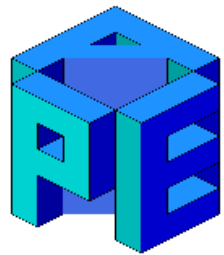




SAPIENZA  
UNIVERSITÀ DI ROMA



# APE Lab and the Brain



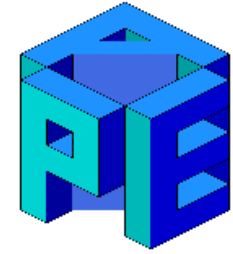
Presentazione delle attività di APE Lab per gli  
studenti del curriculum “Biosistemi”  
(Physics – Lab II Project)

[www.apegate.roma1.infn.it](http://www.apegate.roma1.infn.it)

[https://twitter.com/APELab\\_INFN](https://twitter.com/APELab_INFN) 




# APE Lab & the Brain



Our interests and efforts are focused on:

- hardware and software co-design for **distributed spiking neural network simulations** on **parallel computing architectures** (DPSNN)
- hardware and software co-design for **neuromorphic computing systems** (focus on network, latency, scalability, and on benchmark applications)
- **Thalamo-cortical spiking models** (beneficial effects of sleeps on classification tasks, sleep-memories interplay, synaptic plasticity, combination of contextual and perceptual information)
- data-constrained (**inference**-based) theoretical models for **connectivity** and **plasticity** (**mean-field** and **spiking** simulations)
- **data analysis** (from different and diverse sources, experimental and simulated datasets)
- **software tools** for the HBP infrastructure platforms



**HBP**  
Human Brain Project

- Simulation of spiking neural networks
- Data analysis
- Theoretical models of cortical activity, connectivity and learning

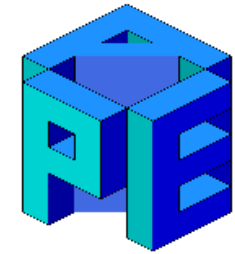
Network architecture  
Network Interface Card (APEnet)  
Parallel Computing and GPUs

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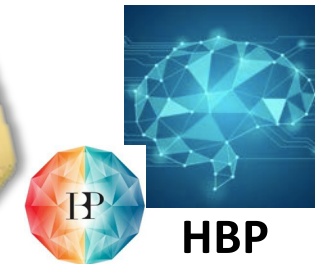


# APE Lab & the Brain



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Network architecture  
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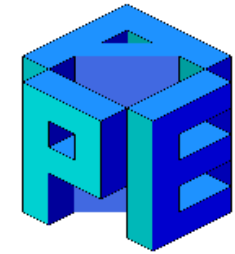
*Our offer for the  
BioPhysicsLab*

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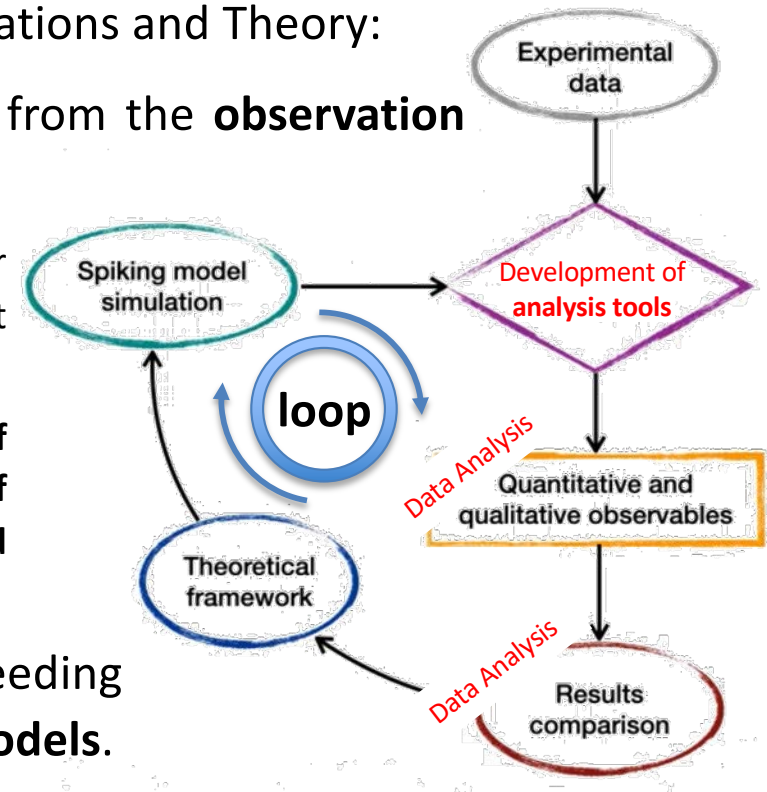


# Data Analysis



The activity of Data Analysis is strongly related to Simulations and Theory:

- understand mechanisms and features of the SWA from the **observation** and the **interpretation** of experimental data;
  - define **benchmark observables** and design **flexible tools**, for **comparing and combining different data sets**, aiming at general claims and at statistically significant assessments;
  - define **methods and procedures** for the **validation of theoretical models and simulations**, the **comparison of models**, and the **comparison of experimental and simulated data**;
- extract results from experimental recordings for feeding **data-driven simulations** and **refining theoretical models**.

