

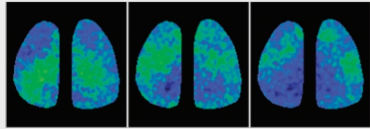
Building adaptable and reusable pipelines for investigating the features of slow cortical rhythms across scales, methods, and species

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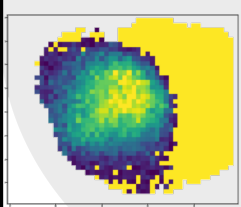
Slow Cortical Waves

Imaging

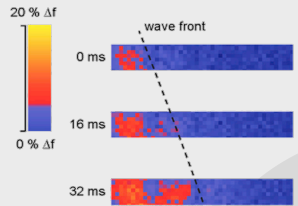
a) Widefield VSD



b) Widefield Calcium Imaging



c) Calcium Imaging



Richness of data

Slow wave activity is observable

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

Lack of comparability

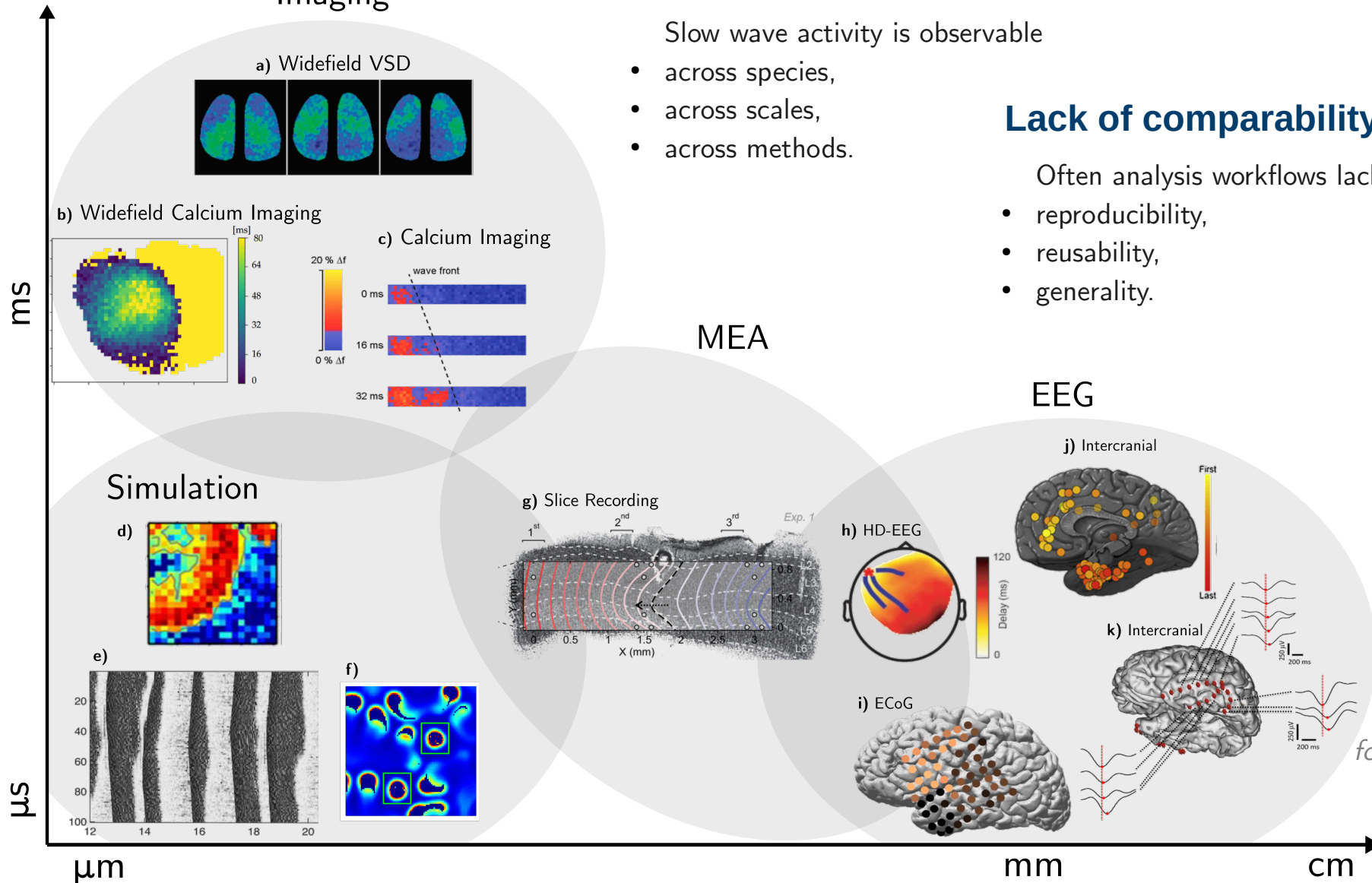
Often analysis workflows lack

- reproducibility,
- reusability,
- generality.

