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Abstract:

The present communication is aimed at creating the biophysical and mathematical foundations for the understanding of the current trends in the use of Machine Learning, Networks, and Artificial Intelligence in the study of Neuroscience. Besides that, these foundations will permit to define the methodologies behind Cognitive Neuroscience, Neuromorphic Computing, Quantum Machine Learning, and Quantum Artificial Neural Networks.

Resumen:

La presente comunicación va dirigida a crear las bases teóricas en matemática y biofísica para comprender los modelos usados en el Aprendizaje de Máquina, Redes, e Inteligencia Artificial para el estudio de las Neurociencias. Además, estas bases permitirán definir las metodologías detrás de la Neurociencia del Conocimiento, Computación Neuromórfica, Aprendizaje de Máquina Cuántico y Redes Neuronales Artificiales Cuánticas.



Tentative Layout

Context of the presentation and the topic.

Part 1: The foundations: dynamical systems, and complex networks in Brain Science.

- History of the problem.
- Computational Neuroscience and Dynamical Systems.
- Graph theory, networks, feedback loops.
- Brain networks: anatomical, functional, and layered.

Part 2: Deep Learning, Machine Learning, and Artificial Intelligence in Brain Science.

- Machine learning for Brain Science fundamentals.
- Artificial Neural Networks for Brain Science.
- Artificial Intelligence for and from Brain Science.
- Neuromorphic Computing, Quantum Computing, Quantum Machine Learning and Brain Science.





The context of the topic





The context of the topic



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and

secret

Joseph Fourier







Scales of Modeling and the love for Fractions !!!





Scales of Modeling and the love for Fractions !!!





Network Medicine and Systems Biology





Part 1: The foundations: dynamical systems, and complex networks in Brain Science.

- History and Motivation of the problem.
- Basic ideas about the Nervous System and Neurons.
- Basic ideas about Electro-encephalography (EEG), Magnetic Resonance Imaging (MRI), Functional MRI (fMRI), and Superconducting Quantum Interferometer Devices (SQUIDs).
- Computational Neuroscience and Dynamical Systems (Hodgkin-Huxley, Fitzhugh-Naguno, Izhikievich, Morris-Lecar, Hammarsh-Rose, Li-Rinzel, Wilson-Cowan, Kuramoto, Hopfield, Spin Glass, and Cellular Automata)
- Graph theory, networks, feedback loops.
- Brain networks: anatomical, functional, and layered.









A Brief History of Neuroscience

Human Brain Project Timeline

HBP Research Platforms becoming a Neuroscience Research Infrastructure





Brain Networks Dynamics – From Dynamical Systems to Complexity and Artificial Intelligence Basic ideas about the Nervous System and Neurons.







Basic ideas about the Nervous System and Neurons.





Basic ideas about the Nervous System and Neurons.







Basic ideas about the Nervous System and Neurons. Functional Areas of the Cerebral Cortex





Basic ideas about the Nervous System and Neurons.

Basic Unit of the nervous system – the <u>Neuron</u> <u>The legacy of Santiago Ramon y Cajal</u>





Basic ideas about the Nervous System and Neurons.

Types of Neurons





Basic ideas about the Nervous System and Neurons.

Information flow through neurons



Figure 45-2b Biological Science, 2/e © 2005 Pearson Prentice Hall, Inc.



Basic ideas about the Nervous System and Neurons.



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Basic ideas about the Nervous System and Neurons.

BRAIN SIZE AND NEURON COUNT

Cerebral cortex mass and neuron count for various mammals.





Basic ideas about the Nervous System and Neurons.

Hierarchy of brain function



Abstract Thought **Concrete Thought** Affiliation Attachment Sexual Behaviour **Emotional Reactivity** Motor Regulation Arousal Appetite Sleep **Blood Pressure** Heart Rate Body Temperature





Basic ideas about the Nervous System and Neurons.

