



# Gradients go to the movies: Macroscale cortical organization during naturalistic viewing

Ahmad Samara<sup>1</sup>, Jeffrey Eilbott<sup>2</sup>, Ting Xu<sup>3</sup>, Hallee Shearer<sup>1</sup>, Tamara Vanderwal<sup>1,2</sup>

<sup>1</sup> University of British Columbia, Canada; <sup>2</sup> BC Children's Hospital Research Institute, Canada; <sup>3</sup> Child Mind Institute, United States

asamara1@student.ubc.ca

## BACKGROUND

- Applying dimension-reduction techniques has revealed underlying principles of functional organization by identifying functional connectivity (FC) components (i.e., gradients)<sup>1</sup>.
  - These FC gradients are phylogenetically conserved<sup>1,2</sup> and are now being used to study brain disorders<sup>3,4</sup>, and to query state-based differences in FC patterns<sup>5</sup>.
  - Another rapidly advancing area of research is the use of naturalistic conditions such as movie-watching to study brain function under more ecologically valid conditions<sup>6</sup>.
- ➔ Here, we ask if the principles of macroscale cortical organization, captured by FC gradients, are the same during movie and rest.

## METHODS

### Dataset

- Human Connectome Project (HCP) 7T release<sup>7</sup>
- N=95, 58 females, mean age 29.5±3.3

### Functional runs

- 7T, TR=1000ms, TE=22.2ms, 1.6mm isotropic voxels
- 4 Rest runs, 15 min each, eyes open
- 4 Movie runs, roughly 15 min each, 4-5 movie clips per run
- Runs within each condition were concatenated

### Behavioural data

- Cognitive, emotion and motor domains
- PCA, first component (PC1) of each domain

### Gradient analyses

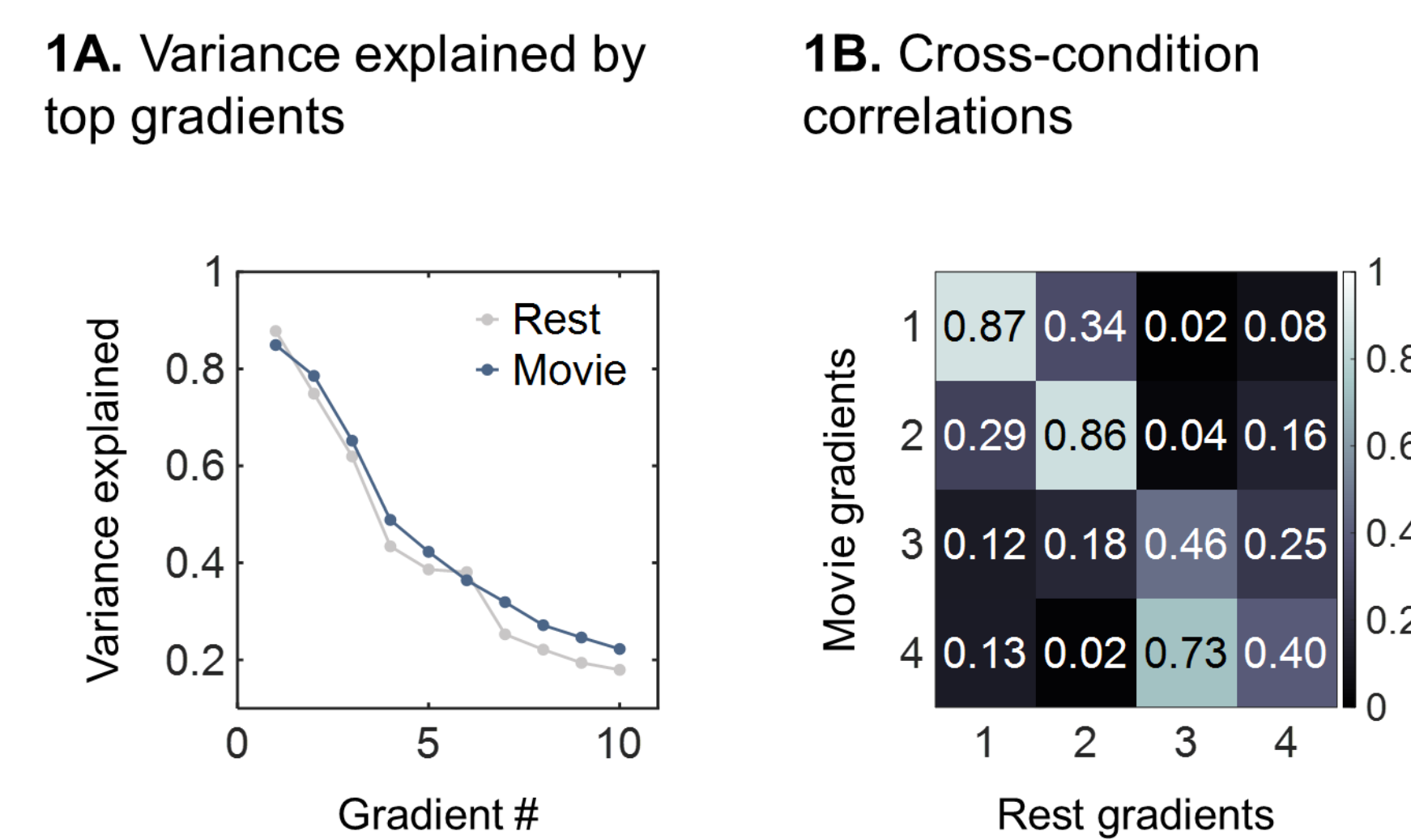
- Inputs: group- and individual-level FC matrices (Schaefer-1000 parcellation<sup>8</sup>)
- BrainSpace toolbox<sup>9</sup>
- Cosine similarity, diffusion embedding
- Group-level gradients were sign-flipped
- Individual-level gradients were aligned to group template