Requirement of cross-domain comparison

Comparability is needed for

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

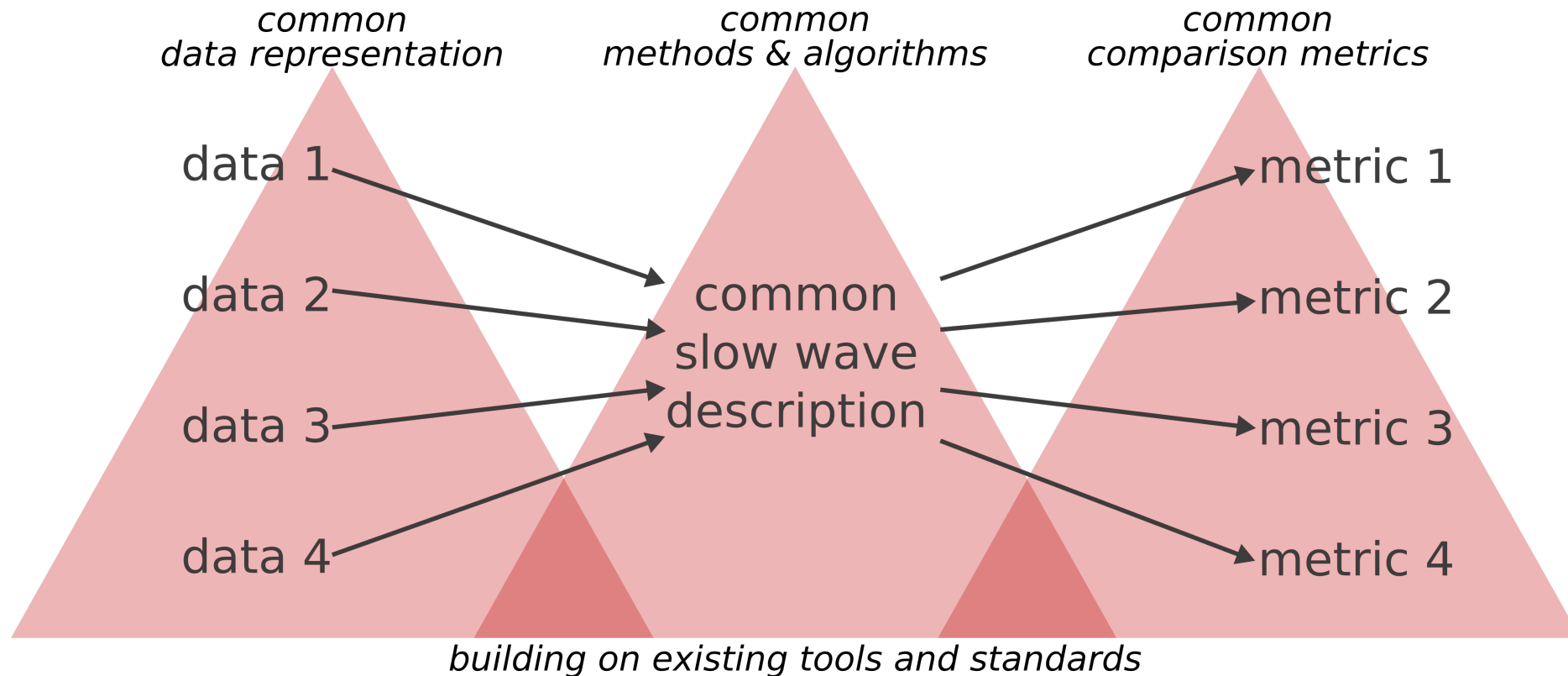


for references see Appendix

Approach: Adaptable and Reusable Analysis Pipeline

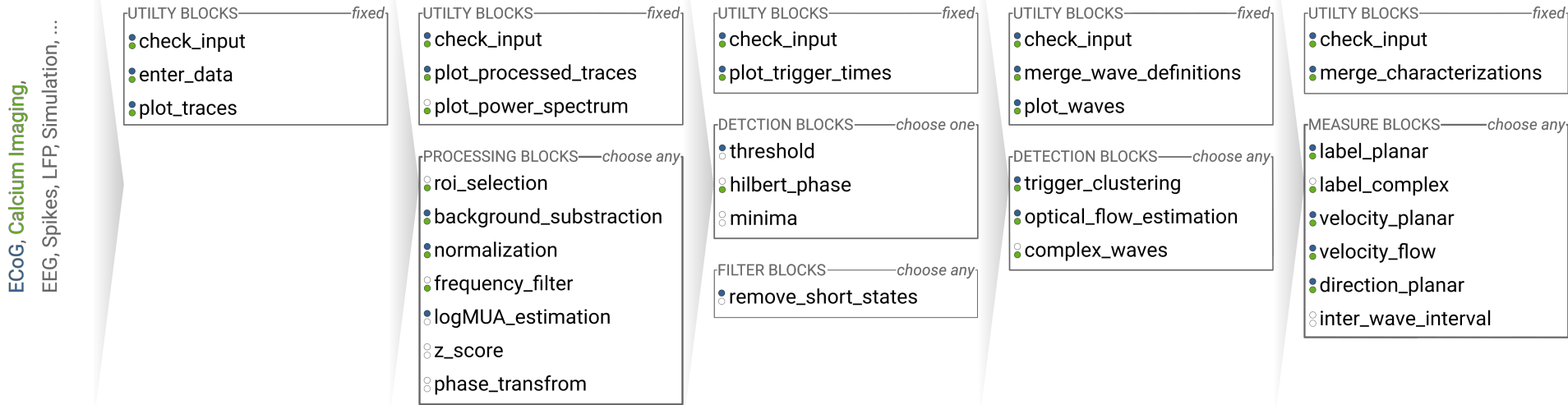
There is no need to reinvent the wheel.

There is value in bringing together existing methods, tools, and standards.