- The study of the dynamics of the Nervous System is the study of the dynamics of a complex system with regulatory feedback loops (control system theory), where self-organization and cooperation (synergetics) operate in the background of a large complex network (graph theory and networks).
 - Such a system has the ability of **self-learning** with a high level optimization. The process of self-learning occurs following a sequence of **unsupervised** and **supervised** learning.
- Brain dynamics is an example of **structure function** problems. Two types of connections: structural (anatomical), dynamical (functional). Therefore, the understanding of the activation of functional networks of neurons behind behaviors, response to stimuli, and central nervous system degenerative diseases is of tremendous importance.





How to collect information about the dynamics of neurons and the brain?



Figure 1. Commonly used techniques for recording brain activity. From left to right, temporal resolution decreases, from <1 ms for single cell and multielectrode array (MEA) recordings to ~1 sec for fMRI. The colours indicate the approximate physical scale of the activity that can be recorded with each approach, as well as the approximate depth limits of each technique. ECoG, EEG, and fluorescence imaging are limited to recording from the brain's outer surface. Note that human recording techniques (ECoG, EEG and fMRI) cover much larger areas than technologies used in animals. This comes at the expense of detail.



How to collect information about the dynamics of neurons and the brain?

Resonance Magnetic Imaging (MRI) and Functional MRI





How to collect information about the dynamics of neurons and the brain?

Resonance Magnetic Imaging (MRI) and Functional MRI

fMRI (Blood Flow) during TM

Red = Higher Blood Flow

Blue= Lower Blood Flow





How to collect information about the dynamics of neurons and the brain?

Resonance Magnetic Imaging (MRI) and Functional MRI



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How to collect information about the dynamics of neurons and the brain?

Resonance Magnetic Imaging (MRI) and Functional MRI



Nature Reviews | Neuroscience





How to collect information about the dynamics of neurons and the brain?







The EEGs images of the epileptic person showing areas of major activity.

Time series analysis of the EEG signals for Epilepsy seizure forecast, Cing M.S. and **Quesada D.**, *In Proceedings of the MOL2NET, International Conference on Multidisciplinary Sciences*, Sciforum Electronic Conference Series, Vol. 3, 07003; <u>http://doi:10.3390/mol2net-03-05102</u>, <u>http://sciforum.net/conference/161/paper/510</u> <u>2</u>

Complex networks and machine learning: From Molecular to Social Sciences (editorial article), **D.Quesada**, M. Cruz-Monteagudo, T. Fletcher, A. Duardo-Sanchez, and H. Gonzalez-Diaz, Applied Sciences, applsci-626592 <u>http://doi:10.3390/app9214493</u> (2019).





How to collect information about the dynamics of neurons and the brain?

- Data generated by the Human Brain Project until today requires techniques from Data Mining, Machine Learning, Pattern Recognition, and Deep Learning in order to make sense of them, to integrate data across scales and time, and to find patterns from spikes distributions in connection to different stimuli.
- Different techniques produce data with different spatial and temporal resolutions, therefore we need to find out how to interpolate across scales.
- Mathematical modeling based on synthetic networks should shed light on patterns obtained from data. Mathematical modeling of the brain activity is demanding a huge computer power, Exascale High Performance Computing (Ex-HPC). Foundations of precision medicine.
- Might **Quantum Computing** help with HPC and precision medicine?



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Brain Networks Dynamics – From Dynamical Systems to **Complexity and Artificial Intelligence**

What is coming next to dynamical systems on networks? **Cognitive Computing and Artificial Intelligence**





2005 Cell Broadband Supercomputer ushers in Engine "Supercomputer on a chip" for high-performance gaming applications and computing systems handling 280 trillion operations every second 2008 2012 Suintillic bytes of data Petaflop Barrier Los Alamos National Lab and IBM create Roadrunner supercomputer first to achieve One guadrillion calculations/second **Exascale Computing**

Supercomputers that would be 80%+ faster than today's fastest computers while consuming just a trickle of energy through designs inspired b human brain





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Preguntas?

Questions?

Вопросы?

Des questions?

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