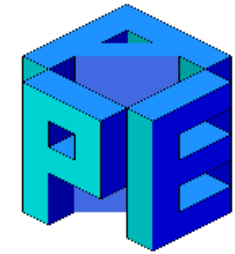


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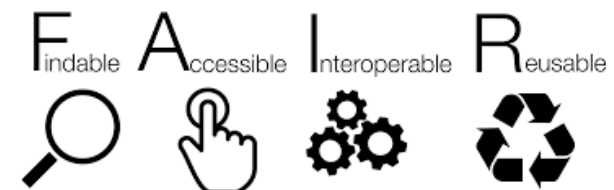
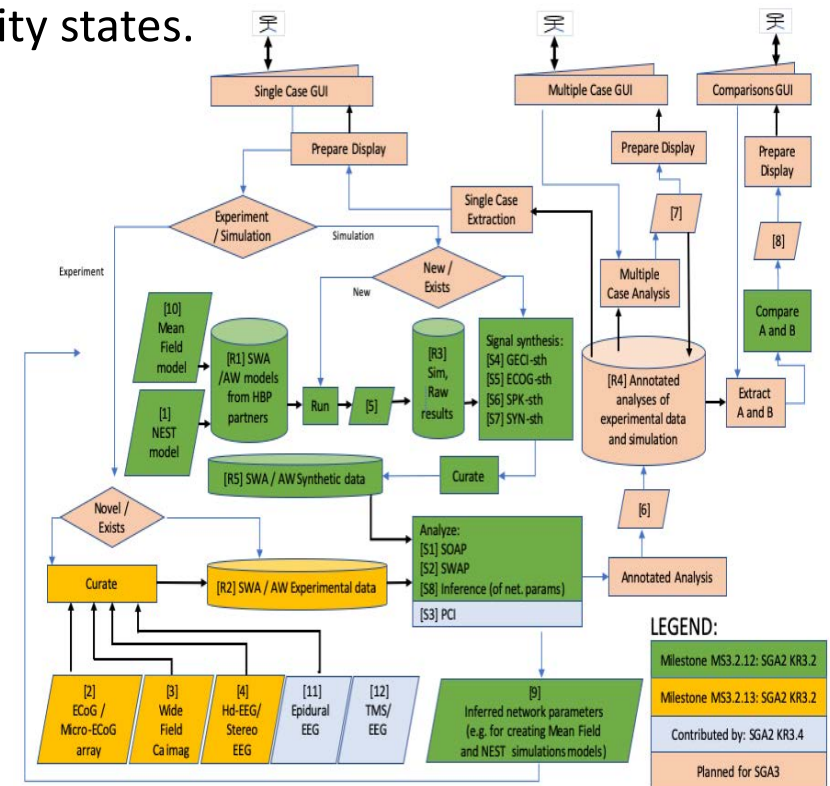
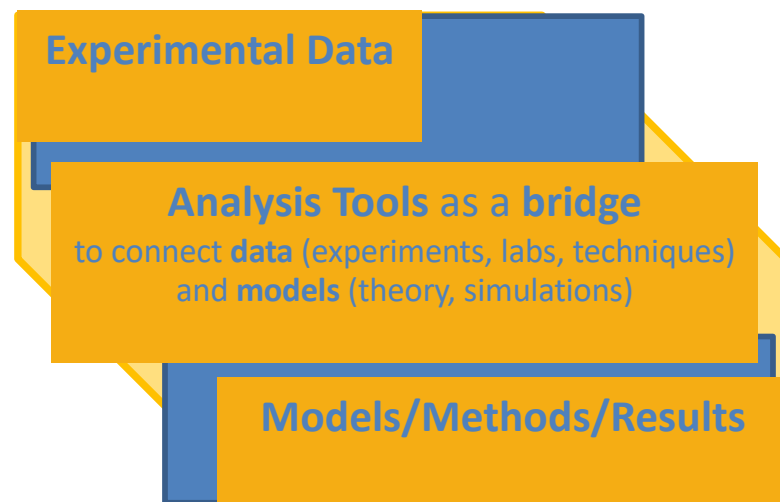


# Workflows, Pipelines and Analysis Tools



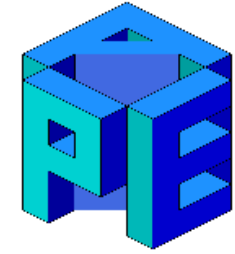
**WaveScales Scientific Mission:** multi-scale, multi-methodology, multi-species investigation of **brain states**, their **transitions**, their **complexity** and their specific **cognitive functions**, starting from **deep sleep/anesthesia** to higher complexity states.

