

CSCI 59000 Machine Learning
Assignment 4
Due: 4/27/2017

1. (25 points) Circle True or False for the following statements. **Write one sentence justification for your answer.**

(True/False) For a SVM classifier with $C > 0$ a sample with the corresponding KKT multiplier equal to 0 indicates an unbounded support vector

(True/False) For a SVM classifier with $C > 0$, $yf(x) < 1$ implies x is a bounded support vector

(True/False) A polynomial kernel of degree p has a larger VC dimension than a linear kernel.

(True/False) When two classes are Normally-distributed with equal covariance matrices the resulting Bayes classifier can be expressed as a discriminant function.

(True/False) Reducing the bias of an estimator also reduces its variance.

(True/False) If two random variables are not correlated then they are independent.

(True/False) $\ln(x)$ is a convex function.

(True/False) In the EM algorithm the lower bound of the likelihood function is maximized at each iteration.

(True/False) Least square regression and Fisher's linear discriminant both use quadratic loss function.

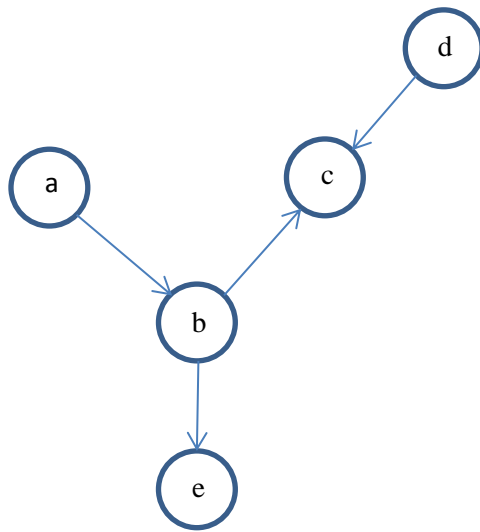
(True/False) The empty set is the smallest possible sigma field.

2. (25 points) Let class 1 and class 2 data be distributed according to mixture distributions $N(-2,2)$ and $N(2,2)$, respectively. Find the posterior probability $p(\text{class 1} | x=0)$, i.e. the probability that $x=0$ belongs to class 1, when the prior probabilities of class 1 and class 2 are as follows.

- a.) $P_1=0.5, P_2=0.5$
- b.) $P_1=0.8, P_2=0.2$
- c.) $P_1=0.2, P_2=0.8$

3. (25 points). Refer to the directed graph below for parts a through f.

- a) (4 points) Write $p(a,b,c,d,e)$ in terms of the conditional and prior probabilities of each node.
- b) (2 points) (True,False) a is independent of c
- c) (2 points) (True,False) a is independent of d
- d) (2 points) (True,False) c is independent of e
- e) (5 points) Convert this graph to a factor graph.
- f) (8 points) Describe a message passing algorithm to compute $p(b)$.
- g) (2 points) (Tue, False) Is message passing possible for graphs with loops? Justify your answer with a sentence or two.



4. Given the vocabulary={the, machine, learning, qualifier, exam, I, will, pass, fail, is, easy, hard} and the following topics defined over this vocabulary:

Topic1 $\sim \text{Mult}(\mu_1)$

Topic2 $\sim \text{Mult}(\mu_2)$

Topic3 $\sim \text{Mult}(\mu_3)$

Topic4 $\sim \text{Mult}(\mu_4)$

where μ_i 's are as follows

| | the | machine | learning | qualifier | exam | I | will | pass | fail | is | easy | hard |
|---------|-----|---------|----------|-----------|------|------|------|------|------|-----|------|------|
| μ_1 | 0.2 | 0.2 | 0.2 | 0.2 | 0.2 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| μ_2 | 0 | 0 | 0 | 0 | 0 | 0.25 | 0.25 | 0 | 0 | 0.5 | 0 | 0 |
| μ_3 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.7 | | 0 | 0.3 | 0 |
| μ_4 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.3 | 0 | 0 | 0.7 |

We generate a phrase with 7 words using the topic proportion vector $\beta=[0.5 \ 0.2 \ 0.2 \ 0.1]$.

Rank the following phrases from most likely (1) to least likely (5) to be generated by this generative model. Justify your rationale for ranking the phrases.

Phrase 1: the machine learning qualifier exam is easy

Phrase 2: the machine learning qualifier exam is hard

Phrase 3: I will pass machine learning qualifier exam

Phrase 4: I will fail machine learning qualifier exam

Phrase 5: the exam is hard I will pass