Benjamin Grewe, Matthew Cook, Giacomo Indiveri, Daniel Kiper, Wolfger von der Behrens, Valerio Mante Lecture 13

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## Exercise 13.1: Population Codes

- 1. a = r + e
- 2. See fig. 1. In a population, neurons usually do not only respond to their preferred stimulus, but also with decaying strength to close ones. Therefore, not only exactly one neuron gets stimulated, but several, with a peak in activity at the actual stimulus.

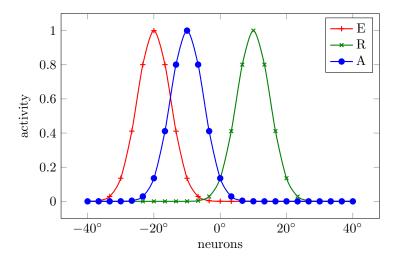


Figure 1: Activity of the input populations E, R, and A

3. We want the system to infer the value of a given the values of e and r, i.e., we want to implement a two-dimensional function. Since we have a two-dimensional layer of neurons (the intermediate layer I) we can use it to hard-wire this function. For that, we give each neuron a meaning based on its position in the layer: the x-coordinate encodes the values of e from  $-40^{\circ}$  to  $40^{\circ}$  and the e-coordinate the values of e from e-40° to e-40°. Now, we set up the connections to the input populations. Each neuron in e-10 represents one possible value of e. We connect it to all neurons in e-11. The weight of the connection is chosen to be high if the difference between e-12 and the encoded e-13 value of the neuron in e-13 is small. The same is done for the population e-13 and values e-15 and e-16 representing a value e-16 is connected in a similar fashion to all neurons in e-17 who's e-18 and e-18 values add up to e-19 and e-19 is connected in a similar fashion to all neurons in e-19 is e-19 in e-19 in

Now, whenever a neuron is active in one of the populations E, R, or A, a whole line of neurons will be active in I: for E and R these lines will be axis-parallel and for A the line will be a diagonal.

If only input e and r is provided to the system, the highest activity in I will be where both lines meet. This in turn activates the corresponding neurons in A, with a peak at a = r + e. In the cited paper, this is calles 'function approximation'.

- 4. See fig. 2. As explained above, the input creates a peak of activity in the intermediate layer I where the two lines are meeting. The resulting activation of neurons in A also activates neurons in I on the diagonal.
- 5. Not only a, the relative position of the object to your head, is changing, but also r, the retinal position of the object. In the activity pattern of fig. 2 we would observe that the point of peak activity would move in the direction of the r-axis towards  $r = -20^{\circ}$ . The diagonal and the line caused by R in the activity pattern would move such that the point of peak activity remains their point of intersection.
- 6. See fig. 3. The recordings correspond to a cut through the activity pattern in fig. 2.
- 7. It is possible by following the same procedure as described above. In fact, any function can be implemented since the intermediate layer serves as a lookup table for the results.

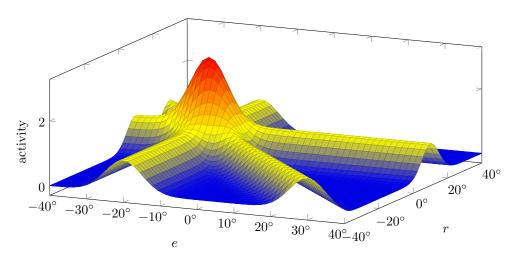


Figure 2: Activity profile of the intermediate layer I when receiving input from E and R.

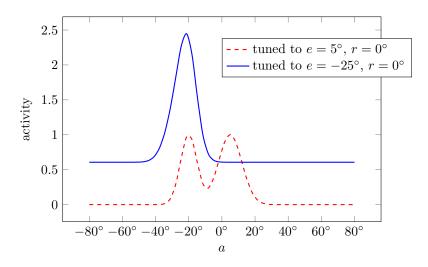


Figure 3: Activity of two neurons in I as the object is moving from  $-80^{\circ}$  to  $80^{\circ}$ .