



UNIVERSITY OF CORDOBA
INSTITUTE OF POSTGRADUATE STUDIES



UNIVERSITY MASTER'S DEGREE

**PHYSICAL TECHNOLOGY:
RESEARCH AND APPLICATIONS**

MASTER'S THESIS

**Exploring the relationship between Hawkes processes
and self-organized criticality in living systems**

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Line of research: Modelling of complex systems and their interdisciplinary applications

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Autorización de defensa del Trabajo Fin de Máster

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Firmado en Córdoba a X de julio de 2024

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*“Va por los días en los que quiero un abrazo
y acabo encerrado solo en en cuarto”.
—Piezas*

Cambiar encabezado y pie de página en .sty

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List of Figures

List of Tables

Abstract

Chapter 1

Introduction

Chapter 2

Objectives

Chapter 3

Methodology

Chapter 4

Results

Chapter 5

Conclusions

Anexo

REVISAR LOS CÓDIGOS PARA QUE ESTÉN ACTUALIZADOS

Script 5.1. *Script Python con todas las funciones.*

```

1 import numpy as np
2 import matplotlib.pyplot as plt
3
4 def algorithm(rate, mu, n):
5     """
6     Algorithm that computes interevent times and Hawkes intensity
7
8     #Output: rate x_k, x_k
9     """
10    # Paso 1
11    u1 = np.random.uniform()
12    if mu == 0:
13        F1 = np.inf
14    else:
15        F1 = -np.log(u1) / mu
16
17    # Paso 2
18    u2 = np.random.uniform()
19    if (rate - mu) == 0:
20        G2 = 0
21    else:
22        G2 = 1 + np.log(u2) / (rate - mu)
23
24
25    # Paso 3
26    if G2 <= 0:
27        F2 = np.inf
28    else:
29        F2 = -np.log(G2)
30
31    # Paso 4
32    xk = min(F1, F2)
33
34    # Paso 5
35    rate_tk = (rate - mu) * np.exp(-xk) + n + mu
36    return rate_tk, xk
37
38 def generate_series(K, n, mu):
39     """
40     Generates temporal series for K Hawkes processes
41
42     ##Inputs:

```

```

43 K: Number of events
44 n: Strength of the Hawkes process
45 mu: Background intensity
46
47 ##Output:
48 times: time series the events
49 rate: time series for the intensity
50 """
51 times_between_events = [0]
52 rate = [mu]
53 for _ in range(K):
54     rateTk, xk = algorithm(rate[-1], mu, n)
55     rate.append(rateTk)
56     times_between_events.append(xk)
57 times = np.cumsum(times_between_events)
58 return times, rate
59
60 def identify_clusters(times, delta):
61     """
62     Identifies clusters in a temporal series given a resolution parameter delta
63
64     ## Inputs:
65     times: temporal series
66     delta: resolution parameter
67
68     ## Output:
69     clusters: list of clusters
70     """
71     clusters = []
72     current_cluster = []
73     for i in range(len(times) - 1):
74         if times[i + 1] - times[i] <= delta:
75             if not current_cluster:
76                 current_cluster.append(times[i])
77                 current_cluster.append(times[i + 1])
78             else:
79                 if current_cluster:
80                     clusters.append(current_cluster)
81                     current_cluster = []
82     return clusters
83
84 def generate_series_perc(K, n, mu):
85     """
86     Generates temporal series for K Hawkes processes
87
88     ##Inputs:
89     K: Number of events
90     n: Strength of the Hawkes process
91     mu: Background intensity
92
93     ##Output:
94     times_between_events: time series the interevent times
95     times: time series the events
96     rate: time series for the intensity
97     """
98     times_between_events = [0]
99     rate = [mu]
100    for _ in range(K):
101        rateTk, xk = algorithm(rate[-1], mu, n)
102        rate.append(rateTk)
103        times_between_events.append(xk)
104    times = np.cumsum(times_between_events)

```



```

105     return times_between_events, times, rate
106
107 def calculate_percolation_strength(times_between_events, deltas):
108     percolation_strengths = []
109
110     for delta in deltas:
111         cluster_sizes = []
112         # Initialize the size of the current cluster
113         current_cluster_size = 1 # The first event is always a cluster
114
115         for i in range(len(times_between_events)):
116             if times_between_events[i] <= delta:
117                 current_cluster_size += 1
118             else:
119                 if current_cluster_size > 1: # Only consider clusters with more than one
event
120                     cluster_sizes.append(current_cluster_size)
121                     # Reset the size of the current cluster
122                     current_cluster_size = 1 # The next event is always a cluster
123
124         # Add the size of the last cluster
125         if current_cluster_size > 1: # Only consider clusters with more than one event
126             cluster_sizes.append(current_cluster_size)
127
128         max_cluster_size = max(cluster_sizes)
129
130         percolation_strengths.append(max_cluster_size / len(times_between_events))
131     return percolation_strengths
132
133 def model(n_max, mu_E, mu_I, tau, n_EE, n_IE, n_EI, n_II, dt):
134     """
135     Solve the equations of the mena field model for a given number of iterations n_max
136
137     Inputs:
138     n_max: number of iterations
139     mu_E: Poisson rate of excitatory neurons
140     mu_I: Poisson rate of inhibitory neurons
141     tau: characteristic time of the system
142     n_EE: influence of excitatory neurons on excitatory neurons
143     n_IE: influence of excitatory neurons on inhibitory neurons
144     n_EI: influence of inhibitory neurons on excitatory neurons
145     n_II: influence of inhibitory neurons on inhibitory neurons
146     dt: time step
147
148     Outputs:
149     time: time series
150     t_events_E: times of events of excitatory neurons
151     t_events_I: times of events of inhibitory neurons
152     rates_E: rates of excitatory neurons
153     rates_I: rates of inhibitory neurons
154     """
155     n_E = n_I = n = 0
156     t_events_E = [0]
157     t_events_I = [0]
158     rates_E = [mu_E]
159     rates_I = [mu_I]
160     time = [0]
161     while n <= n_max:
162         # Excitation neurons
163         l_Enew = rates_E[-1] + dt * (mu_E - rates_E[-1])/tau
164         if np.random.uniform() < rates_E[-1]*dt:
165             l_Enew += n_EE

```

```

166         t_events_E.append(time[-1]+dt*np.random.uniform())
167         n_E += 1
168     if np.random.uniform() < rates_I[-1]*dt:
169         l_Enew -= n_IE
170         t_events_E.append(time[-1]+dt*np.random.uniform())
171         n_E += 1
172
173     # Inhibition neurons
174     l_Inew = rates_I[-1] + dt * (mu_I - rates_I[-1])/tau
175     if np.random.uniform() < rates_E[-1]*dt:
176         l_Inew += n_EI
177         t_events_I.append(time[-1]+dt*np.random.uniform())
178         n_I += 1
179     if np.random.uniform() < rates_I[-1]*dt:
180         l_Inew -= n_II
181         t_events_I.append(time[-1]+dt*np.random.uniform())
182         n_I += 1
183     rates_E.append(l_Enew)
184     rates_I.append(l_Inew)
185     time.append(time[-1]+dt)
186
187     n = n_E + n_I
188     return time, t_events_E, t_events_I, rates_E, rates_I

```