

A theory-driven approach to data analysis: practical applications

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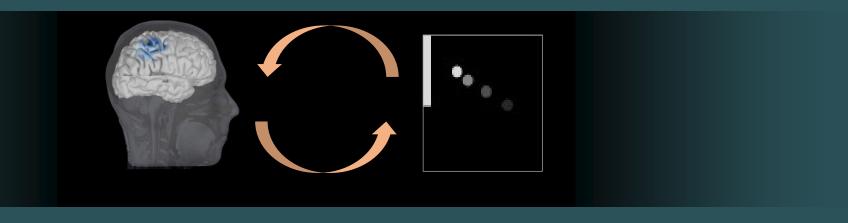
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CNS2024 workshop - Virtual Brains: From data to modeling and back

A theory-driven approach to data analysis: practical applications



Marie-Constance Corsi,
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NERV team, Paris Brain Institute







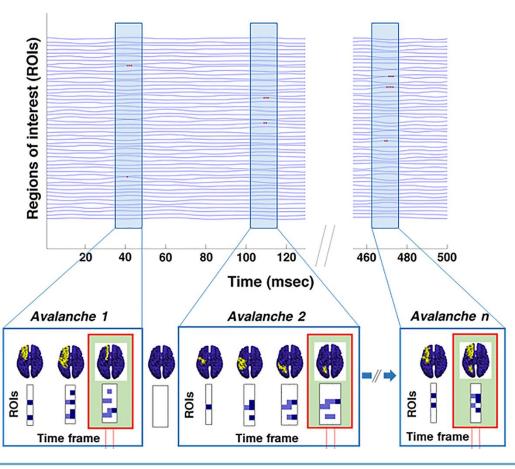






Capturing fast, non-linear brain dynamics

Neuronal avalanches: bursts of enhanced activity observed across neuroimaging modalities

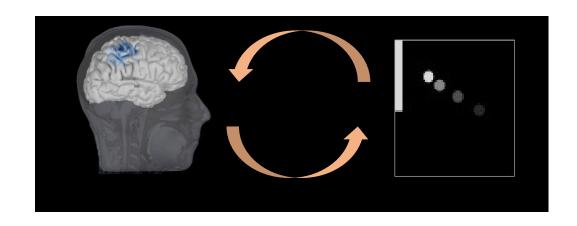


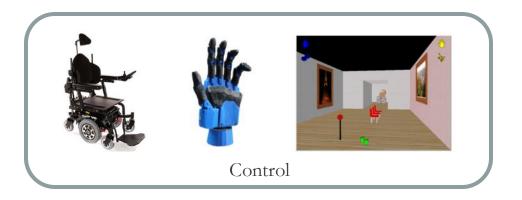
Adapted from [Polverino et al, Neurology, 2022]

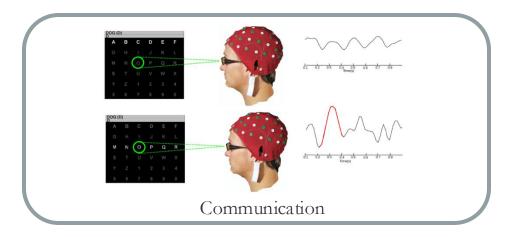
Hypothesis:

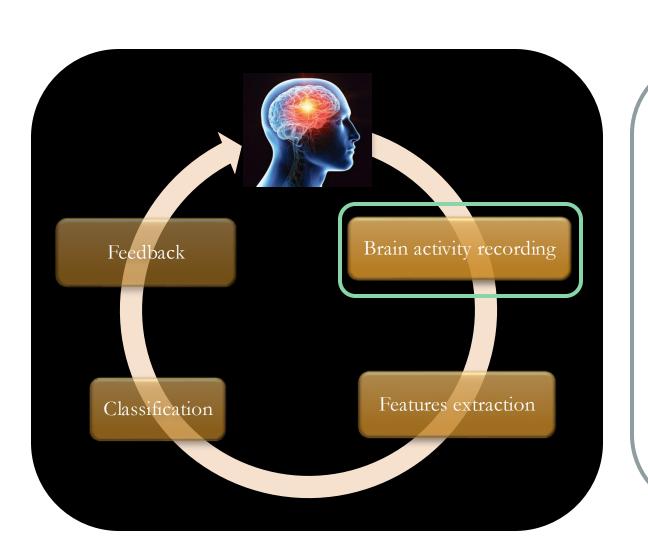
The neuronal avalanches could spread differently according to the task/populations & more!

What is a Brain-Computer Interface (BCI)?