- Offer **experimental data**, **simulation models**, **results** and **analysis tools** to the Scientific Community through **EBRAINS** (European Brain Research InfrastructureS) <https://ebrains.eu/>
- Create a **reproducible** and **cooperative** scientific **framework** providing **FAIR** data principles and supporting data and model **comparison**.





# Build modular, adaptable and reusable pipelines



The issue of the **reproducibility of results** is a key-point in the scientific community, in particular in fields that involve life sciences. This aspect is a crucial element when **analyzing data** and when interpreting the outcome in the lights of theoretical models aimed at generating **plausible simulations** of the observed phenomena.

The case of neuroscience is not an exception: the **variety of the experimental techniques for data acquisition** and the **diversity of subjects and species** involved (due to **large biological variability**, but also to **brain states, physiological/pathological conditions, drug doses** and **data taking setups**) make challenging the building of reliable and generalizable data analysis tools aimed at identifying common observables when **comparing the outcome of different experiments** acquired with different experimental modalities, and at obtaining reproducible results.

In addition, for a fair comparison and an accurate **validation of the models**, biologically-plausible data-driven modelling of the phenomena should follow the same approach, subjecting the outcome of the simulations to the **same analysis tools used for the data**.



common framework for Experimental and Simulated data  
→ release for the Neuroscience Community

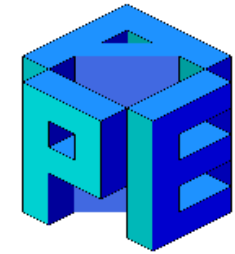


[WaveScaleS-APELab Software Pipelines]

# SWAP and SOAP

<https://github.com/INM-6/wavescalephant>

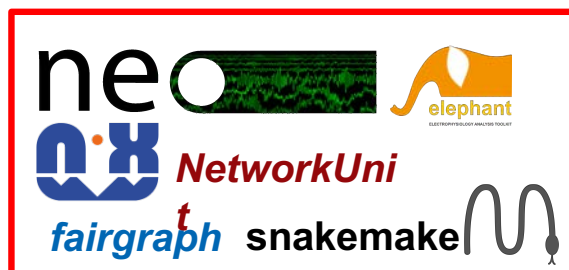
APE-Fork: <https://github.com/APE-group/wavescalephant>



SWAP is **Slow Wave Analysis Pipeline**, a robust analysis procedure capable to extract, plot and statistically evaluate the **spatio-temporal features** of slow waves and **propagation dynamics**, offering a set of **software tools and methods** that allow going **from raw-data to statistical assessment of results**.

SWAP has been largely employed in the analysis of experimental data. Currently, efforts have been directed to the improvement of the pipeline towards **robustness and flexibility**, **expanding/integrating general tools**, aimed at extending the range of applicability (diverse experimental datasets and the outcome of simulations) and at integrating it into the **HBP platforms**.

Related Pipeline: **SOAP (Slow Oscillation Analysis Pipeline)**, to investigate the **local properties** of Slow Oscillations (SO) of the multi-unit activity signal between Up and Down states, complementing and enriching the information of the SWAP.



