .
- 2) When $\lambda > 20$, the difference between training and the test error rate is roughly remaining as a constant, and both training and test error rates are increasing proportionally with λ with some small fluctuations.



3 Training and testing error rates for $\lambda = 1, 10$, and 100 .

λ	Training Error Rate	Testing Error Rate
1	0.049266	0.061849
10	0.052202	0.060547
100	0.060359	0.068359

```

Command Window
New to MATLAB? See resources for Getting Started.

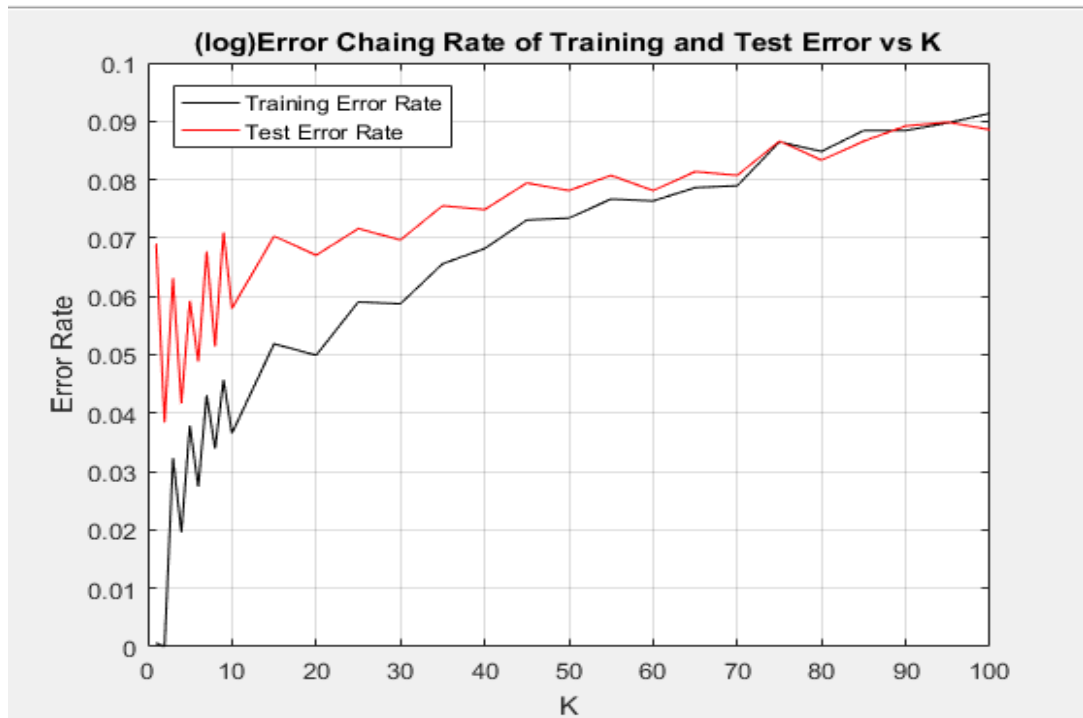
lamda= 1,   Traing Error Rate=4.9266 %, Test Error Rate=6.1849 %
lamda= 10,  Traing Error Rate=5.2202 %, Test Error Rate=6.0547 %
lamda= 100, Traing Error Rate=6.0359 %, Test Error Rate=6.8359 %

fx >>