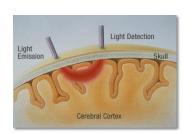




Non-invasive tools



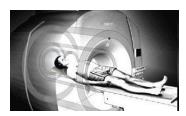
NIRS

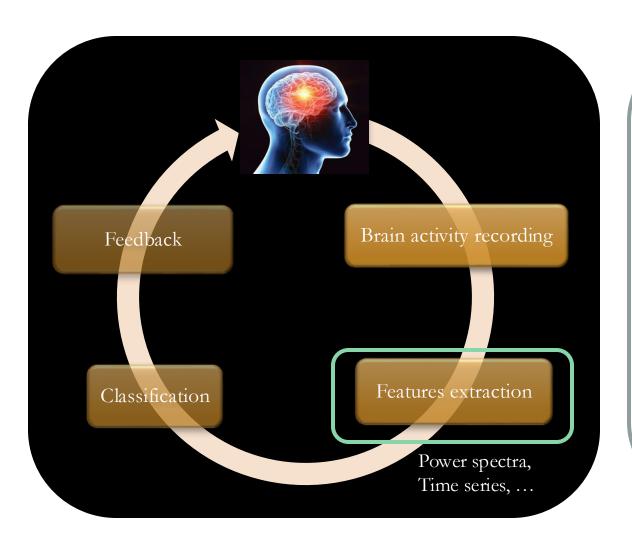


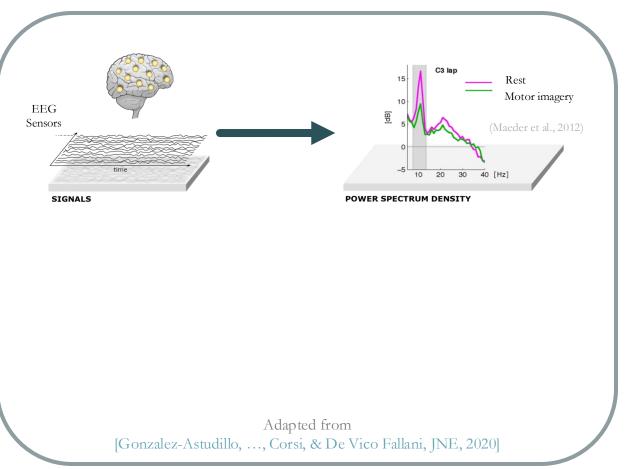
MEG

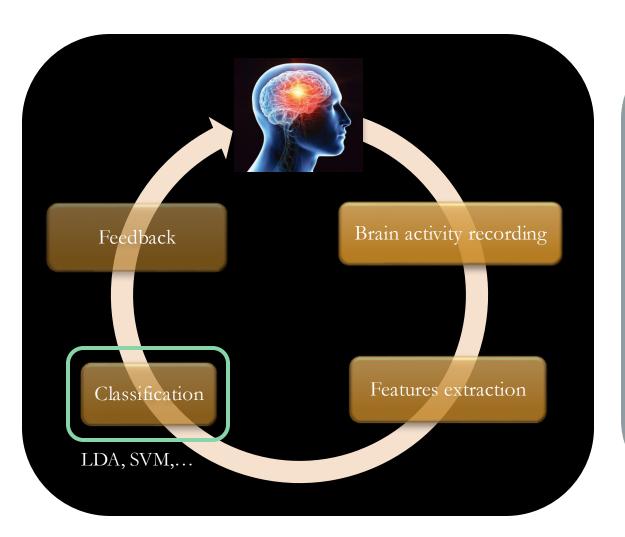


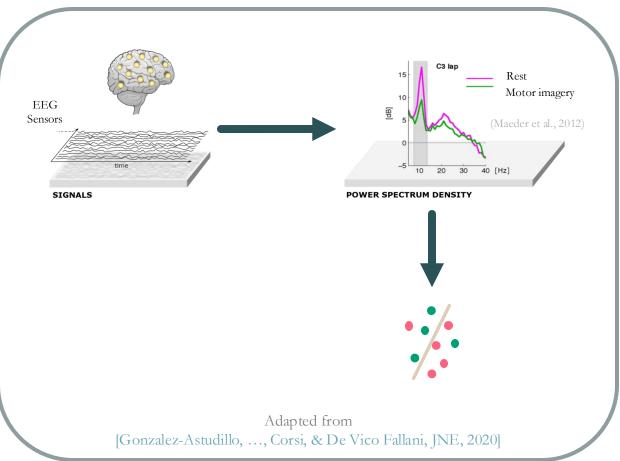
fMRI

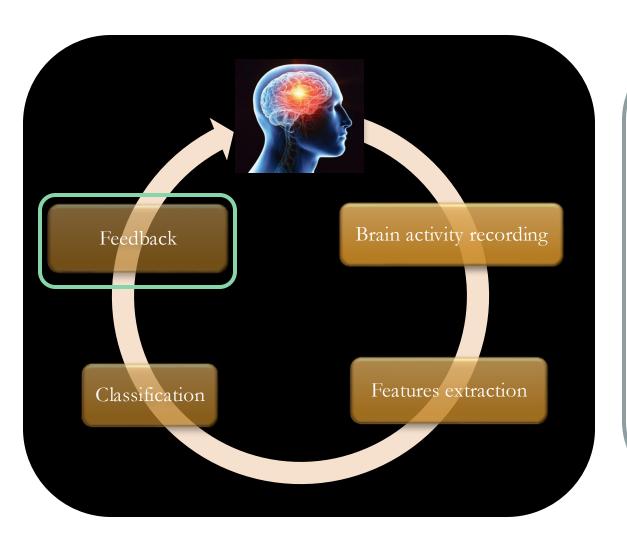


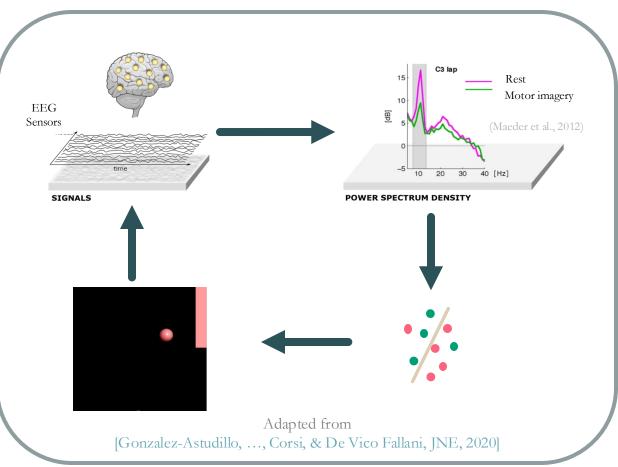




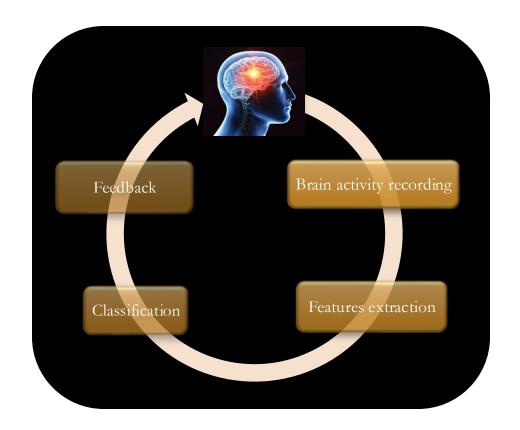


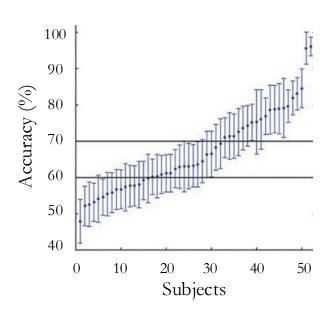






Brain-Computer Interface (BCI) – current challenges





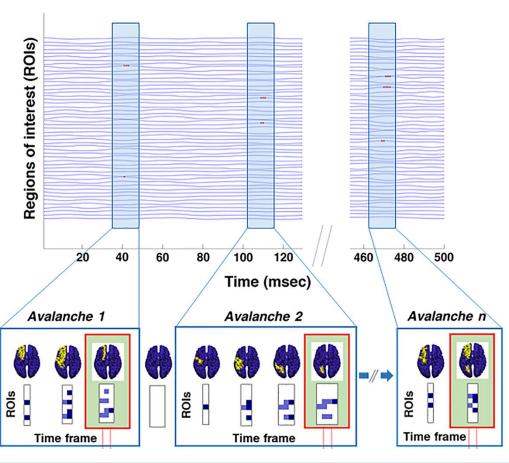