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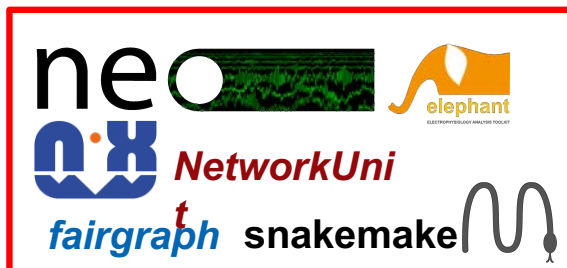
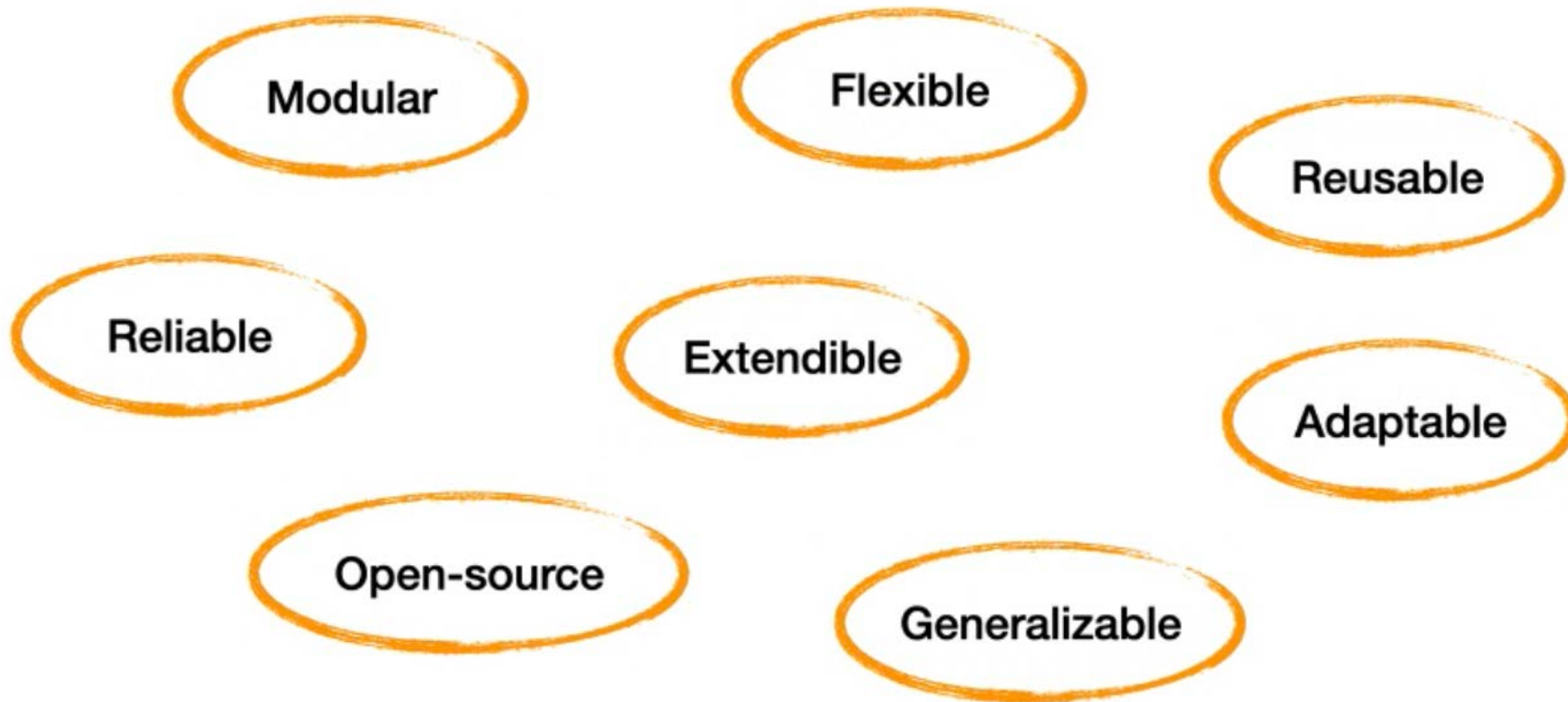
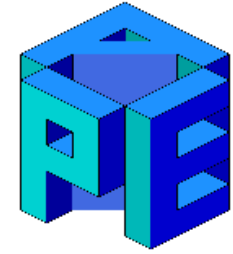


[WaveScaleES-APELab Software Pipelines]

