



# ISMRM 27<sup>TH</sup> ANNUAL MEETING & EXHIBITION

Palais des congrès de Montréal  Montréal, QC, Canada  11–16 May 2019

## Periods of discernible cognition contribute to dynamic functional connectivity during rest

Javier Gonzalez-Castillo<sup>1</sup>, César Caballero-Gaudes<sup>3</sup>, Natasha Topolski<sup>1</sup>, Francisco Pereira<sup>2</sup>,  
Daniel A. Handwerker<sup>1</sup>, Peter A. Bandettini<sup>1,2</sup>

<sup>1</sup>Section on Functional Imaging Methods, National Institute of Mental Health, NIH, USA

<sup>2</sup>Machine Learning Team, National Institute of Mental Health, NIH, USA

<sup>3</sup>Basque Center on Cognition, Brain and Language, Spain





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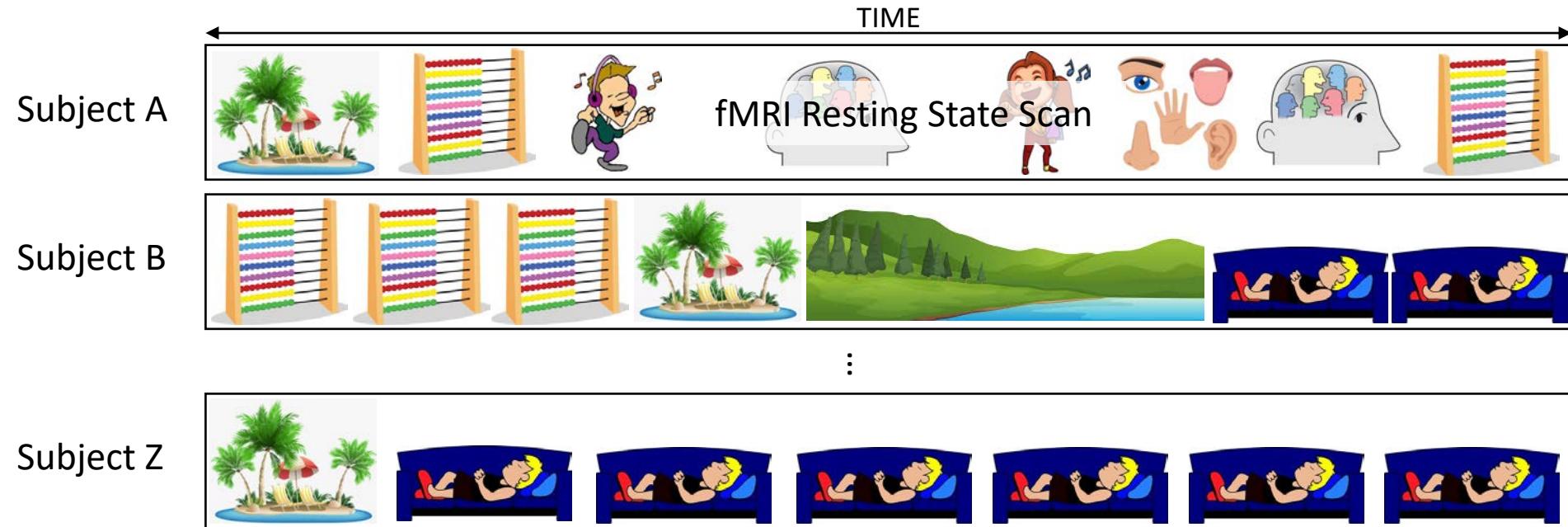
## Declaration of Financial Interests or Relationships

Speaker Name: Javier Gonzalez-Castillo

I have no financial interests or relationships to disclose with regard to the subject matter of this presentation.