Adapted from (Ahn & Jun, 2015)

Problem:

Current BCIs fail to detect the mental intentions in ~30% of users − **BCI inefficiency** (Thompson, 2018) ⇒ Rely on local measurements of the brain activity

Capturing fast, non-linear brain dynamics

Neuronal avalanches: bursts of enhanced activity observed across neuroimaging modalities

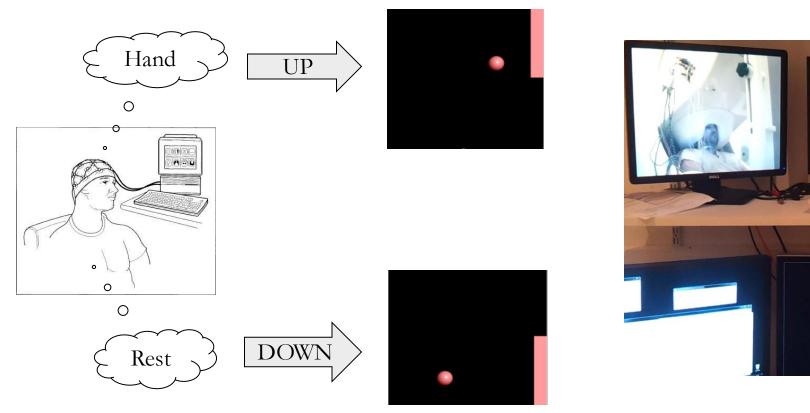


Adapted from [Polverino et al, Neurology, 2022]

Hypothesis:

The neuronal avalanches could spread differently according to the task & provide original markers of BCI performance.

