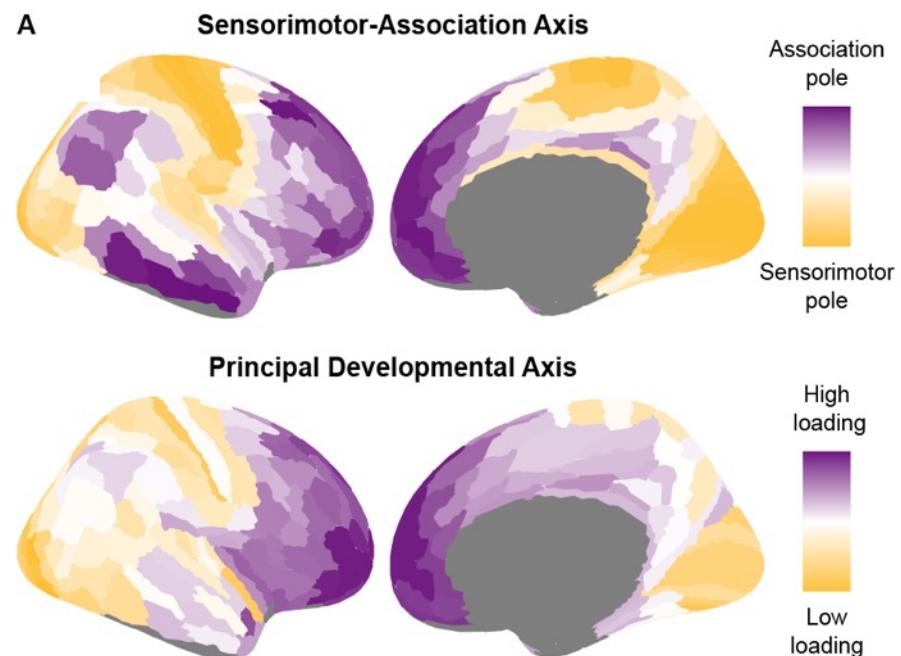
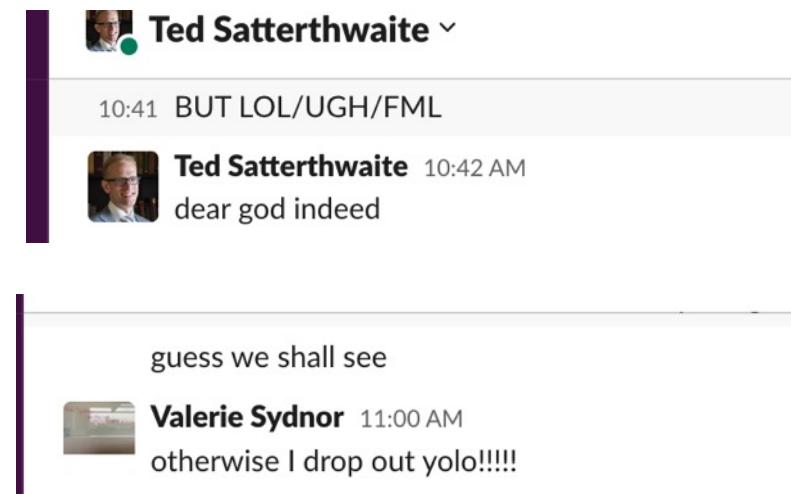
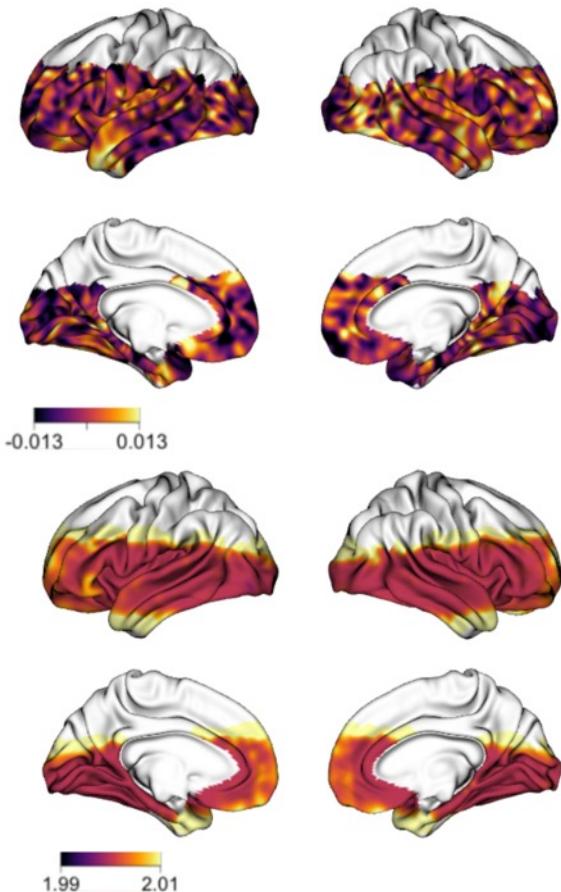


Project Development 🤝 Brain Development

A story in 3 acts



Overarching Project Aim

To characterize the spatiotemporal progression of developmental plasticity across the human cortex during childhood and adolescence.

Principles of Human Cortical Development

Human cortical development is **protracted**

- There are mechanisms that endow the human brain with an extended window of plasticity



Principles of Human Cortical Development

Human cortical development is **protracted**

Human cortical development is **heterochronous**

- Different regions are most plastic at different ages and mature at different rates



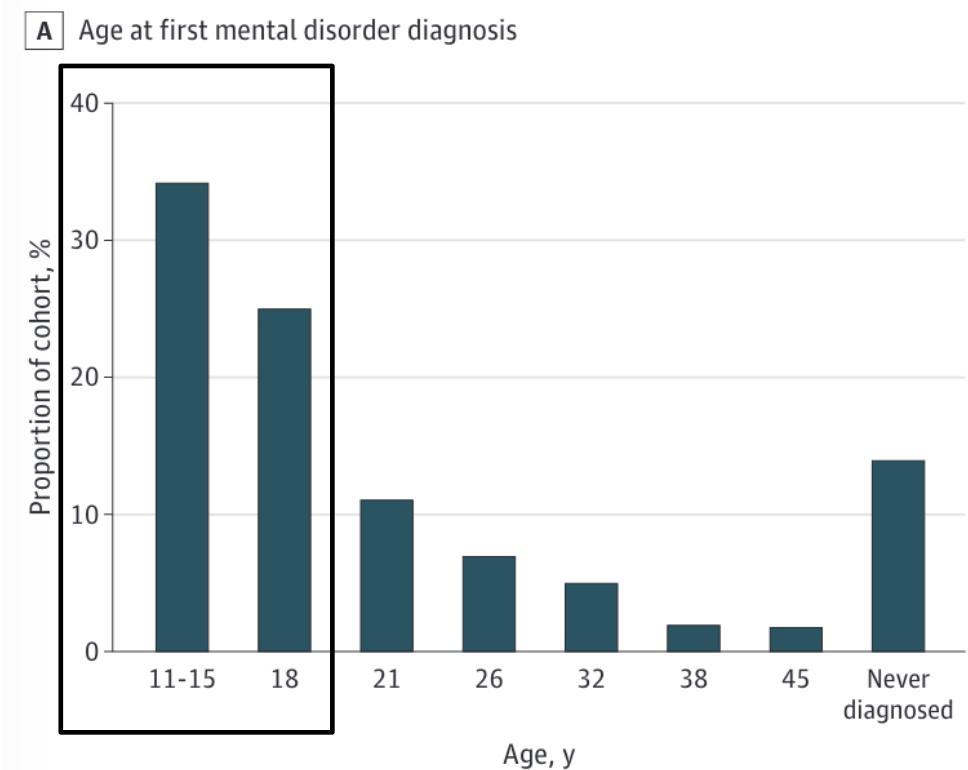
Principles of Human Cortical Development

Human cortical development is **protracted**

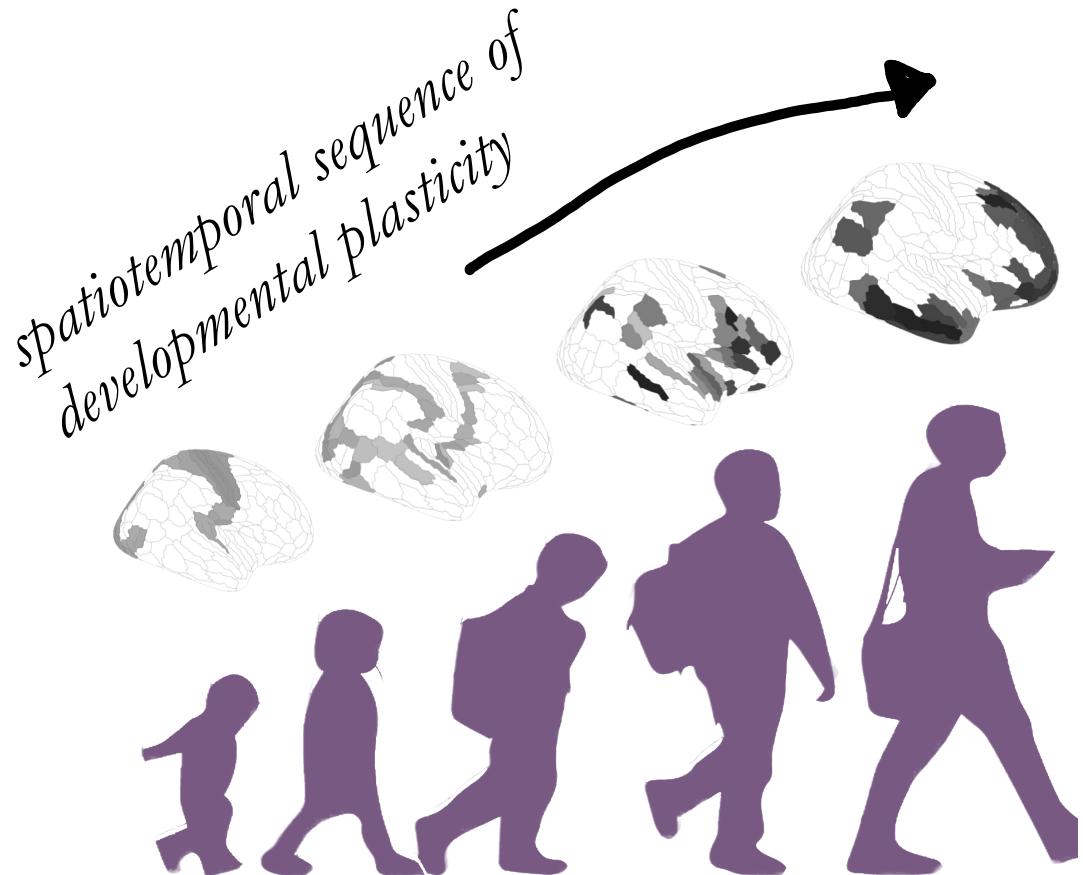
Human cortical development is **heterochronous**