### Prediction of behaviour

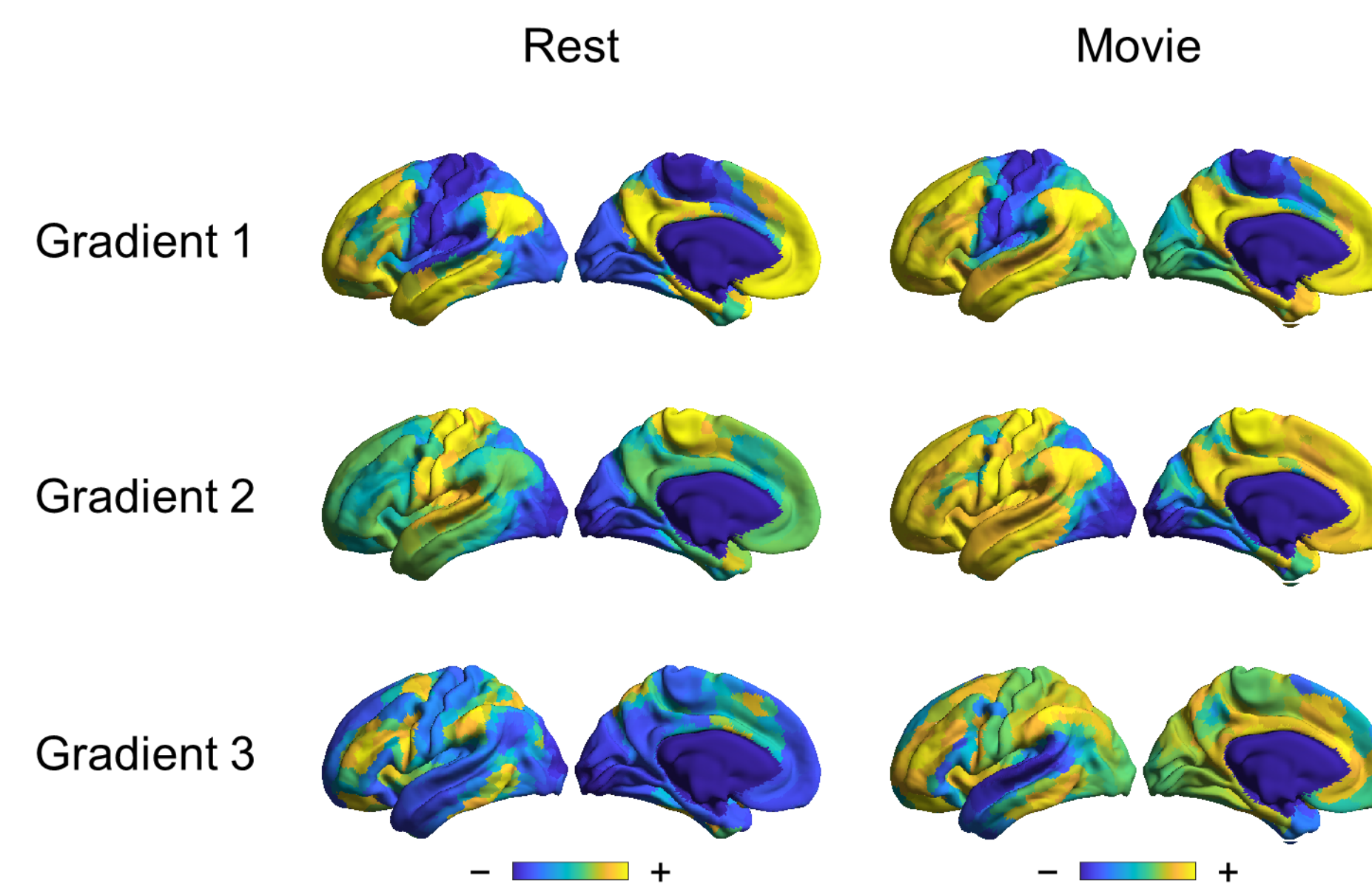
- Brain: Rest gradients vs. Movie gradients
- Behaviour: cognitive PC1, emotion PC1 and motor PC1
- Penalized regression
- 10-fold (9 training, 1 testing), siblings constrained to same fold, 100 iterations