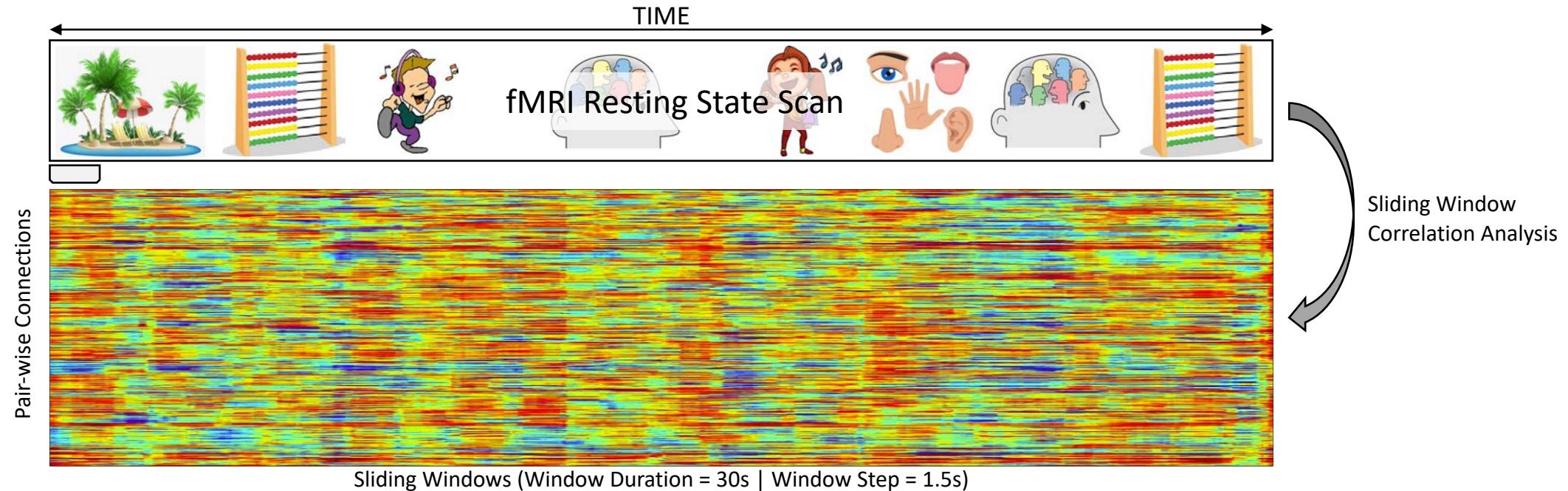


# Working Hypothesis



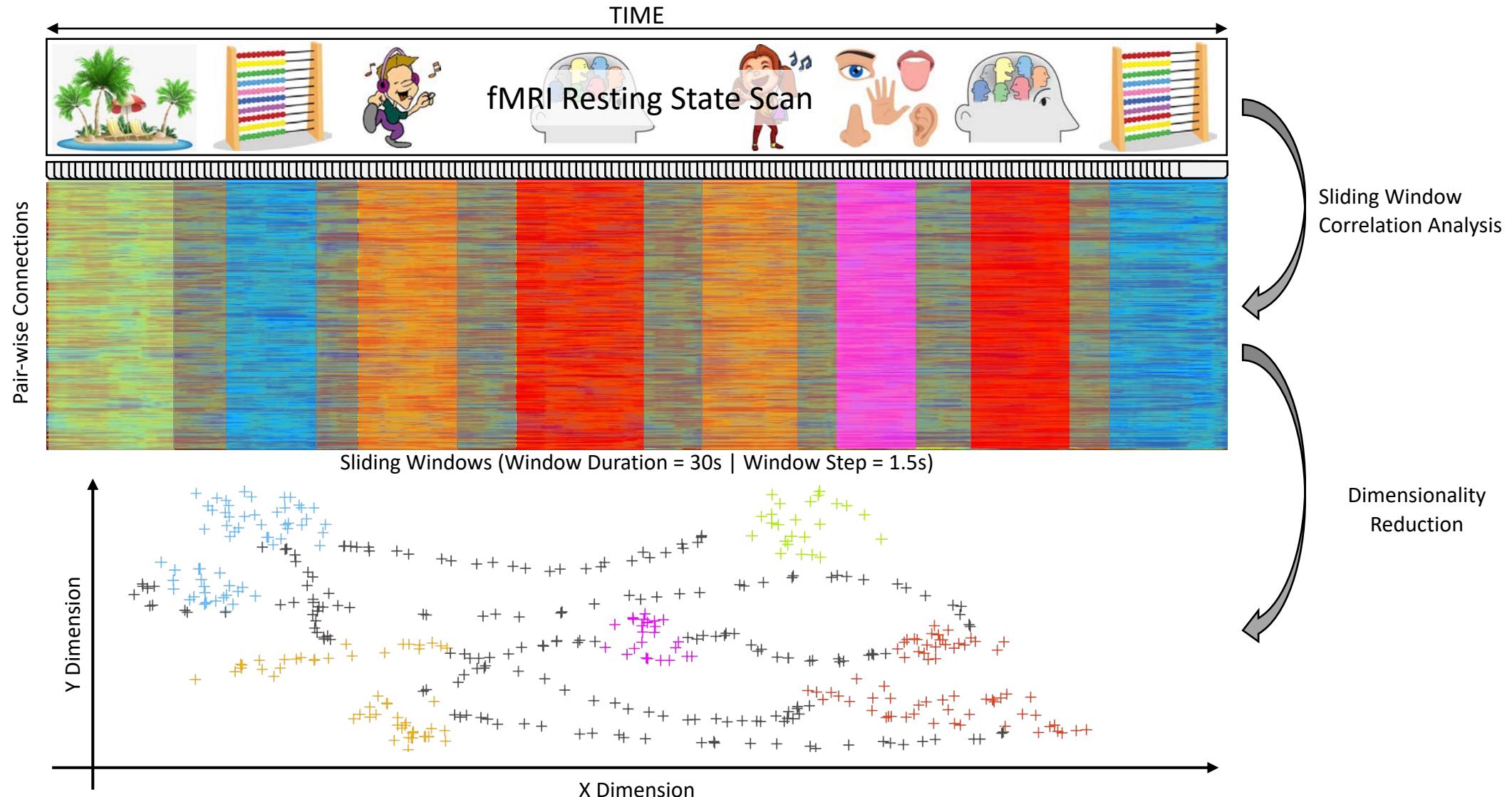


# Working Hypothesis



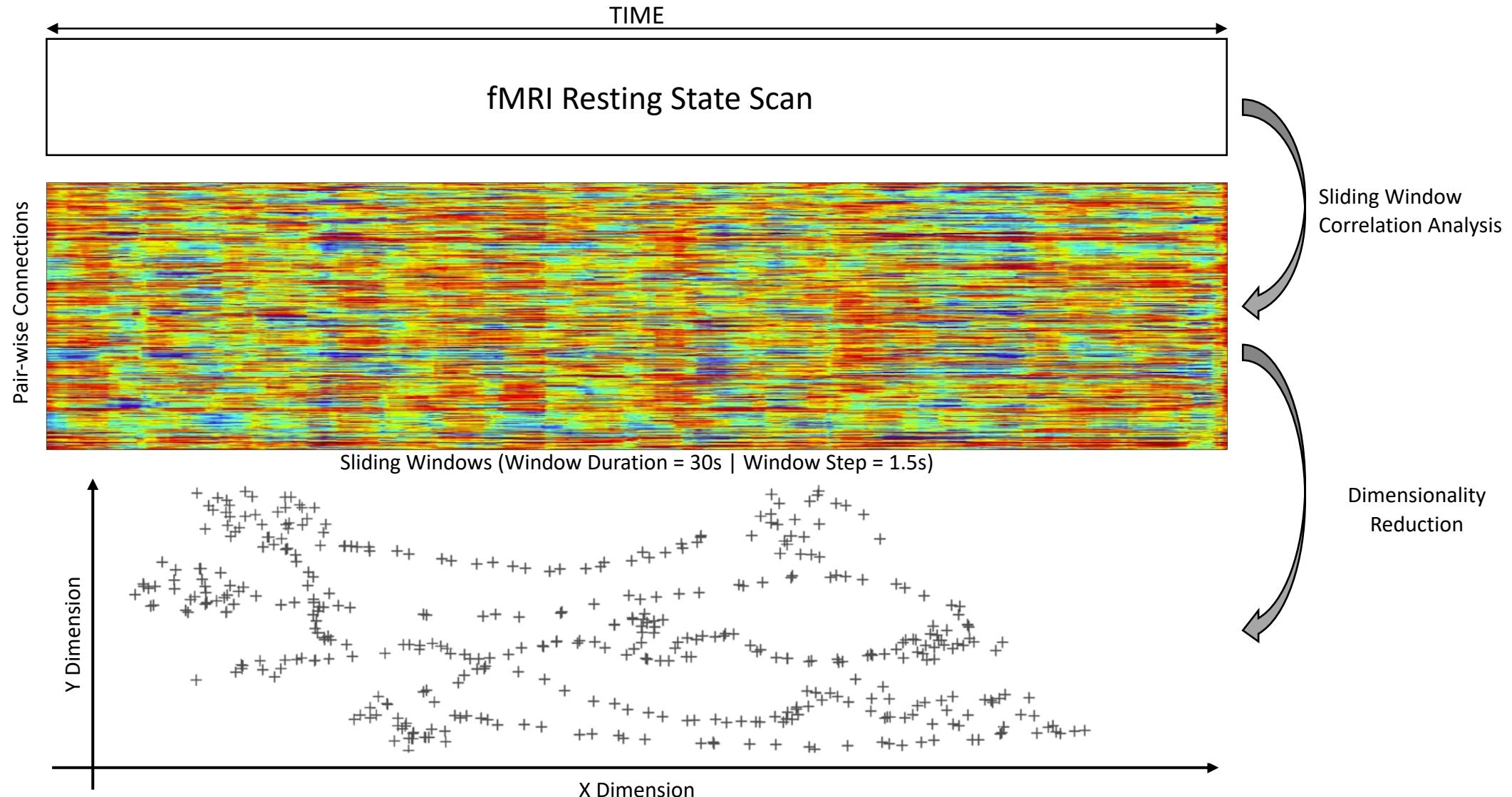


# Working Hypothesis



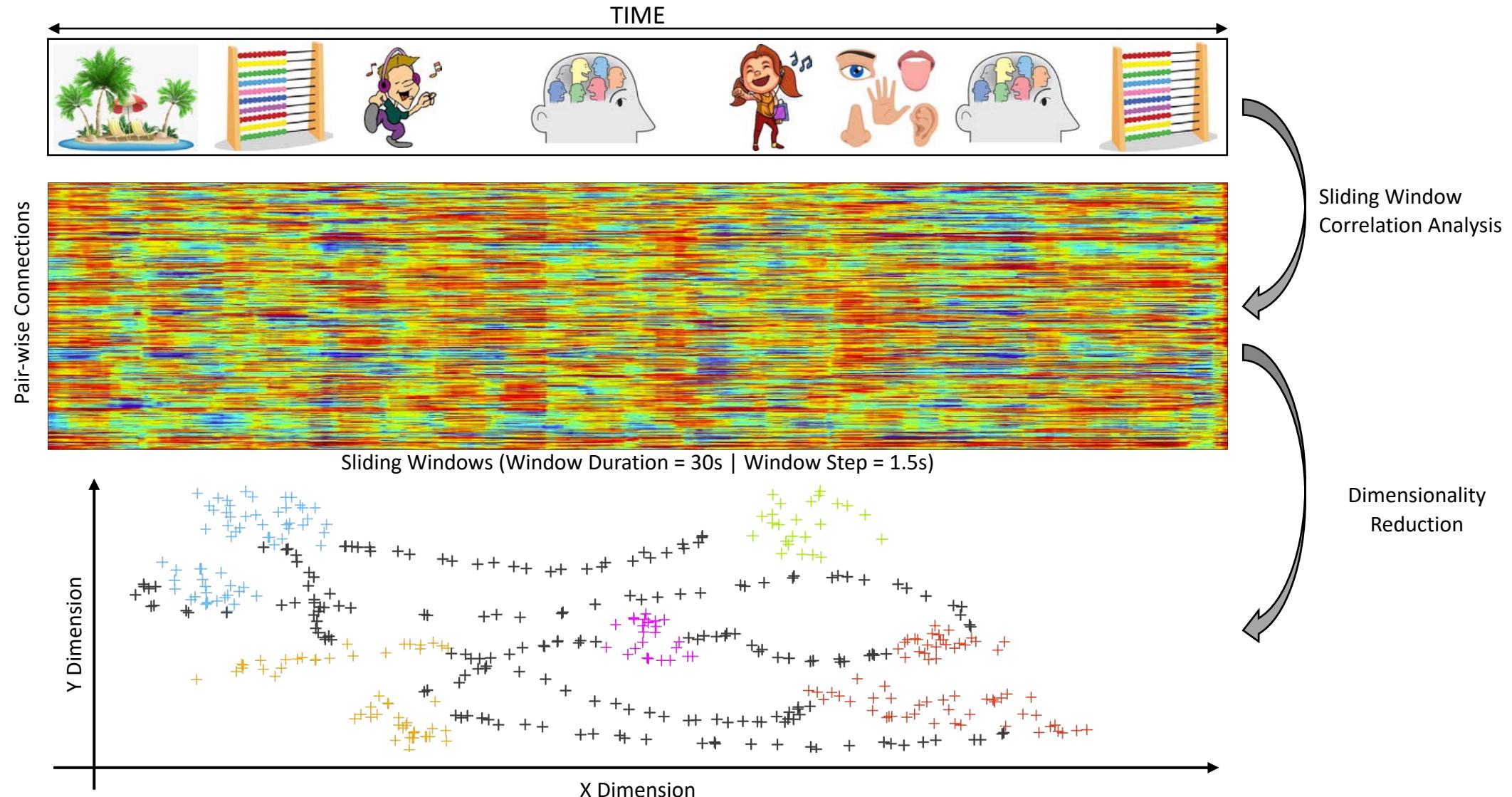


# Working Hypothesis





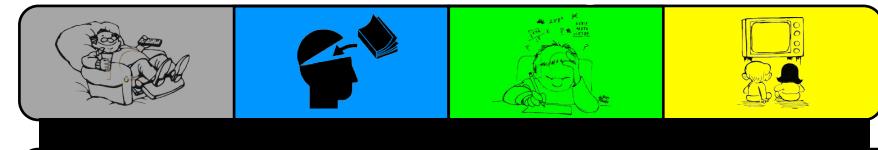
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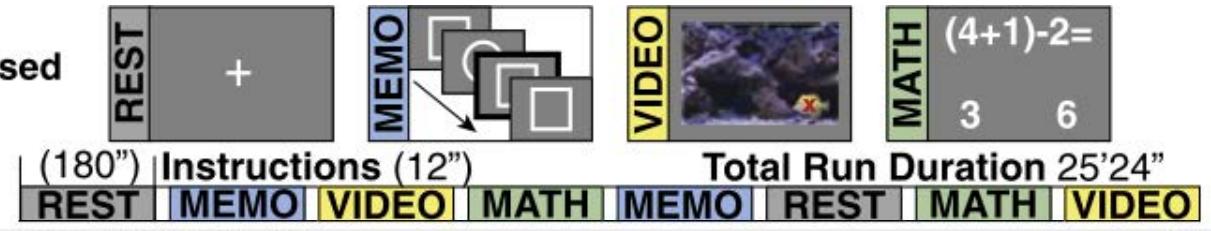


# Experiments / Methods

## Multi-Task Dataset | Testing



Mental States Imposed by Experiment



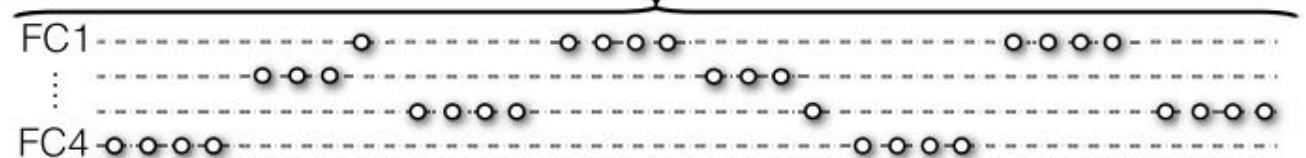
Time Segmentation



Computation of Windowed FC Patterns

K-means clustering of FC states (without mental state/temporal order information)

FC State Detection



FC State Timeline

Comparison of FC and mental state timelines

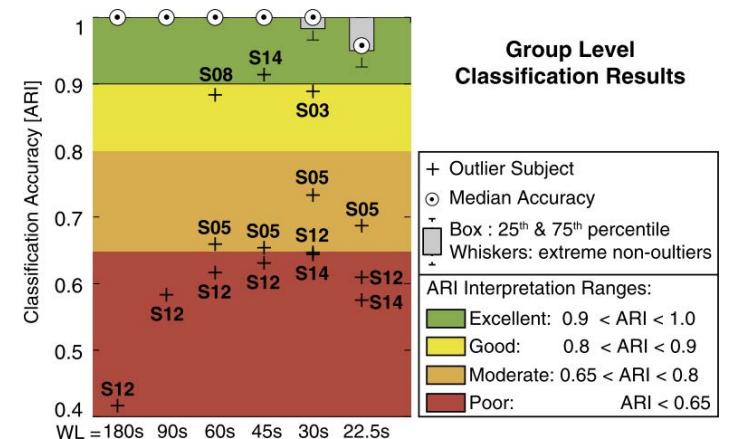
Validation

Mental State Timeline

## Continuous Rest Dataset | Application



- 20 Subjects | 7T | 2mm<sup>3</sup> | TR = 1.5s
- Task timing known to experimenter
- Dynamic FC helped segment scans into FC homogenous segments that align with cognitive tasks.

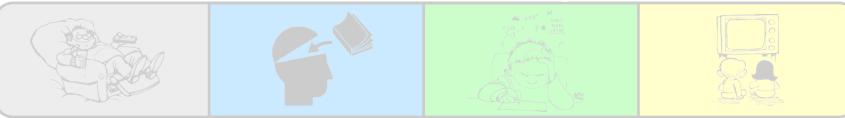


- Lacks ability to determine the cognitive nature of those segments.