BCI experiment

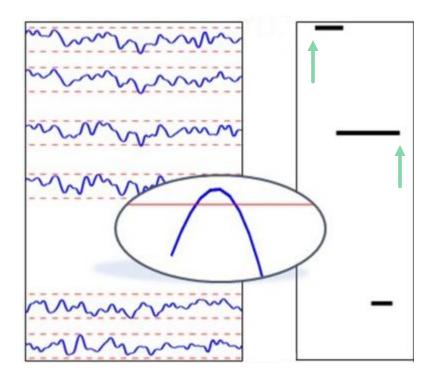




For a complete description of the protocol and the dataset, please refer to [Corsi et al, NeuroImage, 2020]

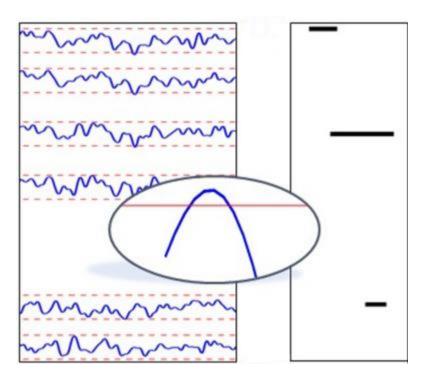
Objective:

Tracking the dynamical features related to motor imagery as compared to rest



Adapted from [Sorrentino et al, eLife, 2021]



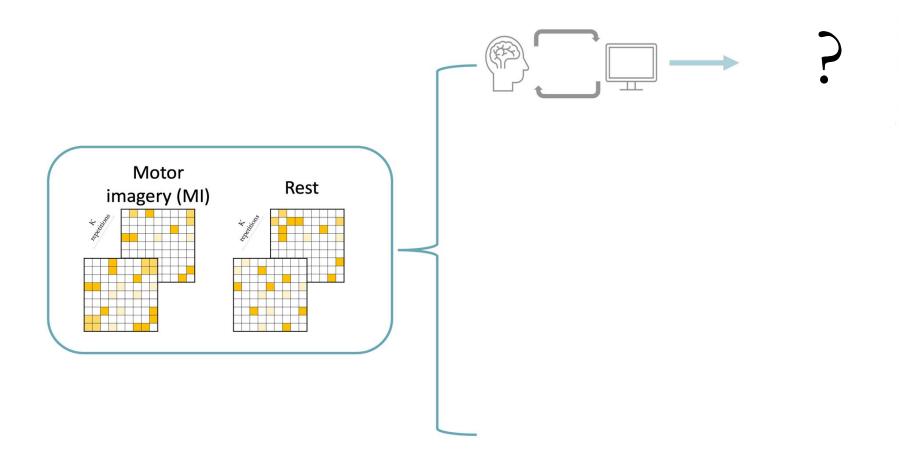


Neuronal avalanche State of the state of th

Avalanche Transition Matrix (ATM)

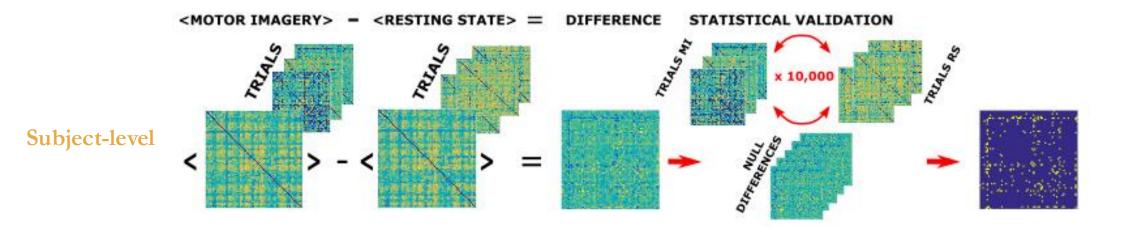
Adapted from [Sorrentino et al, eLife, 2021]





[Corsi*, Sorrentino* et al, iScience, 2024]