## RESULTS

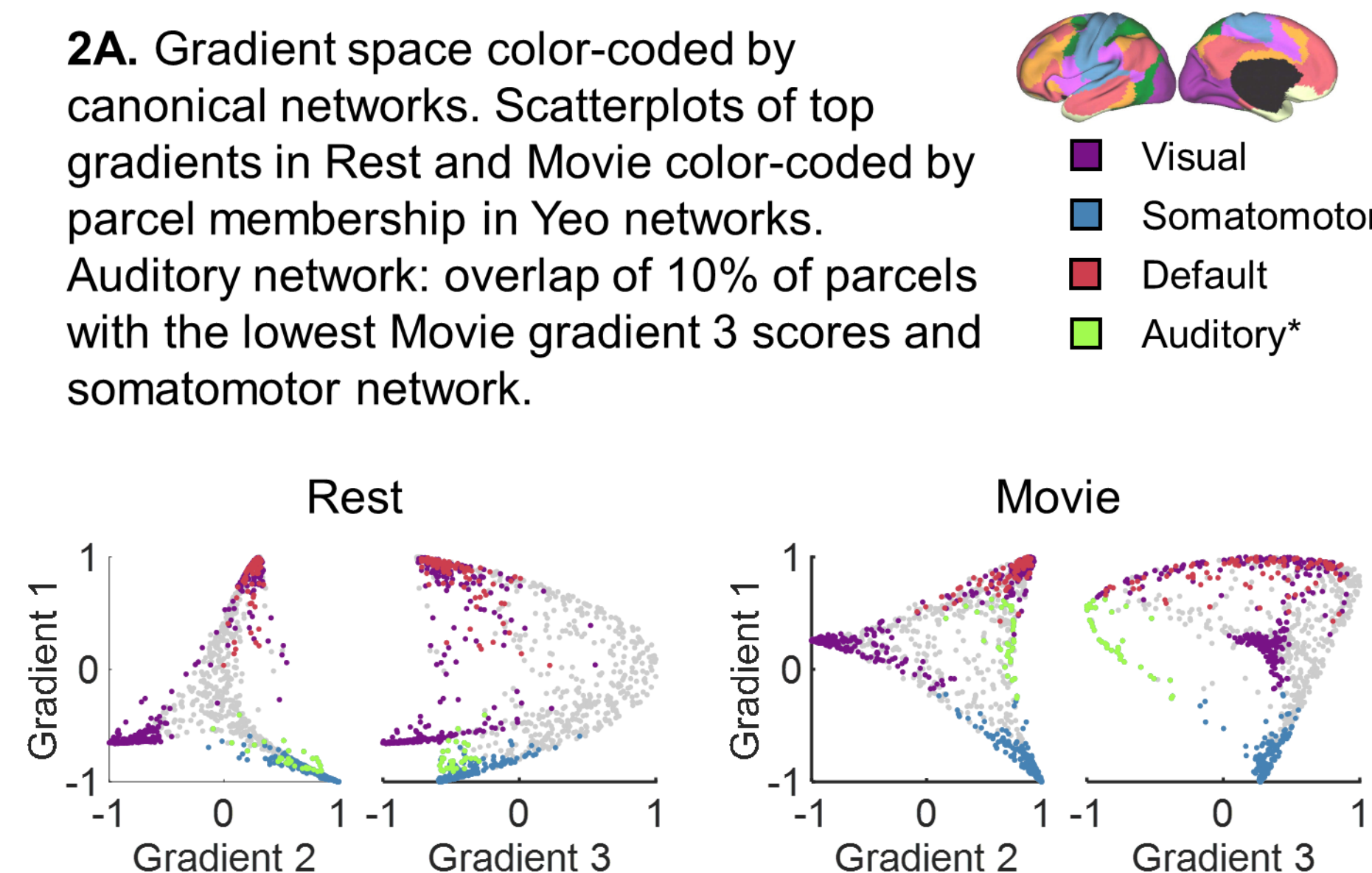
**Figure 1. Gradient topography**



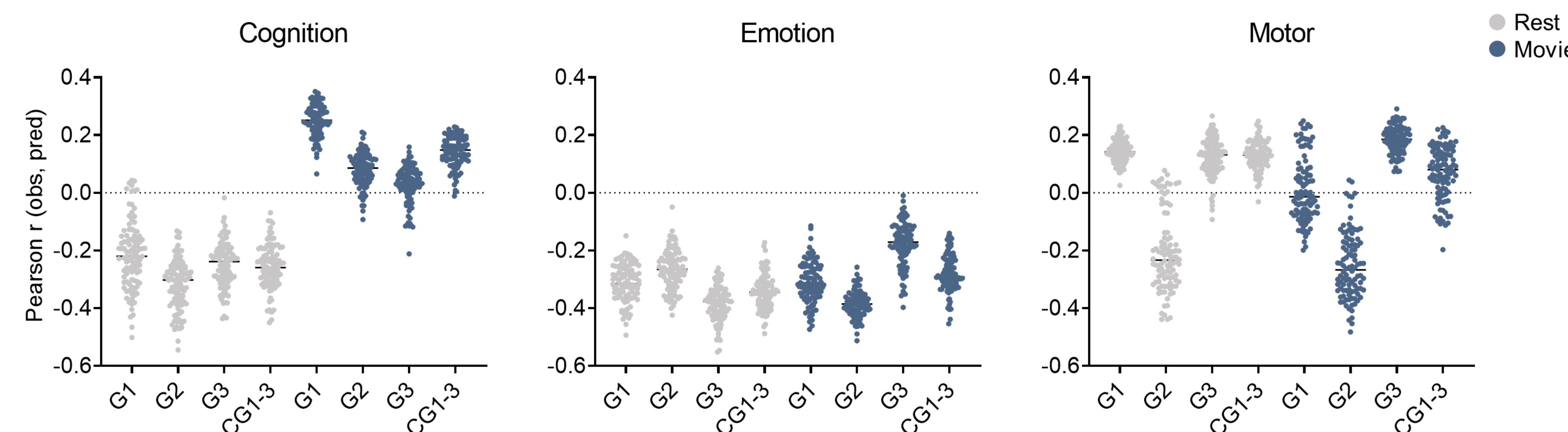
**1C. Gradient scores projected on cortical surface**



**Figure 2. Gradient space**



**Figure 3. Predictive modelling.** Movie vs. Rest for gradient-based prediction of cognitive, emotion and motor behavioral scores. CG1-3, combined gradients 1-3; G1, gradient 1; G2, gradient 2; G3, gradient 3.



## CONCLUSIONS

- Movie-watching data underscore the hierarchical organization of the brain observed in resting state.
  - Movie-watching reveals 3 unique modality-specific hierarchical gradients.
  - Movie gradients appear to outperform Rest gradients when predicting cognitive scores.
- ➔ These modality-specific hierarchical gradients might provide a unique tool for biomarker research in neuropsychiatry.

## REFERENCES

- Margulies, D.S. et al. (2016) Situating the default-mode network along a principal gradient of macroscale cortical organization. *Proc Natl Acad Sci U S A* 113 (44), 12574-12579.