Human cortical development enhances
vulnerability

- The majority of psychiatric disorders manifest in late childhood or adolescence



Timing of Human Cortical Development



- Normative patterns of developmental plasticity
- The role of disrupted plasticity mechanisms in youth-onset psychiatric disorders
- Age-dependent brain environment interactions
- Windows where interventions may maximally impact the brain

Timing of Human Cortical Development

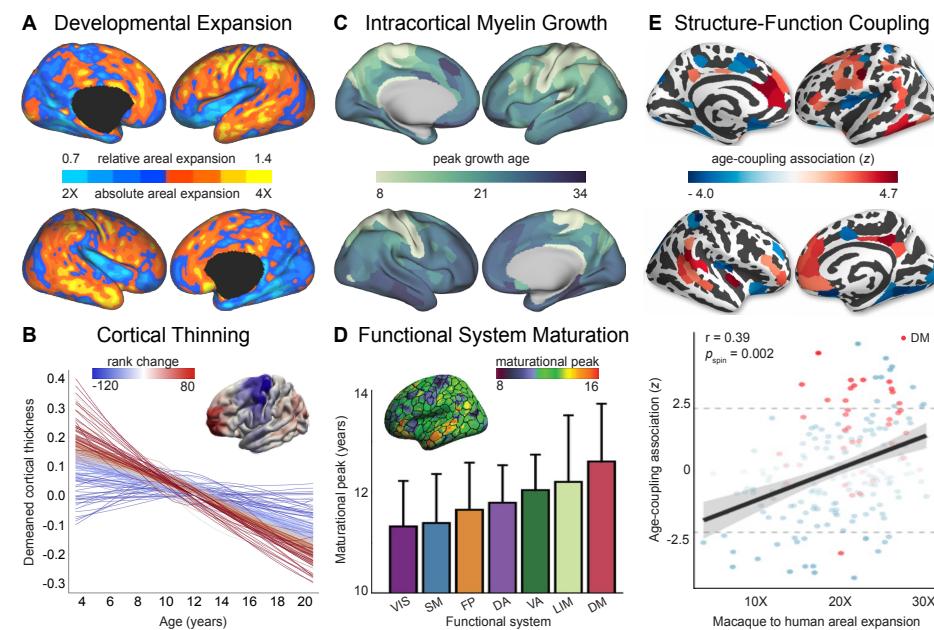
Developmental change
happens earlier in
sensorimotor cortices
and later in
association cortices



Aim 1:

To characterize the spatiotemporal development of cortical plasticity

Knowledge gap: The precise spatiotemporal sequence of development has yet to be characterized across the cortical mantle.



Sydnor et al., 2021, Neuron

Adapted from Hill et al., 2010 (A), Ball et al., 2020 (B), Grydeland et al., 2019 (C), Dong et al., 2020 (D), Baum et al., 2020 (E)

Aim 1:
To characterize the
spatiotemporal
development of
cortical plasticity

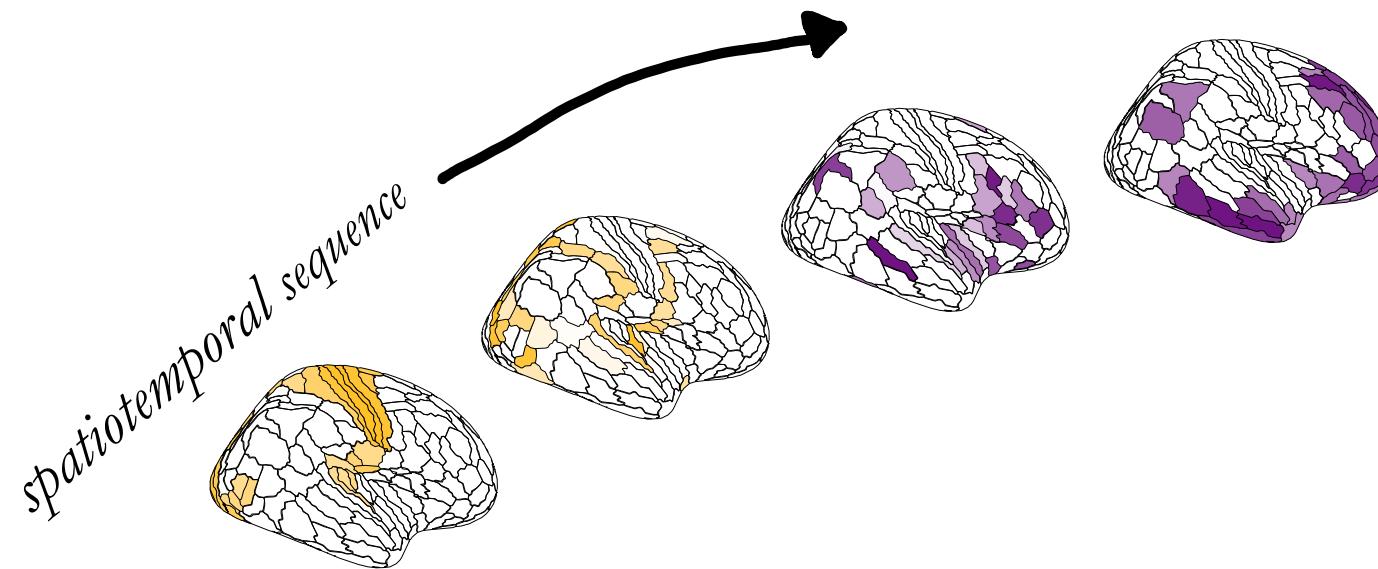
Knowledge gap: The precise spatiotemporal sequence of development has yet to be characterized across the cortical mantle.



Imaging and quantifying temporal sequences of cortical plasticity and cortical maturation

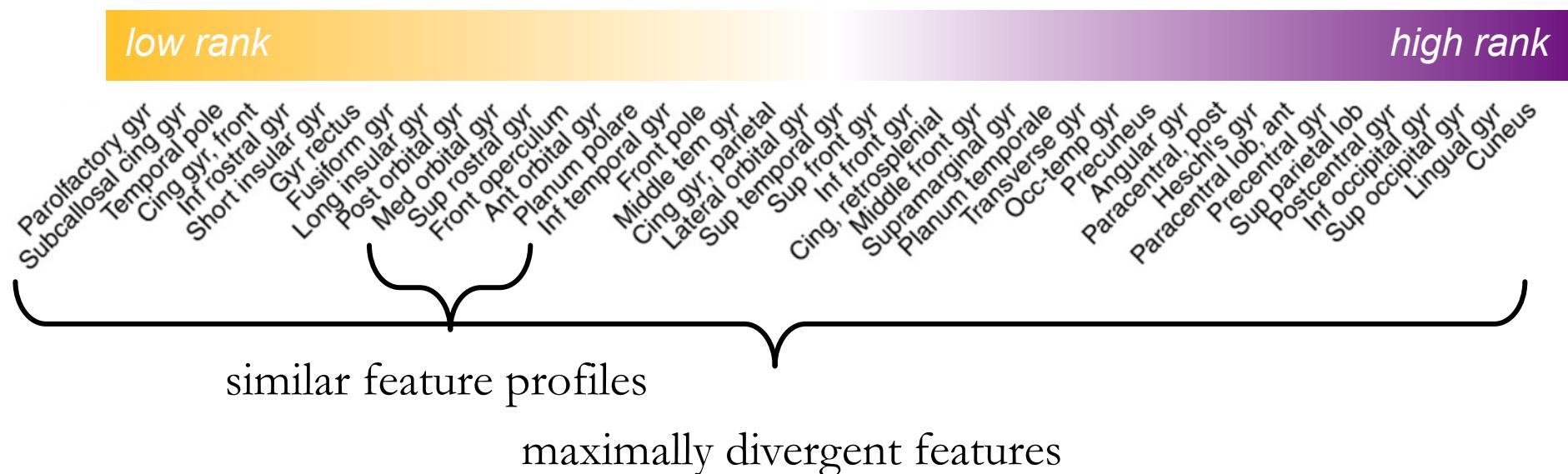
Timing of Human Cortical Development

During childhood and adolescence, cortical maturation progresses along a **sensorimotor-association axis due to the hierarchical unfolding of plasticity-regulating events**