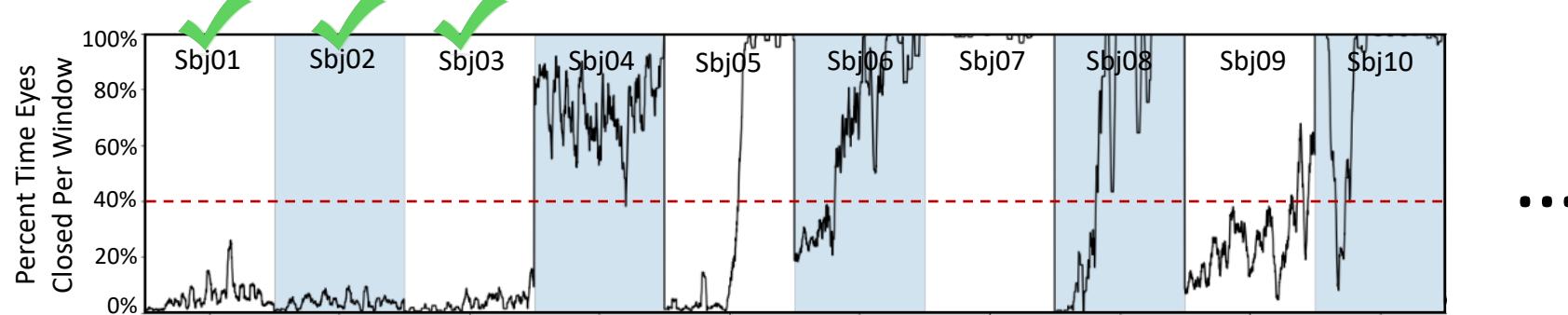


# Experimental Datasets / Methods

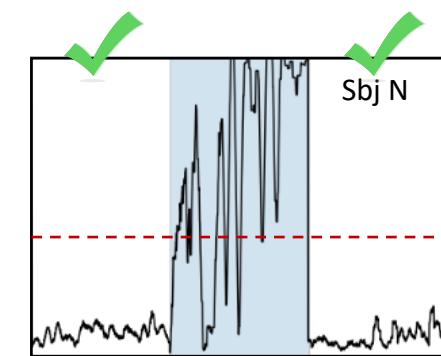
## Multi-Task Dataset | Testing



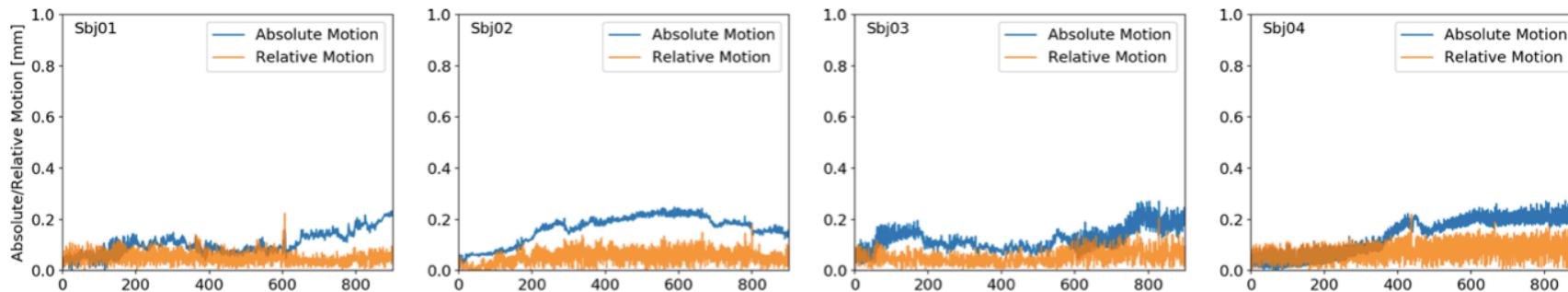
- 7T HCP Release: 15-min long eyes-open resting state scans with concurrent eye tracking recordings.
- Subjects that stayed awake during the whole rest scan.



## Continuous Rest Dataset | Application



- Of these, we focused on the 20 subjects with the least amount of motion.

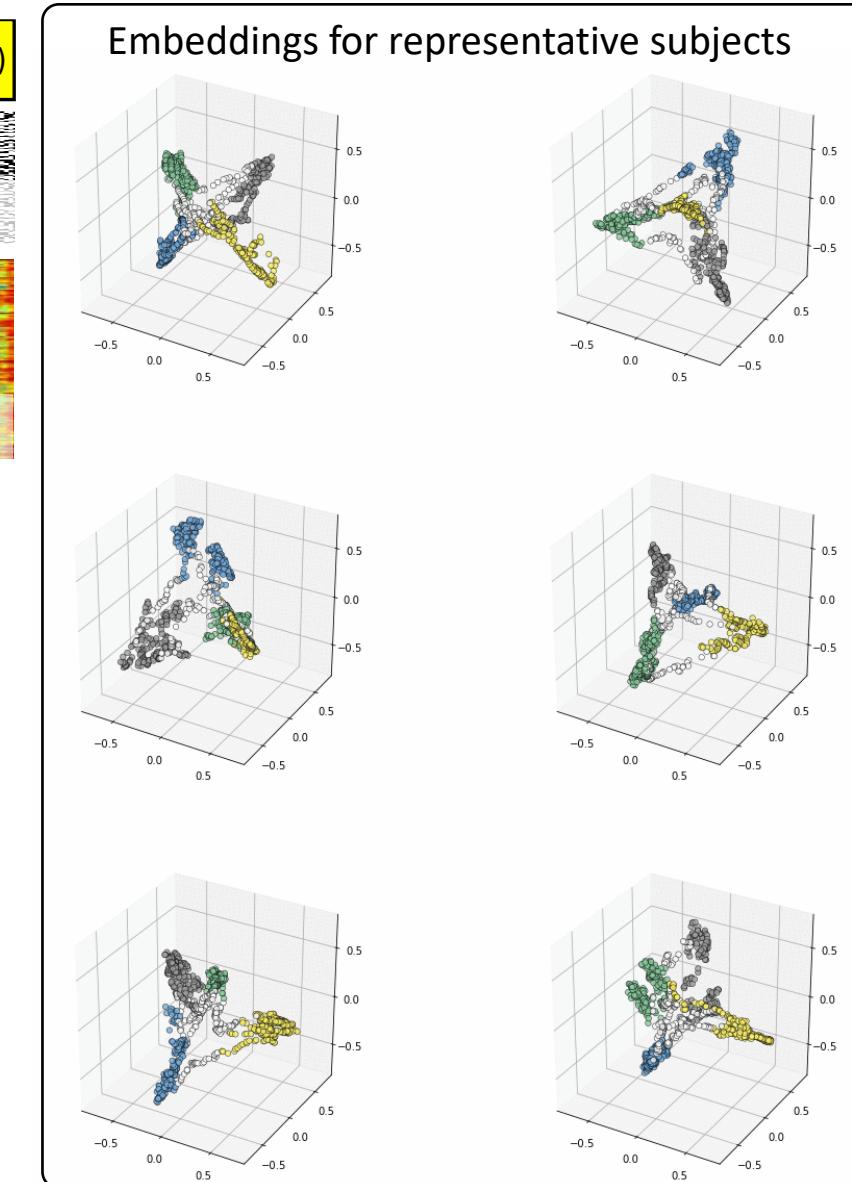
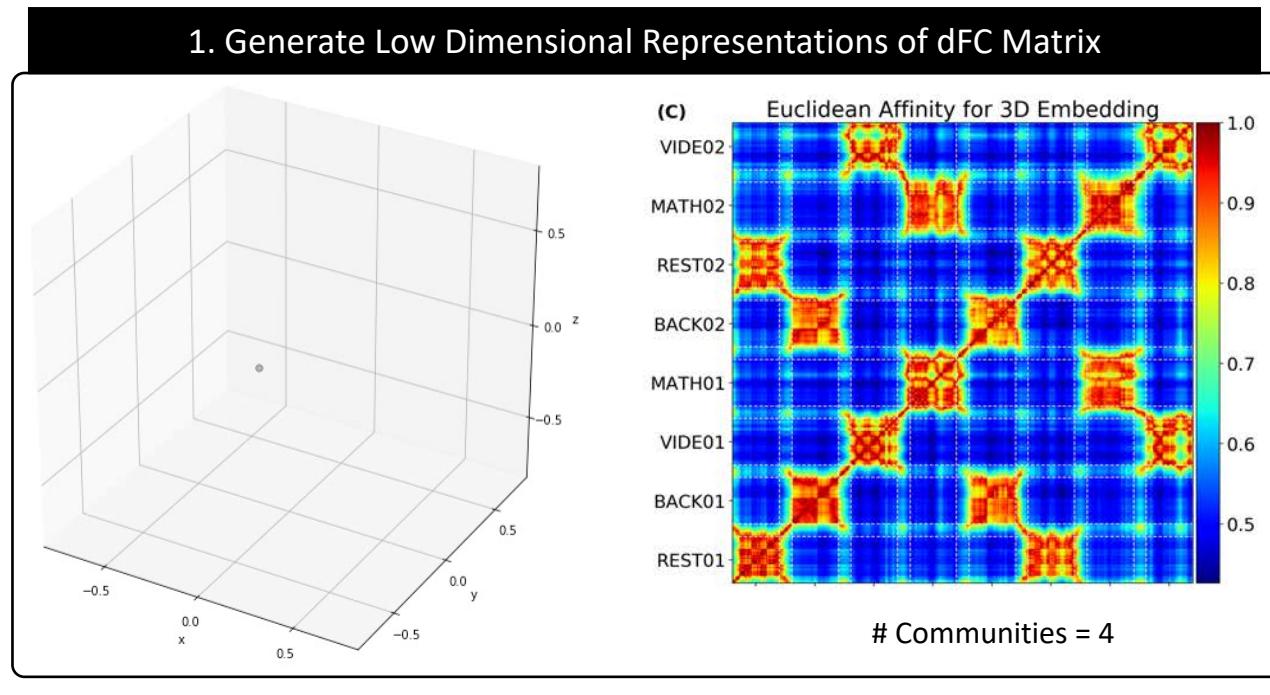
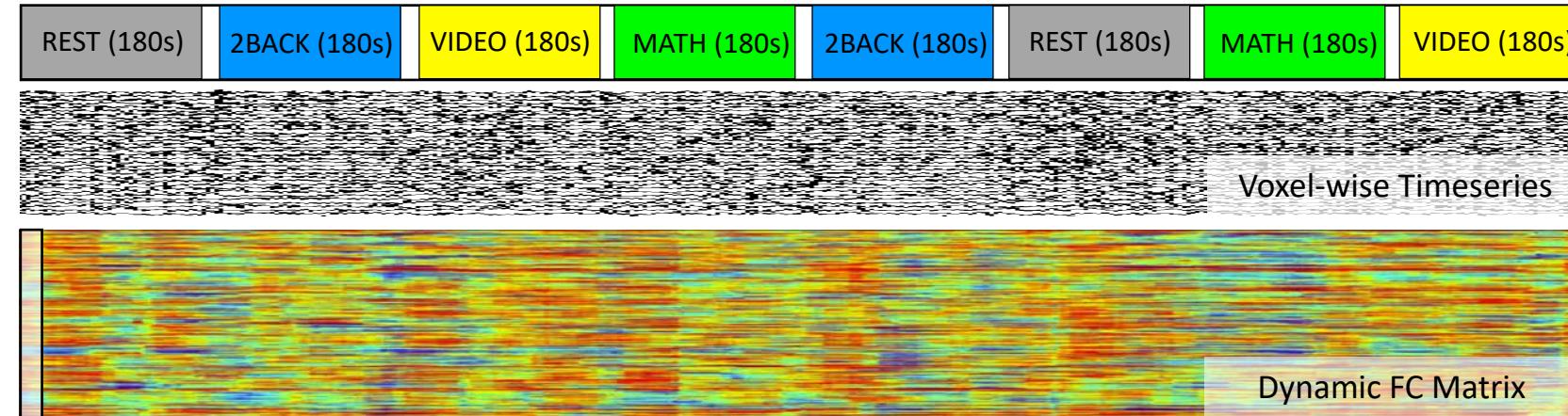


Average absolute motion was  $0.27 \pm 0.18$  mm, and average relative volume-to-volume motion was  $0.10 \pm 0.07$  mm.