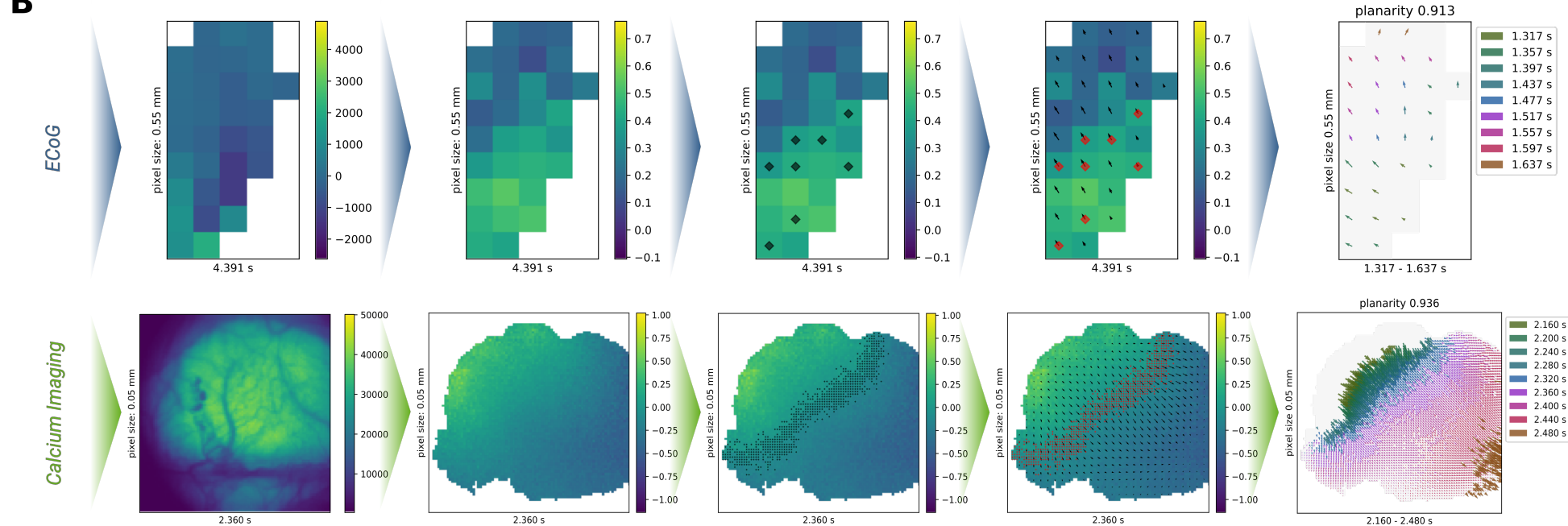


Slow Waves Analysis Pipeline

A



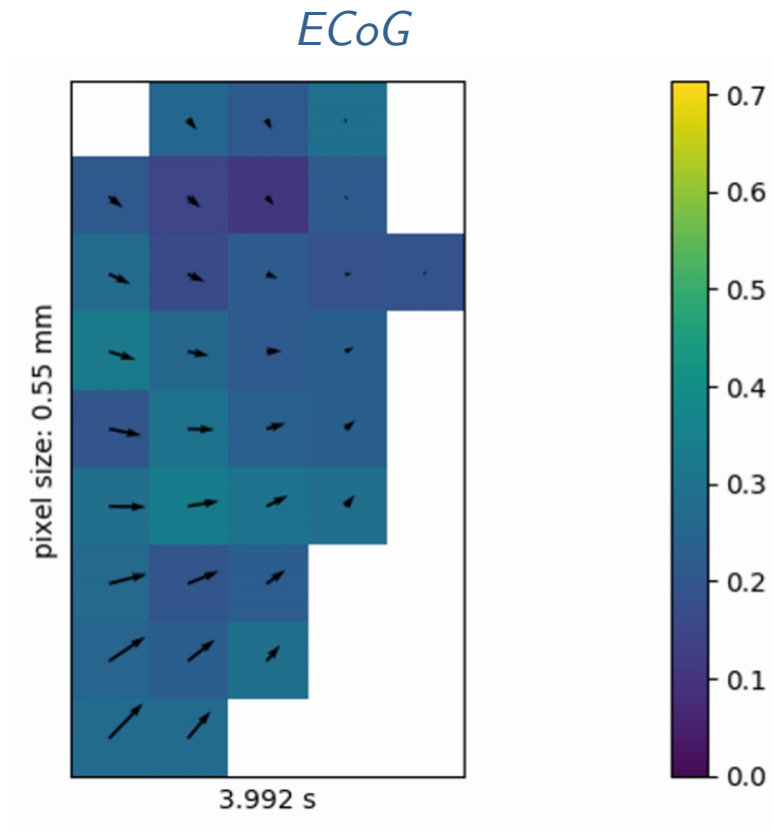
B



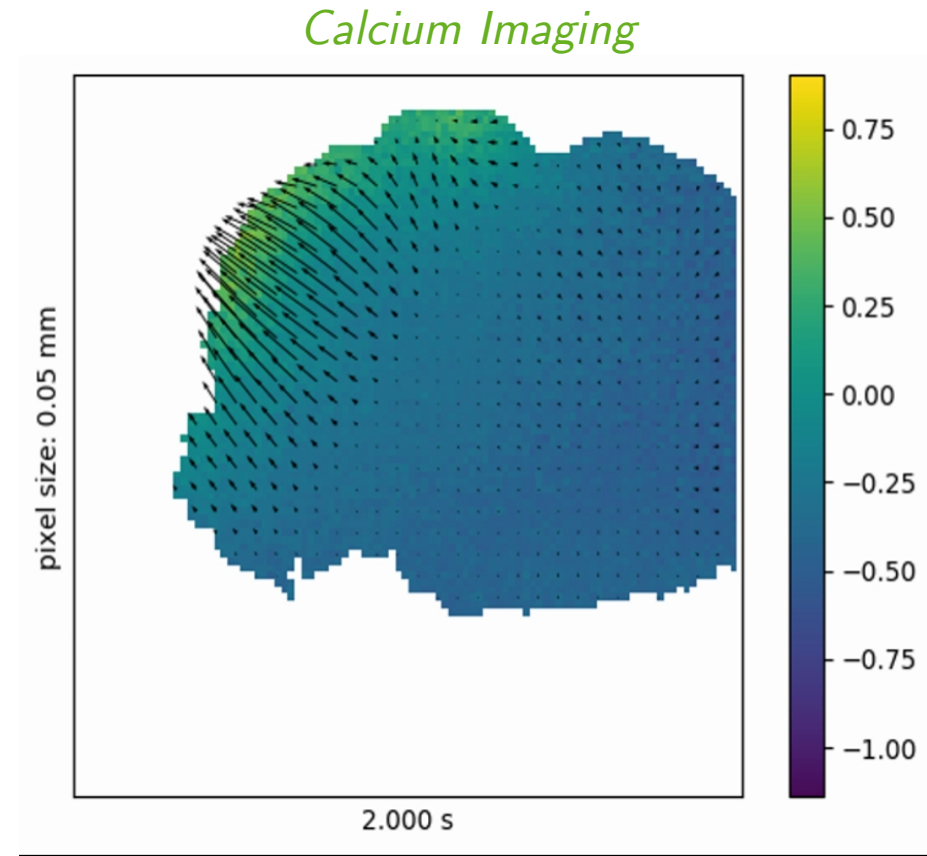
- Pipeline = series of stages
- Stage = collection of blocks
- Workflow = path along blocks
- Benefit: Each element of the pipeline is reusable and exchangeable.