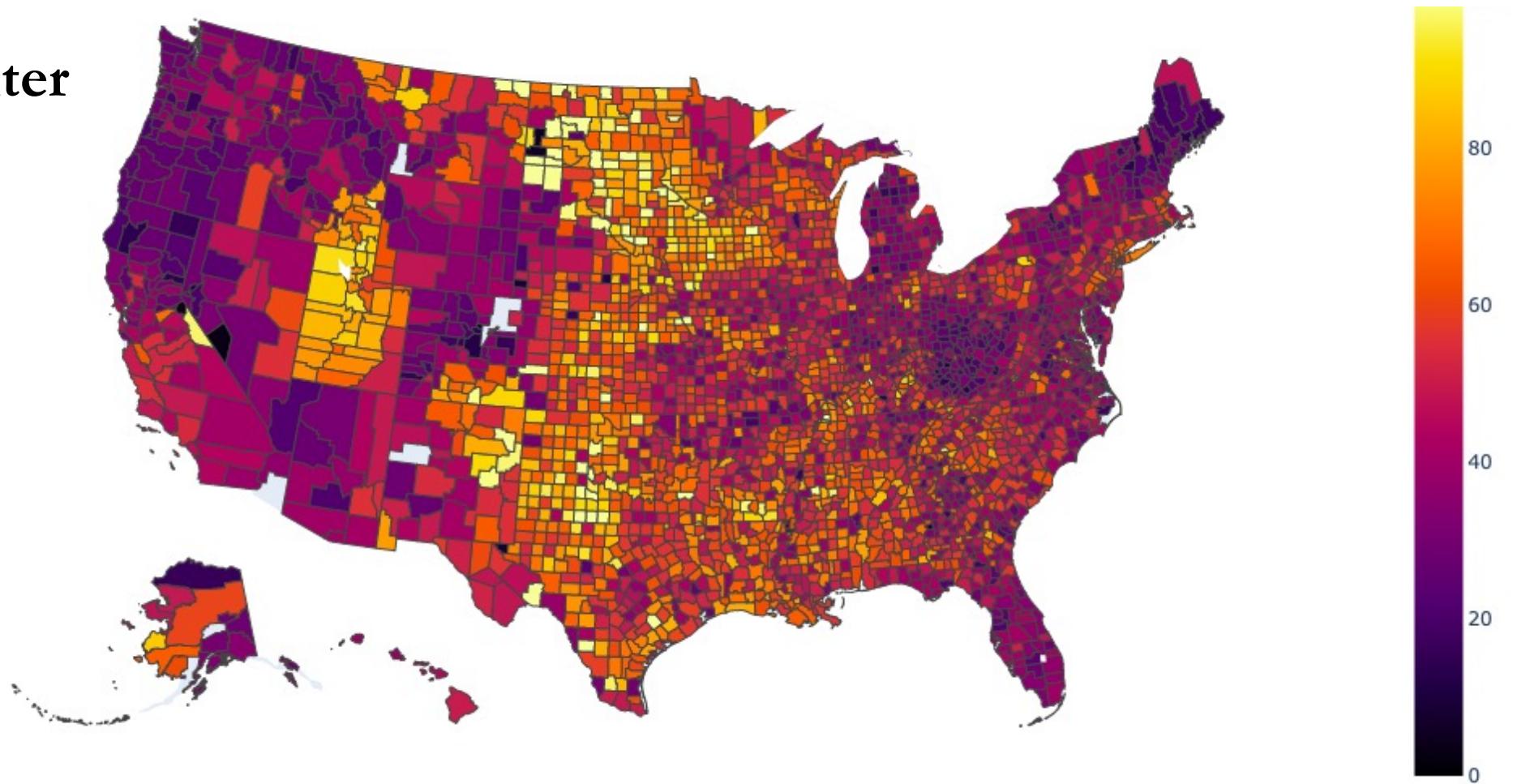
Sensorimotor-Association Axis

Axis: unidimensional ordering (ranking) of cortical regions, defined by patterns of variability in one or more cortical properties

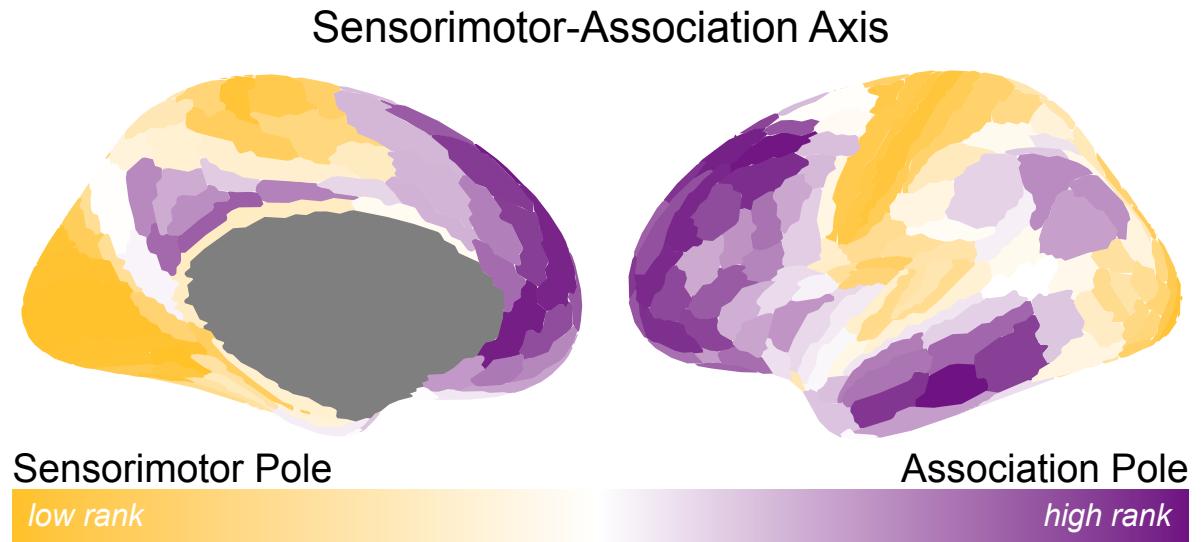


Sensorimotor-Association Axis

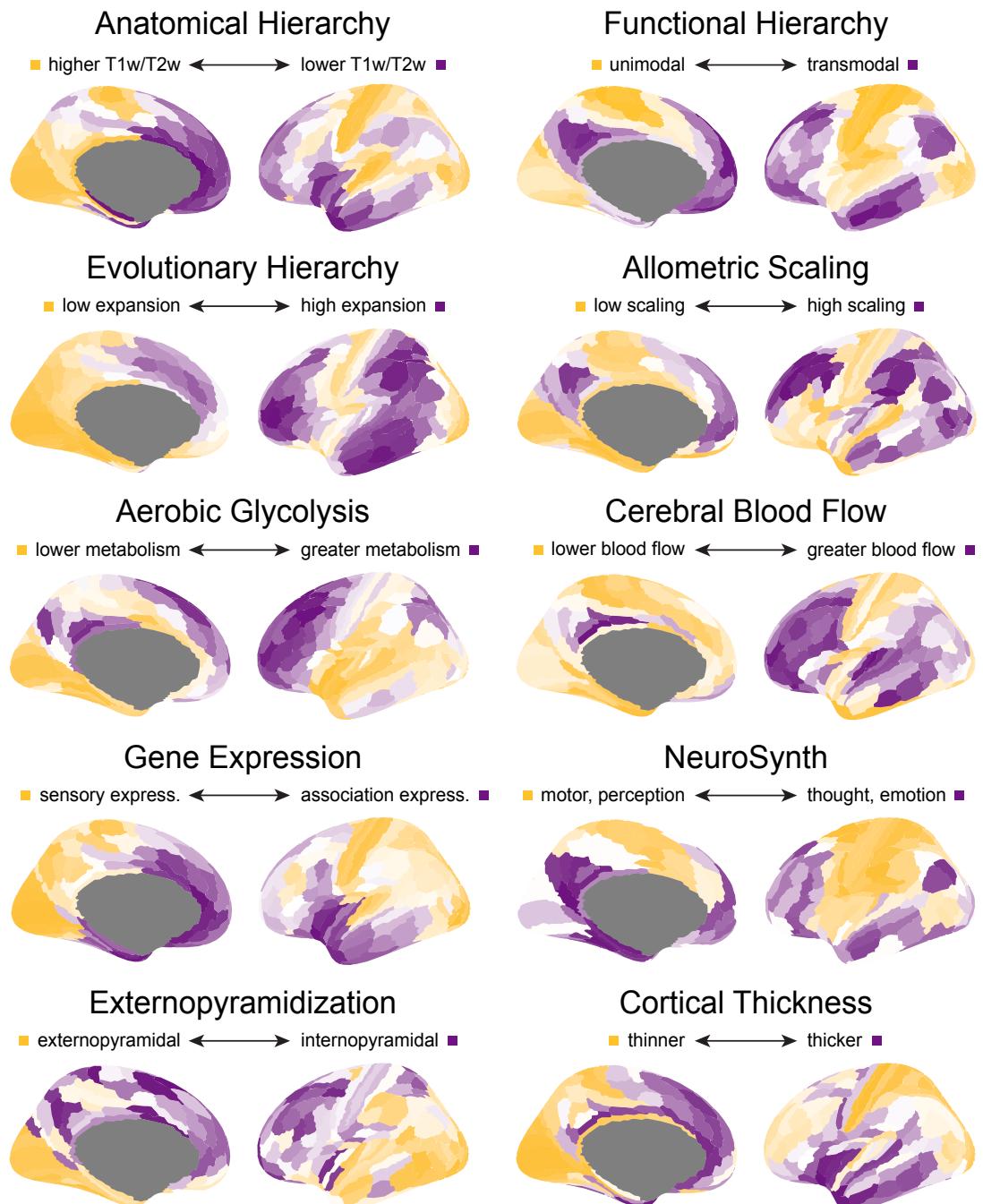
Coast-to-center
axis



Sensorimotor-Association (S-A) Axis



An axis of cortical feature variation



Anatomical Hierarchy

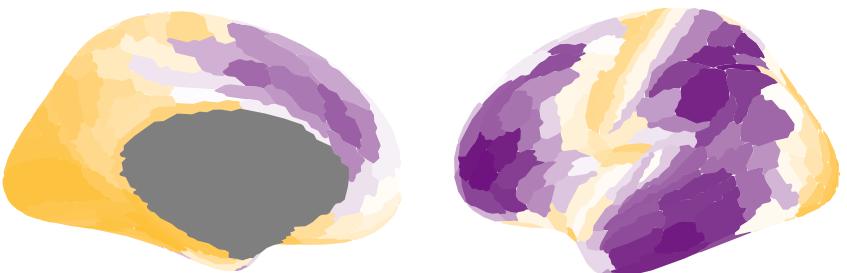
■ higher T1w/T2w ← → lower T1w/T2w ■



Burt et al., 2018, *Nat Neuro*

Evolutionary Hierarchy

■ low expansion ← → high expansion ■



Hill et al., 2010, *PNAS*

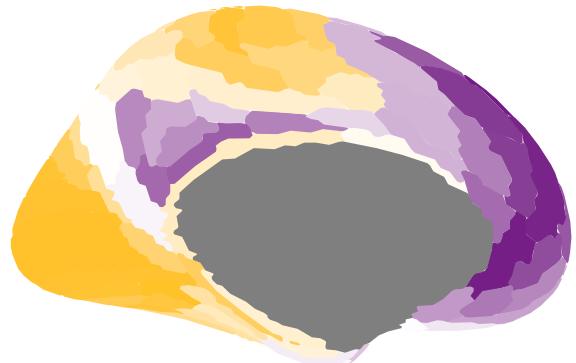
Functional Hierarchy

■ unimodal ← → transmodal ■



Margulies et al., 2016, *PNAS*

Sensorimotor-Association Axis



Sensorimotor Pole

low rank



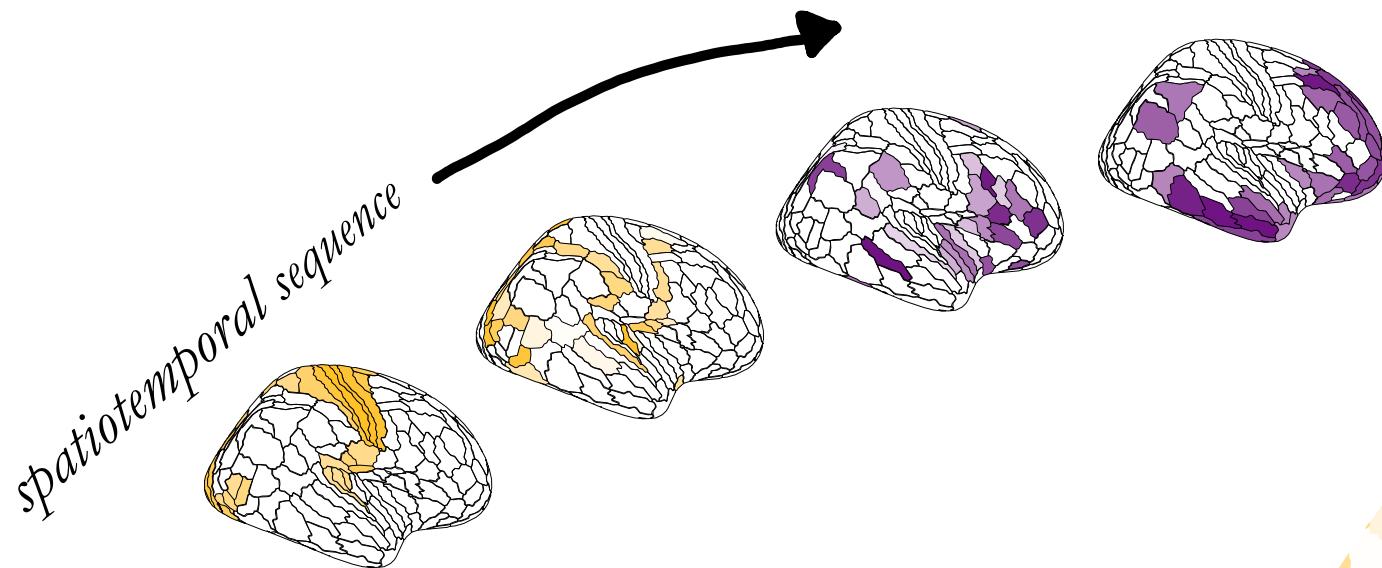
Association Pole

high rank

feed-forward connections
low evolution expansion
**action, perception,
sensation**

