## ECE 695C, Midterm #1

6:30-7:30pm Tuesday, September 29, 2009, ME 312,

- 1. Enter your name, student ID number, e-mail address, and signature in the space provided on this page, **NOW!**
- 2. This is a closed book exam.
- 3. Some time-consuming and bonus questions are assigned a small number of points. Make sure you manage your time well during the exam.
- 4. There are 4 questions and 12 pages in the exam booklet. Use the back of each page for rough work.
- 5. Neither calculators nor help sheets are allowed.

| Name:       |  |  |
|-------------|--|--|
| Student ID: |  |  |
| E-mail:     |  |  |
| Signature:  |  |  |

## *Question 1:* [20%]

Consider a hypothesis testing problem with observation Y:

 $H_0$ : Y is of distribution  $P_Y \sim e^{-2|y-1|}$ , and  $H_1$ : Y is of distribution  $Q_Y \sim e^{-\pi(y+1)^2}$ .

- 1. [6%] Write down the Maximum Likelihood (ML) detector in the form of a loglikelihood-ratio test.
- 2. [6%] Find out the decisions for different observations  $Y=0.5,\ Y=-0.5,\ {\rm and}$ Y = -3, respectively.
- 3. [8%] Prove that the ML detector minimizes the summation of the false-alarm and the misdection probabilities.

Question 2: [30%] Consider a binary code of the following 1 by N parity-check matrix

$$H = (1 \ 1 \ 1 \ 1 \ \cdots \ 1). \tag{1}$$

Suppose we pass this code through an i.i.d. binary-input/ternary-output channel with a parameter  $\epsilon \in [0, 1]$ . Namely, for each  $X = x, x \in \{0, 1\}$ , we have

$$P(Y = y | X = x) = \begin{cases} 1 - \epsilon & \text{if } y = (-1)^x \\ \epsilon & \text{if } y = 0 \\ 0 & \text{if } y = (-1)^{x+1} \end{cases}$$
 (2)

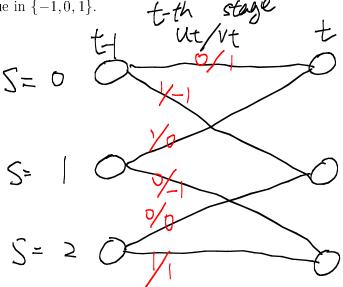
- 1. [3%] What is the code rate of this code.
- 2. [8%] Suppose the received output is  $\overrightarrow{y} = y_1 y_2 y_3 \cdots y_N$  where each  $y_i$  takes value in  $\{-1,0,1\}$ . Plot the factor graph representation of the joint probability  $P_{\overrightarrow{X}\overrightarrow{Y}}(\overrightarrow{x},\overrightarrow{y})$ , assuming each valid codeword is equally likely to be chosen. Please explicitly describe the factor functions used in your factor graph representation.
- 3. [8%] Use the BCJR decoder on this factor graph to find the Maximum A posteriori Probability (MAP) decision of the third bit  $x_3$ , assuming the observation is  $\overrightarrow{y} = -1, 1, 0, -1, 1, 1, 1, -1$  with N = 8. Please write down all the forward (and feedback) metrics  $a_{X_i}(x_i)$  (and  $b_{X_j}(x_j)$ ) in the following form

$$a_{X_i}(x_i) = \begin{cases} \cdots & \text{if } x = \cdots \\ \cdots & \text{if } x = \cdots \end{cases}$$
 (3)

And write down the decision rule in the final stage.

- 4. [5%] Repeat the above question for general  $\overrightarrow{y} = y_1 y_2 y_3 \cdots y_N$ . For this sub-question, there is no need to write down the detailed derivation of the state metrics. A final result in terms of the observation  $y_1 y_2 y_3 \cdots y_N$  would be sufficient.
  - Note: when there is a tie between the computed posterior probabilities, please declare  $x_3$  as "uncertain" rather than choose it to be 0 or 1.
- 5. [6%] Suppose the all-zero codeword  $\overrightarrow{x} = 0, 0, 0, 0, \cdots, 0$  was transmitted. Find the closed-form expression of the probability that the third bit  $x_3$  is declared as "uncertain". Your answer should be in terms of  $\epsilon$  and N.

Question 3: [35%] Consider the following trellis structure with three states, which takes an input of T binary bits  $u_1u_2\cdots u_T$  to an output of T real numbers  $v_1v_2\cdots v_T$ . Each  $v_i$ takes value in  $\{-1,0,1\}$ .