# SWAP and SOAP

<https://github.com/INM-6/wavescalephant>

APE-Fork: <https://github.com/APE-group/wavescalephant>



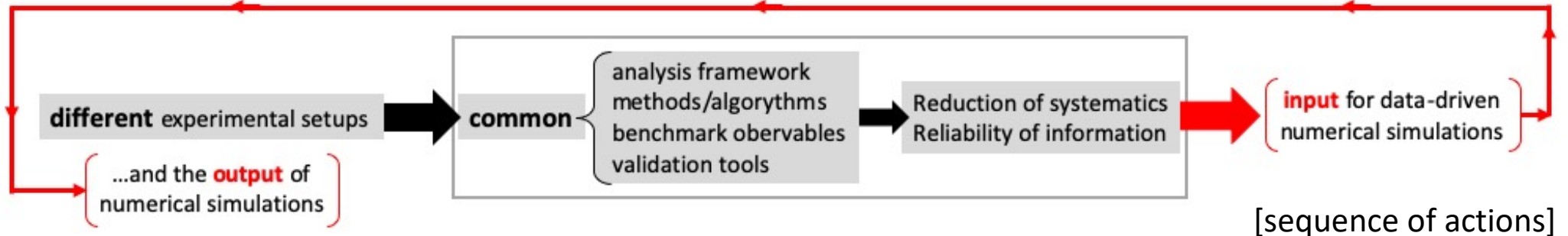
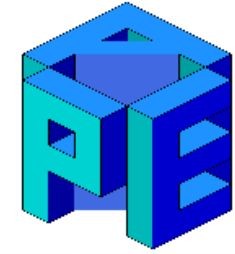
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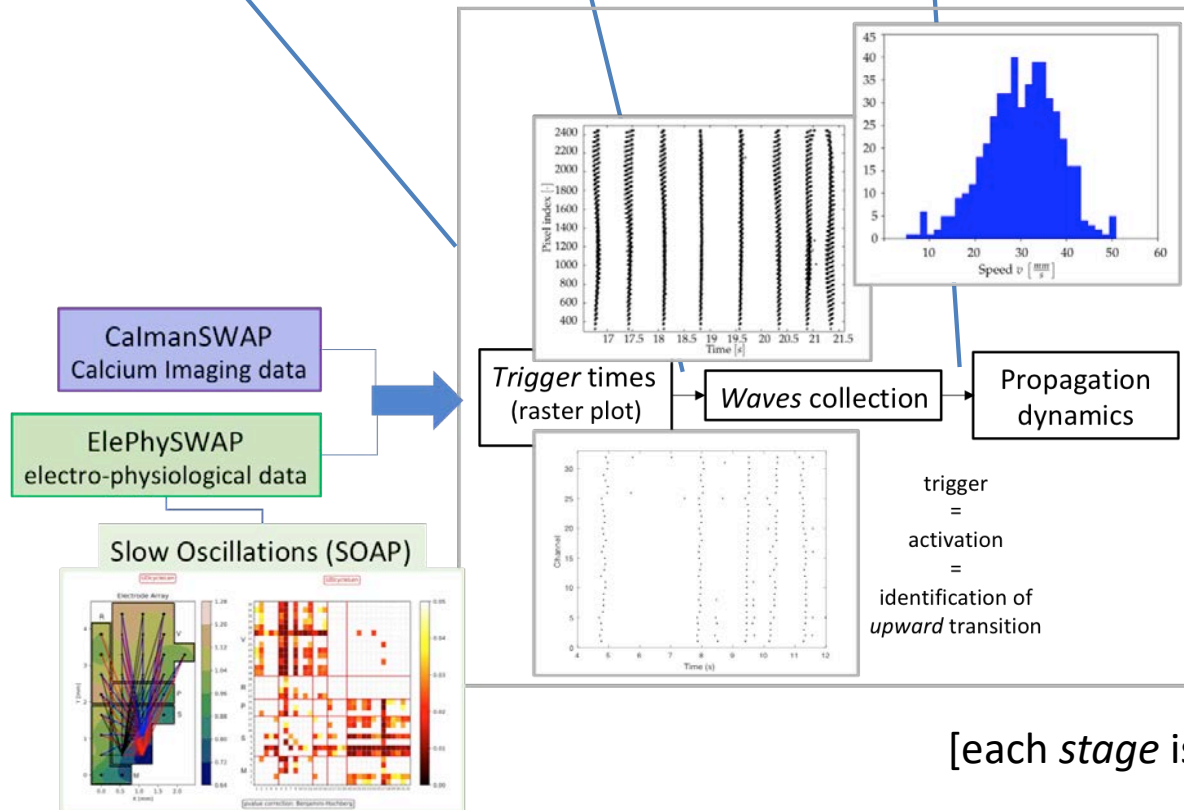




# Common Analysis Framework and Pipeline Stages



Data Entry | Processing | Trigger Detection | Wave Detection | Wave Characterization

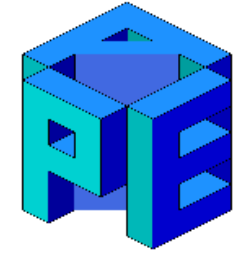


[each stage is made up of blocks]