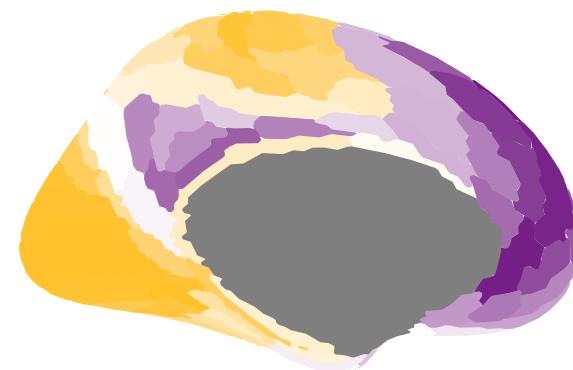
feed-back connections
high evolution expansion
**introspection,
socioemotional
processing**

Timing of Human Cortical Development

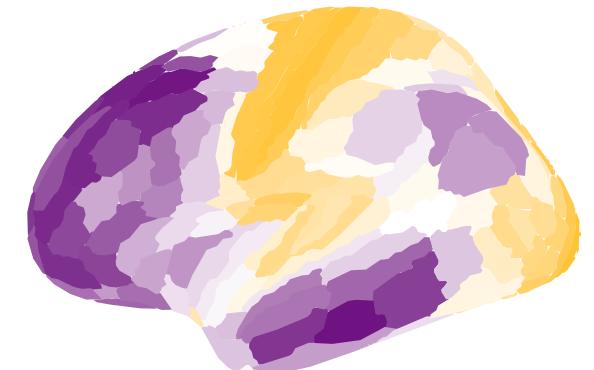


Neurodevelopmental
Hierarchy?

Sensorimotor-Association Axis



Sensorimotor Pole
low rank

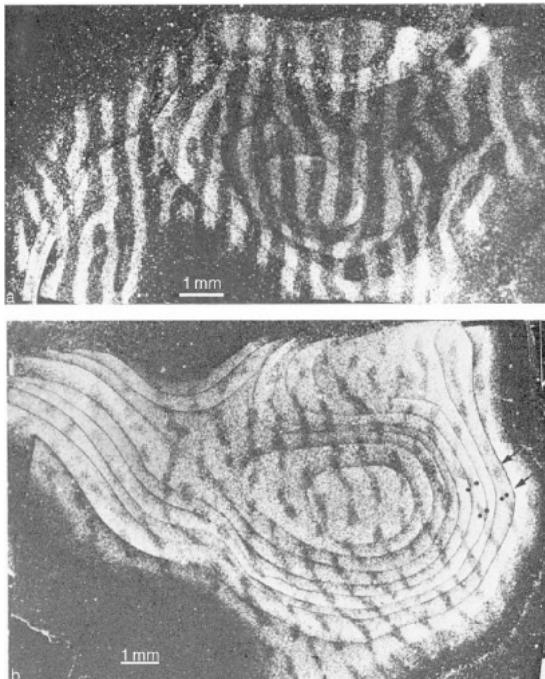


Association Pole
high rank

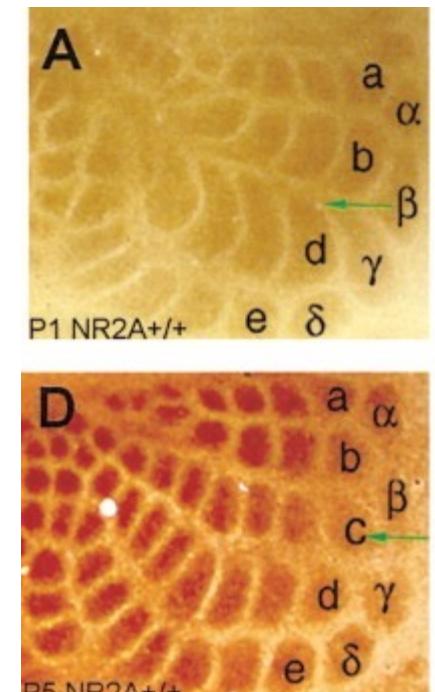
Critical Periods of Plasticity

Temporally constrained developmental windows where experiences have a large and lasting impact on the organization of neural circuits

Visual cortex: ocular dominance columns

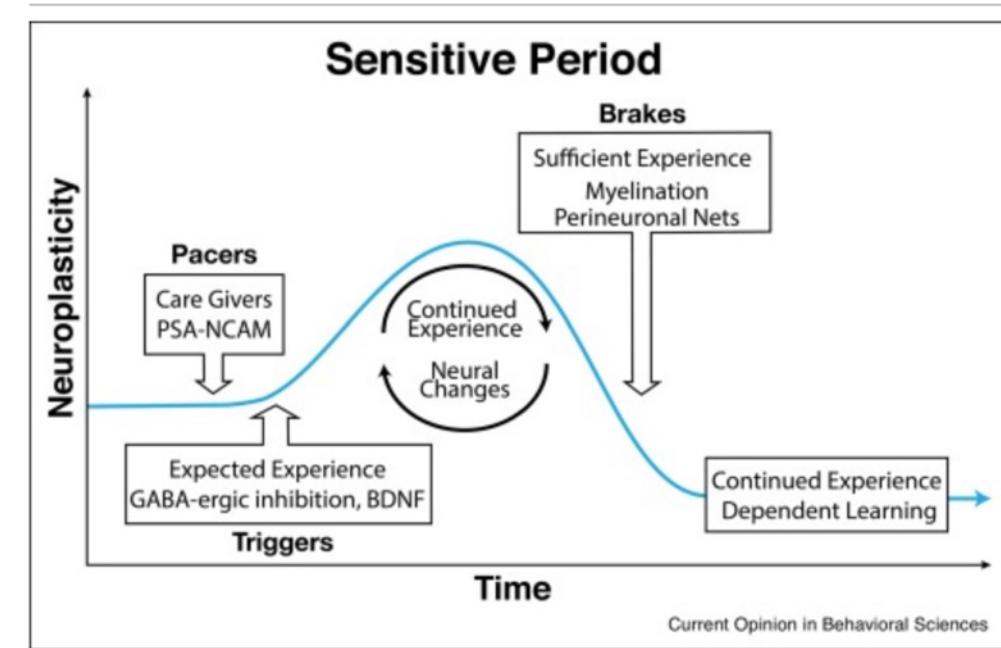
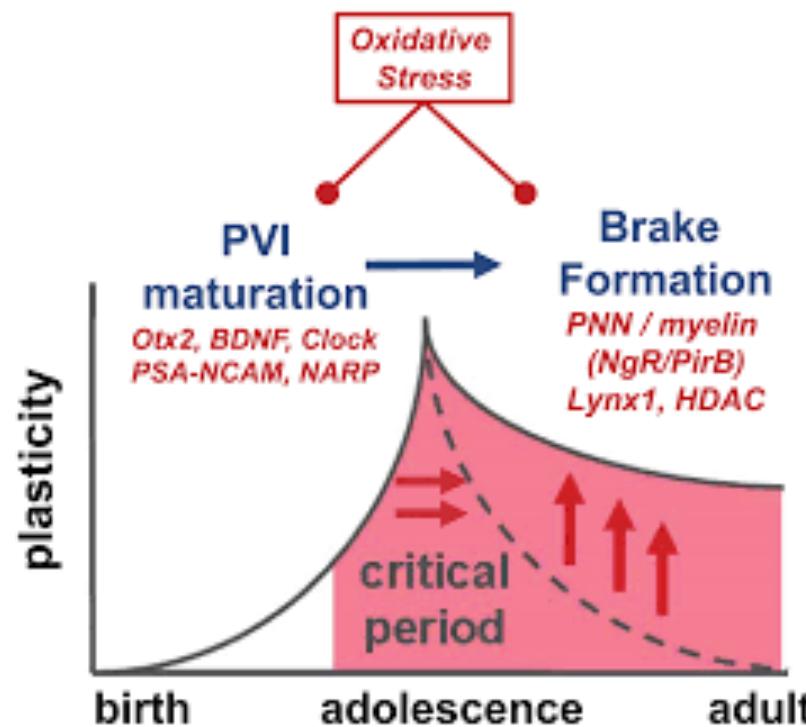


