

## Coursework 2

This coursework relates to the properties of spike train. These questions are adapted from the exercises given in Part 1.1 of

<http://www.gatsby.ucl.ac.uk/~dayan/book/exercises.html>

in their original form they are exercises for the book Dayan and Abbott, a recommended text book for this course.

We give helper code for completing this coursework in Python and Julia, but feel free to use MATLAB or another language if you prefer.

The first question relates to **Poisson processes**, a Poisson process is a memoryless random process producing a time series of events; in the application to spike trains an event corresponds to a spike. By memoryless it is meant that the chance of an event depends only on a **rate function  $r(t)$**  and not on the history of past events. The idea is that the **probability** of an event in a small interval  $\delta t$  wide **is  $r(t)\delta t$** .

Imagine a person fishing in the sea, the chance of catching a fish might depend on the time of day but **it doesn't depend on how many fishes the person has already caught**, however, if they are fishing in a small pond the chance of catching a fish would diminish as they catch fish, so **fishing in the sea is a Poisson process**, but fishing in a pond is not. In the two questions here the Poisson process is homogenous, that is, **the rate is constant**. Of course, if there is a refractory period, that is a time during which the neuron cannot spike, the spike train is not a Poisson process, but in this question a Poisson process is used to generate the spike train.

It can be proved, with a nice argument you are urged to look up, that the **distribution of inter-event intervals  $t$** , here inter-spike intervals, is given by

$$p(t) = re^{-rt} \quad (1)$$

The code supplied in `poisson.py` and `poisson.jl` **generates intervals according to this distribution**. A distinctive feature of a Poisson process is that its Fano factor and coefficient of variation. The aim here is to calculate these quantities for simulated and real spike trains.

The **Fano factor** is defined as

$$F = \frac{\sigma^2}{\mu} \quad (2)$$

where  $\sigma^2$  is a variance and  $\mu$  is an average. In the case of spike trains it is usually applied to the spike count; so to calculate it you divide the spike train into intervals and work out the spike count for each interval. The Fano factor is calculated using the average and variance for these counts. The **coefficient of variation** is

$$C_v = \frac{\sigma}{\mu} \quad (3)$$

where  $\sigma$  is a standard deviation and  $\mu$  is an average. In the case of spike trains this is usually applied to the inter-spike interval, that is the time difference between successive spikes.

### Question 1

In the `spike_trains` folder you will find `poisson.jl` and `poisson.py`. These contain a function which will generate spike trains simulated using a Poisson process with a refractory period. Calculate the Fano factor of the **spike count** and coefficient of variation of the **inter-spike interval** for 1000 seconds of spike train with a firing rate of 35 Hz, both with no refractory period and with a refractory period of 5 ms. In the case of the Fano factor the count should be performed over windows of width 10 ms, 50 ms and 100 ms. [5 marks]

### Question 2

In the `spike_trains` folder you will find the data file `rho.dat`. This contains data collected and provided by Rob de Ruyter van Steveninck from a fly H1 neuron responding to an approximate white-noise visual motion stimulus. Data were collected for 20 minutes at a sampling rate of 500 Hz. In the file, `rho` is a vector that gives the sequence of spiking events or non-events at the sampled time, that is, every 2 ms. Simple programmes, `load.jl` and `load.py`, are supplied to load this data file and the data file described in the next question.

Calculate the Fano factor and coefficient of variation for this spike train as for the simulated spike trains above. [5 marks]

### Question 3

For the same spike train given in the `rho` vector, calculate and plot the autocorrelogram over the range  $-100$  ms to  $+100$  ms. You can calculate this using the method outlined in the lecture, or using an existing python/julia package. You can plot using Python or Julia or you can export the data and plot using another package such as gnuplot. Do not upload a screen shot of the plot, the plot should be exported into whatever format you upload. [5 marks]

### Question 4

In the `spike.trains` folder you will find the data file `stim.dat`. This give the motion stimulus that evoked the spike train in `rho.dat`. Calculate and plot the **spike triggered average** over a 100 ms window. [5 marks]

### COMSM2127

Calculate the stimulus triggered by pairs of spikes, that is for intervals of 2 ms, 10 ms, 20 ms and 50 ms calculate the average stimulus before a pair of spikes seperated by that interval; do this for both the case where the spikes are not neccesarily adjacent and the case where they are. [5 marks]

### Submission instructions

Please submit your code along with a short document giving the answers to Q1 and Q2 and the plots from Q3 and Q4 and for COMSM2127 students the extra plot for that section. Include enough text to make it clear what you are presenting, for example ‘the Fano factor for the Poisson train with zero refractory period is  $F = \dots$ ’. Submit the document as a pdf, not a doc. If (but only if) Blackboard will not let you upload separate files for the code and pdf, then please combine both files in a .zip.

The deadline is 1pm on 27th April 2020.