Van Essen et al. *NeuroImage* 2013



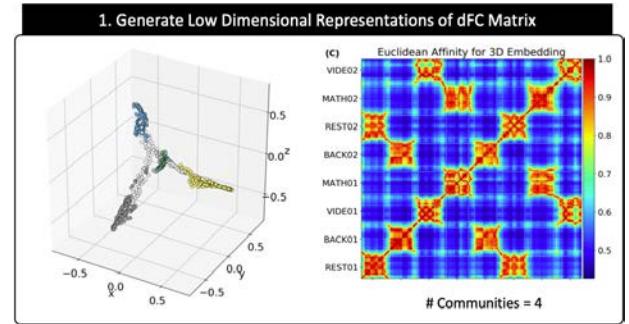
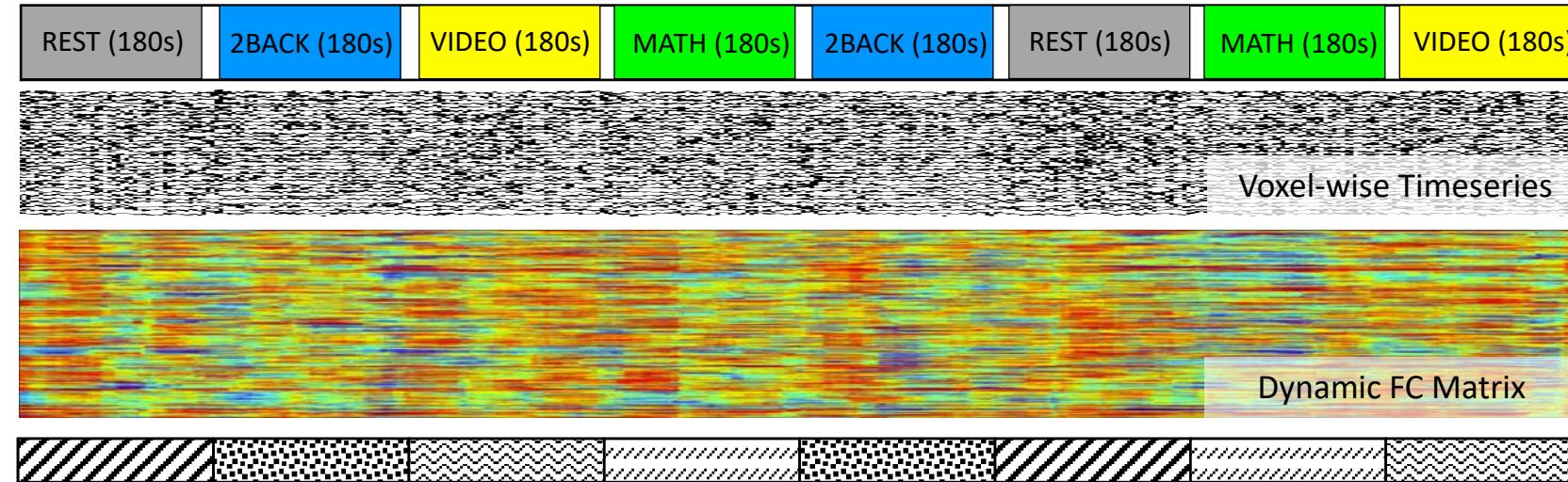
# Testing Methods on Multi-task Data LOW DIMENSIONAL EMBEDDINGS



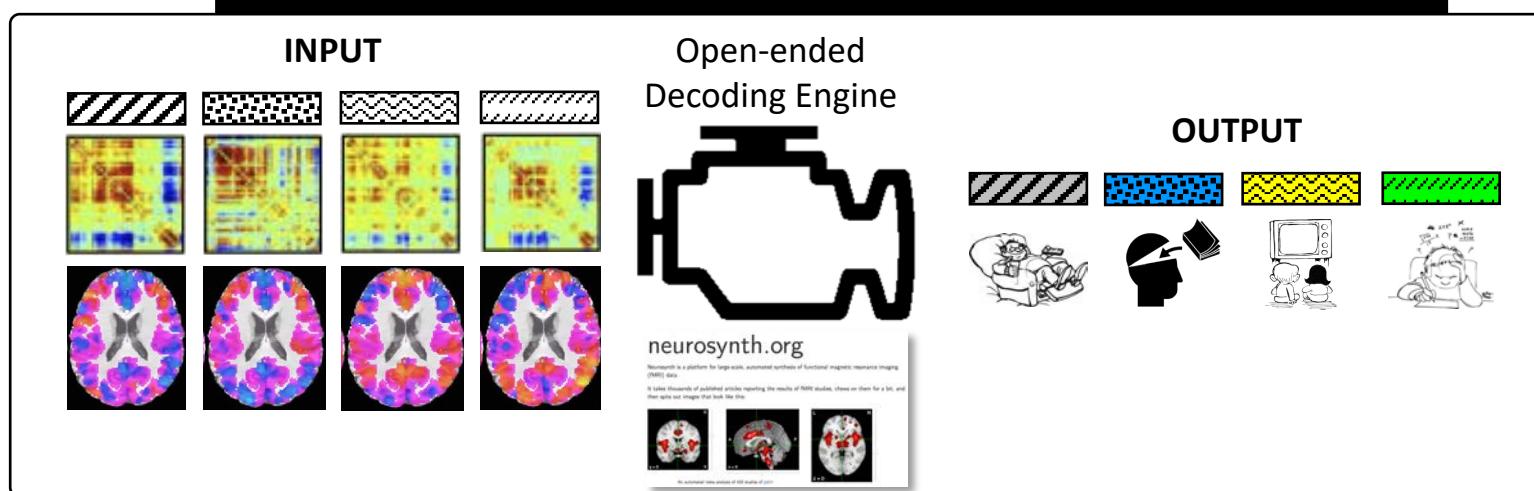


# Testing Methods on Multi-task Data

## INFERRING COGNITIVE CORRELATES (I)



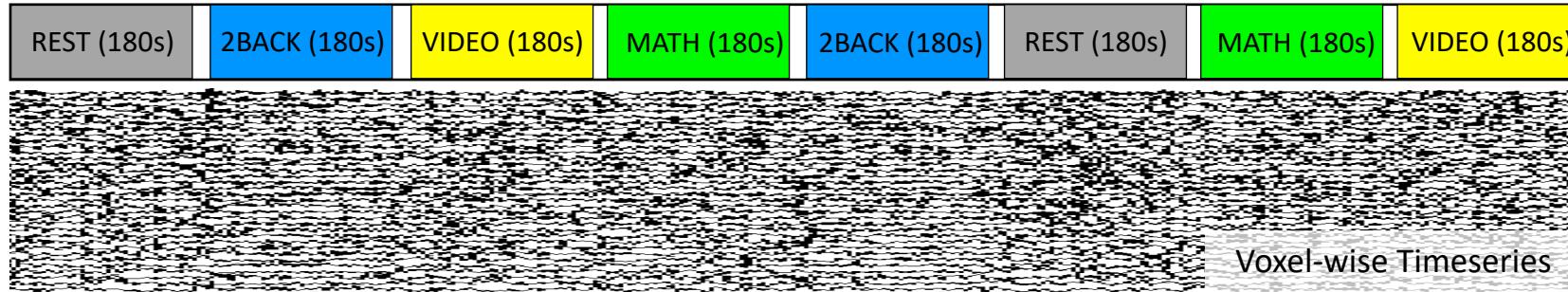
3. Decode Cognitive Processes aligned with each segment





# Testing Methods on Multi-task Data

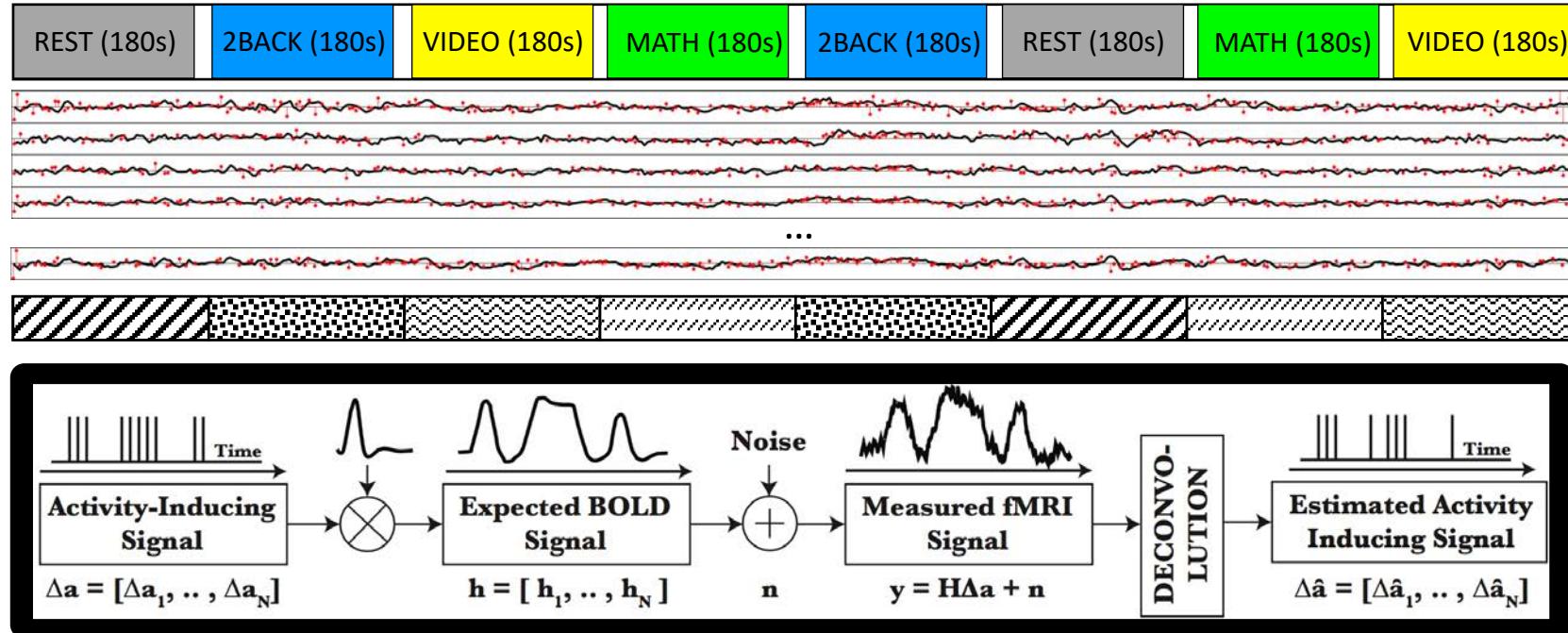
## INFERRING COGNITIVE CORRELATES (II)