Somatosensory cortex: barrel map

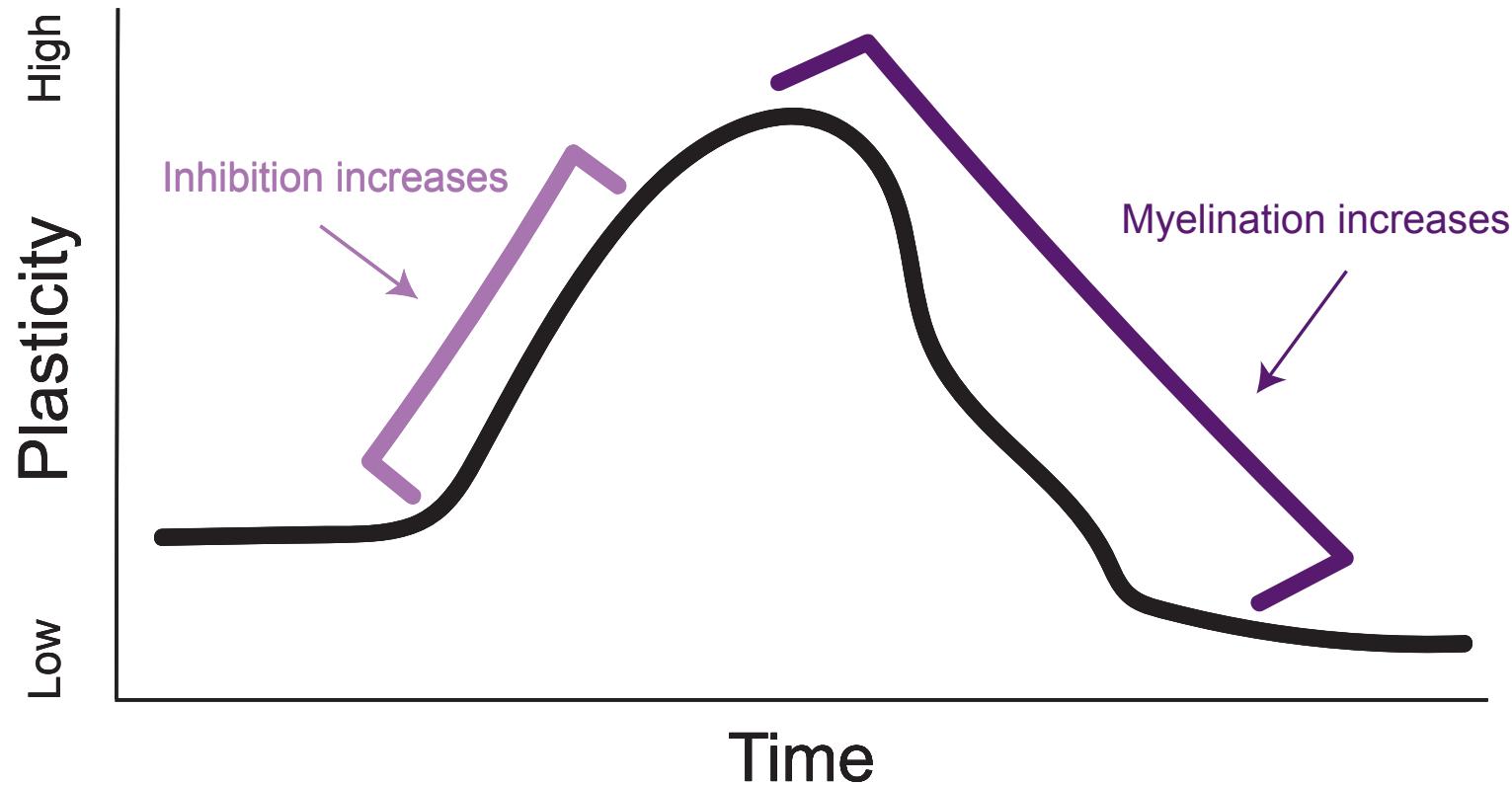


Critical Periods of Plasticity

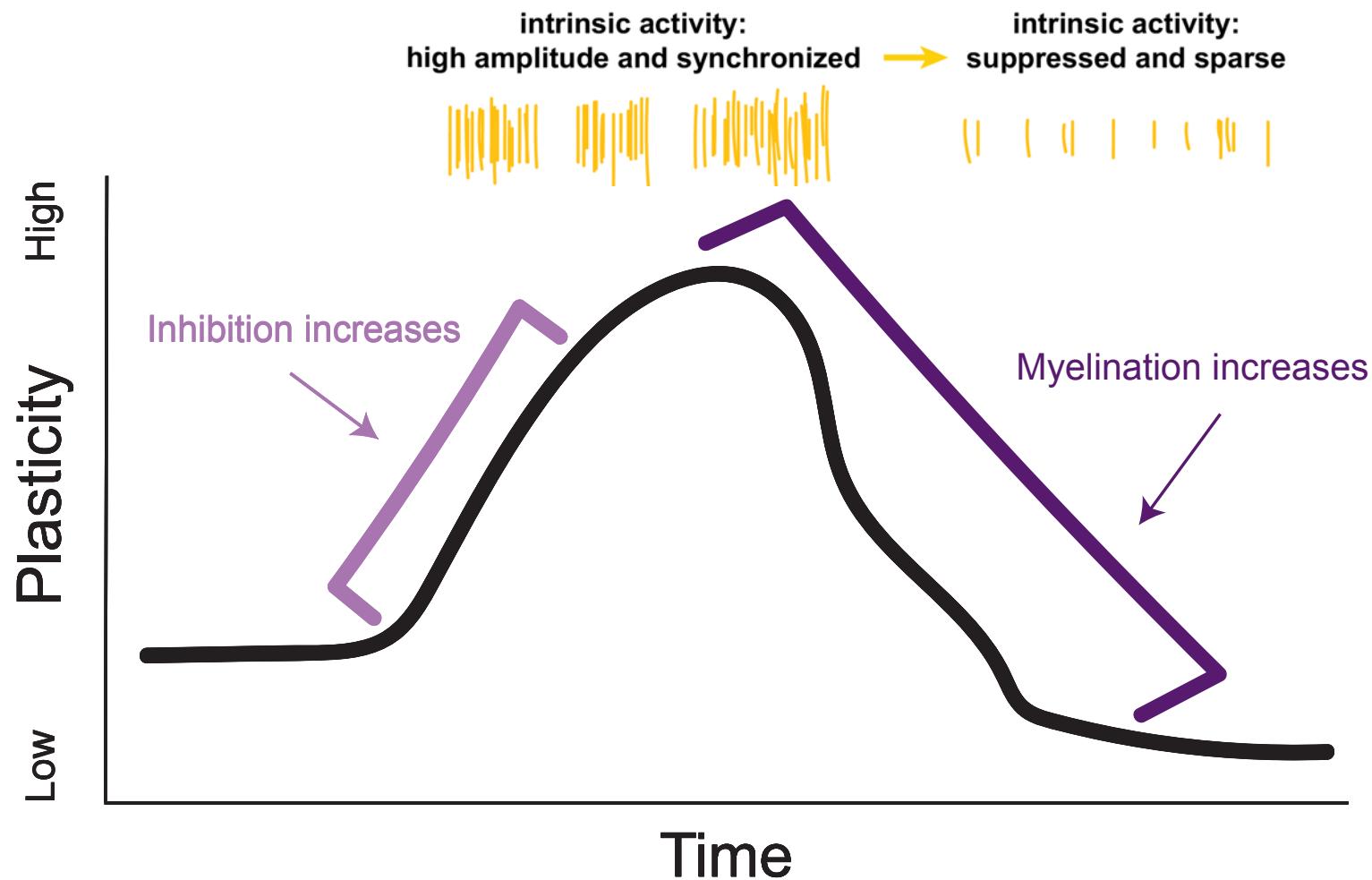
Temporally constrained developmental windows where experiences have a large and lasting impact on the organization of neural circuits



Plasticity Signatures



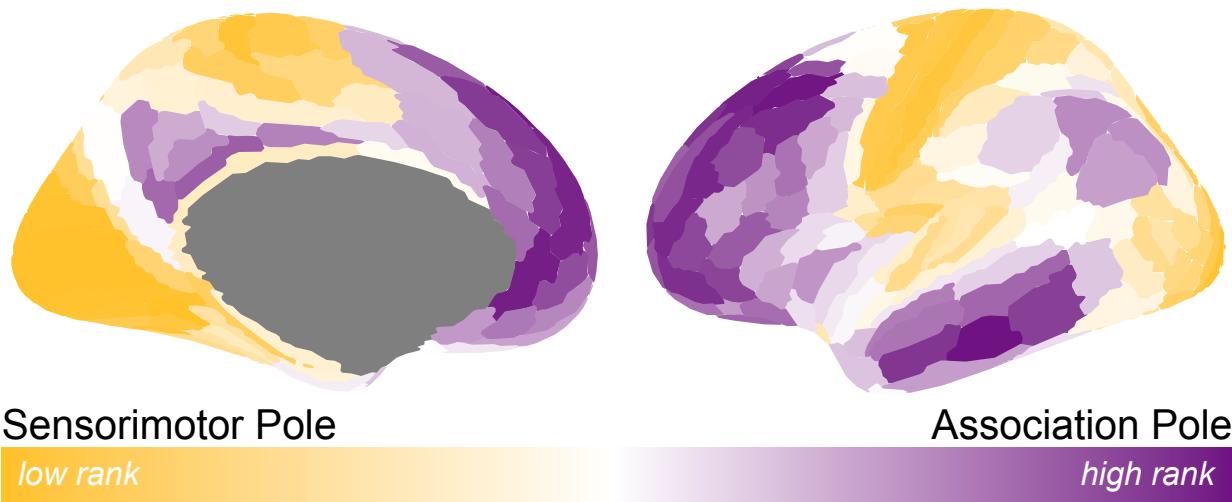
Plasticity Signatures



Aim 1:

To characterize the spatiotemporal development of cortical plasticity

Methods gap: most prior developmental imaging studies have not aimed to examine metrics that are sensitive to biological features that influence cortical plasticity



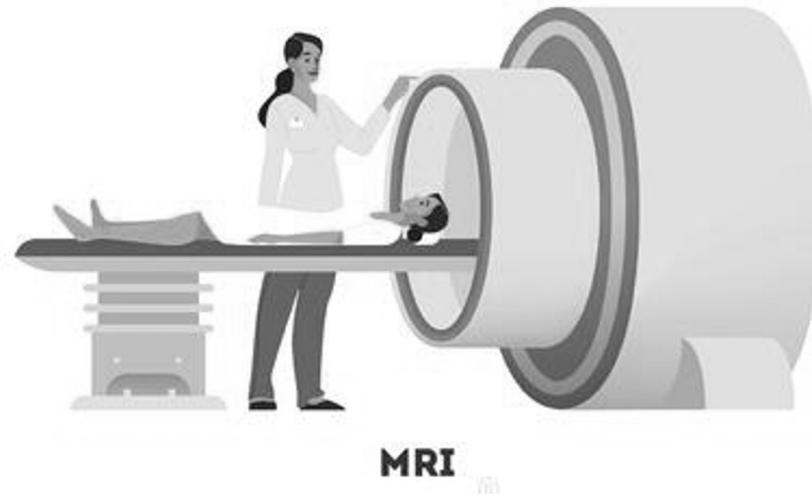
Aim 1:
To characterize the
spatiotemporal
development of
cortical plasticity