- Xu, T. et al. (2020) Cross-species functional alignment reveals evolutionary hierarchy within the connectome. *Neuroimage* 223, 117346.
- Hong, S.J. et al. (2019) Atypical functional connectome hierarchy in autism. *Nat Commun* 10 (1), 1022.
- Hong, S.J. et al. (2020) Toward a connectivity gradient-based framework for reproducible biomarker discovery. *Neuroimage* 223, 117322.
- Cross, N. et al. (2021) Cortical gradients of functional connectivity are robust to state-dependent changes following sleep deprivation. *Neuroimage* 226, 117547.
- Sonkusare, S. et al. (2019) Naturalistic Stimuli in Neuroscience: Critically Acclaimed. *Trends Cogn Sci* 23 (8), 699-714.
- Van Essen, D.C. et al. (2013) The WU-Minn Human Connectome Project: an overview. *Neuroimage* 80, 62-79.
- Schaefer, A. et al. (2018) Local-Global Parcellation of the Human Cerebral Cortex from Intrinsic Functional Connectivity MRI. *Cereb Cortex* 28 (9), 3095-3114.
- Vos de Wael, R. et al. (2020) BrainSpace: a toolbox for the analysis of macroscale gradients in neuroimaging and connectomics datasets. *Commun Biol* 3 (1), 103.



THE UNIVERSITY OF BRITISH COLUMBIA



Naturalistic Neuroimaging Lab