# Data Analysis – MEA data

## Features of the SOs and differential excitability

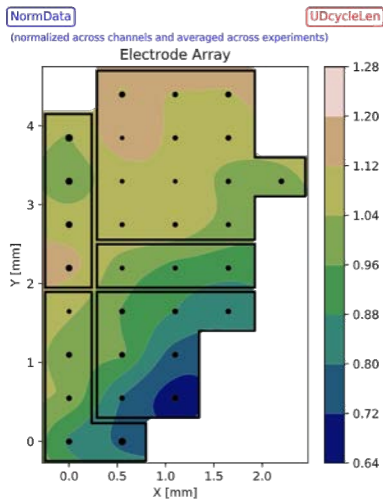
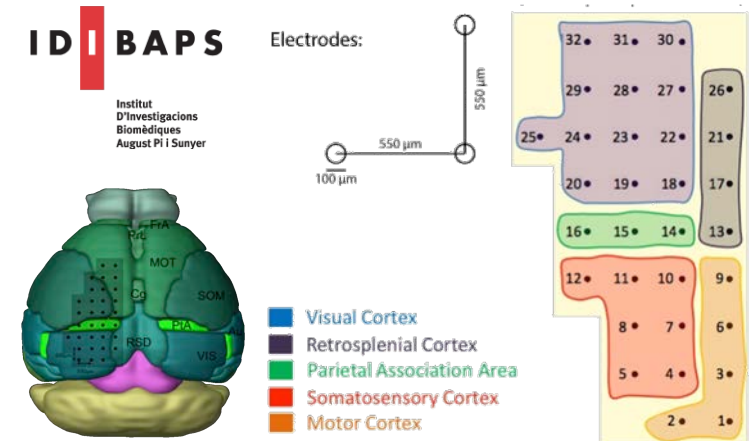


### RESULTS

- **differentiation of cortical areas**
- **gradients of excitability**, in particular along a direction from fronto-lateral towards occipito-medial regions.

### OUTCOME and PERSPECTIVE

- classification of **brain states** (levels of anaesthesia)
- **input for theoretical models and data-driven simulations.**



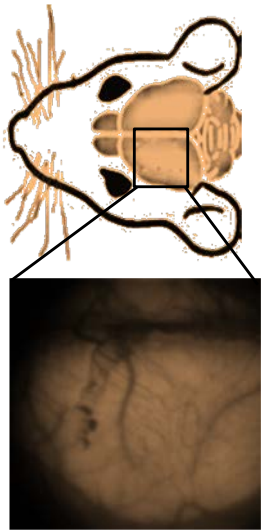
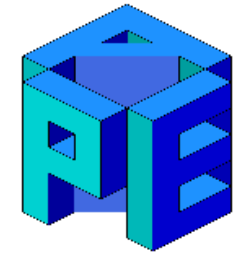
G. De Bonis et al., *Front Syst Neurosci.* (2019)  
[arXiv:1902.08599](https://arxiv.org/abs/1902.08599) [q-bio.NC]

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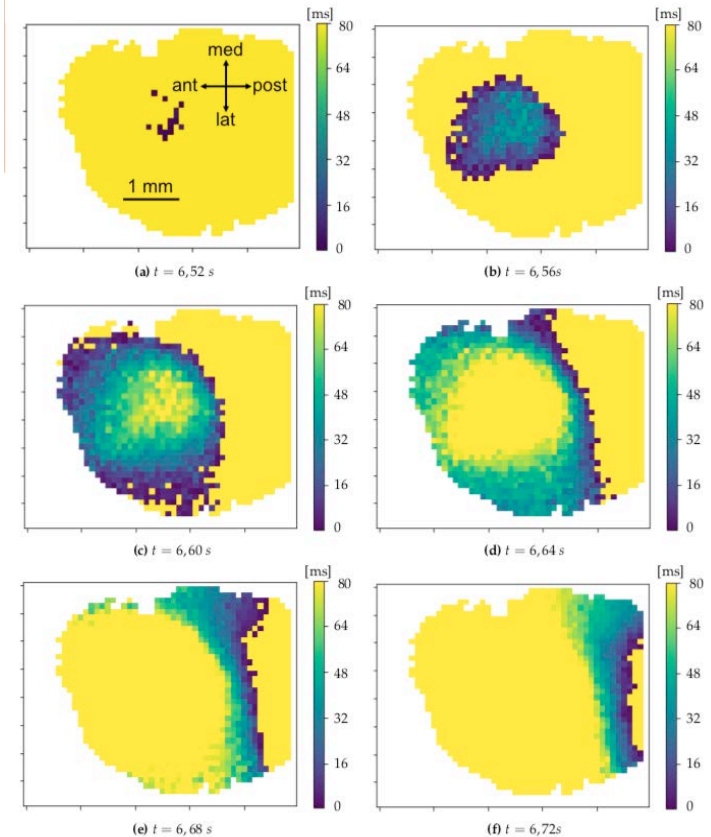
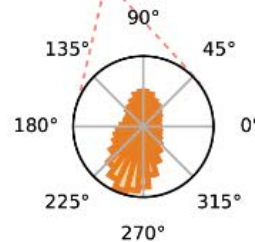
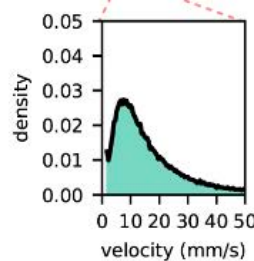
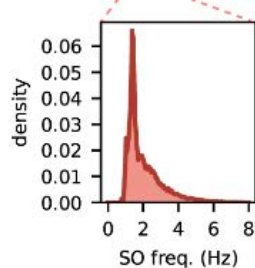
# Data Analysis – Optical Imaging data