Plasticity-Regulating Features

Increases in inhibition

Increases in intracortical myelination

Alterations in spontaneous activity patterns



Aim 1:
To characterize the
spatiotemporal
development of
cortical plasticity

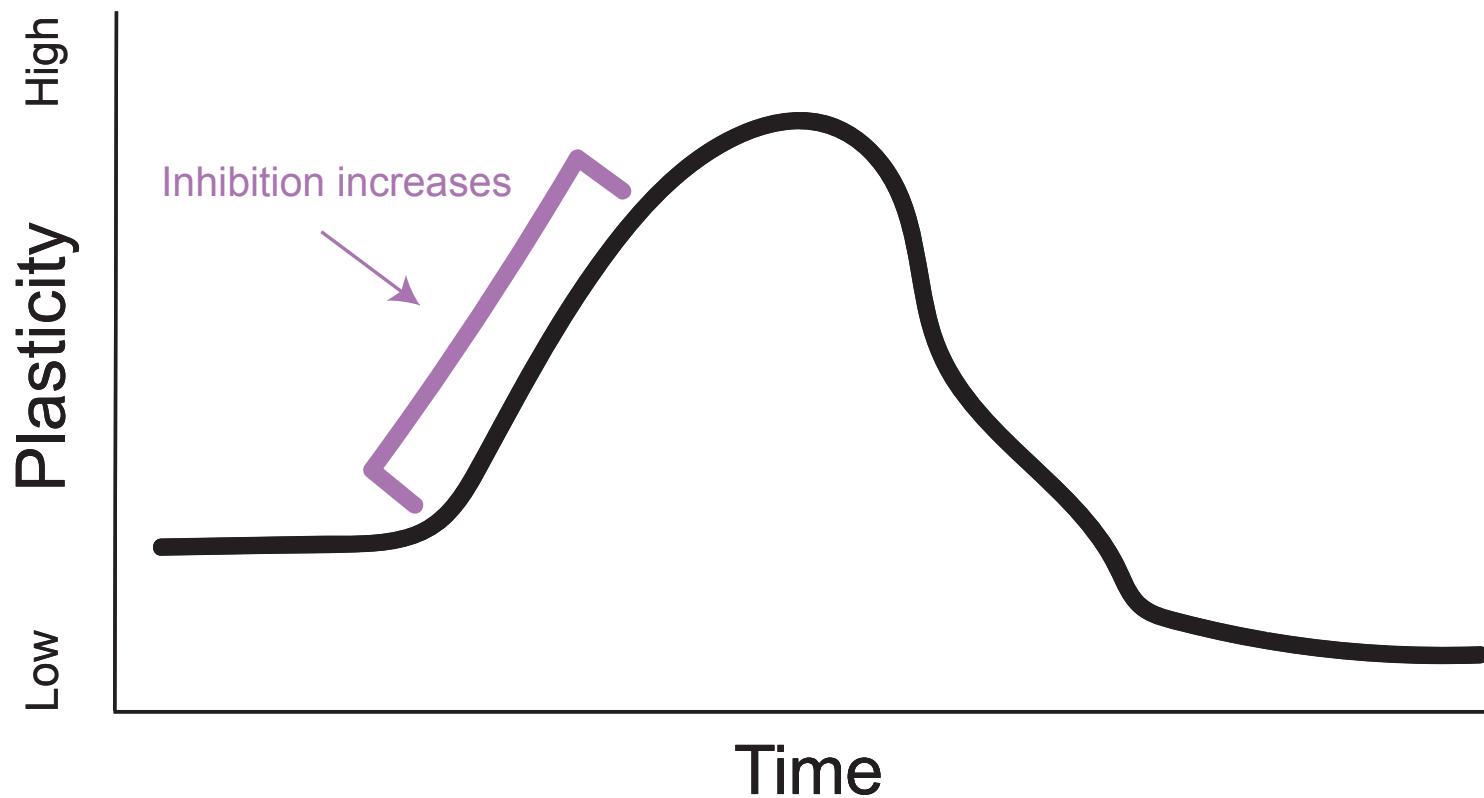
Plasticity-Regulating Features

Increases in inhibition: **REHO, Catch22**

Increases in intracortical myelination: **GWC**

Alterations in spontaneous activity patterns: **ALFF**

Plasticity Signatures: Act 1



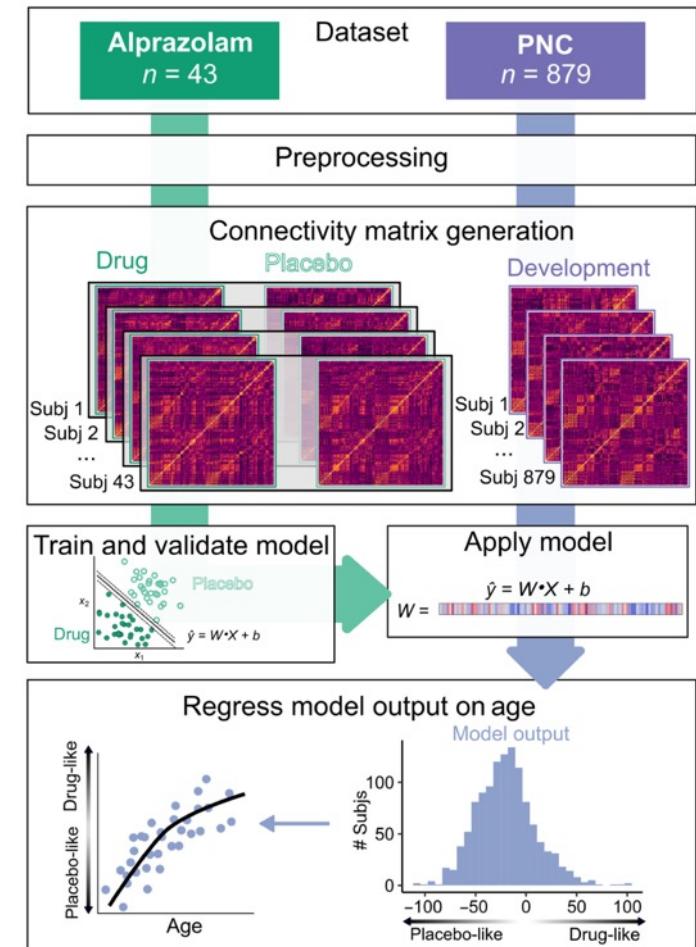
In Vivo Imaging of Inhibition

SCIENCE ADVANCES | RESEARCH ARTICLE

DEVELOPMENTAL NEUROSCIENCE

A developmental reduction of the excitation:inhibition ratio in association cortex during adolescence

Bart Larsen^{1,2,3*}, Zaixu Cui^{1,2,3,4}, Azeez Adebimpe^{1,2,3}, Adam Pines^{1,2,3}, Aaron Alexander-Bloch^{2,3}, Max Bertolero^{1,2,3}, Monica E. Calkins^{2,3}, Raquel E. Gur^{2,3,5}, Ruben C. Gur^{2,3,5}, Arun S. Mahadevan⁶, Tyler M. Moore^{2,3}, David R. Roalf^{2,3}, Jakob Seidlitz^{2,3}, Valerie J. Sydnor^{1,2,3}, Daniel H. Wolf^{2,3†}, Theodore D. Satterthwaite^{1,2,3†}



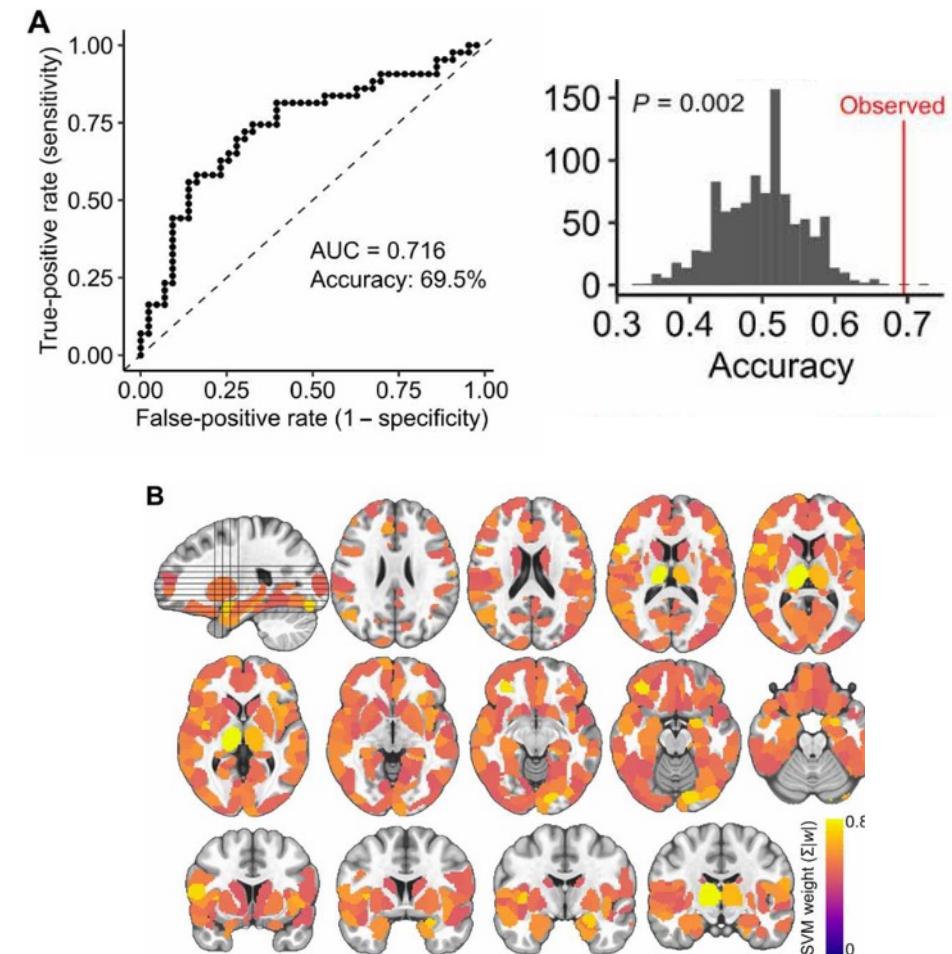
In Vivo Imaging of Inhibition

SCIENCE ADVANCES | RESEARCH ARTICLE

DEVELOPMENTAL NEUROSCIENCE

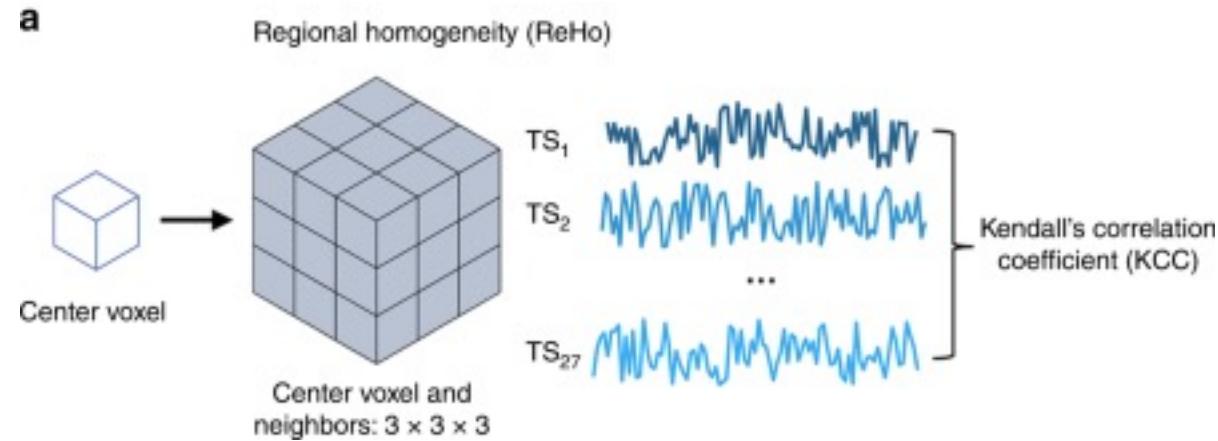
A developmental reduction of the excitation:inhibition ratio in association cortex during adolescence