# Testing Methods on Multi-task Data

## INFERRING COGNITIVE CORRELATES (II)

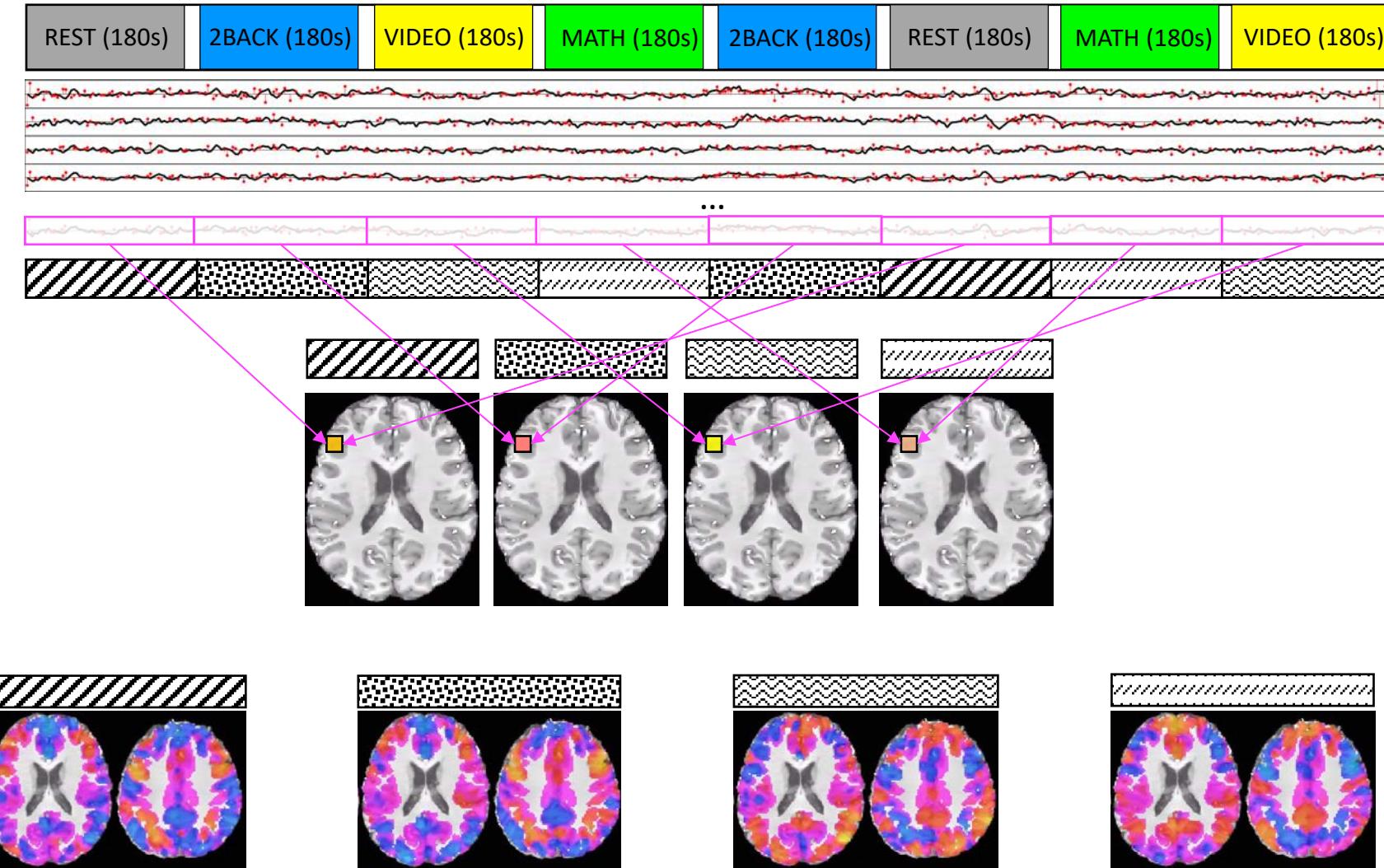


Hemodynamic Deconvolution – Find Most Prominent Activity Inducing Events  
(SPFM; Caballero-Gaudes et al. HMB 2011)



# Testing Methods on Multi-task Data

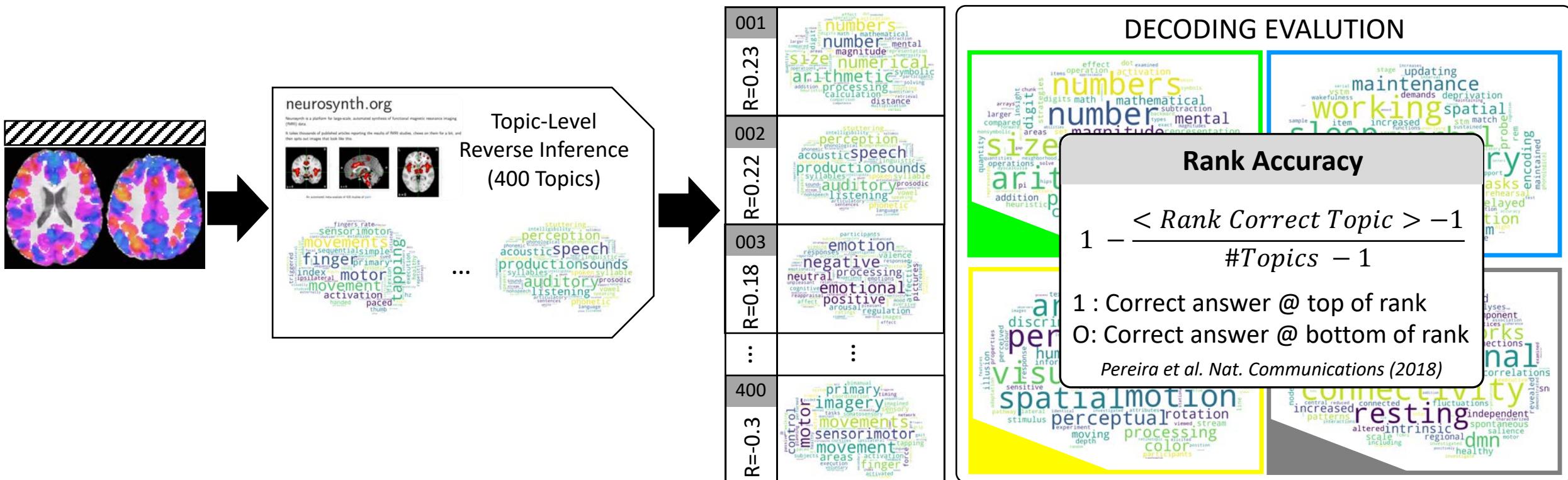
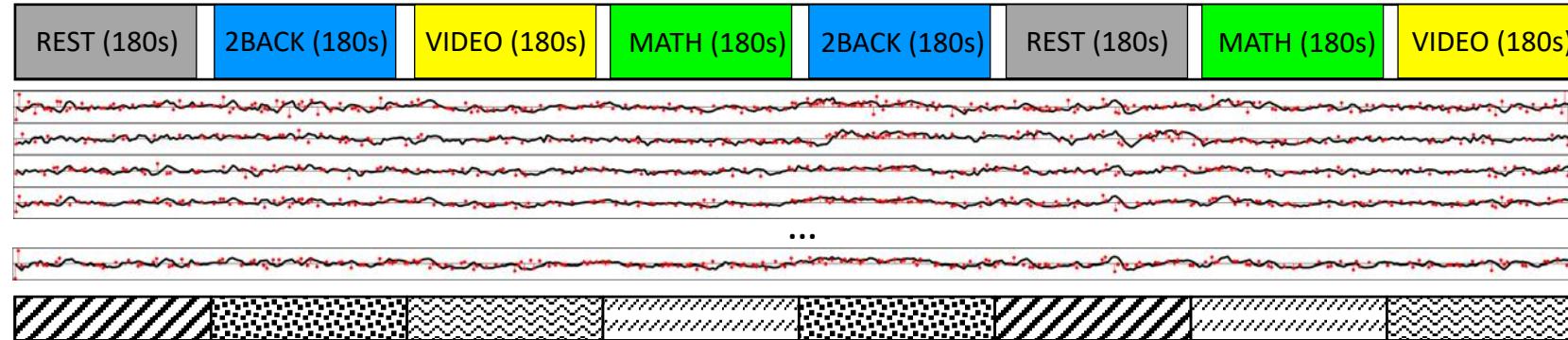
## INFERRING COGNITIVE CORRELATES (II)





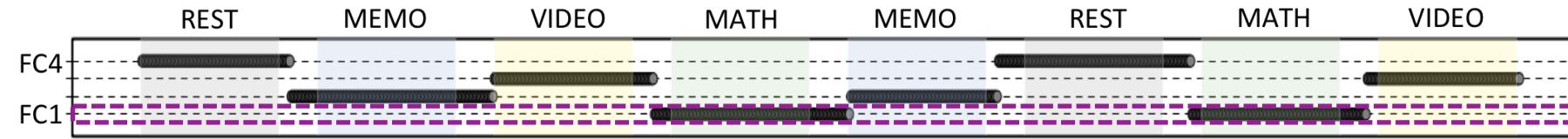
# Testing Methods on Multi-task Data

## INFERRING COGNITIVE CORRELATES (II)

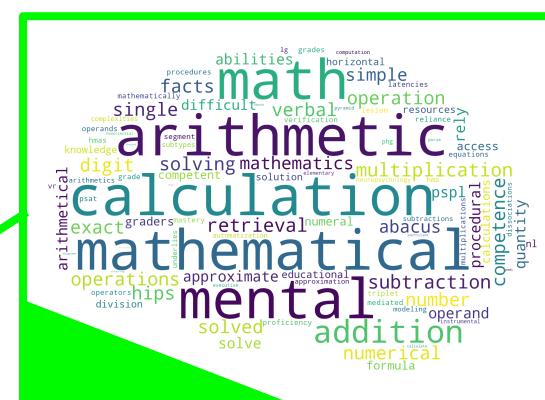
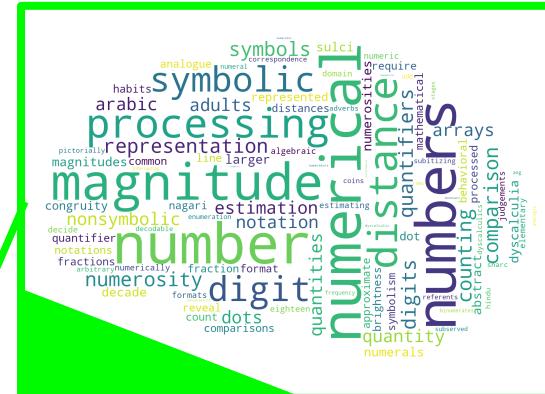
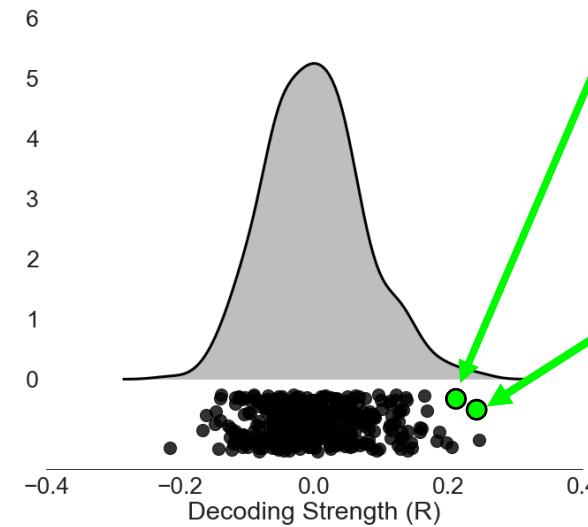
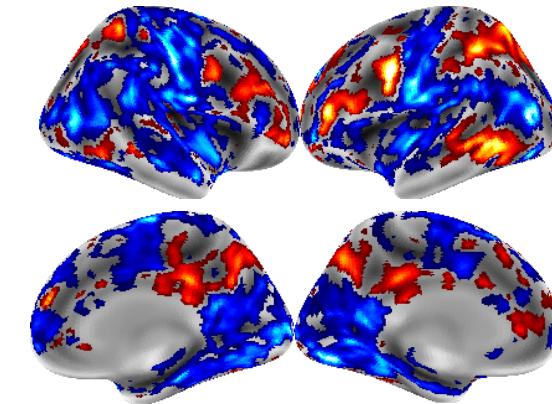




