

# Assignment 2

36-462, Spring 2008

Due 29 February 2008

You can either do questions 4 and 5, or question 6. If you want to do all three, 6 will be extra credit.

When a problem asks you to do a simulation or write a program, include your code in your answer.

## 1. BASIC PROPERTIES OF ENTROPY

- (a) Prove that the entropy of a random variable is non-negative.
- (b) If the number of values  $X$  can take on is  $m$ , prove that  $H[X] \leq \log_2 m$ , and the maximum is attained just when every possibility is equally likely. (*Hint*: One way to do this is to express the probabilities as  $p_i = \frac{1}{m} + \delta_i$ , and use the fact that the sum of the  $p_i$  must be one.)

## 2. THE $r = 1$ LOGISTIC MAP AS IID COIN-TOSSING

Write a program to simulate the symbolic dynamics of the logistic map with  $r = 1$ . Tabulate the frequencies of sub-sequences of length  $2L$ . Test whether  $X_t^{t+L-1}$  is independent of  $X_{t-L}^{t-1}$ . Explain how you decided how long the simulation should be.

## 3. TOPOLOGICAL ENTROPY RATE ESTIMATION

- (a) Write a program to calculate the topological entropy rate for the logistic map at any  $r$ .
- (b) How would you put a standard error on your estimate of  $h_0$ ?

## 4. MARKOV CHAIN ESTIMATION

- (a) Write a program (`markov.mle.1`) to estimate the transition matrix of a binary-valued Markov chain by maximum likelihood.
- (b) Write a program (`markov.mle.k`) to estimate the transition matrix of a Markov chain of order  $k$ .
- (c) Write a program (`markov.mle.bic`) which uses BIC to select a  $k$  between 1 and  $k_{\max}$ . Your program should output the estimated  $k$  as well as the transition matrix.

5. CHAIN ESTIMATION, CONTINUED

- (a) Write a program to simulate the Foulkes process (lecture 6) for an arbitrary number of time-steps.
- (b) Use the output of this simulation as input to your `markov.mle.bic` program. How many time-steps must you use before the estimate  $k$  becomes 4? How many before all the transition probabilities are within 0.05 of the true probabilities?

6. JANET (extra credit; worth as much as previous two problems combined)

- (a) Read Foulkes's paper (on syllabus page, under lecture 6).
- (b) Write an implementation of JANET.
- (c) Show that your program reproduces Foulkes's results. If you cannot reproduce his results, how do you explain the differences?