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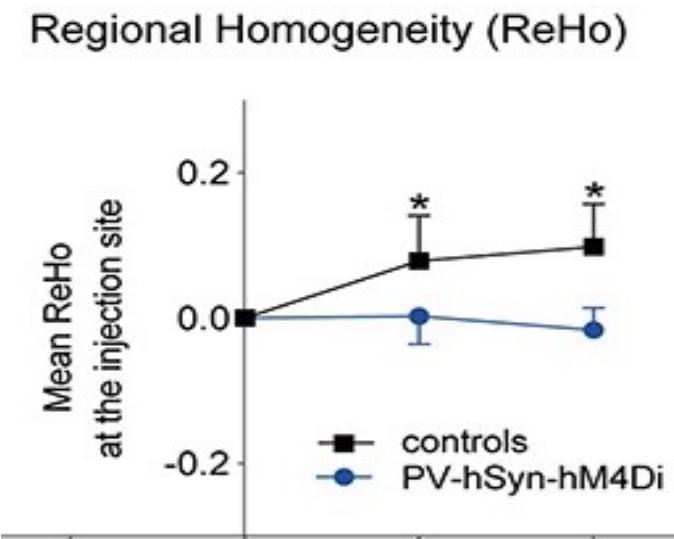
Aim 1:
To characterize the
spatiotemporal
development of
cortical plasticity

Imaging Cortical Inhibition REHO



Chemogenetic
manipulation of
excitation and inhibition
with simultaneous fMRI

Markicovic et al., 2020



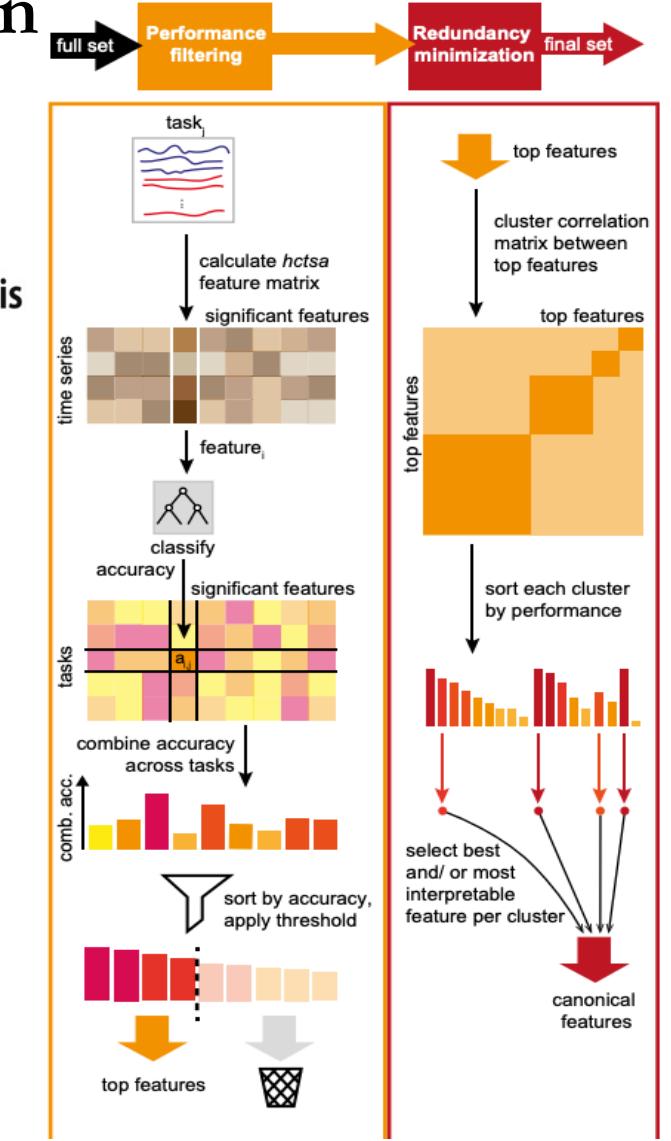
Aim 1:
To characterize the
spatiotemporal
development of
cortical plasticity

Imaging Cortical Inhibition

REHO, Catch22

catch22: CAnonical Time-series CCharacteristics

Selected through highly comparative time-series analysis



In Vivo Imaging of Inhibition: REHO

Surface (2D) regional functional homogeneity

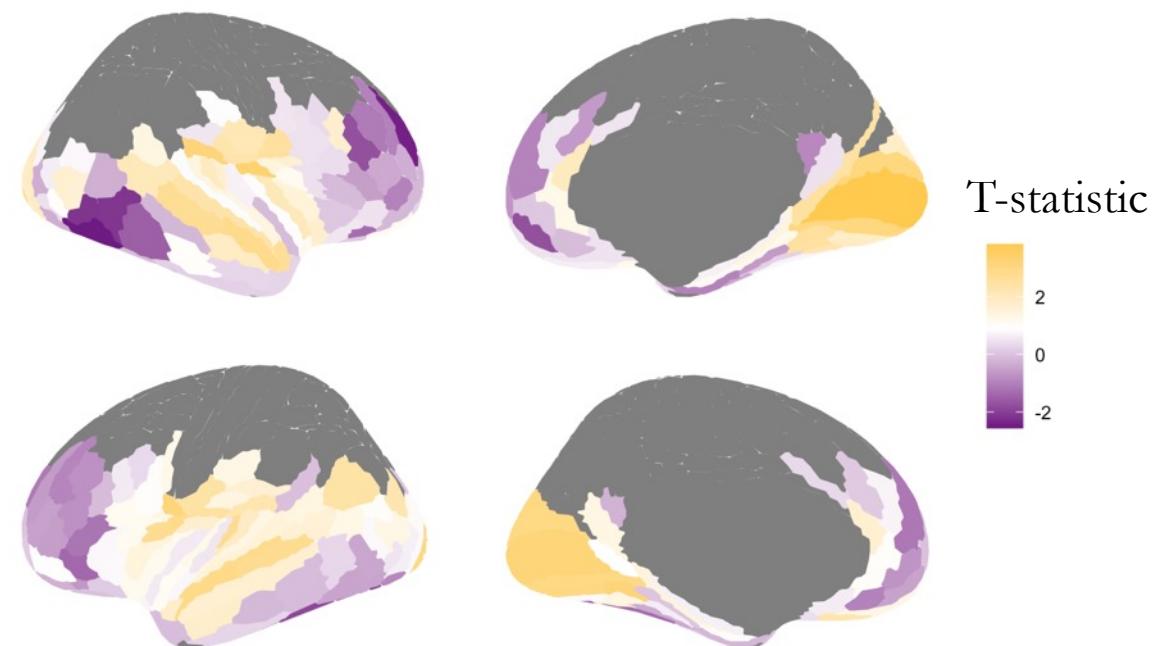
GABA agonist v. placebo t-tests

Yellow: GABA agonist = higher REHO

Purple: GABA agonist = lower REHO

Correlation of t-statistic with

S-A axis: $r = -0.4$



N = 42 subjects (84 scans)

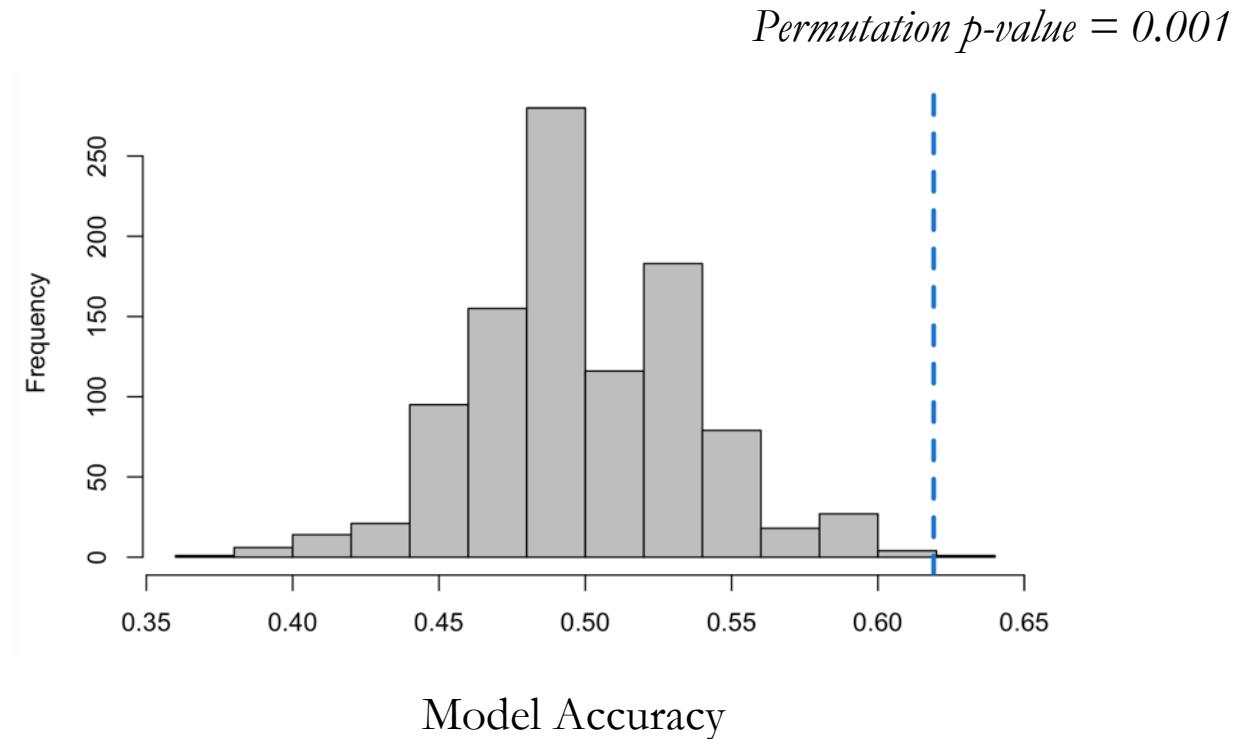
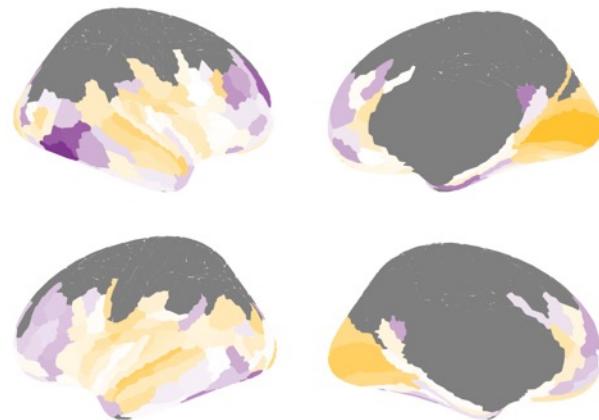
In Vivo Imaging of Inhibition: REHO