```

Q4. K-Nearest Neighbours

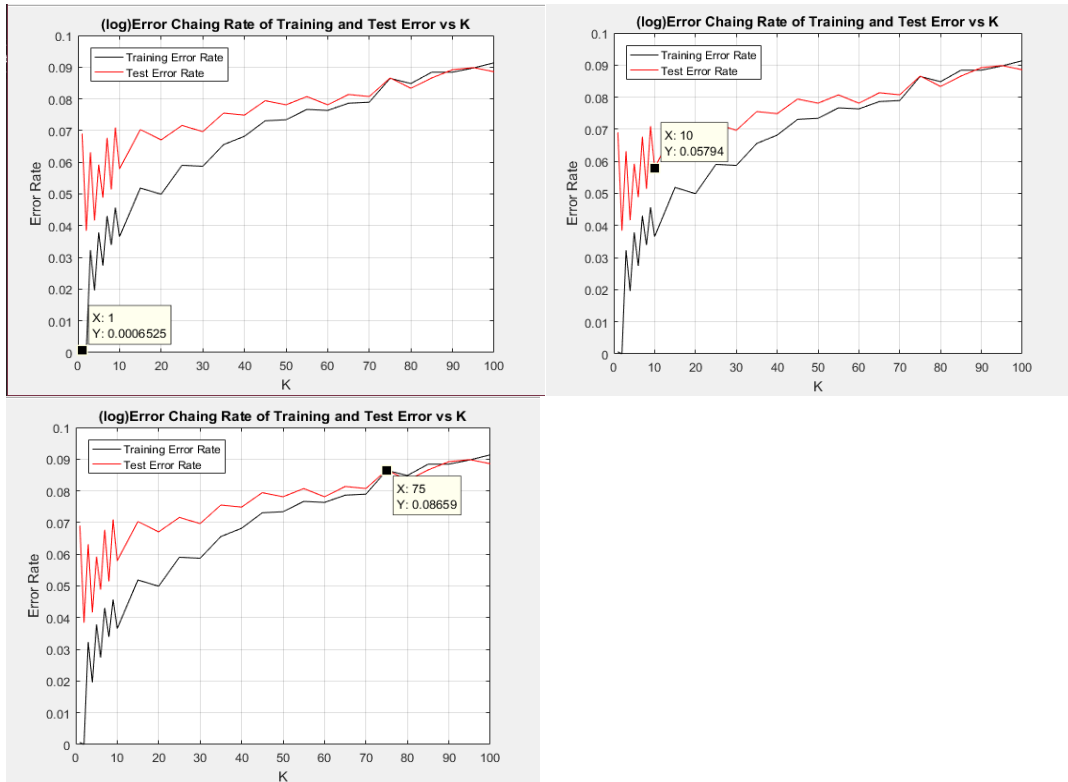
1 The plot of training and test error rates versus K



2 What do you observe about the training and test errors as K change?

As K increased from 1 to 100, the relationship between error rates and K can be categorized into 2 parts:

- 1) When $0 \leq K \leq 75$, Test Error Rate is always higher than the Training Error Rate, and they are gradually getting closer to each other while K increasing:
When $0 \leq K \leq 10$, both Training & Test error rates increased with huge spikes and fluctuations.
 - a. At $K=1$, the Training Error Rate is very low (1, 0.0006525) but not equal to 0. Because some samples have the same features distance=0 but from different classes.
 - b. When $K > 10$, the waveform became smoother and the difference between the error rate of Training and Test error reduced gradually until they cross with each other at $K = 75$.
- 2) When $k > 75$, the waveform is smoother and the error rate of Test data is smaller than the Training data.



3 Training and testing error rates for K = 1, 10, and 100.

K	Training Error Rate	Testing Error Rate
1	0.000653	0.069010
10	0.036542	0.057943
100	0.091354	0.088542

Command Window

New to MATLAB? See resources for [Getting Started](#).

```

K= 1,   Traing Error Rate=6.9010 %, Test Error Rate=6.9010 %
K= 10,  Traing Error Rate=5.7943 %, Test Error Rate=5.7943 %
K= 100, Traing Error Rate=8.8542 %, Test Error Rate=8.8542 %
fx >>

```

Q5. Survey

Time Spent

I am a part-time student, and I have spent 4 working-days on this assignment, spent 16 hours (around 4 hours per day) in total. Before doing the assignment, I also spent a few days revising the notes since I was not familiar with the formula and terms.

Feedback

This is my 1st semester in NUS, and I have only taken 2 modules, EE5907 & EE5902, where I can tell the difference between the teaching mode between 2 professors with no doubt. Frankly speaking, Prof. Thomas gave a clear explanation of the topics he covered, and he always encourages his students to ask questions and gave feedback during his class. I enjoyed his way of teaching and believe it could lead me to a better understanding of pattern recognition.