Results

Our approach enables diverse data to be compared in terms of abstract phenomenon descriptions (i.e. slow waves)



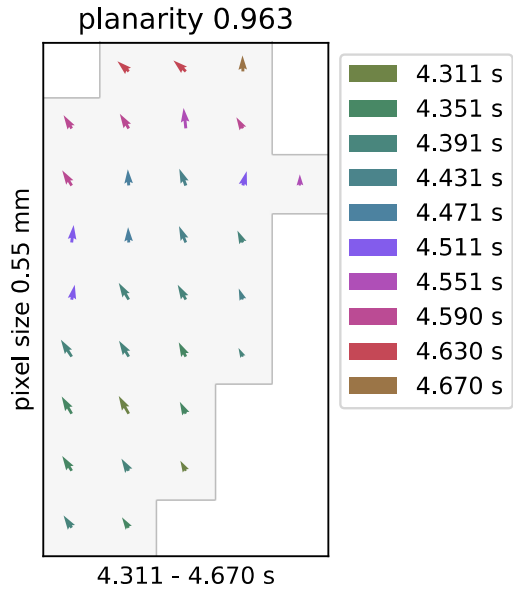
[Video Link](#)



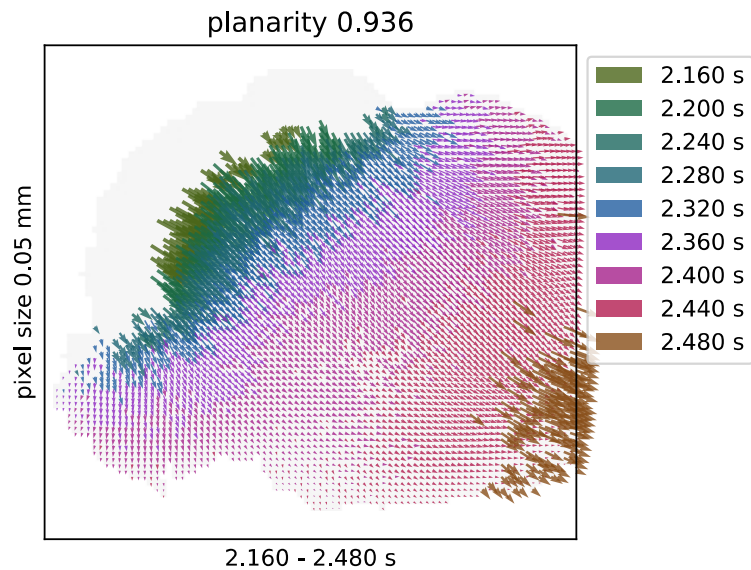
[Video Link](#)