# Reverse Inference in Multi-task Data (Individual Results)

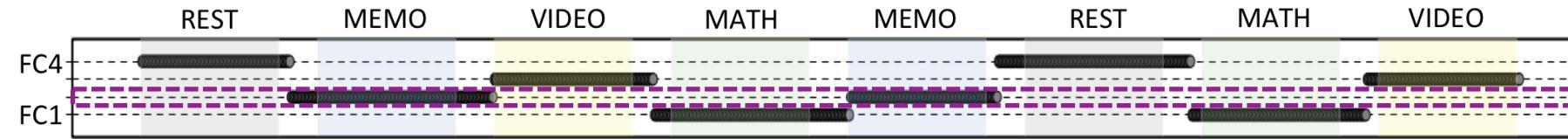


FC 1

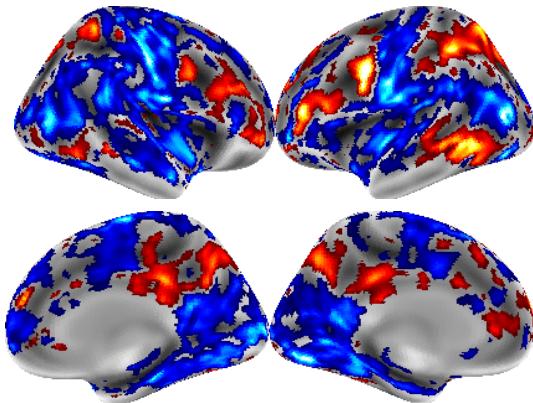




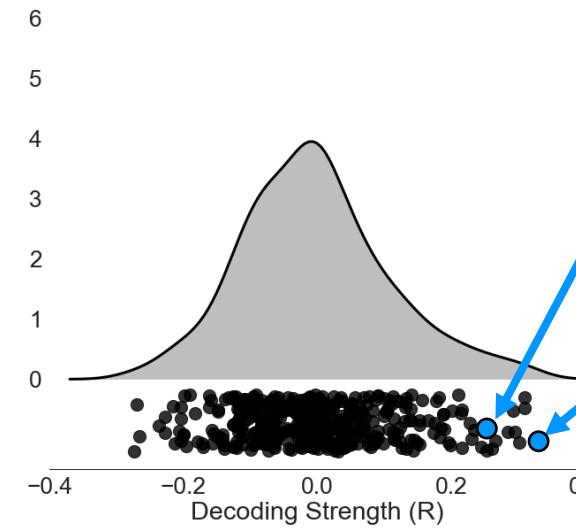
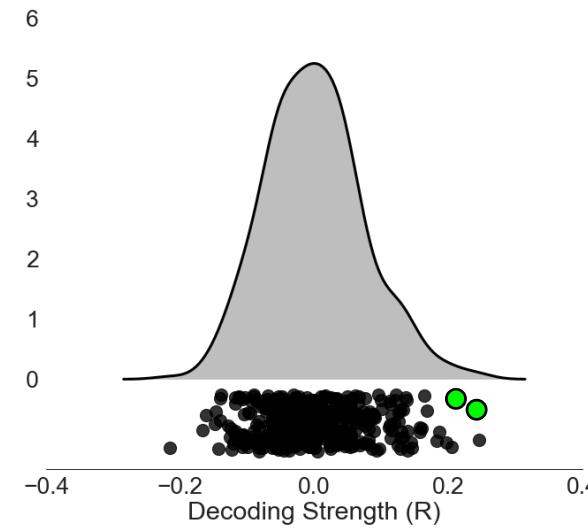
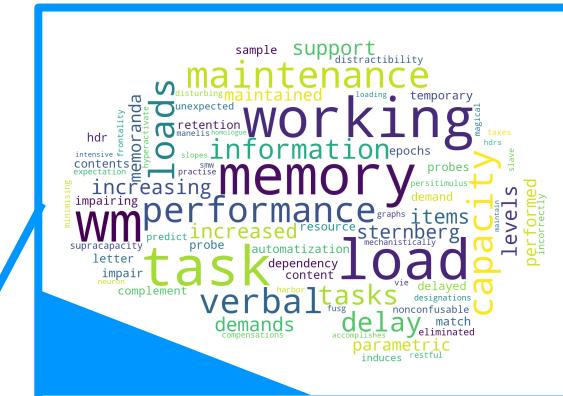
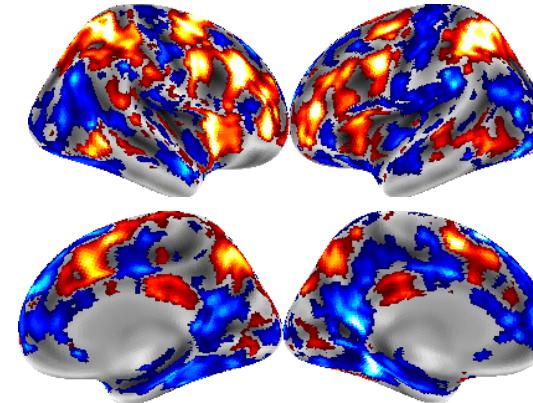
# Reverse Inference in Multi-task Data (Individual Results)



