

Blocks instead of puzzles pieces analyzing cortical wave activity across scales in an adaptable framework

Robin Gutzen | Research Center Juelich, Germany

EBRAINS Workshop BASSES | 13-15 June 2022 | Rome, Italy & virtual



Co-funded by
the European Union

Science is collaborative



Sonja Grün
Michael Denker



Giulia De Bonis
Elena Pastorelli
Cristiano Capone
Chiara De Luca
Pier Stanislao Paolucci



Andrew Davison

ISTITUTO SUPERIORE DI SANITA'

Maurizio Mattia



Arnaud Manasanch
Maria V. Sanchez-Vives

Science is collaborative



Sonja Grün
Michael Denker



Giulia De Bonis
Elena Pastorelli
Cristiano Capone
Chiara De Luca
Pier Stanislao Paolucci



Andrew Davison

ISTITUTO SUPERIORE DI SANITA'

Maurizio Mattia

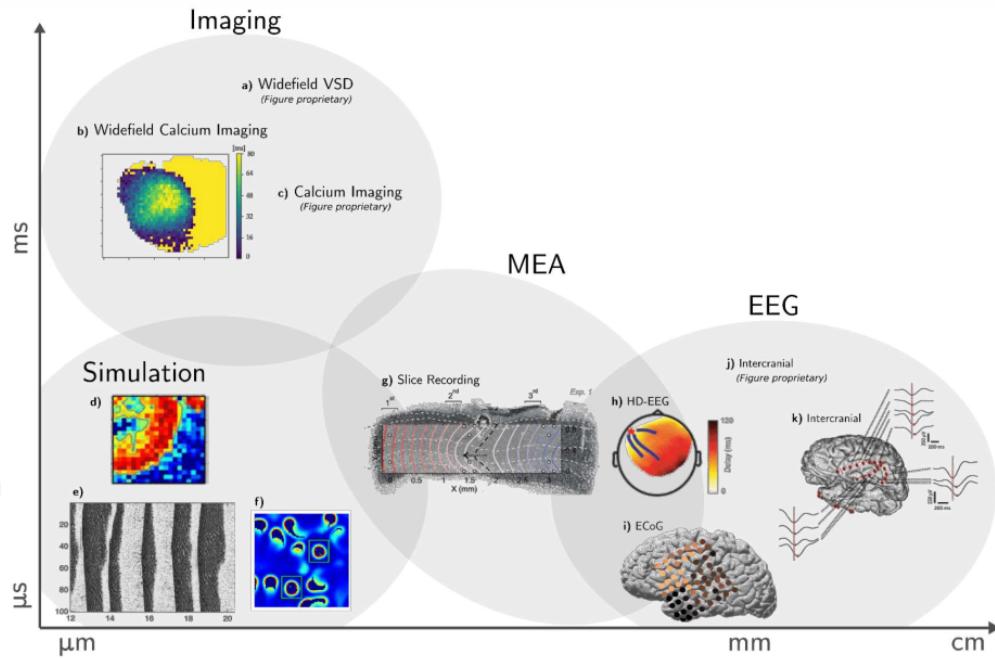


Anna Letizia Allegra Mascaro
Francesco Resta
Francesco Saverio Pavone

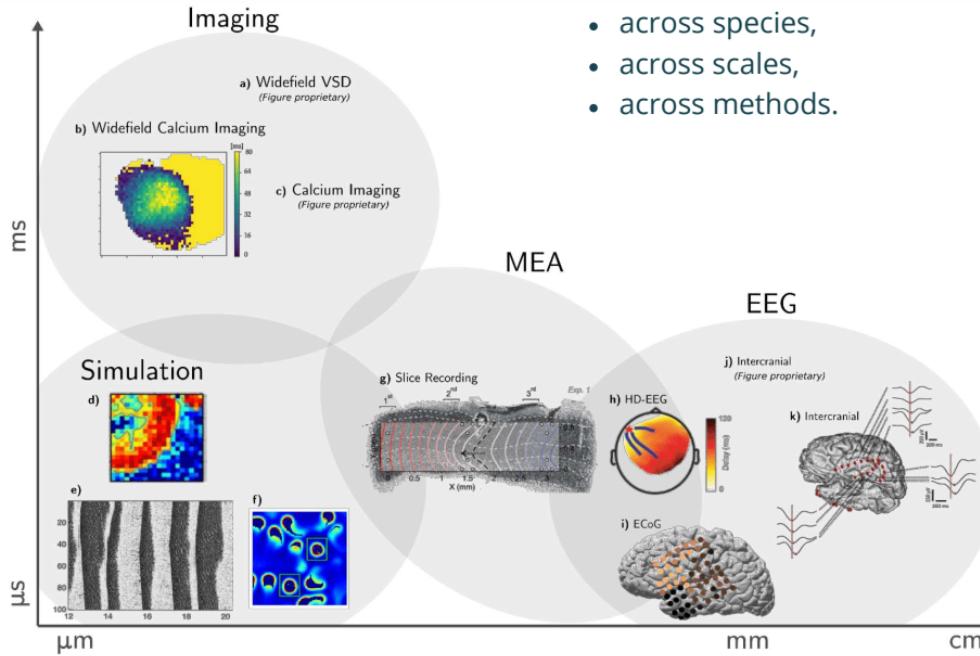


Arnaud Manasanch
Maria V. Sanchez-Vives

How to combine and compare heterogeneous data?



How to combine and compare heterogeneous data?

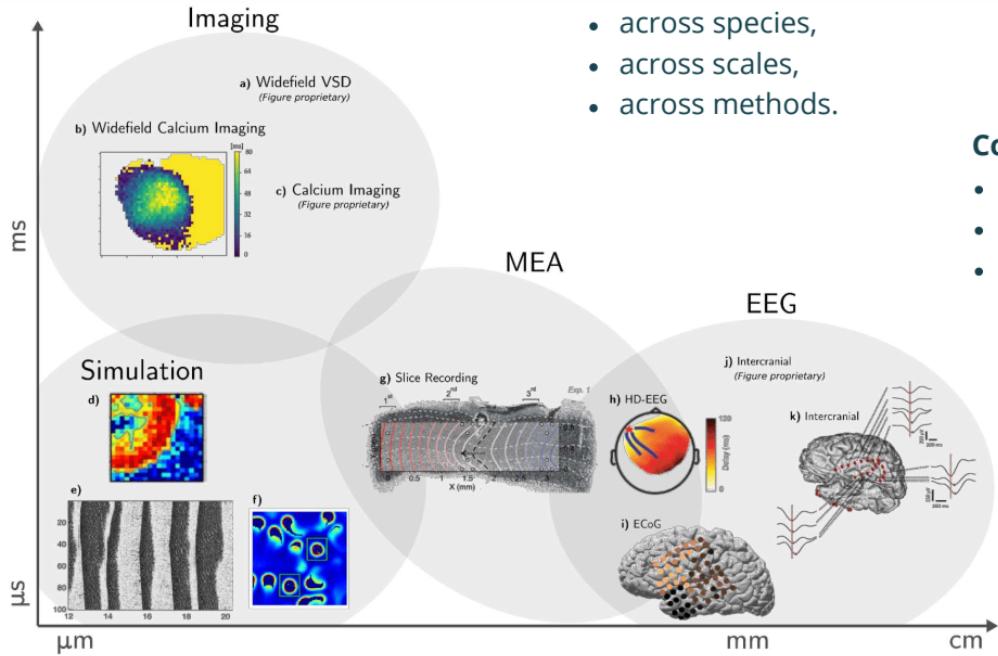


Slow cortical waves are observable

- across species,
- across scales,
- across methods.

