## **T-61.231 Principles of Pattern Recognition** Exercise 10: 2.12.2002

1. Consider the following proximity matrix:

	0	4	9	6	5	
	4	0	1	8	7	
P =	9	1	0	3	2	
	6	8	3	0	1	
	5	7	2	1	0	

Apply the single and complete link algorithms to P and comment on the resulting dendreograms. (*Theodoridis, exercise 13.10, p. 437*)

- 2. The C-means clustering algorithm (or the LBG coding algorithm) can be used for the coding of images. What is the compression ratio if windows of  $(k \times k)$  pixels sampled from a colored image (8 bits/color, 3 colors) are coded using  $2^n$  code vectors.
- 3. Let us consider 1-dimensional self-organizing map (SOM), where both weights of neurons  $m_i$  and input vectors x are always in the unit circle. That means they are angles between  $[0, 2\pi]$ . There are 5 weights and their locations in the beginning of the learning are shown in Figure 1.



Figure 1:

Learning rule (Kohonen's rule):

- 1. Choose point x arbitrarily from the unit circle.
- 2. Find among 5 weights the Best Matching Unit (BMU)  $m_c$  whose distance (angle) from the point x is the smallest.
- 3. Update the weight  $m_c$  and its 2 nearest neighbors. Neighborhood is defined so that e.g. neighbors of  $m_3$  are always (independent from the location)  $m_2$  and  $m_4$ . Neighborhood is cyclical: neighbors of  $m_5$  are  $m_4$  and  $m_1$ , and similarly neighbors of  $m_1$ are  $m_5$  and  $m_2$ . Weights are updated so that they are moved along the shortest route to the point in the middle of the input x and their current location.

The problem is: you have to arrange the weights into the ascending or descending order in the unit circle by using the learning rule given above. You may choose inputs x arbitrarily. Try to minimize the number of learning steps.

(Hint: minimum solution has 2 steps, that means only 2 inputs x have to be chosen. Can you find out how?)

4. Assume the energy function

$$C = \sum_{q} \sum_{r} h(r-q) \sum_{x \in V_r} \|x - m_q\|^2$$

where r and q are map indices,  $m_q$  are neuron weights, h(r-q) is the space invariant neighborhood function, and  $V_r$  is the set of input points for which neuron r is the bestmatching unit. It can be shown that this is an energy function for the Kohonen algorithm if the set of input points is finite.

a) Form the gradient of function C with respect to the weight vector  $m_q$  and let it be zero. This defines an equilibrium point for the net.

b) If we assume that all the sets  $V_r$  have an equal amount of N points, and the average of set  $V_r$  is denoted as

$$c_r = 1/N \sum_{x \in V_r} x,$$

show that in the equilibrium point defined by a) it holds

$$m_q = \sum_r h(q-r)c_r.$$

5. LVQ1-algorithm is applied for one-dimensional task in which the inputs are from two classes. The prior probabilities of the classes are equal. The value of input x is zero or one if it belongs to class  $\omega_1$  or  $\omega_2$ , respectively. Each class is presented with a single weight,  $w_1$  or  $w_2$ . Where do the weights converge? Consider different initial values for the weights.