We thus have  $2^T$  different valid codewords. A popular application of trellis codes is "trellis quantization." That is, a trellis quantizer takes as input any T-dimensional real vector  $\overrightarrow{x} = (x_1, x_2, \dots, x_T)$  and outputs a binary string  $\hat{\overrightarrow{u}} = (\hat{u}_1, \hat{u}_2, \dots, \hat{u}_T)$  such that among all  $2^T$  valid trellis codewords, the  $\hat{\overrightarrow{v}}$  real vector corresponding to  $\hat{\overrightarrow{u}}$  is the one that is the closest to  $\overrightarrow{x}$  in terms of the Euclidean distance  $\sqrt{\sum_{i=1}^{T}(x_i-v_i)^2}$ . Describe how to implement such trellis quantization by describing the following three

steps of your iterative trellis quantizers:

- For the t-th stage, write down the path-metric assignment for the six branches in the trellis when the input is  $x_t$ .
- Describe the update rules of your trellis quantizer.
- Describe carefully the final decision rule of your trellis quantizer.

Question 4: [15% + bonus 10%] The description of this problem is very long but the questions are actually much simpler.

Consider the following communication scheme over a binary symmetric channel with cross-over probability p. Namely, for any time slot t, the transmitter can remain silent  $x_t = 0$  or transmit a bit  $x_t = 1$ . When transmitting a zero (remaining silent), the transmitter uses no power (cost = 0). When transmitting a one, the transmitter uses power 1 (cost = 1). There are totally T slots available.

Suppose we use  $H_2(p)$  to denote the binary entropy function

$$H_2(p) \stackrel{\Delta}{=} -p \log_2(p) - (1-p) \log_2(1-p).$$
 (4)

The maximum number of bits one can transmit over this channel is  $T(I(X;Y)) = T(1 - H_2(p))$ , which requires P(X=0) = P(X=1) = 1/2. The total cost for the transmission is thus T/2. The data rate per cost is thus  $\frac{T(1-H_2(p))}{T/2} = 2(1-H_2(p))$ . On the other hand, we can choose non-uniform prior distribution P(X=0) = 1 - w and P(X=1) = w instead. One can show that with the non-uniform prior distribution the achievable rate per unit cost is

$$\frac{H_2(w+p-2pw)-H_2(p)}{w}.$$

By some simple calculus, one can show that

$$\max_{w \in [0,1]} \frac{H_2(w+p-2pw) - H_2(p)}{w} = D(P_1||P_0), \tag{5}$$

where the two distributions  $P_1$  and  $P_0$  are

$$P_{1}(y) = P_{Y|X}(y|x=1) = \begin{cases} p & \text{if } y=0\\ (1-p) & \text{if } y=1 \end{cases},$$

$$P_{0}(y) = P_{Y|X}(y|x=0) = \begin{cases} (1-p) & \text{if } y=0\\ p & \text{if } y=1 \end{cases}$$
(6)

Namely, the maximum achievable capacity per unit cost (ACPUC) is  $D(P_1||P_0)$  with  $p^* = 0$ .

Question: Consider the following code construction that achieves this optimal rate per unit cost and answer the following subquestions.

Our construction has M+1 valid codewords. We first divide the T bits into M different sub-periods, each period has T/M bits. The zero-th codeword  $\overrightarrow{x}_0 = 00 \cdots 0$  contains T zeros. The second codeword is  $\overrightarrow{x}_0 = \underbrace{11 \cdots 1}_{T/M \text{ bits } (M-1)T/M \text{ bits}} \underbrace{00000 \cdots 0}_{T/M \text{ bits}}$ . Namely, the first sub-period is

all one and the remaining bits are all zero. Similarly, the *i*-th codeword  $\overrightarrow{x}_i$ ,  $i=2,\cdots,M$ has the i-th subperiod being all one while the remaining subperiods being all zero.

For example, if T=6 and M=3, the four valid codewords are:  $\overrightarrow{x}_0=000000$ ,  $\overrightarrow{x}_1 = 110000, \ \overrightarrow{x}_2 = 001100, \ \text{and} \ \overrightarrow{x}_3 = 000011.$  We choose the M value satisfying  $M+1=2^{\frac{T}{M}\cdot(D(P_1||P_0)-\delta)}$  for some small  $\delta>0$ 

- 1. [3%] With  $M+1=2^{\frac{T}{M}\cdot(D(P_1||P_0)-\delta)}$ , how many bits can we transmit using this scheme?
- 2. [3%] With the above construction, in average, how much cost is it to transmit a codeword?
- 3. [2%] What is the rate per unit cost of the above scheme.
- 4. [7% + bonus 10% = 17%] The remaining question is whether the receiver can successfully distinguish among the M+1 different codewords  $\overrightarrow{x}_i$ ,  $i=0,\cdots,M$  based on the noisy observation over the binary symmetric channel. Explain in words (or prove that) why using the above scheme the receiver can indeed successfully distinguish among M+1 different codewords  $\overrightarrow{x}_i$ ,  $i=0,\cdots,M$  when T is sufficiently large.
  - Hint 1: Quantify the probability that the  $\overrightarrow{x}_0$  being misdetected as  $\overrightarrow{x}_i$  for some  $i \neq 0$ .
  - Hint 2: Design a decoder that looks at each of the M subperiods individually first and then make a decision by jointly considering all M subperiods together.