Figure references in Appendix

How to combine and compare heterogeneous data?



Slow cortical waves are observable

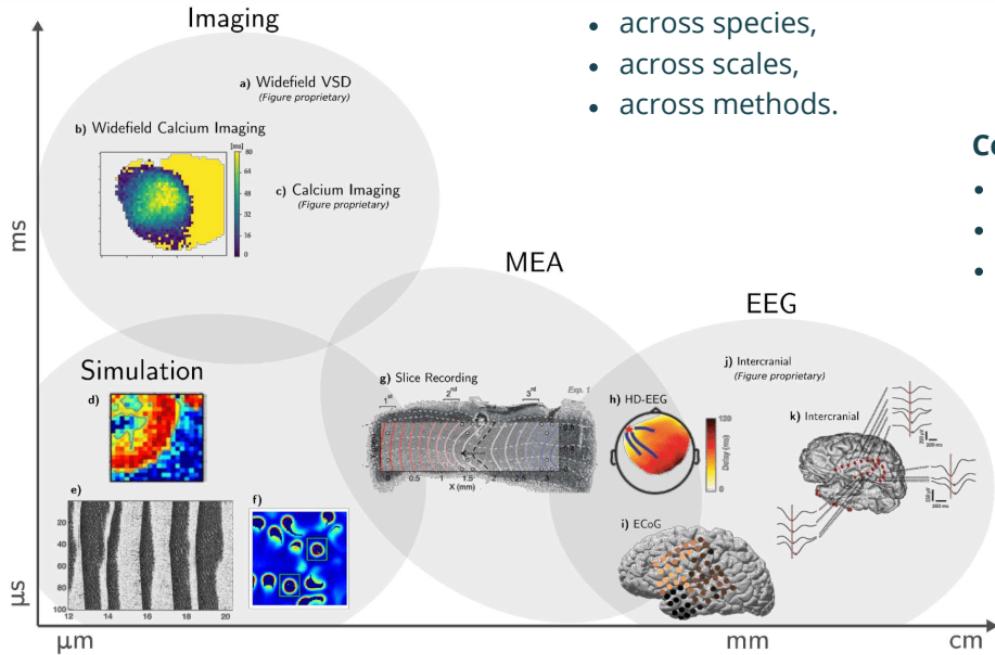
- across species,
- across scales,
- across methods.

Comparability is needed for

- integration of data sources,
- quantifying experimental variability,
- model calibration & validation.

Figure references in Appendix

How to combine and compare heterogeneous data?



Slow cortical waves are observable

- across species,
- across scales,
- across methods.

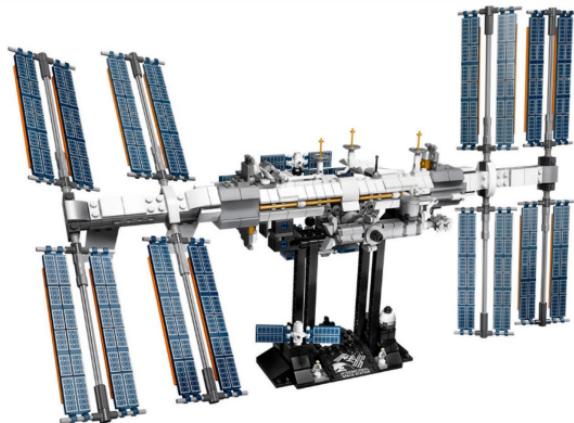
Comparability is needed for

- integration of data sources,
- quantifying experimental variability,
- model calibration & validation.

How can analysis workflows support comparability?

Figure references in Appendix

Building analysis workflows is (not) rocket science



Puzzle pieces vs. building blocks



Puzzle pieces vs. building blocks



Modularity

the elements are combinable in multiple ways

Puzzle pieces vs. building blocks



✗



✓

Modularity

the elements are combinable in multiple ways

✗

Adaptability

elements can be added, removed, or changed

✓

Puzzle pieces vs. building blocks



✗

Modularity

the elements are combinable in multiple ways

✓

✗

Adaptability

elements can be added, removed, or changed

✓

✗

Reproducibility

the elements are individually maintainable

✓



Puzzle pieces vs. building blocks



✗

Modularity

the elements are combinable in multiple ways

✓

✗

Adaptability

elements can be added, removed, or changed

✓

✗

Reproducibility

the elements are individually maintainable

✓

✗

Reusability

the basic elements and individual parts are useful on their own

✓



Puzzle pieces vs. building blocks



✗

Modularity

the elements are combinable in multiple ways

✓

✗

Adaptability

elements can be added, removed, or changed

✓

✗

Reproducibility

the elements are individually maintainable

✓

✗

Reusability

the basic elements and individual parts are useful on their own

✓

✗

Versatility

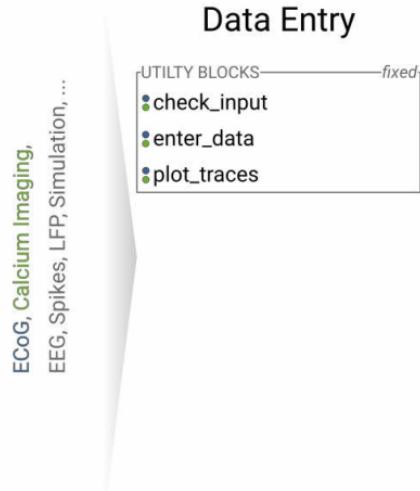
its usability can be expanded beyond its initial scope

✓

A modular analysis pipeline from building blocks: Cobrawap

EEG, Calcium Imaging,
EEG, Spikes, LFP, Simulation, ...

A modular analysis pipeline from building blocks: Cobrawap



A modular analysis pipeline from building blocks: Cobrawap

EEG, Calcium Imaging,
EEG, Spikes, LFP, Simulation, ...