FC 1

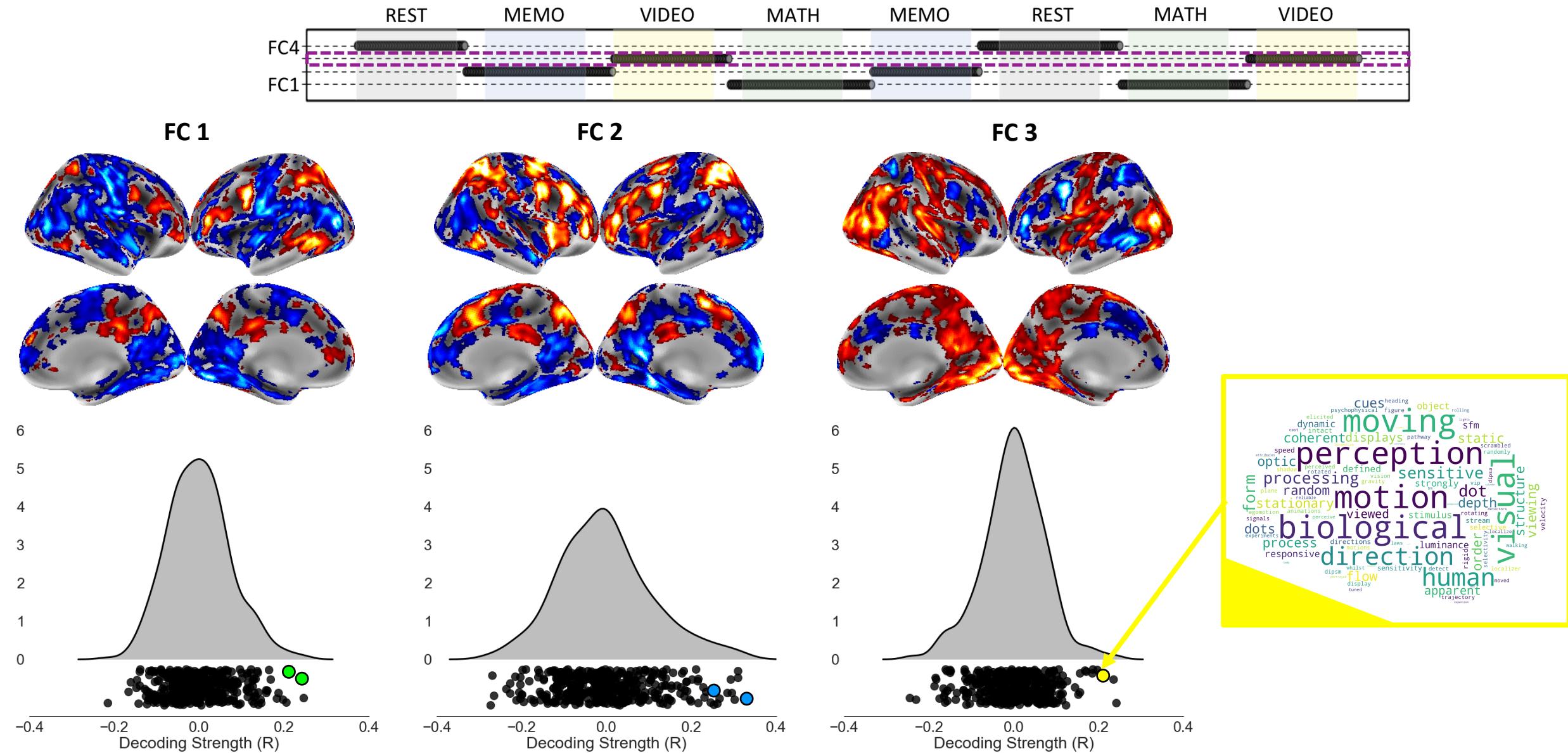


FC 2



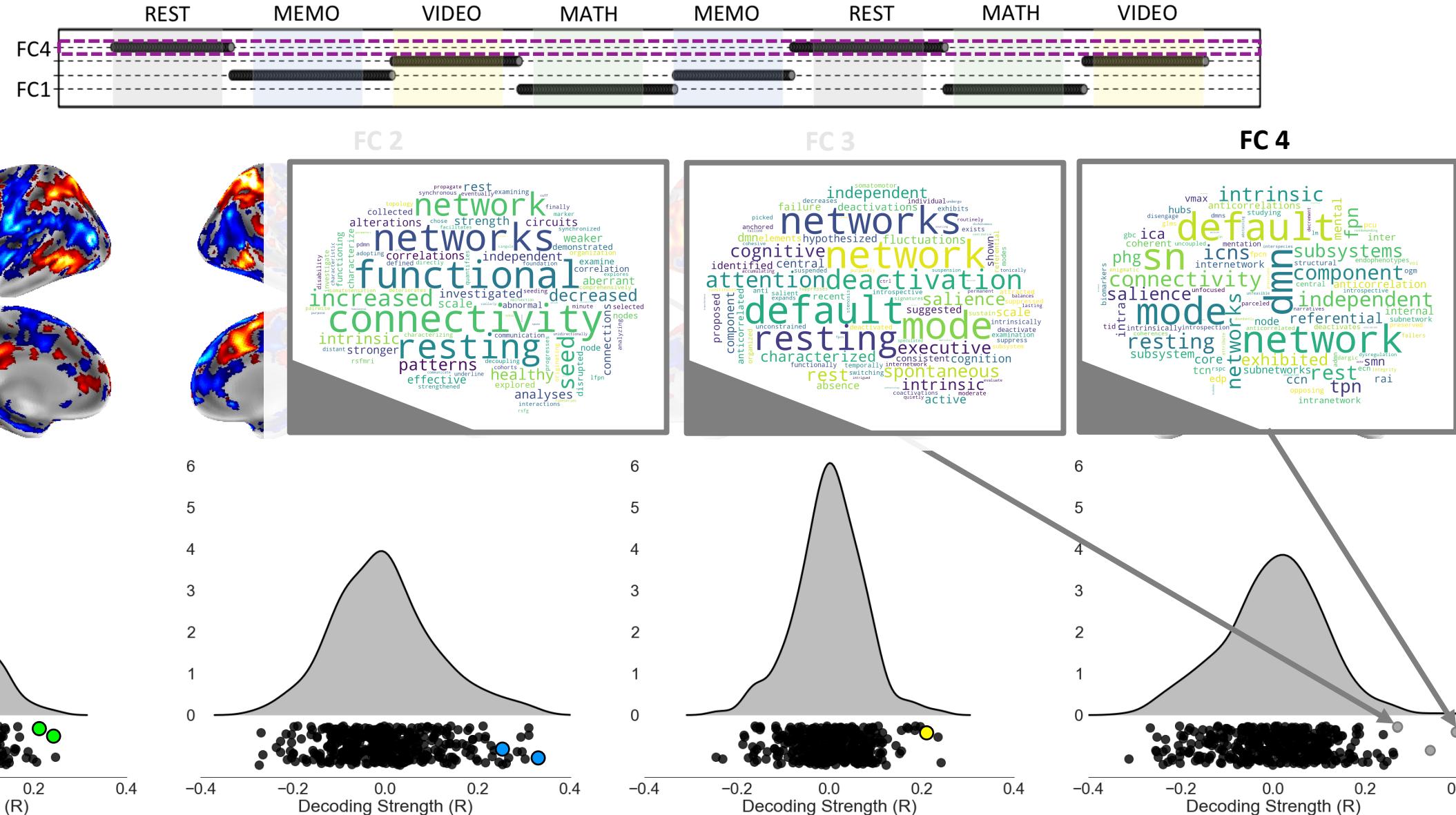


# Reverse Inference in Multi-task Data (Individual Results)



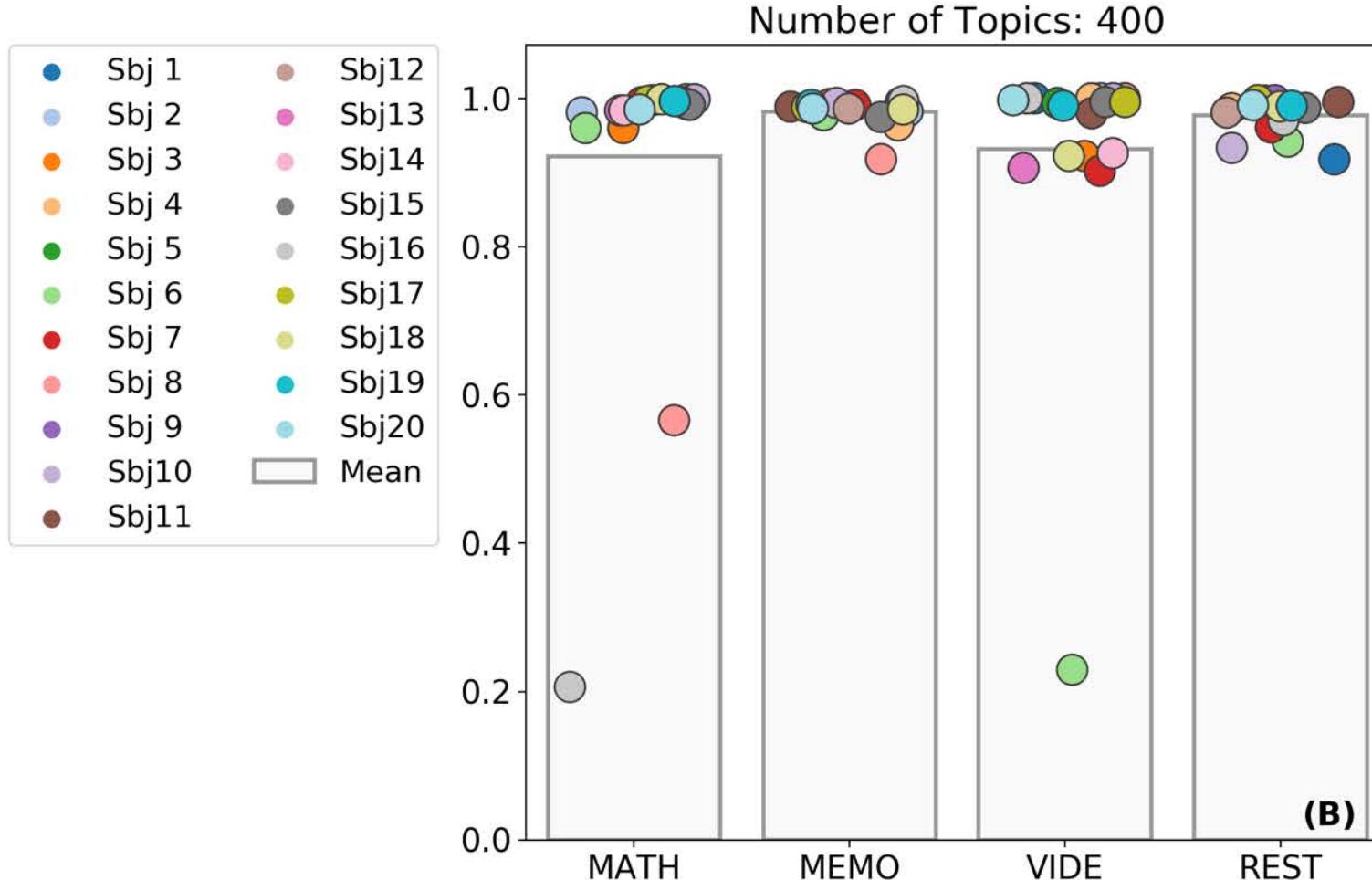


# Reverse Inference in Multi-task Data (Individual Results)





# Reverse Inference in Multi-task Data (Group Results)



**Rank Accuracy**

$$1 - \frac{\langle \text{Rank Correct Topic} \rangle - 1}{\# \text{Topics} - 1}$$

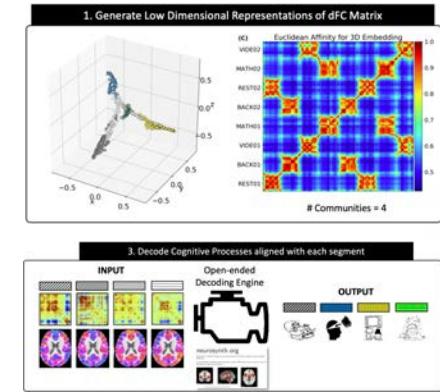
1 : Correct answer @ top of rank  
0: Correct answer @ bottom of rank

Pereira et al. *Nat. Communications* (2018)

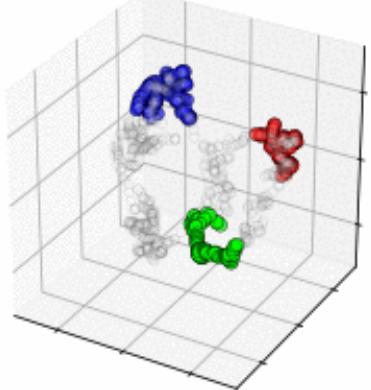


# Exploration of Resting Data

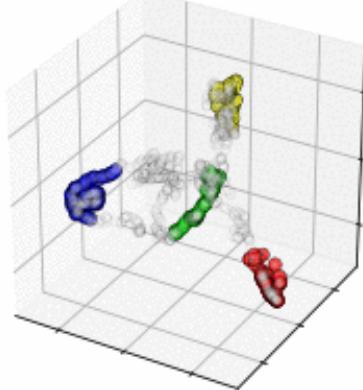
## (Laplacian Embeddings – Distant Corners)