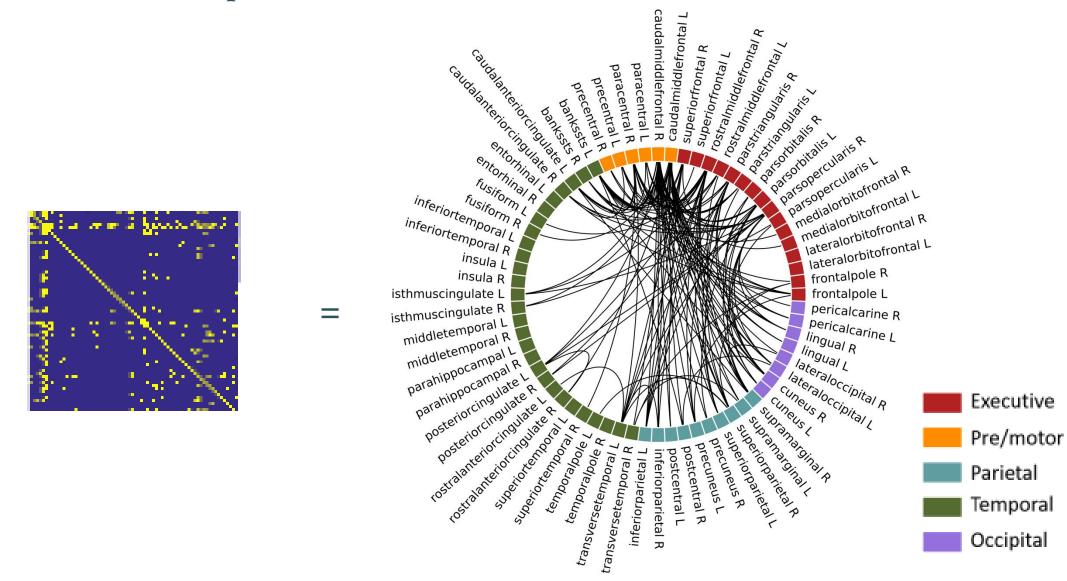


TASK-RELATED RELIABLE EDGES

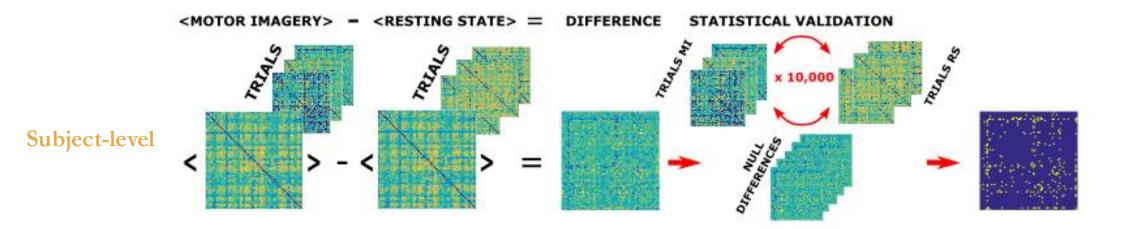
Group-level

[Corsi*, Sorrentino* et al, iScience, 2024]





Task-related differences are in edges hinging on pre/motor areas (in most subjects)