Results: Wave Planarity

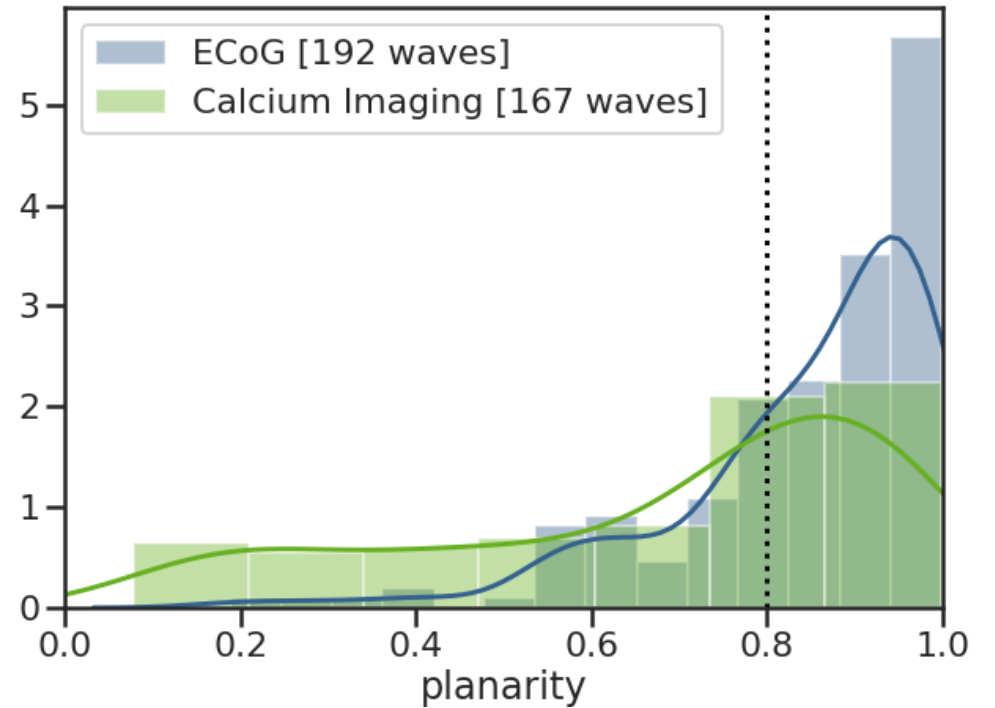
ECoG



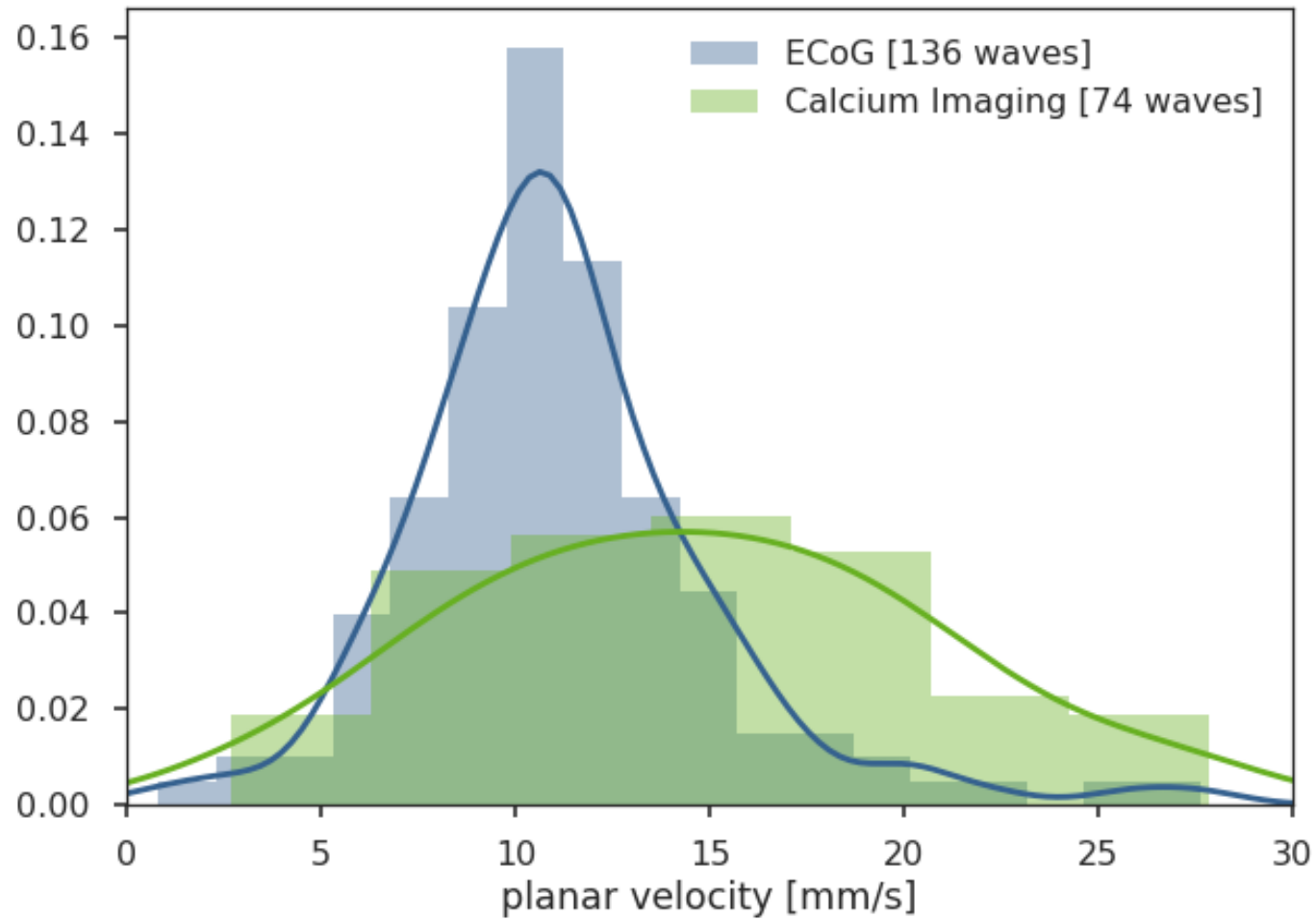