A modular analysis pipeline from building blocks: Cobrawap

EEG, Calcium Imaging,
EEG, Spikes, LFP, Simulation, ...

Data Entry

- UTILITY BLOCKS—fixed
- check_input
 - enter_data
 - plot_traces

Processing

- UTILITY BLOCKS—fixed
- check_input
 - plot_processed_traces
- PROCESSING BLOCKS—choose any
- roi_selection
 - background_subtraction
 - normalization
 - frequency_filter
 - zscore
 - detrending
 - subsampling
 - spatial_downsampling
 - logMUA_estimation
 - phase_transform

Trigger Detection

- UTILITY BLOCKS—fixed
- check_input
 - plot_trigger_times
- DETECTION BLOCKS—choose one
- threshold
 - hilbert_phase
 - minima
- FILTER BLOCKS—choose any
- remove_short_states

A modular analysis pipeline from building blocks: Cobrawap

ECOG, Calcium Imaging,
EEG, Spikes, LFP, Simulation, ...

Data Entry

- UTILITY BLOCKS—fixed
- check_input
 - enter_data
 - plot_traces

Processing

- UTILITY BLOCKS—fixed
- check_input
 - plot_processed_traces

- PROCESSING BLOCKS—choose any
- roi_selection
 - background_subtraction
 - normalization
 - frequency_filter
 - zscore
 - detrending
 - subsampling
 - spatial_downsampling
 - logMUA_estimation
 - phase_transform

Trigger Detection

- UTILITY BLOCKS—fixed
- check_input
 - plot_trigger_times

- DETECTION BLOCKS—choose one
- threshold
 - hilbert_phase
 - minima

- FILTER BLOCKS—choose any
- remove_short_states

Wave Detection

- UTILITY BLOCKS—fixed
- check_input
 - merge_wave_definitions
 - plot_waves

- DETECTION BLOCKS—choose one
- trigger_clustering
 - time_sequence_cropping

- ADD. PROPERTIES—choose any
- optical_flow
 - critical_points
 - wave_mode_clustering

A modular analysis pipeline from building blocks: Cobrawap

ECOG, Calcium Imaging,
EEG, Spikes, LFP, Simulation, ...

Data Entry

UTILITY BLOCKS	fixed
• check_input	
• enter_data	
• plot_traces	

Processing

UTILITY BLOCKS	fixed
• check_input	
• plot_processed_traces	

PROCESSING BLOCKS	choose any
• roi_selection	
• background_subtraction	
• normalization	
• frequency_filter	
• zscore	
• detrending	
• subsampling	
• spatial_downsampling	
• logMUA_estimation	
• phase_transform	

Trigger Detection

UTILITY BLOCKS	fixed
• check_input	
• plot_trigger_times	

DETECTION BLOCKS	choose one
• threshold	
• hilbert_phase	
• minima	

FILTER BLOCKS	choose any
• remove_short_states	

Wave Detection

UTILITY BLOCKS	fixed
• check_input	
• merge_wave_definitions	

DETECTION BLOCKS	choose one
• trigger_clustering	
• time_sequence_cropping	

ADD. PROPERTIES	choose any
• optical_flow	
• critical_points	
• wave_mode_clustering	

Characterization

UTILITY BLOCKS	fixed
• check_input	
• merge_characterizations	

MEASURE BLOCKS	choose any
• annotations	
• label_planar	
• velocity_planar	
• direction_planar	
• inter_wave_interval	
• number_of_trigger	
• duration	
• velocity_local	
• direction_local	
• inter_wave_interval_local	

A modular analysis pipeline from building blocks: Cobrawap

EEG, Calcium Imaging,
EEG, Spikes, LFP, Simulation, ...

Data Entry

UTILITY BLOCKS	fixed
• check_input	
• enter_data	
• plot_traces	

Processing

UTILITY BLOCKS	fixed
• check_input	
• plot_processed_traces	

PROCESSING BLOCKS	choose any
• roi_selection	
• background_subtraction	
• normalization	
• frequency_filter	
• zscore	
• detrending	
• subsampling	
• spatial_downsampling	
• logMUA_estimation	
• phase_transform	

Trigger Detection

UTILITY BLOCKS	fixed
• check_input	
• plot_trigger_times	

DETECTION BLOCKS	choose one
• threshold	
• hilbert_phase	
• minima	

FILTER BLOCKS	choose any
• remove_short_states	

Wave Detection

UTILITY BLOCKS	fixed
• merge_wave_definitions	
• plot_waves	

DETECTION BLOCKS	choose one
• trigger_clustering	
• time_sequence_cropping	

ADD. PROPERTIES	choose any
• optical_flow	
• critical_points	
• wave_mode_clustering	

Characterization

UTILITY BLOCKS	fixed
• check_input	
• merge_characterizations	

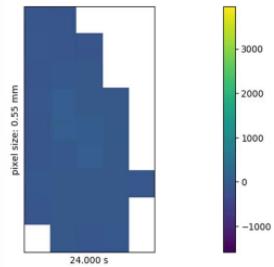
MEASURE BLOCKS	choose any
• annotations	
• label_planar	
• velocity_planar	
• direction_planar	
• inter_wave_interval	
• number_of_trigger	
• duration	
• velocity_local	
• direction_local	
• inter_wave_interval_local	



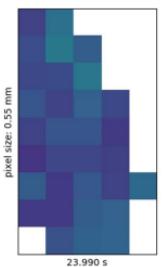
Adapting the pipeline to heterogeneous data

ECOG

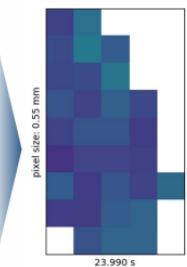
Data Entry



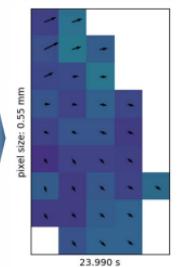
Processing



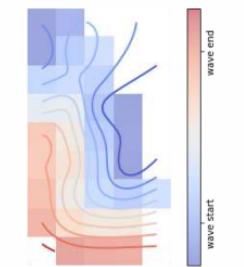
Trigger Detection



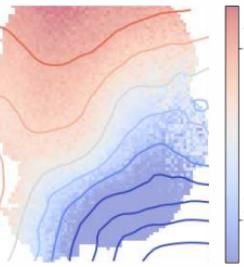
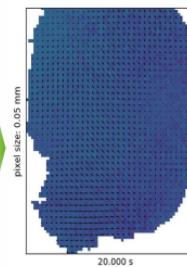
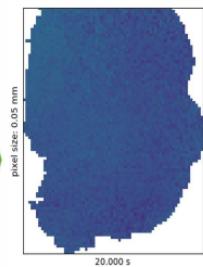
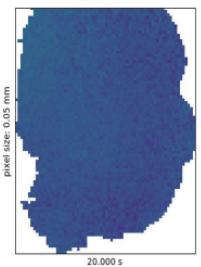
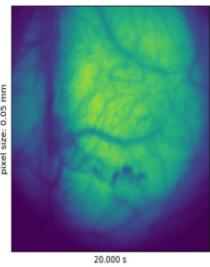
Wave Detection