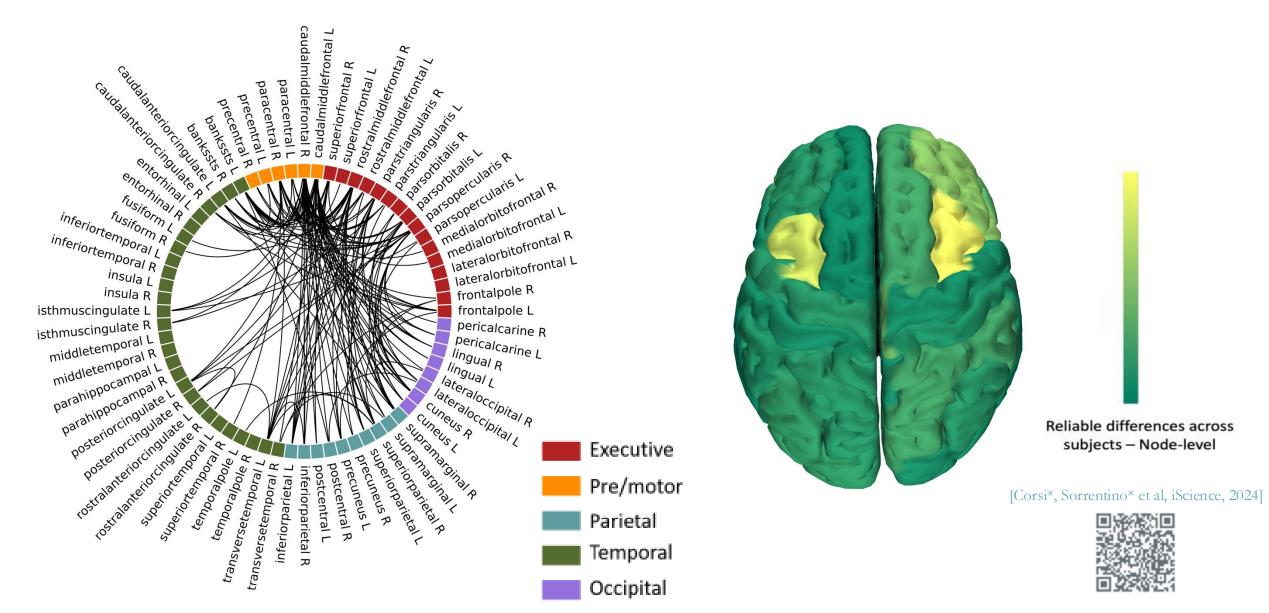
TASK-RELATED RELIABLE NODES

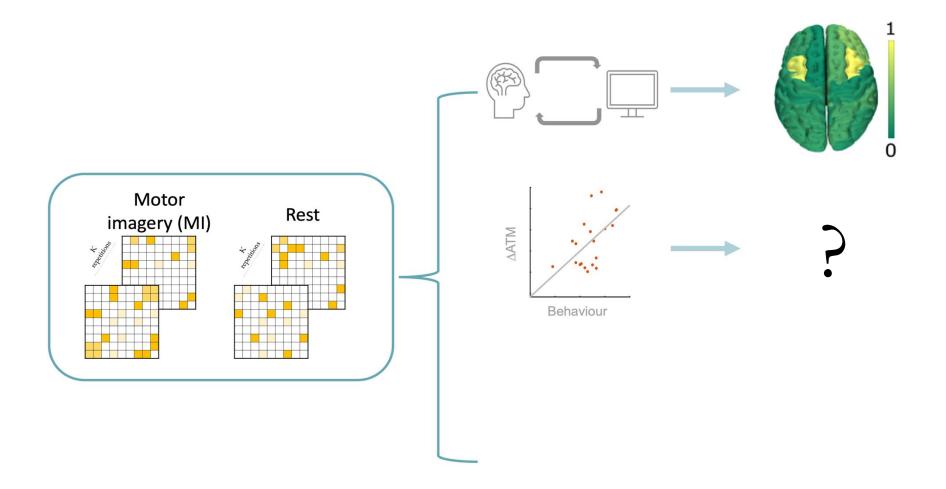
TASK-RELATED RELIABLE NODES

Group-level

[Corsi*, Sorrentino* et al, iScience, 2024]

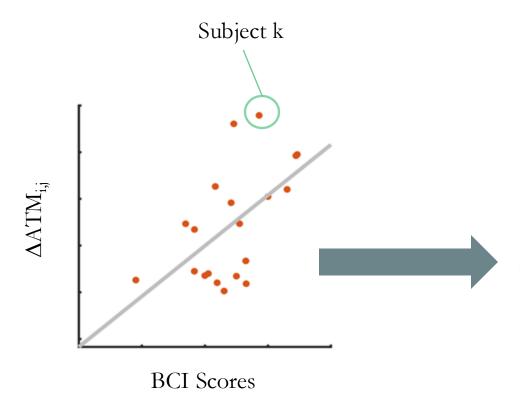




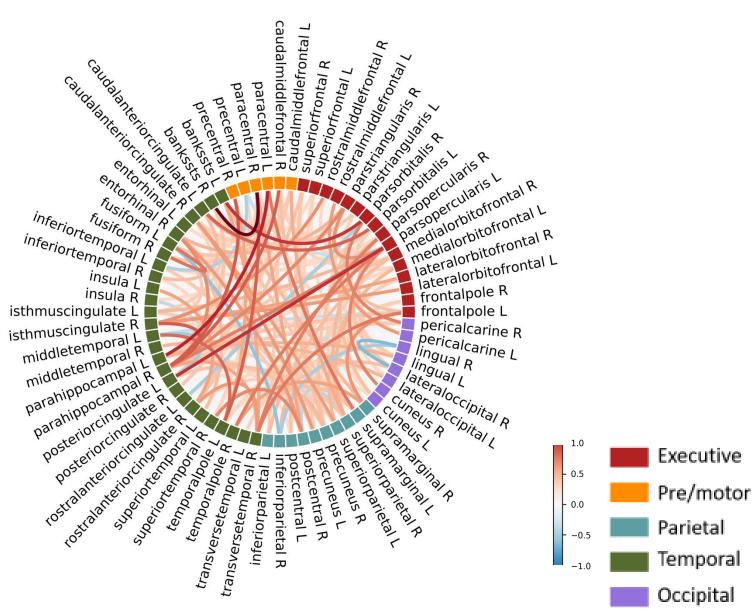


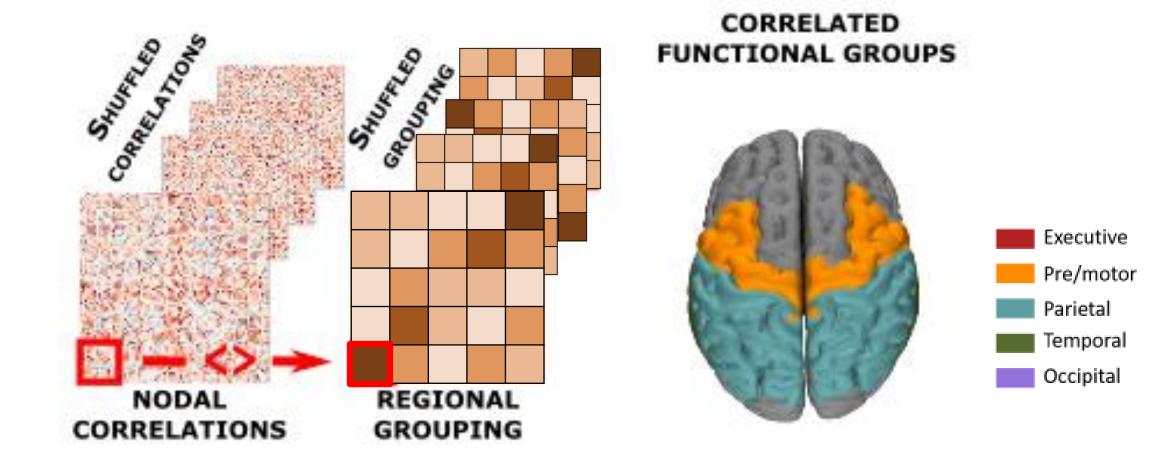
[Corsi*, Sorrentino* et al, iScience, 2024]

