Antonio Galves

Universidade de S.Paulo and NeuroMat November 23, 2015

1st Workshop RGBRain

Antonio Galves The scientific project of NeuroMat

Research, Dissemination and Innovation Center for NeuroMathematics

- Research center funded by FAPESP
- established in August 2013 at the University of São Paulo
- integrating mathematical modeling and neurobiology.

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neuromat.numec.prp.usp.br
www.facebook.com/neuromathematics
https://github.com/neuromat
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NeuroMat Project | NeuroMat

28/10/13 16:36



NeuroMat Project

This proposal concerns the creation of a mathematical Center aiming to integrate modeling with basic and applied research at the frontier of neuroscience. The goal of the Center is to develop a mathematical framework leading to the theoretical understanding of neural systems, fully integrated with experimental research in neuroscience. New models and theories will be developed in order to handle the huge quantity of data produced by concurrent experimental research and to provide a conceptual framework for the multiscale assects disolayed by neural homomena.

Technology transfer and innovation will focus on products aimed at public health programs in re-habilition and will be offered through the Lucy Montror Rehabilitation Center of the Sao Paulo State Government. The USP FLOSS Competence Center will partner in producing high quality computational tools for neuroscience research and clinical use, all available



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Long term goal:



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Long term goal:

to develop the new mathematics which is deemed necessary to account for a Theory of the Brain (...)

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- Long term goal:
- to develop the new mathematics which is deemed necessary to account for a Theory of the Brain (...)
- The long-term objective is to understand and explain complex neuroscientific phenomena, with focus on plasticity mechanisms underlying learning and memory, (...)

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- to develop the new mathematics which is deemed necessary to account for a Theory of the Brain (...)
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I am quoting the Research Project we submitted to FAPESP

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Long term steps

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Long term steps

This requires the definition of a full new class of mathematical models to describe and explain in a parsimonious way the different scales of neural activity and the relationship between them.

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Long term steps

- This requires the definition of a full new class of mathematical models to describe and explain in a parsimonious way the different scales of neural activity and the relationship between them.
- The construction of these models should occur together with the development of suitable statistical and computational methods, including model selection principles (...)

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We are NOT a Center of Applied Mathematics

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- We are NOT a Center of Applied Mathematics
- The mathematics required to address the issues associated to brain plasticity does not exist yet

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- We are NOT a Center of Applied Mathematics
- The mathematics required to address the issues associated to brain plasticity does not exist yet
- (with all due respect to models like Hodgkin-Huxley and extensions).

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- We are NOT a Center of Applied Mathematics
- The mathematics required to address the issues associated to brain plasticity does not exist yet
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- ► We are **NOT** signal processors,

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- We are NOT a Center of Applied Mathematics
- The mathematics required to address the issues associated to brain plasticity does not exist yet
- (with all due respect to models like Hodgkin-Huxley and extensions).
- ► We are **NOT** signal processors,
- even if part of our activities involves signal processing tasks.

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Mutatis mutandis

Our goal is

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Our goal is to construct new mathematical models

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Our goal is to construct new mathematical models which could play in Neuroscience the same clarifying role

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Our goal is to construct new mathematical models which could play in Neuroscience the same clarifying role that Gibbs models played

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Our goal is

to construct new mathematical models

which could play in Neuroscience the same clarifying role

that Gibbs models played

in the Statistical Mechanics derivation of Thermodynamics.

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What are we doing to achieve these goals?

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What are we doing to achieve these goals?

We need to make progresses in the direction of these long term goals and steps.

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Goals for the first two years

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Goals for the first two years

Recall the *The development of the long-term goal* (...) *requires the initial development of two foundational aspects:*

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Recall the *The development of the long-term goal* (...) *requires the initial development of two foundational aspects:*

Development of a new class of stochastic processes

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Recall the *The development of the long-term goal* (...) *requires the initial development of two foundational aspects:*

- Development of a new class of stochastic processes
- Development of the statistical tools required by this new class of stochastic processes

Recall the *The development of the long-term goal* (...) *requires the initial development of two foundational aspects:*

- Development of a new class of stochastic processes
- Development of the statistical tools required by this new class of stochastic processes

I am quoting the text sent to FAPESP with our goals for the first two years.

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We propose a new paradigm based on the idea that neuronal activity must be described as a stochastic systems

We propose a new paradigm based on the idea that neuronal activity must be described as a stochastic systems

with a large number of interacting components,

We propose a new paradigm based on the idea that neuronal activity must be described as a stochastic systems

- with a large number of interacting components,
- whose evolution depends on the history of the system.

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Basic features of these stochastic processes

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Basic features of these stochastic processes

The activity of each component depends on the past history of its interaction neighborhood.

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Basic features of these stochastic processes

- The activity of each component depends on the past history of its interaction neighborhood.
- Both the size of the relevant past history and of the interaction neighborhood change as the process evolves.

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Double time evolution

Therefore there is a double time evolution:

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Therefore there is a double time evolution:

one describing the changes in neuronal activity,

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Therefore there is a double time evolution:

- one describing the changes in neuronal activity,
- and another one describing changes in the graph of interactions among components.

for this new class of stochastic processes.

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for this new class of stochastic processes.

Brain activity is underpinned by a double graph structure:

for this new class of stochastic processes.

Brain activity is underpinned by a double graph structure:

 physical graphs defined by connections between brain regions

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for this new class of stochastic processes.

Brain activity is underpinned by a double graph structure:

- physical graphs defined by connections between brain regions
- and functional graphs relating regions recruited for each particular activity.

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for this new class of stochastic processes.

Brain activity is underpinned by a double graph structure:

- physical graphs defined by connections between brain regions
- and functional graphs relating regions recruited for each particular activity.

While the physical graphs can be directly observed, functional interactions can only be inferred from data.

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Inferring functional structures

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Inferring functional structures

Traditionally, this has been done using descriptive statistical methods which give little insight on the mechanism underlying the dynamics of the neural activity.

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- Alternative to this naive descriptive statistical approach: statistical model selection.

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Inferring functional structures

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- Alternative to this naive descriptive statistical approach: statistical model selection.
- Statistical model selection means: to assign models to samples following some optimality criterion.

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Inferring functional structures

- Traditionally, this has been done using descriptive statistical methods which give little insight on the mechanism underlying the dynamics of the neural activity.
- Alternative to this naive descriptive statistical approach: statistical model selection.
- Statistical model selection means: to assign models to samples following some optimality criterion.

Inference and model selection within this framework requires the development of new statistical methods.

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To succeed we must be able



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To succeed we must be able

to constitute interdisciplinary sub teams

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To succeed we must be able

- to constitute interdisciplinary sub teams
- able to address neurobiological questions from a NeuroMat point of view.

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To succeed we must be able

- to constitute interdisciplinary sub teams
- able to address neurobiological questions from a NeuroMat point of view.
- Question: what is the NeuroMat point of view?!

To succeed we must be able

- to constitute interdisciplinary sub teams
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- To be continued

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