Detection of wavefronts, SW propagation, features of the SWs



## RESULTS

- Development of new **tools and methods**, integrated with established ones, for supporting **quantitative studies** of neuronal dynamics for imaging data, aimed at **overcoming the limited spatial resolution of electrode arrays** (from electrodes to pixels).
- Statistical analysis of observed **spatio-temporal propagation patterns**.



Propagation of the wavefront along the cortex surface

M. Celotto et al., **Methods Protoc.** (2020)  
[arXiv:1811.11687](https://arxiv.org/abs/1811.11687) [q-bio.NC];  
 C. Capone et al., in preparation

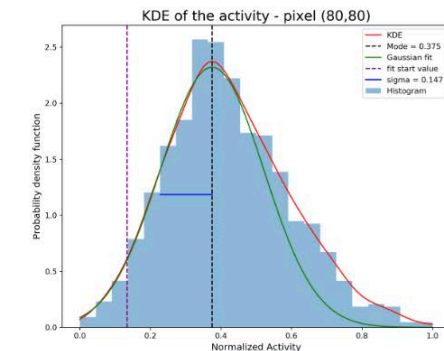
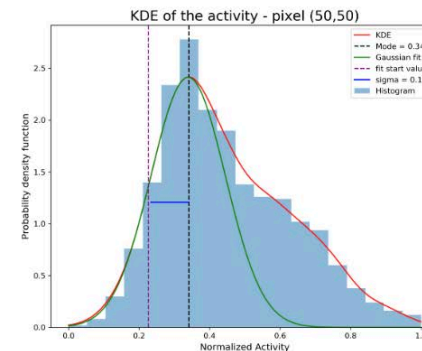
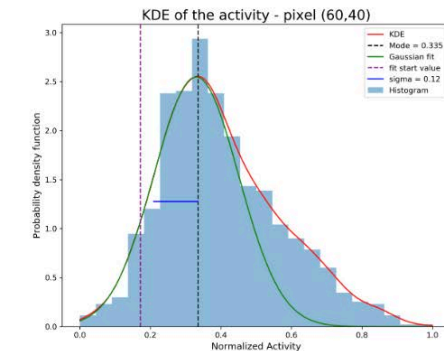
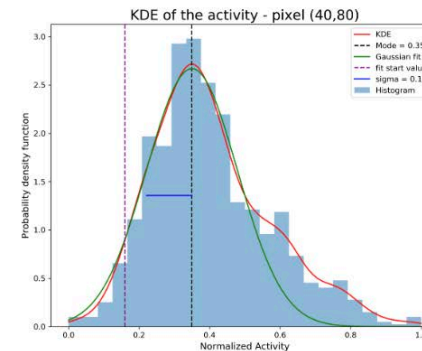
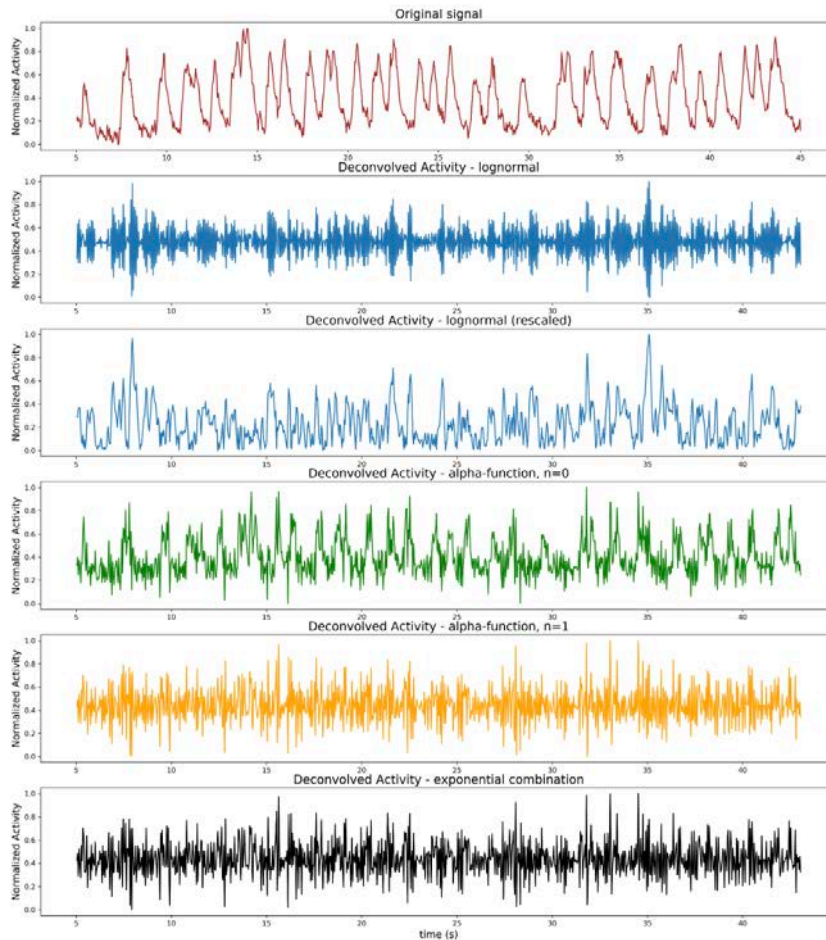
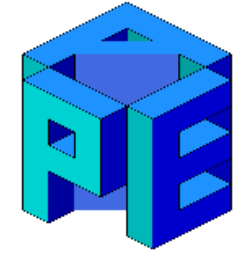
...started from the work of students from Physics Lab. II (Biosystems), 2018 + inputs from 2019

