UNIVERSITY OF BRISTOL

August / September 2019 Examination Period

FACULTY OF ENGINEERING

Third Year / M Level Examination for the Degree of Bachelor of Science / Master of Engineering / Masters of Science

COMS 30127-R / COMSM 2127-R Computational Neuroscience

TIME ALLOWED: 2 hours

This paper contains *two* parts.

The first section contains *15* short questions.

Each question is worth *two marks* and all should be attempted.

The second section contains *three* long questions.

Each long question is worth *20 marks*.

The best *two* long question answers will be used for assessment.

The maximum for this paper is *70 marks*.

Other Instructions:

Calculators must have the Faculty of Engineering Seal of Approval.

TURN OVER ONLY WHEN TOLD TO START WRITING

Section A: short questions - answer all questions

Q1. This is a picture of Tan's brain showing a lesion to Broca's area. What were the consequences of this lesion to Tan.

A very old looking photograph of a brain, it has a rough hole about where your temple is.

- **Q2**. What are the advantages and disadvantages of Electroencephalography (EEG) as a tool to study neuroscience.
- **Q3**. The Euler approximation used to solve differential equations has errors of order $O(\delta t^2)$, where δt is the time step; why is that?
- **Q4**. The differential equation

$$\tau \frac{df}{dt} = c - f$$

with c a constant is in equilibrium at f = c; without solving the differential equation describe how we know the equilibrium is stable.

- **Q5**. Some models of single neurons are simpler than others (for example McCulloch-Pitts versus Hodgkin-Huxley). Name two benefits that simple neuron models have compared with more detailed neuron models.
- **Q6**. Which subregion of the hippocampus is thought to perform pattern completion? And which other subregion of the hippocampus is thought to be crucial for pattern separation?
- **Q7**. Give the expression for the energy of a Hopfield network as a function of its activity state and synaptic weights. How does the energy relate to pattern completion?
- **Q8**. What is an attractor network?

Q9. The receptive field of neurons in primary visual cortex can often be approximated by a Gabor function (see picture). What feature of visual scenes would a neuron with this receptive field be sensitive to?

A bright oval, running from SW to NE, is flanked by two darker ovals

- **Q10**. Draw the typical f-l curve for a leaky integrate-and-fire neuron model.
- **Q11**. What are the two main timescales of synaptic plasticity? Give the respective timescales at which each type of plasticity operates.
- **Q12**. Draw the basic pair-wise STDP learning curve, with the respective axes.
- **Q13**. Briefly describe the phenomenon of memory savings and its synaptic theory.
- **Q14**. Name an ion which is found in greater concentration outside a neuron than inside.
- **Q15**. According to the Hodgkin-Huxley equation the conductance of the potassium gate is proportional to n^4 . Give the differential equation that describes how n evolves.

Section B: long questions - answer two questions

- **Q1**. This question is about mathematics.
 - (a) Show that the solution to the differential equation

$$\tau \frac{df}{dt} = g(t) - f$$

is

$$f(t) = \frac{1}{\tau} e^{-t/\tau} \int_0^t e^{s/\tau} g(s) ds + f(0) e^{-t/\tau}$$

[4 marks]

- (b) Explain how this solution can be described as a filter of the input g(t) and what this tells us about f(t). [4 marks]
- (c) If

$$g(t) = e^{-t/\tau}$$

what is the solution?

[4 marks]

(d) Solve the differential equation for g(t) = c a constant.

- [4 marks]
- (e) If c = 1 and f(0) = -1 write an expression for the time until f = 0.

[4 marks]

- **Q2**. This question is about Perceptrons.
 - (a) The Perceptron can be considered as a linear classifier. Describe what this means. [3 marks]
 - (b) Draw some example datapoints on a 2D plot in a way that makes it impossible for a Perceptron to separate. [4 marks]
 - (c) Is Perceptron learning supervised or unsupervised?

[2 marks]

- (d) What is the Perceptron learning rule? Give the mathematical rule for updating the weights. [5 marks]
- (e) Assume a Perceptron initially has thee input weights: $\mathbf{w} = (-1, 1, 2)$. There are also two training input patterns $p_1 = (0, 1, 1)$, $p_2 = (1, 0, 1)$ with associated target labels $d_1 = 1$ and $d_2 = -1$. Perform the weight update rule sequentially for each input pattern, and report the weight vector at each step. Assume the learning rate $\eta = 0.1$.

- Q3. This question is part about Oja's rule and part about sparse coding.
 - (a) Give Oja's learning rule.

[3 marks]

- (b) Give the expression to which the weight converges for the above rule and explain its meaning. [5 marks]
- (c) What does sparse coding mean?

[2 marks] [3 marks]

- (d) Name a potential benefit of a sparse coding scheme for the brain.
- (e) Sparse code features are typically learned in a supervised setting by minimising a loss or error function. Write down an example loss function that could lead to sparse features. [3 marks]
- (f) Draw an example of a typical 2D basis function learned from a sparse coding rule trained on natural images, as in Olshausen and Field, 1996. [4 marks]