Characterization



Calcium Imaging

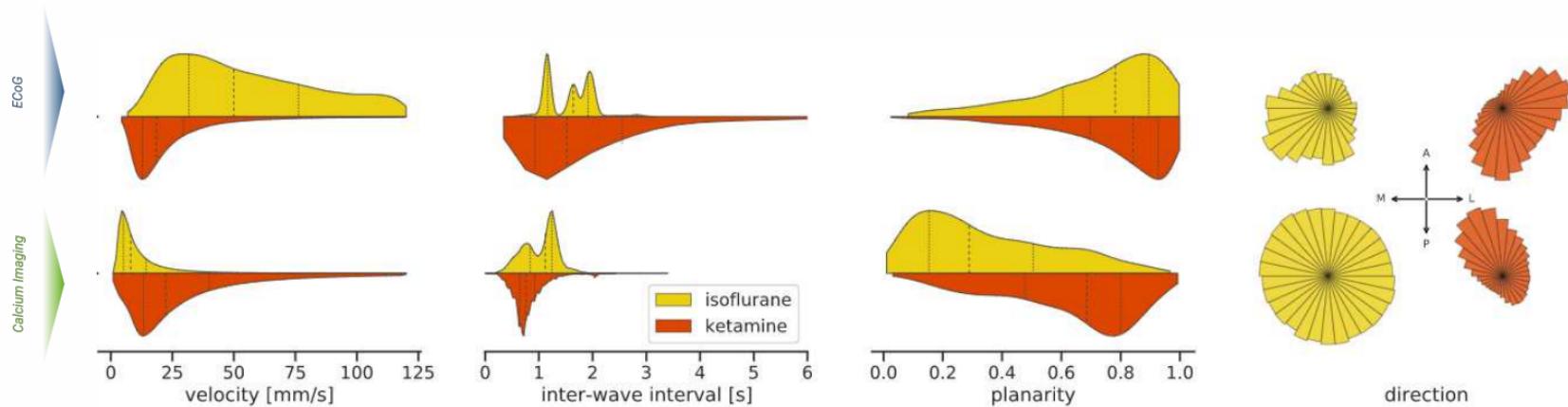


data from Resta et al. 2021, and Sanchez-Vives 2019

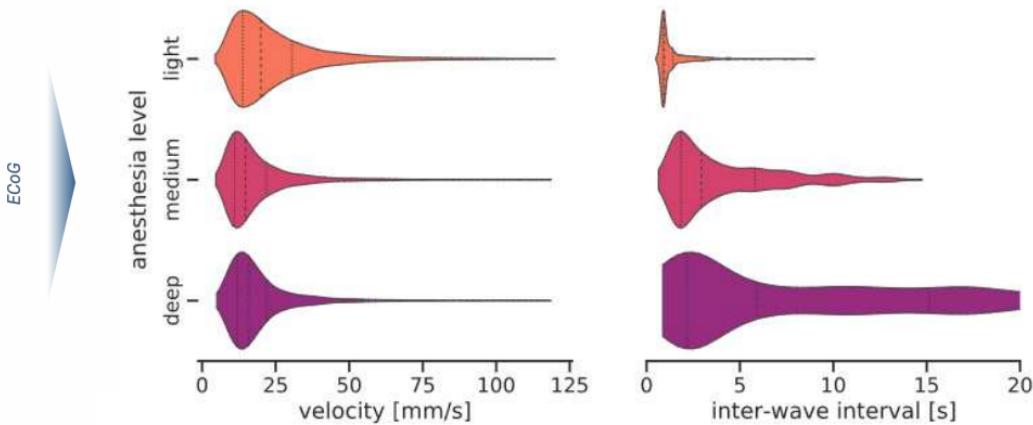
Comparable data enables meta-studies

Characterizing slow waves in anesthetized mice:

2 measurement techniques / 5 datasets / 60 recordings / 6.6 h activity data

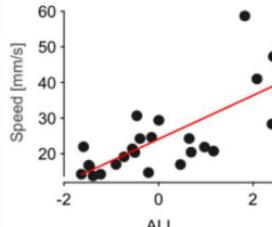


Reproducible pipeline → reproducible results



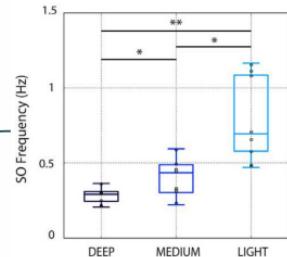
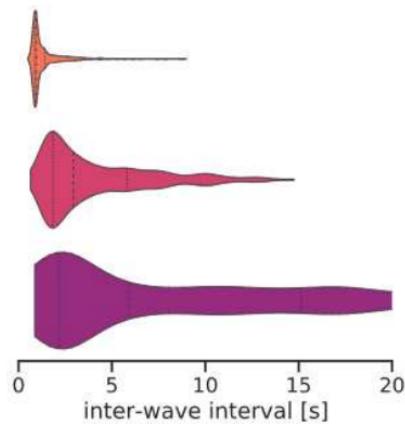
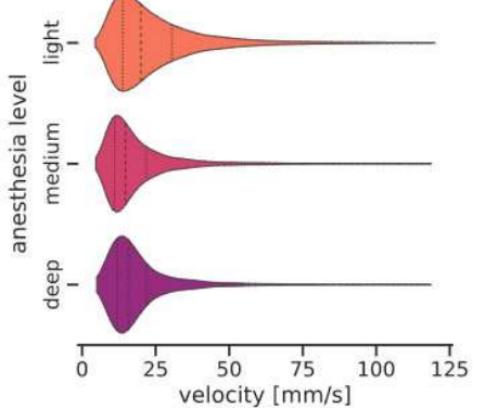
data from Sanchez-Vives 2020

