

# Homework 5.1

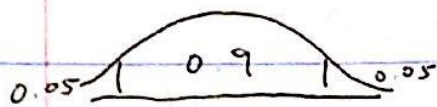
1) a)  $\bar{x} = 447$

$s^2 = 376.36$

$n = 300$

$\alpha = 10\%$

$z = 1.645$



$$ME = 1.645 \sqrt{\frac{376.36}{300}} = 1.8425$$

$(445.158, 448.842) \text{ seconds}$

b)  $z = 2.58$

$$ME = 2.58 \sqrt{\frac{376.36}{300}} = 2.885$$

$(444.1, 449.9) \text{ seconds}$

2) a)  $L(\theta) = \prod_{i=1}^n f(x_i | \theta) = \prod_{i=1}^n \lambda e^{-\lambda x_i}$

$$LL(\theta) = \sum_{i=1}^n \log(\lambda e^{-\lambda x_i})$$

$$= \sum_{i=1}^n \log \lambda - \lambda x_i$$

$$= n \log \lambda - \lambda \sum_{i=1}^n x_i$$

$$= n \log \lambda - \lambda Y$$

$$Y = \sum_{i=1}^n x_i$$

$$\frac{\partial LL(\lambda)}{\partial \lambda} = \frac{n}{\lambda} - Y = 0$$

$$\boxed{\lambda_{MLE} = \frac{n}{Y}} = \frac{n}{\sum_{i=1}^n X_i} = \frac{1}{\bar{X}}$$

b) Yes it is biased because the PDF for the exponential distribution is convex, so  $E[f(x)] \geq f(E[x])$  and the bias is not 0.

$$c) \lim_{n \rightarrow \infty} P(|\lambda_{MLE} - \lambda| < \varepsilon) = 1 \quad \text{for } \varepsilon > 0$$

$$= \lim_{n \rightarrow \infty} P\left(\left|\frac{1}{\bar{X}} - \lambda\right| < \varepsilon\right) = 1$$

Yes it is consistent because as  $n$  increases  $\bar{X}$  approaches  $\frac{1}{\lambda}$ .

3) If the value of  $X_i$  is known, the values for all other  $X$  are known as well. The  $X$  <sup>random variables</sup> ~~values~~ are not independent, so it is problematic for the model learned by the Naive Bayesian Classifier.

4. No Laplace Estimators  
Class 0: tested 2, correctly classified 2  
Class 1: tested 2, correctly classified 2  
Overall: tested 4, correctly classified 4  
Accuracy: 1.000000  
  
With Laplace Estimators  
Class 0: tested 2, correctly classified 2  
Class 1: tested 2, correctly classified 2  
Overall: tested 4, correctly classified 4  
Accuracy: 1.000000
5. No Laplace Estimators  
Class 0: tested 48, correctly classified 52  
Class 1: tested 76, correctly classified 83  
Overall: tested 124, correctly classified 135  
Accuracy: 0.918519  
  
With Laplace Estimators  
Class 0: tested 48, correctly classified 52  
Class 1: tested 76, correctly classified 83  
Overall: tested 124, correctly classified 135  
Accuracy: 0.918519
6. No Laplace Estimators  
Class 0: tested 10, correctly classified 15  
Class 1: tested 135, correctly classified 172  
Overall: tested 145, correctly classified 187  
Accuracy: 0.775401  
  
With Laplace Estimators  
Class 0: tested 10, correctly classified 15  
Class 1: tested 130, correctly classified 172  
Overall: tested 140, correctly classified 187  
Accuracy: 0.748663
7. Laplace Estimators did not change the accuracy of the vote data, but decreased the accuracy for the heart data. In general, Laplace Estimators improve accuracy when test data produce unrepresentative MLE estimates, such as an MLE estimate of 0 for an event that can actually occur. Otherwise, Laplace Estimators are not better than MLEs for classification accuracy.