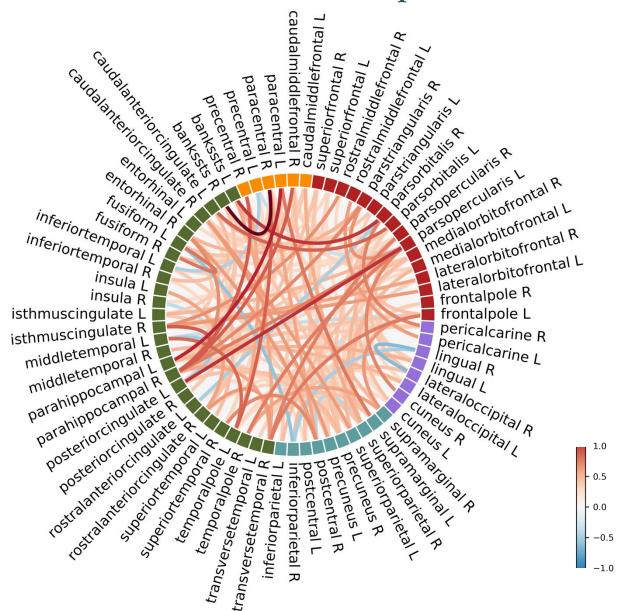


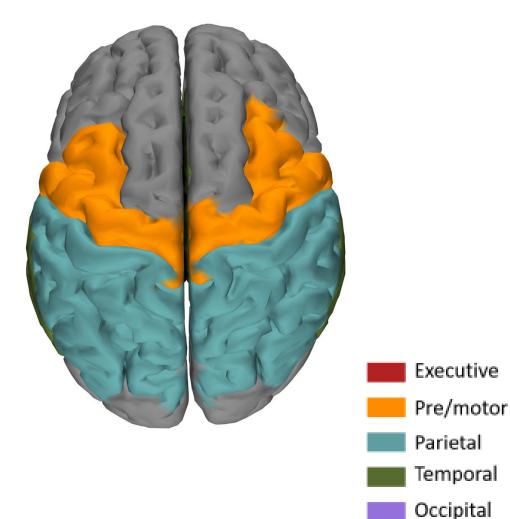


Edge-wise correlation

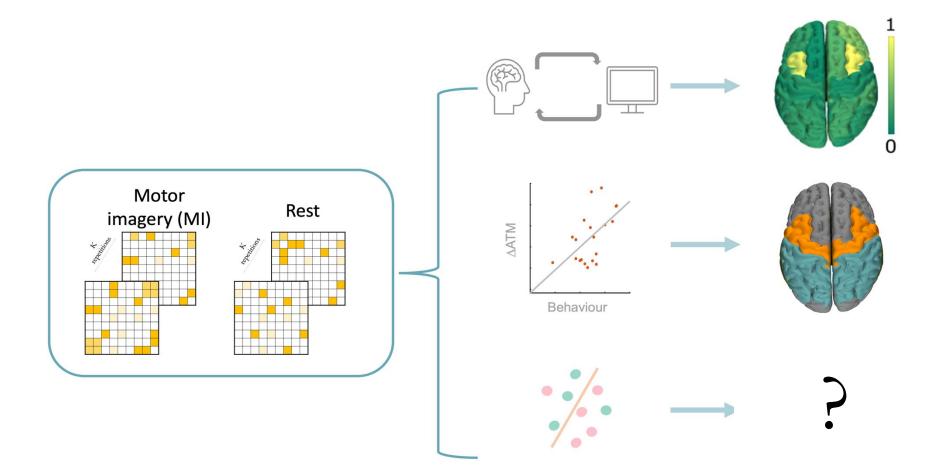








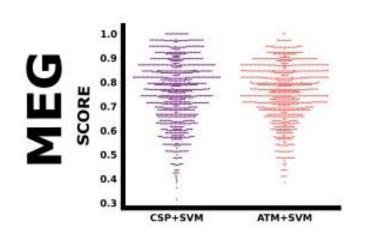
Transition probabilities as alternative features for BCI