Reproducible pipeline → reproducible results



Pazienti et al. 2022

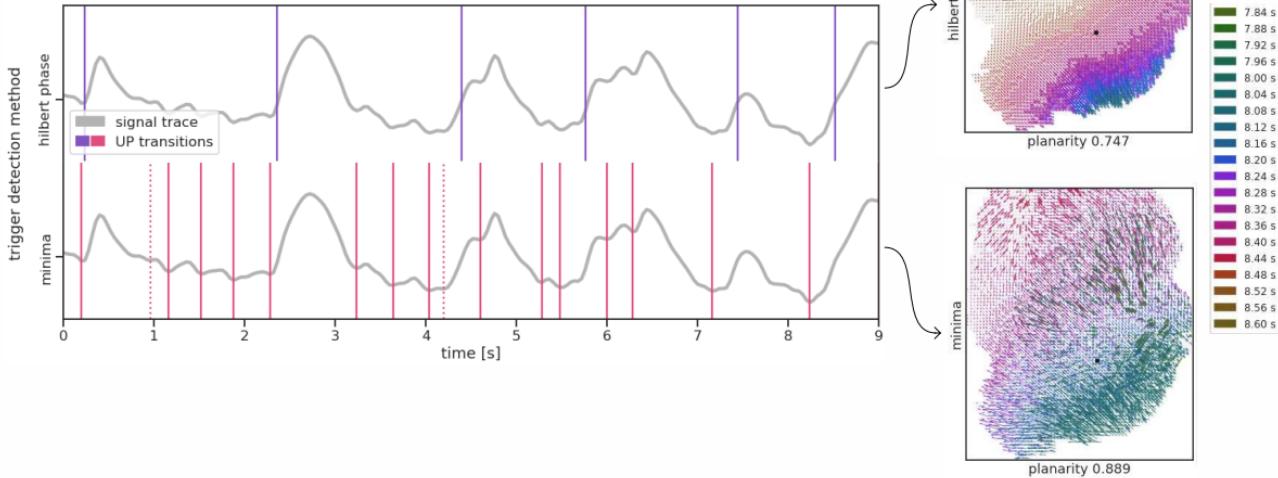
EEG



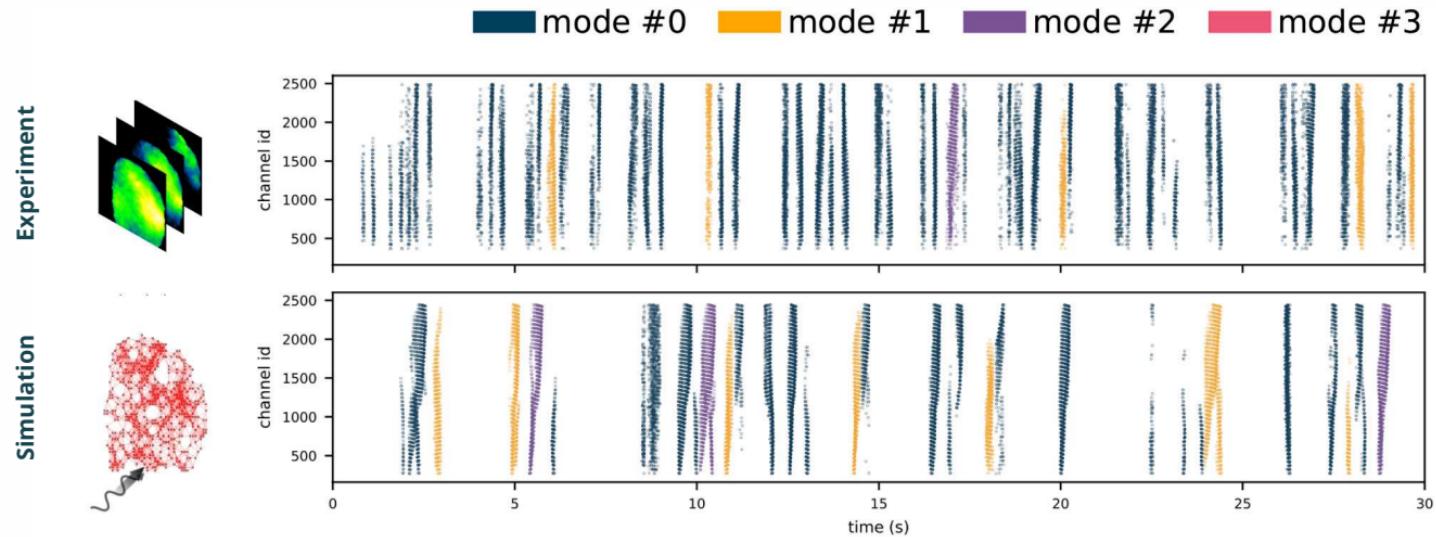
Dasilva et al. 2021

data from Sanchez-Vives 2020

Comparing methods on the same data

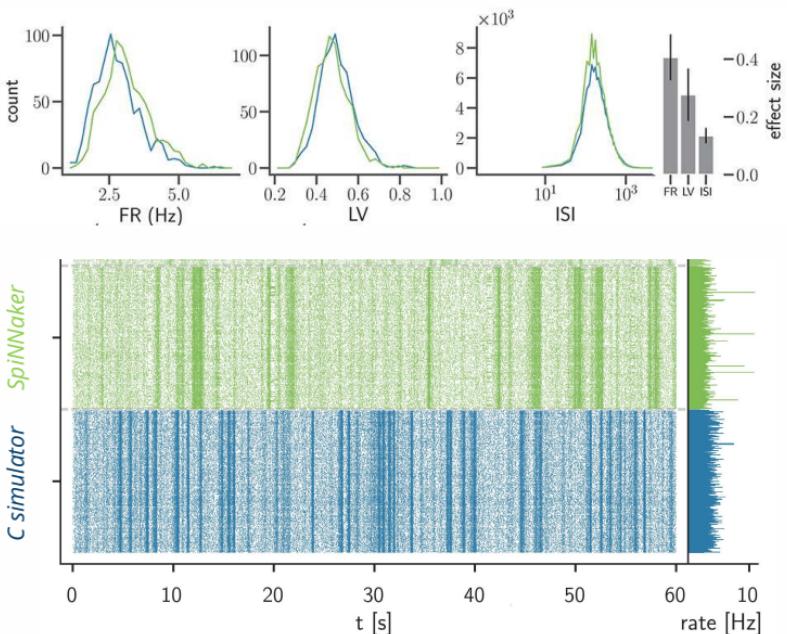
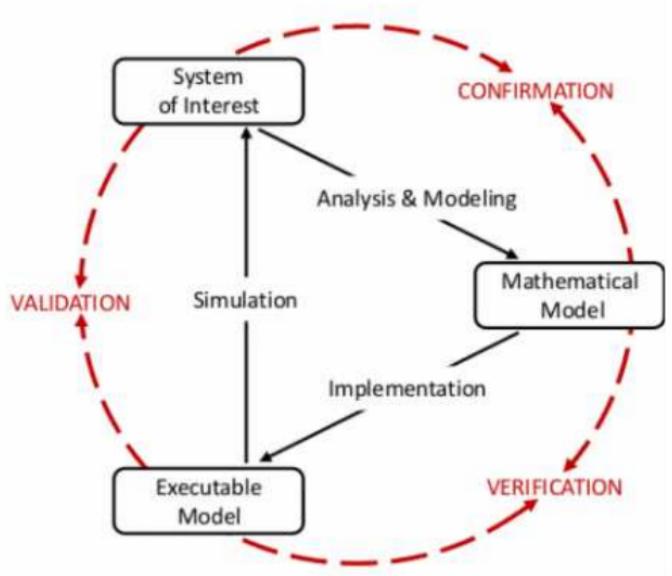