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# Data Analysis – Analysis Tools

Development of analysis tools (*blocks*) for SWAP:  
deconvolution, KDE (Kernel Density Estimation)



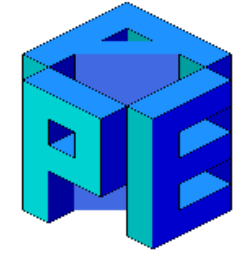
Deconvolution of optical imaging data  
→ inference of model parameters  
(the loop: from data to model)

work of students from Physics Lab. II  
(Biosystems), 2020 → pre-print in  
preparation

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[giulia.debonis@roma1.infn.it](mailto:giulia.debonis@roma1.infn.it)



# Data Analysis



## Proposed items of activity (1)

### (1) Optical Imaging

**Topic:** Analysis of electrophysiological data collected from anesthetized mice with optical imaging techniques (wide-field microscopy). **New dataset:** isoflurane, stimulated data.

**Target:** Study of waves propagation patterns, propagation speed, excitability, multi-areal connectivity; **comparison ketamine vs isoflurane; comparison spontaneous vs perturbed data; comparison with electrodes data.**

#### **The candidates should:**

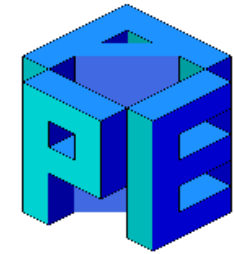
- be interested in cortical activity during sleep;
- be interested in statistics and statistical analysis of experimental data;
- know/be willing to learn MATLAB and Python, and Python-based tools (Elephant, Snakemake, Neo)

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# Data Analysis



## Proposed items of activity (2)

### (2) SWAP

**Topic:** Development and improvement of the analysis pipeline, test on experimental and simulated data.

**Target:** Focus on reliability, robustness, reconfigurability, portability, parallelization, open source.

#### **The candidates should:**

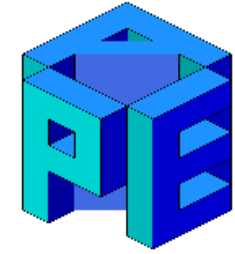
- be interested in programming, code optimization, parallelization;
- be interested in computer science and algorithms;
- know/be willing to learn MATLAB, Python, Python-based tools (Elephant, Snakemake, Neo) + any other programming languages/tools useful for improving performance.

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# Data Analysis



## Proposed items of activity (3)

### (3) Epidural EEG and Measures of Complexity

**Topic:** Analysis of electrophysiological data collected from mice under anesthesia and in natural sleep, using epidural EEG recordings.

**Target:** Test of the SWAP software tools to different datasets, and evaluation of possible extensions; determination and classification of waves propagation patterns; comparison of different anesthetics and natural sleep; measures of complexity and level of consciousness.

#### **The candidates should:**

- be interested in cortical activity during sleep, and in quantitative assessment of the level of consciousness;
- be interested in statistics and statistical analysis of experimental data;
- know/be willing to learn MATLAB and Python, and Python-based tools (Elephant, Snakemake, Neo)

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