Calcium Imaging



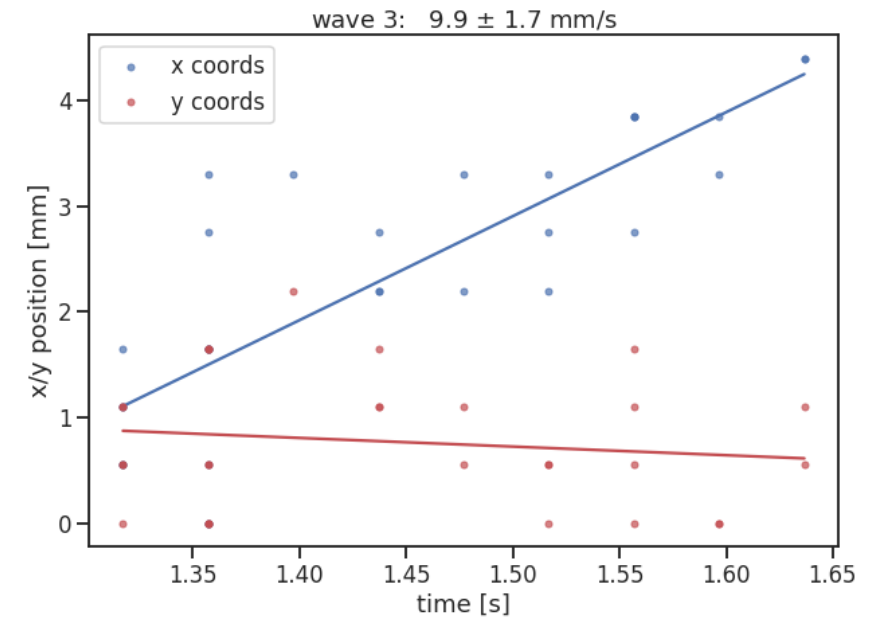
$$\text{planarity} = \frac{\|\sum \vec{v}_i\|}{\sum \|\vec{v}_i\|}$$