Comparison to models: Calibration & Validation



Capone et al. 2021

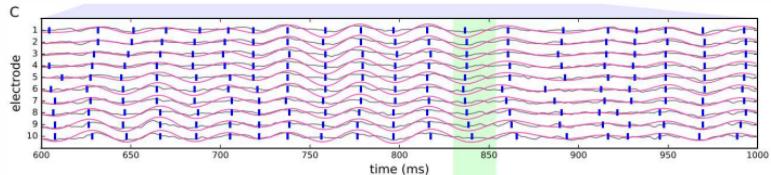
Network-level validation



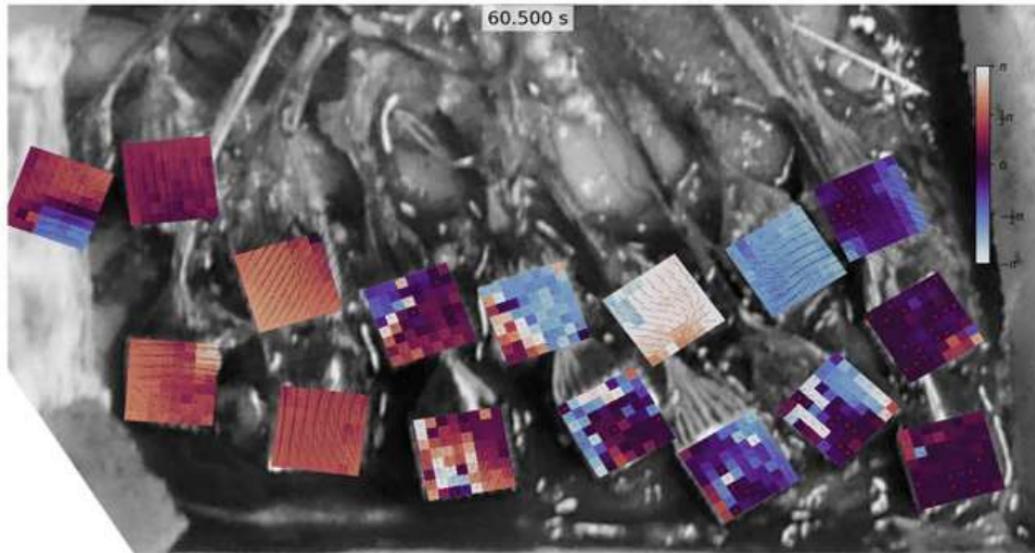
<https://github.com/INM-6/NetworkUnit>

Gutzen et al. 2018
Trensch et al. 2018

Reusing the pipeline for cortical beta-waves



Denker et al. 2018



data from Chen et al. 2022

The benefits of a pipeline from blocks

Modularity

the elements are combinable in multiple ways

Adaptability

elements can be added, removed, or changed

Reproducibility

the elements are individually maintainable

Reusability

the basic elements and individual parts are useful on their own

Versatility

its usability can be expanded beyond its initial scope

The benefits of a pipeline from blocks

Modularity

the elements are combinable in multiple ways



Adaptability

elements can be added, removed, or changed

Reproducibility

the elements are individually maintainable

Reusability

the basic elements and individual parts are useful on their own

Versatility

its usability can be expanded beyond its initial scope

The benefits of a pipeline from blocks

Modularity

the elements are combinable in multiple ways

Adaptability

elements can be added, removed, or changed

Reproducibility

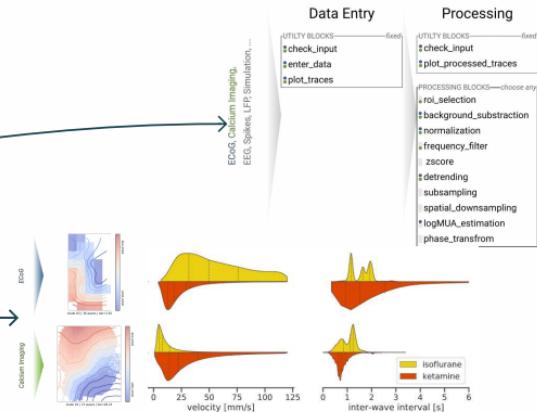
the elements are individually maintainable

Reusability

the basic elements and individual parts are useful on their own

Versatility

its usability can be expanded beyond its initial scope



The benefits of a pipeline from blocks

Modularity

the elements are combinable in multiple ways

Adaptability

elements can be added, removed, or changed

Reproducibility

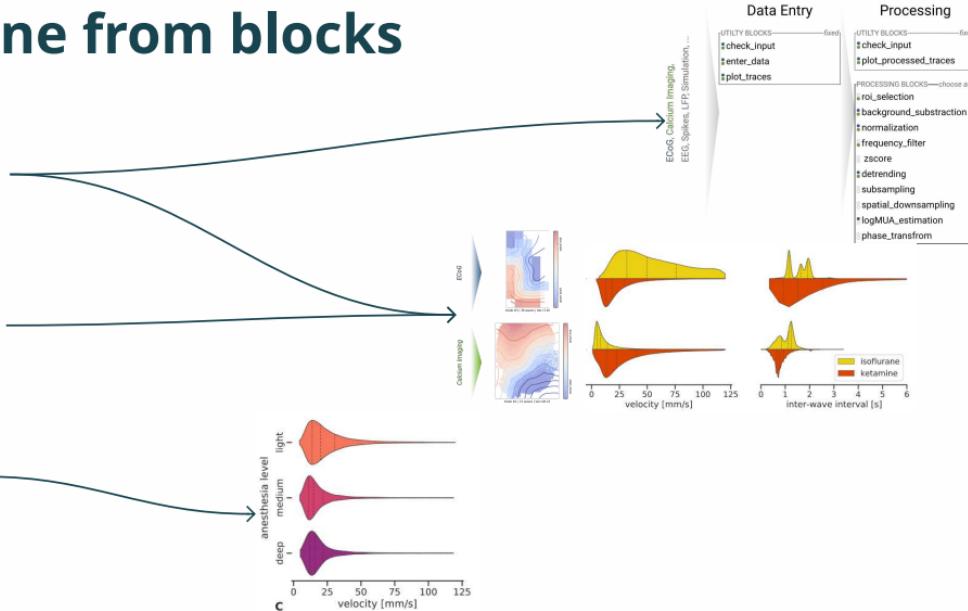
the elements are individually maintainable

