

**Final Exam: Due 6/13(Fri), 6:00PM**

Please prepare your report as outlined below and send it to: **bcs304ta@gmail.com**

- Summarize your results, including discussions and comments for each question, in a PDF file. Name the file as: **"Final\_answer.pdf"**.
- Zip all the MATLAB® codes and text files into one compressed folder, named as: **"Final\_YourSID\_Your Name.zip"**.
- For each problem, clearly indicate which file to run by naming them as: **"Prob1a.m"**, **"Prob1b.m"**, etc. You may also include as many sub-function files as necessary.
- Failure to follow these instructions may result in a penalty.

**Problem 1 [50pts]**

The Izhikevich neuron is modeled as

$$\frac{dV(t)}{dt} = 0.04V^2 + 5V + 140 - u + I(t)$$

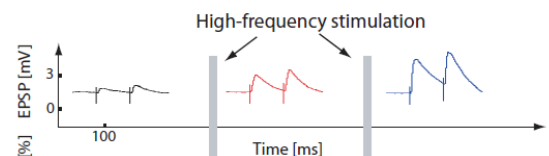
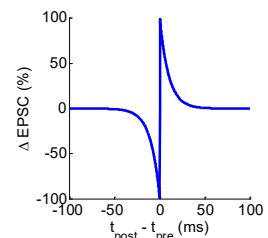
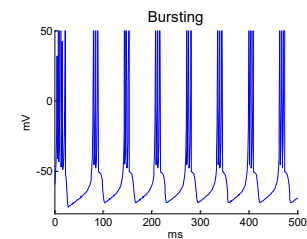
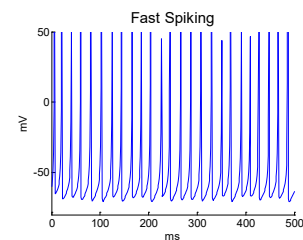
$$\frac{du(t)}{dt} = a(bV - u)$$

with the reset condition

$$V(V > 30) = c, \quad u(V > 30) = u + d$$

To compute  $V(t)$  and  $u(t)$ , use the Euler method with a time step  $dt/\tau = 1$  and temporal resolution  $t_n - t_{n-1} = 1\text{ms}$ .

- For  $I(t) = 10\text{mA}$ , find a set of parameters ( $a, b, c, d$ ) such that the neuron fires at approximately 50Hz in the "fast spiking" mode as shown. Plot  $V(t)$  and ISI (inter-spike-interval) histogram for 500ms.
- For the same input  $I(t) = 10\text{mA}$ , find a set of parameters ( $a, b, c, d$ ) such that the neuron exhibits "bursting" at approximately 50Hz. Plot  $V(t)$  and ISI histogram over 500ms.
- Assume this neuron provides presynaptic input to a target neuron modeled as an Integrate-and-Fire neuron. Using the open-and-decay model of EPSC (Excitatory Post-Synaptic Current), find a condition of the model synapse such that this target neuron induces a spike with the input in **b**, but does not fire with the input in **a**. Plot the pre- and post-synaptic neuron firings for the two conditions, respectively.
- Model the synapse using STDP (Spike Timing Dependent Plasticity) described by an exponential function of  $\Delta t = t_{\text{post}} - t_{\text{pre}}$  as shown;  $\Delta\text{EPSC}$  ( $\Delta t = 10\text{ms}$ )  $\approx 1/e \cdot \Delta\text{EPSC}$  ( $\Delta t = 0\text{ms}$ ). Implement this STDP using appropriate equations and parameters. Show your design of the STDP and plot the  $\Delta\text{EPSC}$  (%) as a function of  $\Delta t$ , for  $\Delta t = [-100, 100]\text{ms}$  as shown.
- Based on your STDP model, estimate the change in EPSC amplitude ( $\Delta\text{EPSC}$ ) after a single "bursting" input from **b**. Plot the EPSCs before and after the bursting input for visual comparison. Discuss qualitatively how high-frequency stimulation can lead to an increase in EPSC amplitude.



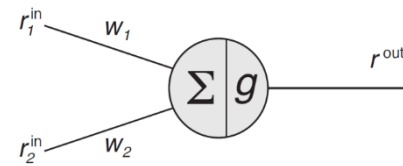
## Problem 2 [20pts]

The spike pattern of a neuron can be represented as a binary string (e.g. [0 1 0 0 0 1 0 0 1]). Use  $\Delta t=10\text{ms}$  time bin for a sample neuron with the refractory period of 10ms.

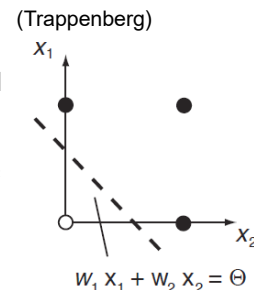
- The neuron is observed to generate exactly 3 spikes in a 100ms window. Estimate analytically the total number of possible spike patterns.
- Assume that these spike patterns are equally likely. Generate  $N=1,000$  patterns randomly (Hint: Use “randperm”), and plot the probability distribution of them.
- Based on the result from **b**, compute the entropy  $S_1[\text{bits}]$  numerically.
- Now assume that spike generation follows a Poisson point process with an average firing rate of 30Hz (i.e. 3 spikes in 100ms). Generate and display 5 example spike trains.
- Estimate analytically the number of possible spike patterns. Compare and discuss the difference between the results in **a** and **e**.
- Under this condition, generate  $N=1,000$  spike patterns randomly. Plot the probability distribution of them.
- Calculate the entropy  $S_2[\text{bits}]$  numerically from **f**. Compare  $S_1$  and  $S_2$  and discuss the reason for the difference in entropy values.

## Problem 3 [20pts]

You are given a linear perceptron model where the binary inputs and output are described as  $r_1^{in}, r_2^{in}$  and  $r^{out} = g(w_1 r_1^{in} + w_2 r_2^{in})$ , where  $g(x) = \begin{cases} 1 & x > \Theta \\ 0 & x \leq \Theta \end{cases}$ . You can implement some Boolean functions by choosing proper values of  $w_1$ ,  $w_2$  and  $\Theta$ .



- Manually pick the values of  $w_1$ ,  $w_2$ , and  $\Theta$  so that your perceptron can perform a Boolean “AND” function. Calculate  $r^{out}$  for all pairs of  $r_1^{in}, r_2^{in}$  to show your choice of parameters works.
- The problem can be simplified by matching the equation of a line  $y = ax + b$ , that has only two free parameters, to  $w_1 r_1^{in} + w_2 r_2^{in} = \Theta$ . Explain the relationship between  $(a, b)$  and  $(w_1, w_2, \Theta)$  under this simplification and describe how to decide  $r^{out}$ .
- Try a couple of randomly chosen values of  $(a, b)$  to estimate an error (cost)  $E$  for each case. In other word, calculate  $r^{out}$  for all pairs of  $r_1^{in}, r_2^{in}$  and estimate the “total difference” between the observed and expected  $r^{out}$ .
- In a 2D space of parameters  $a$  (x-axis) and  $b$  (y-axis), estimate the error  $E(a, b)$  in all locations within a proper boundary. Visualize the profile of  $E(a, b)$  using a 2D heat map. Discuss the condition of  $(a, b)$  for the system to perform a Boolean “AND” function.



## Problem 4 (Questions for questions) [10pts]

Choose one question from a previous homework assignment (e.g., HW2, Problem 1b). Your task is to improve the question by rewriting it in a way that helps students better understand the key scientific concept or idea behind it. Write the revised version of the question, provide a sample answer, and explain the educational goal you intended to achieve with the new version.