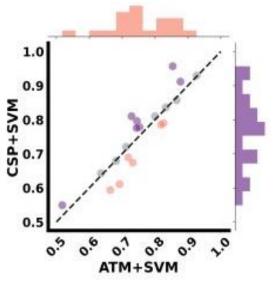


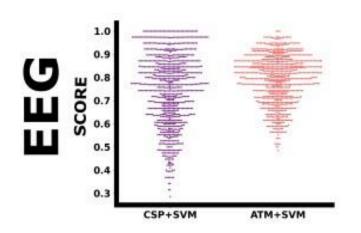
[Corsi*, Sorrentino* et al, iScience, 2024]

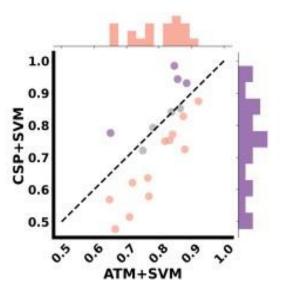


Transition probabilities as alternative features for BCI









signif

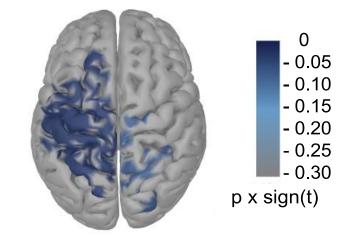
- equals
- ATM+SVM better
- CSP+SVM better

[Corsi*, Sorrentino* et al, iScience, 2024]

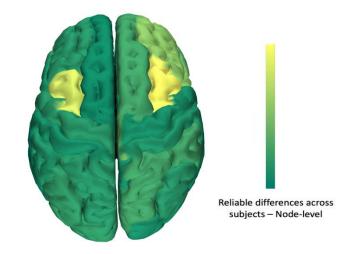


Reliable functional information of task performance retrieval

• Meaningful information communication among regions on the large-scale & aperiodic and scale-free perturbation



Power spectra significant at **group** level

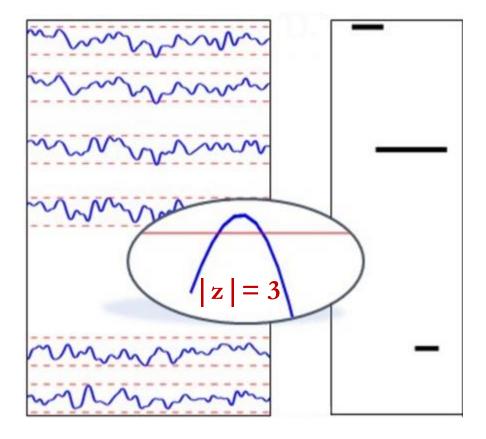


Neuronal avalanches significant at **individual** level

⇒ Tracking changes in perturbation spreading while performing different tasks via the avalanches transition matrices

Reliable functional information of task performance retrieval

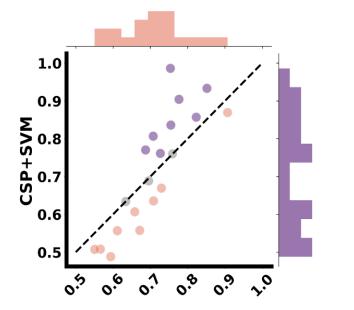
Meaningful information communication among regions on the large-scale & aperiodic and scale-free perturbation

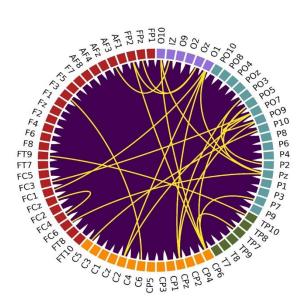


Reliable functional information of task performance retrieval

Building innovative BCI protocols based on ATMs

- Outperforms the benchmark in EEG gold standard in BCI → one step closer to the implementation
- Need to further investigate more suited classification methods







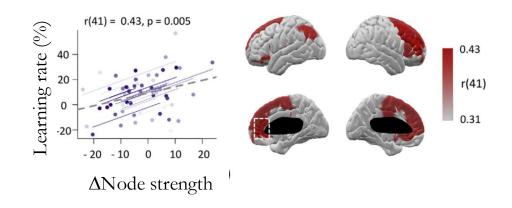
C. Mannino

Reliable functional information of task performance retrieval

- Meaningful information communication among regions on the large-scale & aperiodic and scale-free perturbation
- Building innovative BCI protocols
 - Tracking changes in perturbation spreading while performing different tasks
 - Focusing on higher-order perturbations to capture functionally-relevant processes & reliable information

Markers of BCI performance

- Current predictors of BCI
 - Local measurements power spectra (Ahn et al, 2015) → replicability issues
 - Time-averaged brain interactions (Sugata et al, 2014) & Brain networks metrics [Gonzalez-Astudillo et al, JNE, 2020] → online implementation?
 - node strength & learning process [Corsi et al, NeuroImage 2020]]
 - core-periphery properties & multimodal integration [Corsi et al, JNE 2021]
- Spreading of neuronal avalanches
 - Patterns behaviorally meaningful (Chialvo et al, 2010)
 - Computational fast marker



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Thank you for your attention!