Reusability

the basic elements and individual parts are useful on their own

Versatility

its usability can be expanded beyond its initial scope



The benefits of a pipeline from blocks

Modularity

the elements are combinable in multiple ways

Adaptability

elements can be added, removed, or changed

Reproducibility

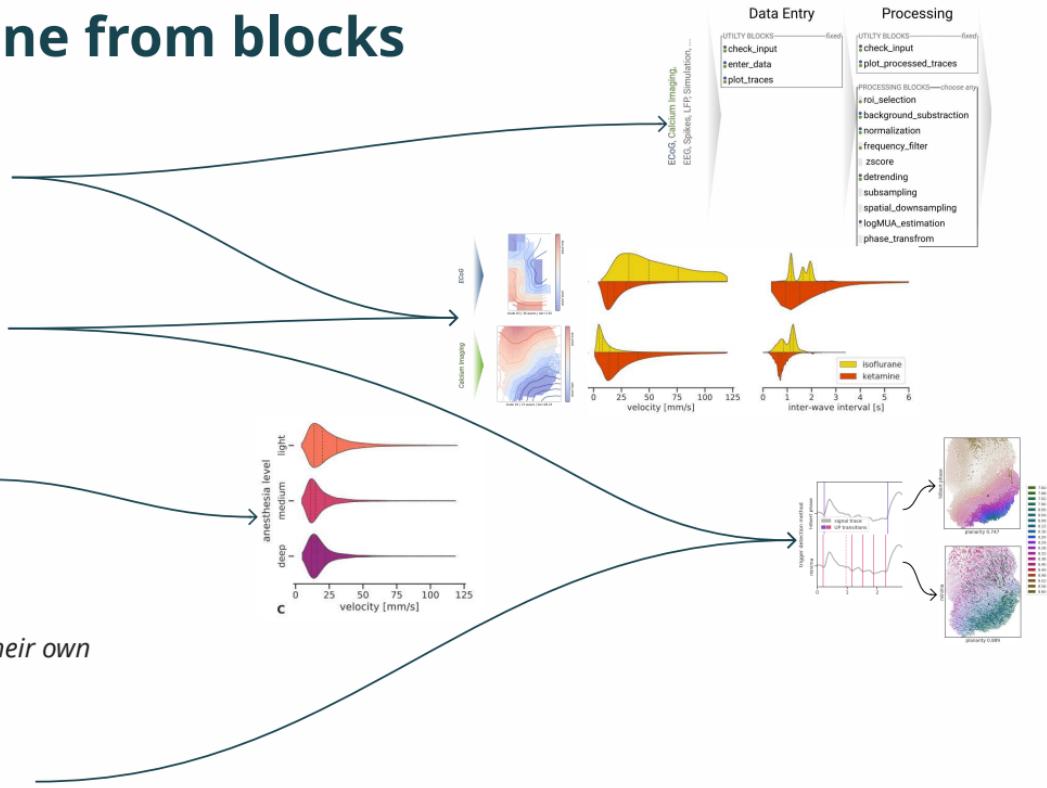
the elements are individually maintainable

Reusability

the basic elements and individual parts are useful on their own

Versatility

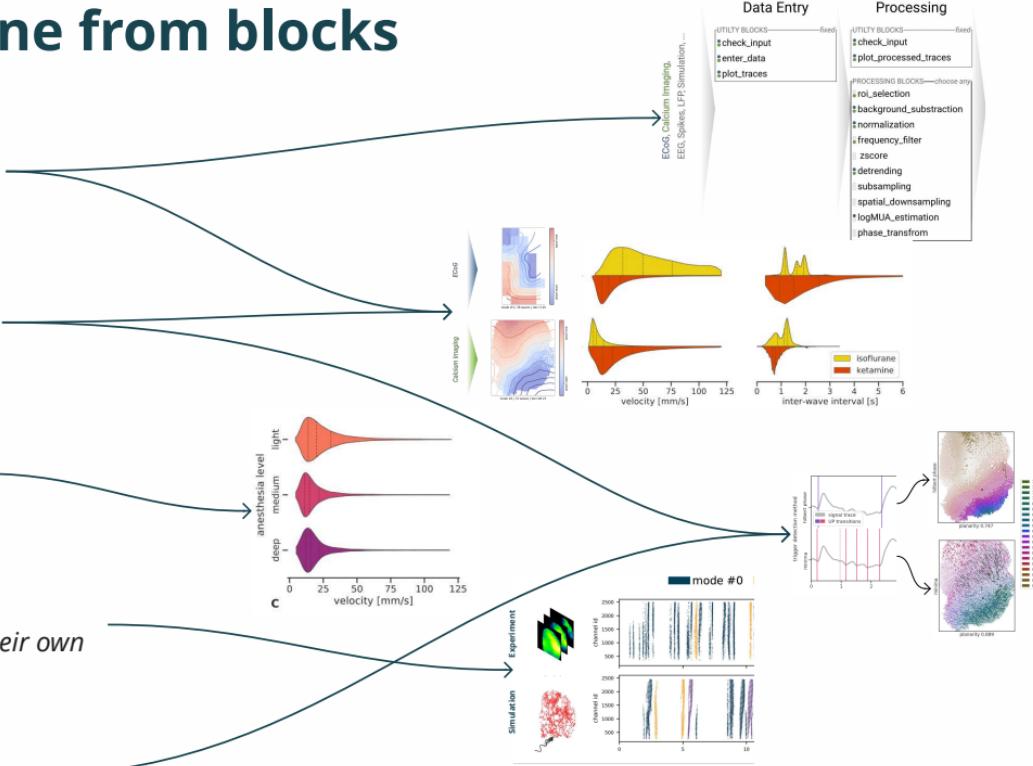
its usability can be expanded beyond its initial scope



