## Information Theory: From Statistical Physics to Quantitative Biology

3. exercise class – 19. November 2008

## 1. Coding in the presence of costs

Frequent occurrence is one reason linked with *short code* words in natural languages ("the", "a", "is"). However, in the case of words like "help!", "fire!", etc., the reason for their shortness is not that these words are frequently used. Instead, in the cases where they are used, time is precious.

Consider a random variable X = i with probabilities  $p_i$ , i = 1, ..., m. Let  $l_i$  be the number of binary symbols in the codeword for i, and let  $c_i$  be the cost per binary letter of the codeword. The average cost C of the code is  $\sum_i p_i c_i l_i$ .

Minimize C over all  $l_i$  subject to the constraint given by the Kraft inequality. Compute the minimum value of C. (Constraints due to the integer nature of  $l_i$  can be ignored.)

## 2. Lempel-Ziv coding

Give the Lempel-Ziv coding of 00000011010100000110101.