Results: Planar Wave Velocity

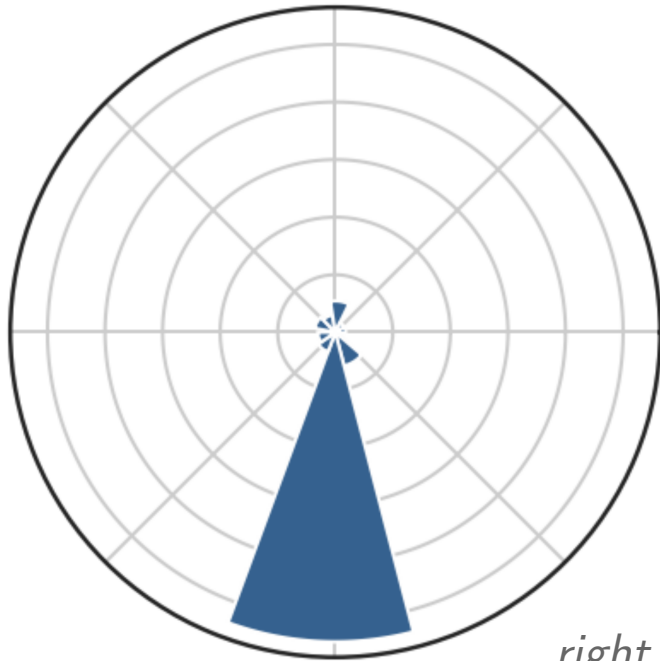


planar velocity = linear interpolation of trigger displacement in x and y direction



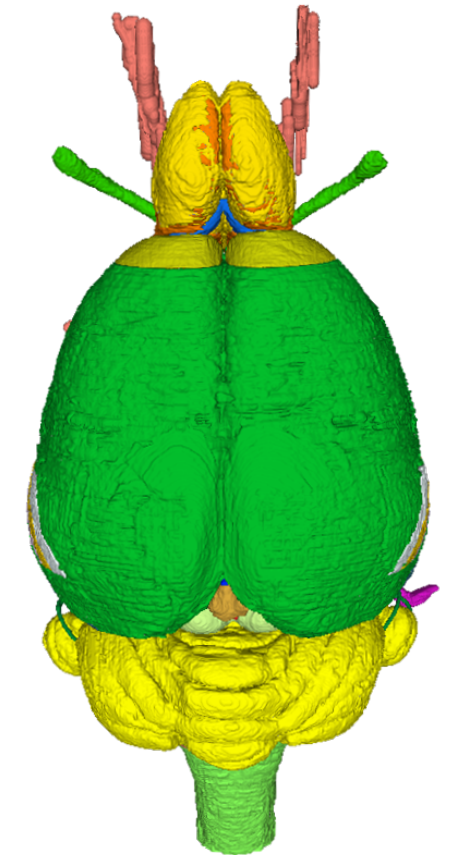
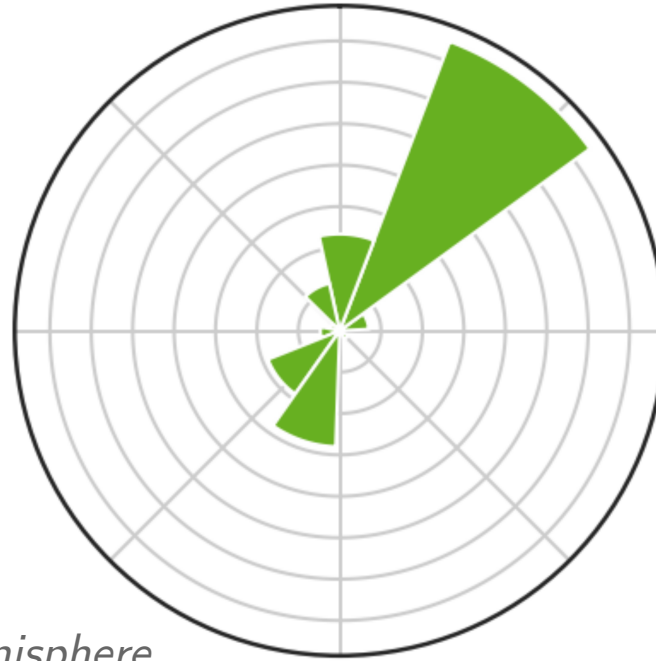
Results: Planar Wave Direction

ECoG



right hemisphere

Calcium Imaging



Waxholm Space rat brain atlas

- **EBRAINS collab: wiki.ebrains.eu/bin/view/Collabs/slow-wave-analysis-pipeline**
- **The pipeline code is open-source: github.com/INM-6/wavescalephant**
- **Preprint coming soon...**

References for inset figures on slide 1

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