The benefits of a pipeline from blocks

Modularity

the elements are combinable in multiple ways



Versatility

its usability can be expanded beyond its initial scope

The benefits of a pipeline from blocks

Modularity

the elements are combinable in multiple ways

Adaptability

elements can be added, removed, or changed

Reproducibility

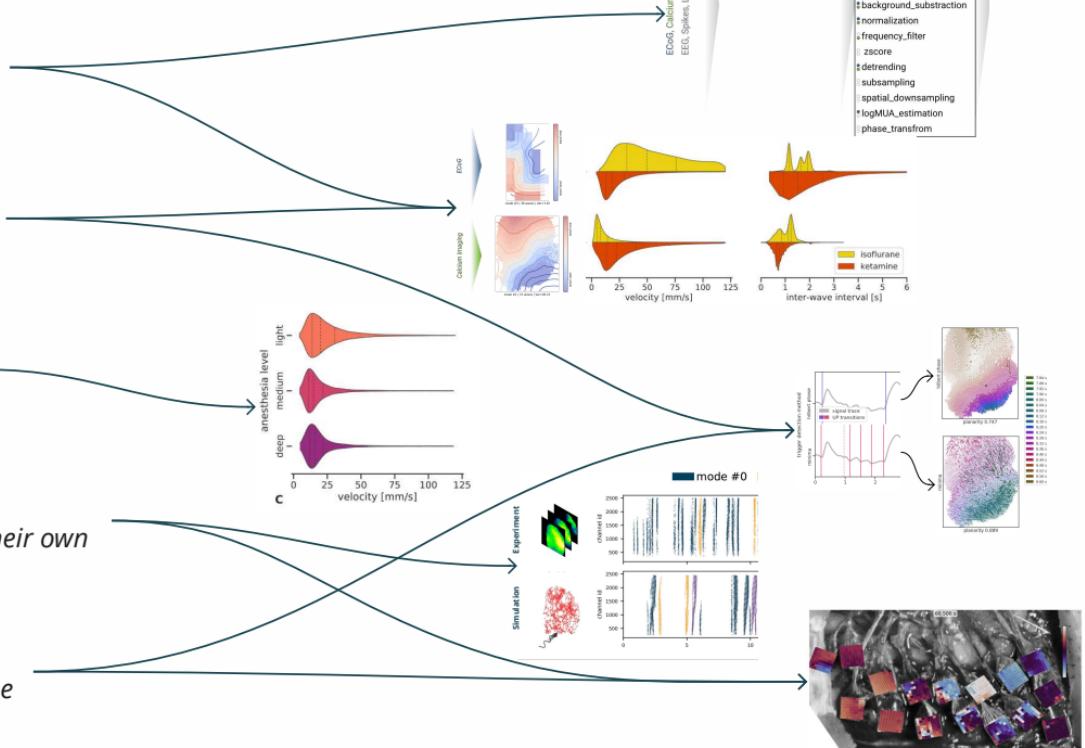
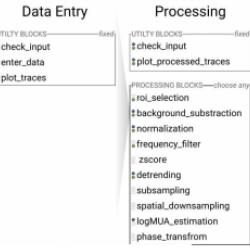
the elements are individually maintainable

Reusability

the basic elements and individual parts are useful on their own

Versatility

its usability can be expanded beyond its initial scope



Reuse and sharing of analysis pipelines can make science more collaborative!

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

 @rgutzen



Co-funded by
the European Union



**Reuse and sharing of analysis pipelines
can make science more collaborative!**

**And building blocks are better suited for
that than puzzle pieces...**

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

 @rgutzen



Co-funded by
the European Union

References

Presented work (to be) published in

- Gutzen et al. (2022) *in prep.*

Referenced work

- Dasilva et al. (2021) *NeuroImage*, doi:10.1016/j.neuroimage.2020.117415
- Pazienti et al. (2021) *iScience*, doi:10.1016/j.isci.2022.103918
- Capone et al. (2022) *arxiv*, doi:10.48550/arXiv.2104.07445
- Denker et al. (2018) *Scientific Reports*, doi:10.1038/s41598-018-22990-7

References for figure on slide 2

- a) Chan et al. (2015) doi:10.1038/ncomms8738
- b) Celotto et al. (2020) doi:10.3390/mps3010014
- c) Stroh et al. (2013) doi:10.1016/j.neuron.2013.01.031
- d) Pastorelli et al. (2019) doi:10.3389/fnsys.2019.00033
- e) Bazhenov et al. (2002) doi:10.1523/JNEUROSCI.22-19-08691.2002
- f) Keane & Gong (2015) doi:10.1523/JNEUROSCI.1669-14.2015
- g) Capone et al. (2017) doi:10.1093/cercor/bhx326
- h) Massimini et al. (2004) doi:12486189
- i) Muller et al. (2016) doi:10.7554/eLife.17267
- j) Nir et al. (2011) doi:10.1016/j.neuron.2011.02.043
- k) Botella-Soler et al. (2012) doi:10.1371/journal.pone.0030757

Datasets

- Resta et al. (2020) *EBRAINS*, doi:10.25493/3E6Y-E8G
- Resta et al. (2020) *EBRAINS*, doi:10.25493/XJR8-QCA
- Sanchez-Vives (2020) *EBRAINS*, doi:10.25493/WKA8-Q4T
- Sanchez-Vives (2019) *EBRAINS*, doi:10.25493/ANF9-EG3
- Sanchez-Vives (2019) *EBRAINS*, doi:10.25493/DZWT-1T8
- Chen et al. (2022) *Scientific Data*, doi:10.1038/s41597-022-01180-1

Image sources

- <https://www.orangepuzzle.de/media/image/f1/70/cd/1453899434-preview-parts.jpg>
- https://m.media-amazon.com/images/I/81OedO8gWeL.AC_SL1500.jpg
- https://img-9gag-fun.9cache.com/photo/a1RqBp6_700bwp.webp

Software links (slide 5)

- <https://github.com/G-Node/nix>
- <http://g-node.github.io/python-odml/>
- <https://neo.readthedocs.io/>
- <https://elephant.readthedocs.io/>
- <https://docs.conda.io/>
- <https://snakemake.github.io/>
- <https://scipy.org/>
- <https://www.docker.com/>
- <https://www.sphinx-doc.org/en/master/>
- <https://numpy.org/>
- <https://yaml.org/>
- <https://ebrains.eu/>

Acknowledgements

This research was funded by the European Union's Horizon 2020 Framework Programme for Research and Innovation under Specific Grant Agreements No. 785907 (HBP SGA2) and No. 945539 (HBP SGA3) and the Helmholtz Association Initiative and Networking Fund ZT-I-0003.

Affiliations

- Institute of Neuroscience and Medicine (INM-6) and Institute for Advanced Simulation (IAS-6) and JARA-Institute Brain Structure-Function Relationships (INM-10), Jülich Research Centre, Jülich, Germany
- Theoretical Systems Neurobiology, RWTH Aachen University, Aachen, Germany
- Istituto Nazionale di Fisica Nucleare (INFN), Sezione di Roma, Rome, Italy
- Ph.D. Program in Behavioural Neuroscience, "Sapienza" University of Rome, Rome, Italy
- Unite de Neurosciences, Information et Complexite, Neuroinformatics Group, CNRS FRE 3693,Gif-sur-Yvette, France
- European Laboratory for Non-linear Spectroscopy (LENS), University of Florence, Florence, Italy
- Istituto di Neuroscienze, CNR, Pisa, Italy
- Institut d'Investigacions Biomediques August Pi i Sunyer (IDIBAPS), Barcelona, Spain
- Institucio Catalana de Recerca i Estudis Avanc ats (ICREA), Barcelona, Spain
- Istituto Superiore di Sanità, (ISS), Rome, Italy