

## Midterm Examination

Professor Paul Fieguth

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Time: 75 Minutes

Grading: The exam is out of 40. The grade breakdown is shown in the margins.

Aids Permitted: *One* 8.5x11" page, *No* calculator.

Advice: Read problems carefully before jumping in to calculations.  
Well-drawn sketches / diagrams can be very helpful.  
If you can't answer a question, you *will* receive part marks for relevant statements, insights, or sketches. Tell me what you know!  
Avoid long / verbose answers; be succinct.

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Bonus Question

Do **NOT** waste your time here unless you're finished with the exam ...

Suppose we take a regular coin and flip it  $\infty$  times.

What is the probability that  $10^6$  heads appear in a row?

What is the probability that, in the whole sequence,  $10^6$  heads appear in a row an infinite number of times?

### Question 1.

Give answers to each of the following; note that each part of the question is independent of the other parts.

- a) Draw a sketch showing the unit standard-deviation shape for the following two clusters:

$$\underline{\mu}_1 = \begin{bmatrix} 0 \\ -2 \end{bmatrix} \quad \Sigma_1 = \begin{bmatrix} 3 & -2 \\ -2 & 3 \end{bmatrix} \quad \underline{\mu}_2 = \begin{bmatrix} 2 \\ 2 \end{bmatrix} \quad \Sigma_2 = \begin{bmatrix} 4 & 0 \\ 0 & 2 \end{bmatrix}$$

- b) Suppose we have a cluster in *three* dimensions:

$$\underline{x} = \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} \quad \underline{\mu}_x = \begin{bmatrix} 1 \\ 0 \\ -1 \end{bmatrix} \quad \Sigma_x = \begin{bmatrix} 3 & 1 & 1 \\ 1 & 5 & -3 \\ 1 & -3 & 4 \end{bmatrix}$$

Clearly we can't sketch the three-dimensional shape, however we *do* know how to sketch in two dimensions. Sketch the shape of the cluster in the two-dimensional feature space  $(x_1, x_3)$ .

- c) In the classroom and in the lab we have generally stuck to one- and two-dimensional problems. *Briefly*, what are some of the challenges associated with applying Pattern Recognition to high-dimensional problems?

- d) State Bayes' rule (there are many ways of writing it, just give me one).

Why is Bayes' rule so important in Pattern Rec? That is, what role does it play? *Be brief!*

- e) A substantial, current socio-environmental problem is urban sprawl. One of the biggest problems is even knowing *how much* sprawl has taken place.

There has recently been some interest in quantifying sprawl based on satellite measurements. What sorts of features might a satellite be able to measure that would allow you to set up a Pattern Recognition problem to discriminate between the classes  $C_{city}$  and  $C_{country}$ ?

Keep your answer brief.

## Question 2.

Human neurons communicate by firing electric signals repeatedly over time. For certain neurons the time  $x$  between successive firings is exponential:

$$p(x|C_1) = \begin{cases} e^{-x} & x \geq 0 \\ 0 & x < 0 \end{cases}$$

In other nerve cells, there is a certain recovery time which is required before the cell can fire again, so the time interval is delayed:

$$p(x|C_2) = \begin{cases} 2e^{-2(x-1)} & x \geq 1 \\ 0 & x < 1 \end{cases}$$

We can try to classify a neuron into one of these two classes by measuring the inter-firing time  $x$ . *Unless otherwise stated*, assume that the two types of neurons are equally likely:

$$P(C_1) = P(C_2) = 0.5.$$

- a) Draw a sketch of the two classes.
- b) Find the mean and variance for each of the two classes.
- c) Write down the MAP classifier *as a function of*  $P(C_1)$ .
- d) Find the MED and MICD classifiers.
- e) Assume that the two classes are equally likely. Find expressions for the probabilities of error  $P_{MED}(\epsilon)$  and  $P_{MAP}(\epsilon)$ . Which error is smaller?
- f) Carefully redraw your sketch from (a), but now on your sketch compare  $P_{MED}(\epsilon)$ ,  $P_{MICD}(\epsilon)$ , and  $P_{MAP}(\epsilon)$ . If you prefer, you may find it neater to draw three separate sketches – your choice.

Based on your sketch, approximately how similar or different are the performances of the three classifiers?