

Complex dynamics for the study of cerebral activity in the human brain A. Garnier¹, A. Vidal², J.-P. Françoise³, H. Benali¹

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Introduction

- **Motivations**: Study of the relationship between structure and function in the human brain, mimic brain imaging outputs.
- Local scale objectives: New ODE model generating cerebral activity (<u>neural</u>, glial, hemodynamic): analysis, validation.
- Global scale objectives: Network dynamics analysis.

Local scale

NEURAL MASS MODEL



Analysis (2)

IMPACT OF THE BALANCE BETWEEN DIRECT (G) AND INDIRECT (α_2) EXCITATORY FEEDBACKS.





FIG.1: Interactions between neuronal populations: indirect (a), direct (b) and **double** (c) and (d) excitatory feedback from pyramidal cells. P: main pyramidal cells population. P': intermediary pyramidal cells population. I: Inhibitory interneuron population. Red (resp. green) arrows: excitation (resp. inhibition). $h_e(t)$ ($h_i(t)$): Action potentials \rightarrow excitatory (resp. inhibitory) post-synaptic potential [5]. sigm: average membrane potential \rightarrow average pulse density [2]. C_i ($i \in [[1, 4]]$): coupling gains ($C_i = \alpha_i C$, C: maximal number of synaptic connections between two populations) [1]. G: direct feedback coupling gain. p(t): excitatory input representative of interactions with long-range neural populations. State variables: y_0, y_1, y_2 . $y_0'' = A a \operatorname{sigm}(y_1 - y_2) - 2 a y_0' - a^2 y_0$ $y_1'' = A a C_2 \operatorname{sigm}(C_1 y_0) - 2 a y_1' - a^2 y_1 + A a G \operatorname{sigm}(y_1 - y_2) + A a p(t)$

 $y_2'' = B \, b \, C_4 \, \operatorname{sigm}(C_3 \, y_0) - 2 \, b \, y_2' - b^2 \, y_2$

FIG.3: Left: Codimension 2 bifurcation diagrams according to *C* and *p*. Codimension one bifurcations (curves): saddle-node (black), supercritical Hopf (solid red line), subcritical Hopf (dotted red line), homoclinic connection (green), SNIC (green dots), fold of limit cycles (purple). Codimension two bifurcations (blue diamonds): Cusp, Bogdanov-Takens (BT), Bogdanov-Takens with SNIC (SBT), Bautin (B), Homoclinic connection to SNIC (S), cusp of limit cycles (CLC). Each colored band corresponds to a dynamical behavior: NMO, NIS, NIS-OTO, NITAM and NIS-STO.

Right: Partition of (G, α_2) parameter space according to the type of bifurcation diagrams in (C, p). Cyan curve: appearance/disappearance of two folds of the Hopf bifurcation branch. Red curve: branch of degenerate Bogdanov-Takens bifurcations. Blue curve: branch of cusp/cusp bifurcation. This diagram defines five regions characterized by a single panel of output types: (a): NIS-OTO, NIS, NIS-STO; (b): NMO, NITAM, NIS-STO; (c): NIS, NIS-STO; (d): NIS, NIS-STO, NMO; (e) NMO. [4]

Analysis (1)

BIFURCATION DIAGRAMS ACCORDING TO p **AND TIME SE-RIES GLOSSARY**

The model can generate five distinct dynamical behaviors:

- Noise Modulated Oscillations (NMO)
- Noise Induced Spiking (NIS)
- Noise Induced Spiking and Over Threshold Oscillations (NIS-OTO)
- Noise Induced Thresholded Amplitude Oscillations (NITAM)
- Noise Induced Spiking and Sub-Threshold Oscillations (NIS-STO) each one linked to a specific dynamical organisation (Figure 2).



Validation

COMPARISON WITH REAL DATA



- Real data: Hippocampal Discharges (HD) recorded in epileptic mice (Mesial Temporal Lobe Epilepsy (MTLE) mouse model).
- **HD typical features**: sparse large amplitude oscillations followed by lower amplitude rhythmic discharges (ressembling to NIS and NIS-STO behaviors respectively).
- **Time-frequency analysis**: rhytmic discharges of HD and **NIS-STO** have a same proper frequency of 4 Hz.

FIG.4: Real (a) and simulated (b) time series and their spectrograms. [3]

Perspectives

- Local scale: Parameter(s) involved in NIS-STO proper frequency, model reduction, astrocytes and hemodynamic compartments modeling.
- Network scale: Local models coupled via anatomical or functional con-

(c) NIS-OTO

(d) NITAM



FIG.2: Bifurcation diagrams (left) according to p and instance of associated LFP time series and its spectrogram (right). Blue, cyan and green curves: singular points with 0, 1 and 2 associated eigenvalues with positive real parts respectively. Red points: Hopf bifurcations (H_1 , H_2 , H_3 and H_4). Black points: saddle-node bifurcations (SN_1 and SN_2). Plain black curves: stable limit cycle extrema. Dashed black curves: unstable limit cycles extrema. Dashed orange line: Saddle-Node on Invariant Circle (SNIC) bifurcation. FLC points: Fold of Limit Cycle bifurcation. [4]

nectivity.

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