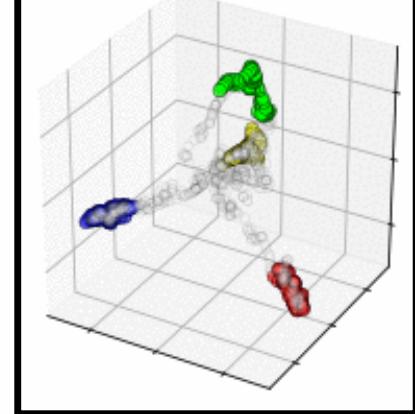
Sbj01



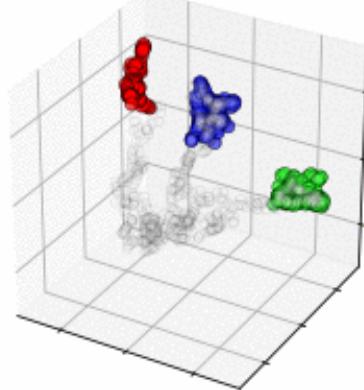
Sbj03



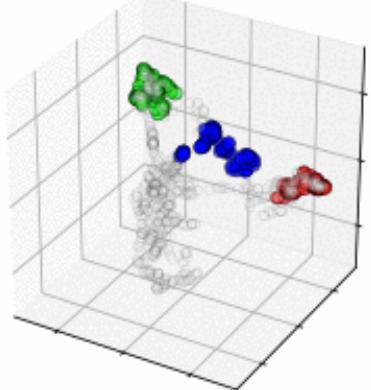
Sbj05



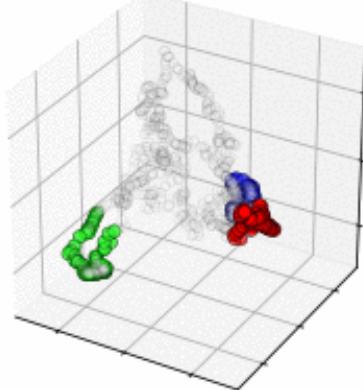
Sbj07



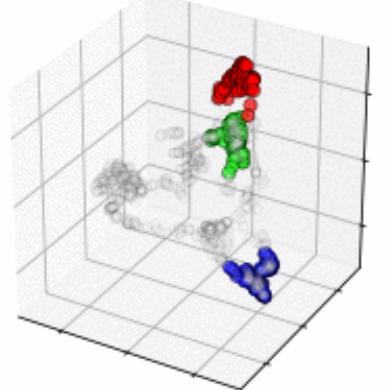
Sbj08



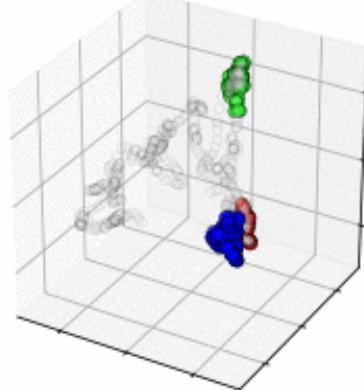
Sbj13



Sbj14

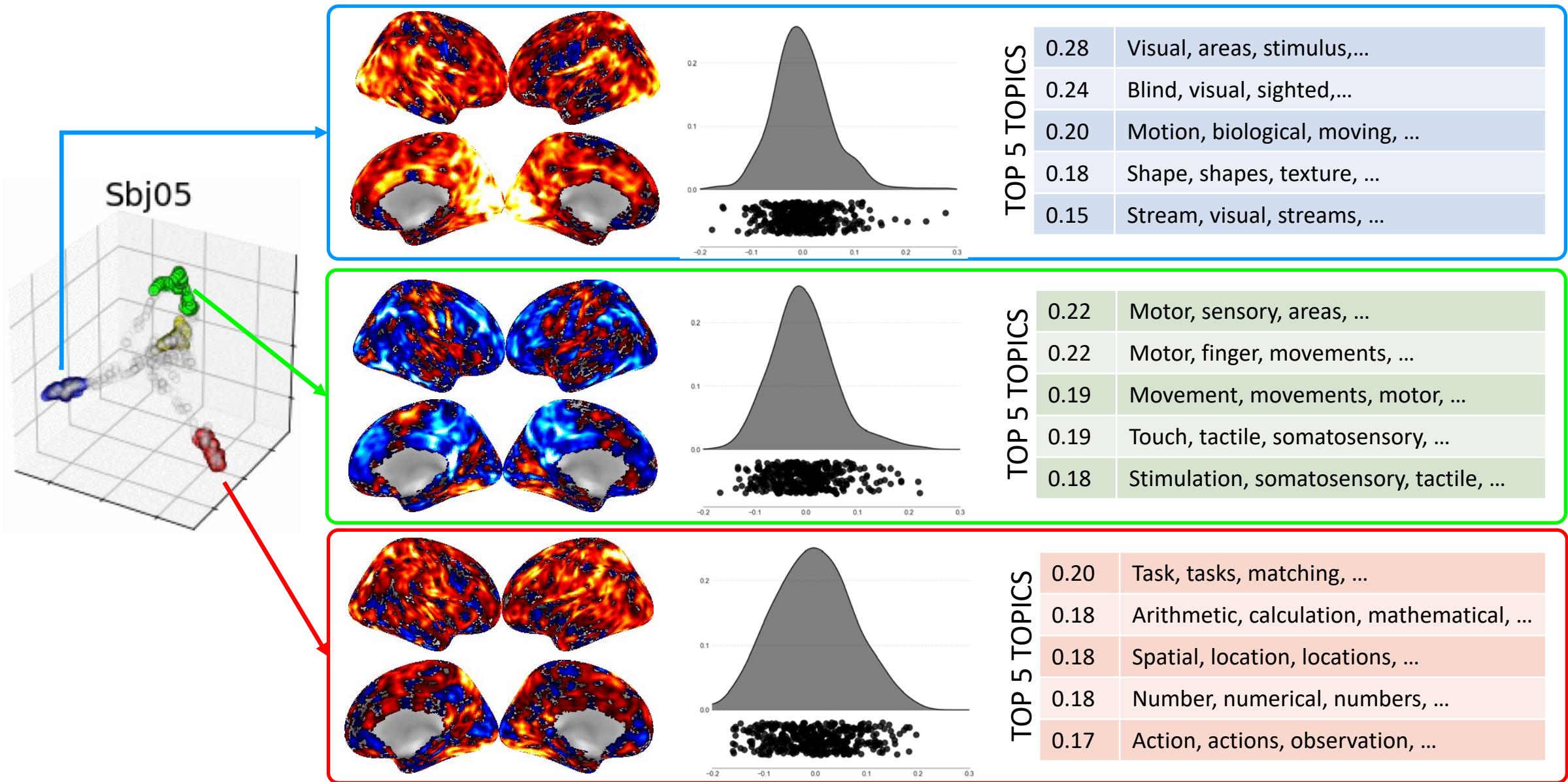


Sbj17



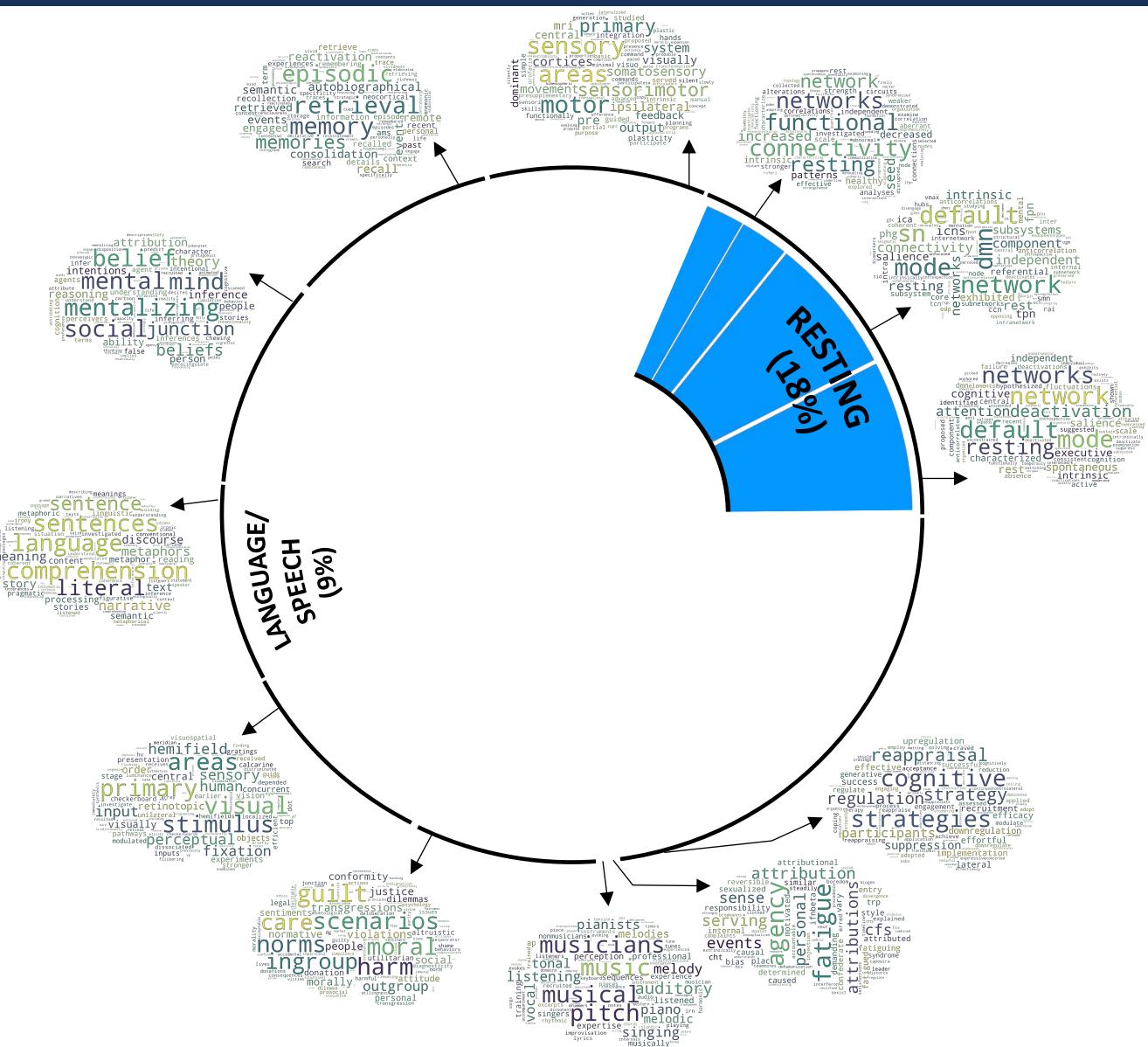


# Reverse Inference in Resting Data (Individual Results)





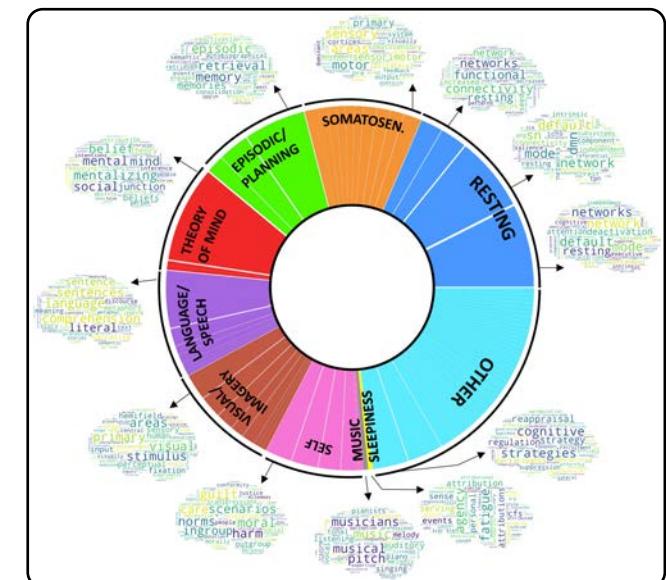
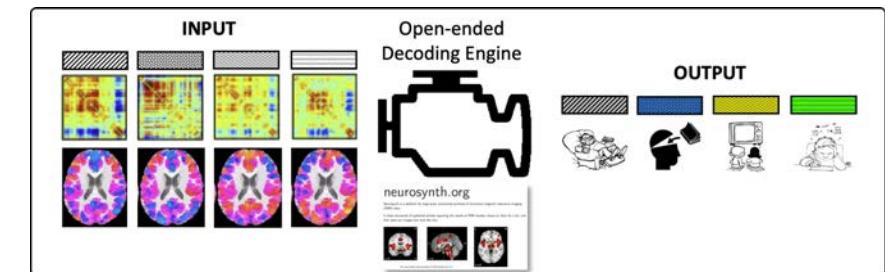
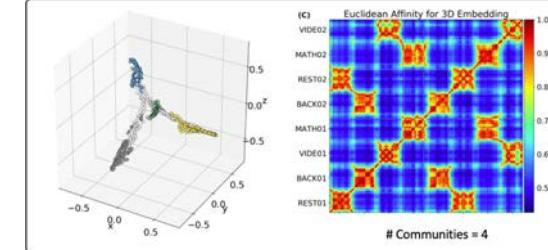
# Reverse Inference in Resting Data (Group Results)





# Conclusions

- Demonstrate the use of Laplacian Embeddings as a valuable explorative tool for dynamic FC during task and rest.
- Demonstrate the combined use of Hemodynamic Deconvolution + NeuroSynth to infer the cognitive correlates of distinct dynamic FC patterns.
- Provide evidence in support of the hypothesis that covert on-going cognition contributes to dFC estimates during awake rest.
- Data suggests that several meaningful FC configurations may be observable during rest.
- Data-driven estimates of covert cognition agree with previous reports of what the most common mental processes subjects engage with during rest are.





# Acknowledgements / Questions



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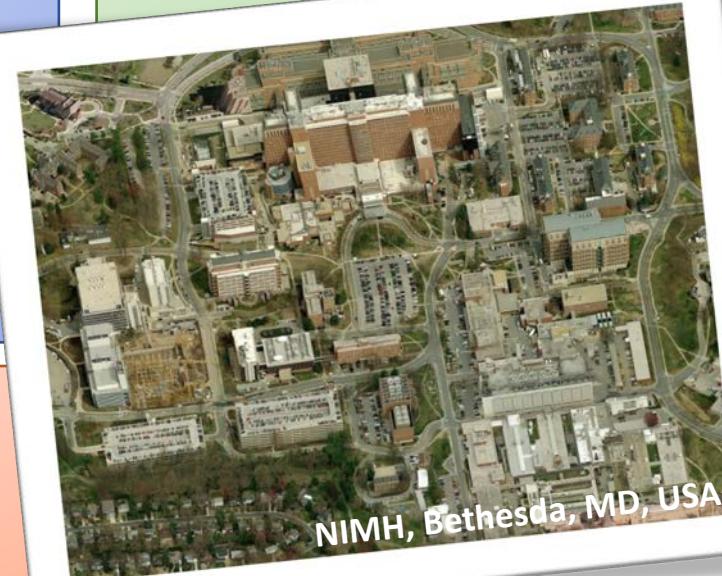
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Daniel Glen, Richard Reynolds  
Gang Chen



## Machine Learning Team

**Francisco Pereira**  
Charles Zheng  
Patrick McClure



## Basque Center on Cognition, Brain and Language

César Caballero-Gaudes  
Manuel Carreiras