Surface (2D) regional functional homogeneity

SVM Results:

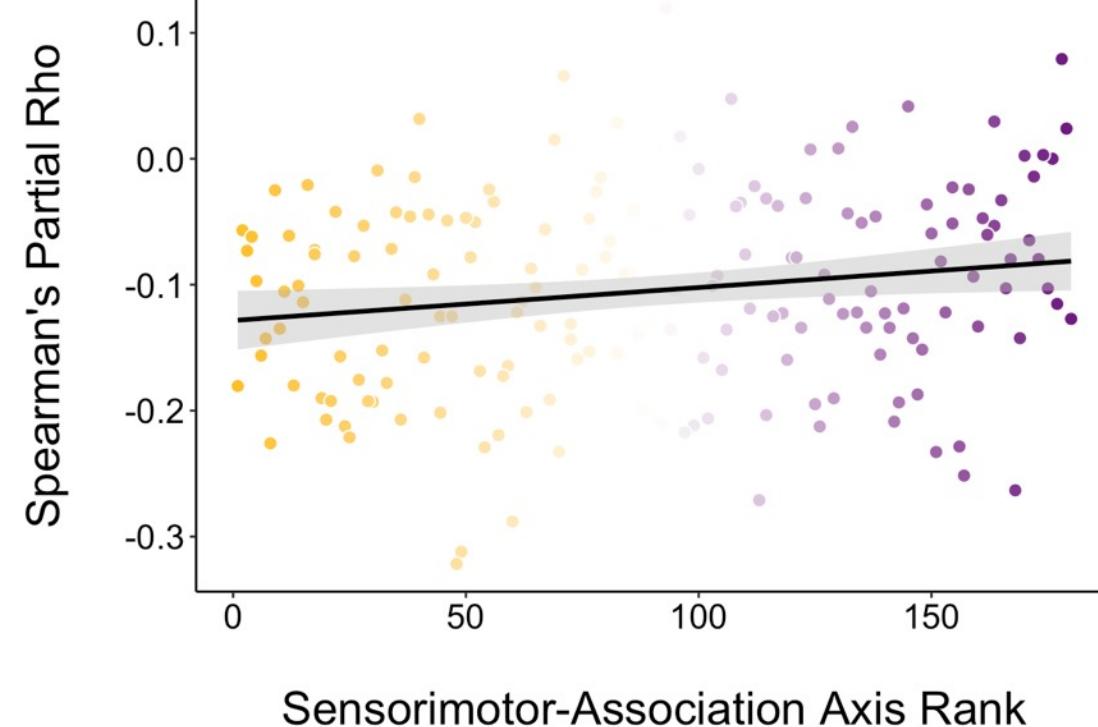
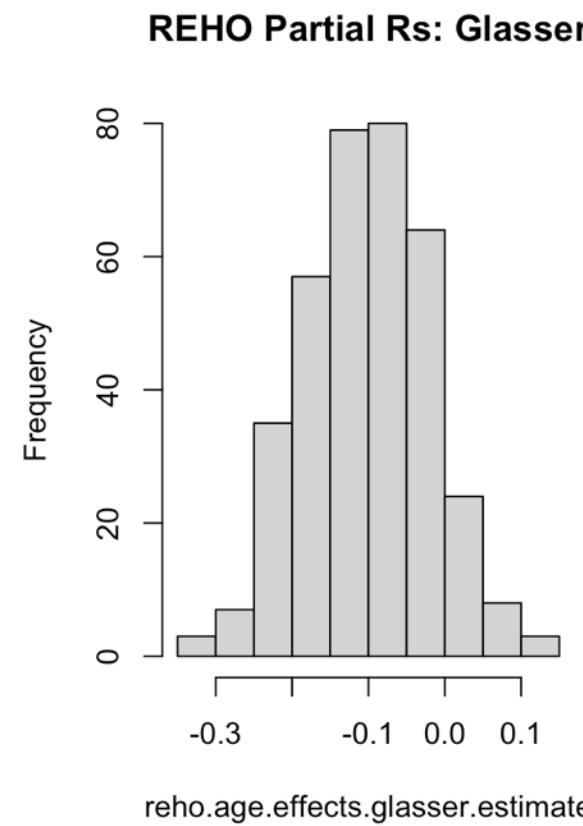
Accurately classified 52/84 scans

Accuracy: 62%

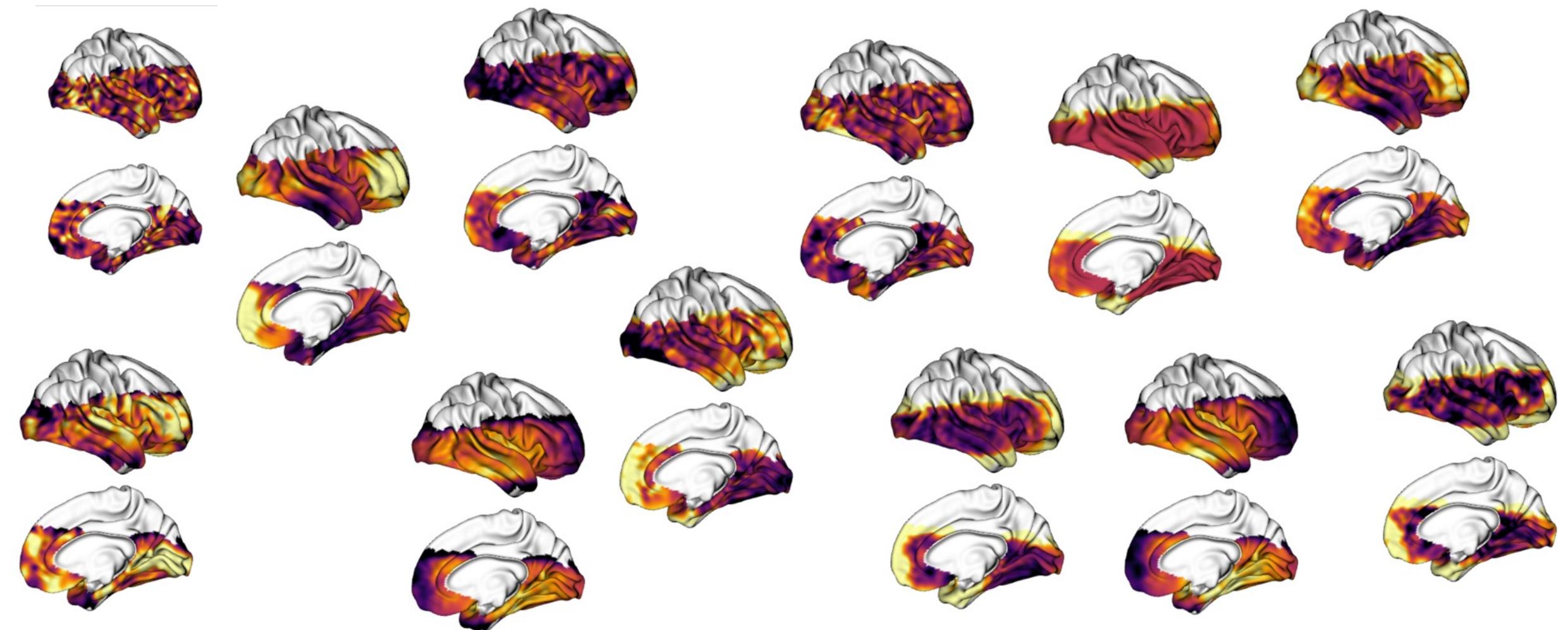


N = 42 subjects (84 scans)

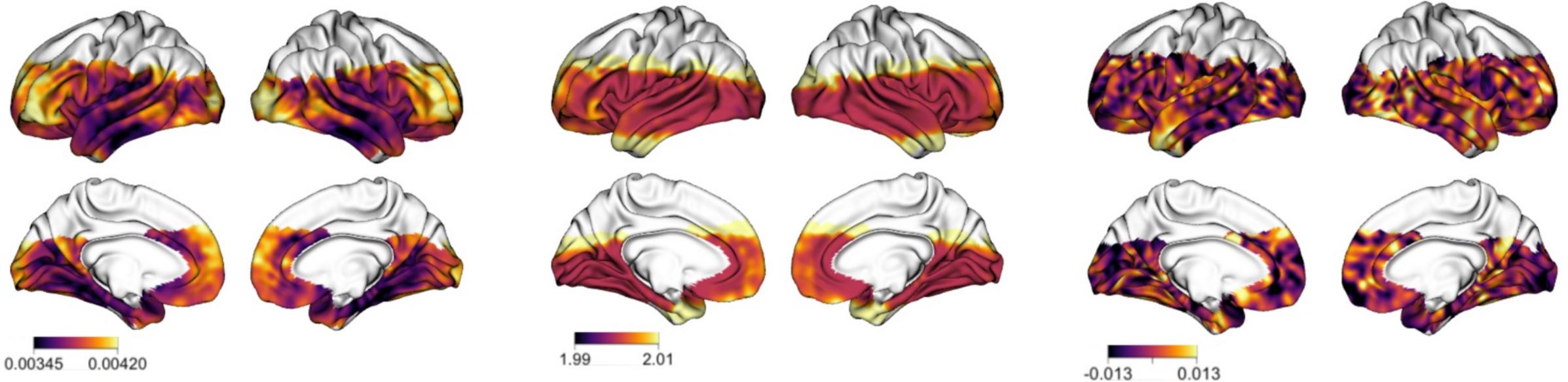
In Vivo Imaging of Inhibition: REHO DEV



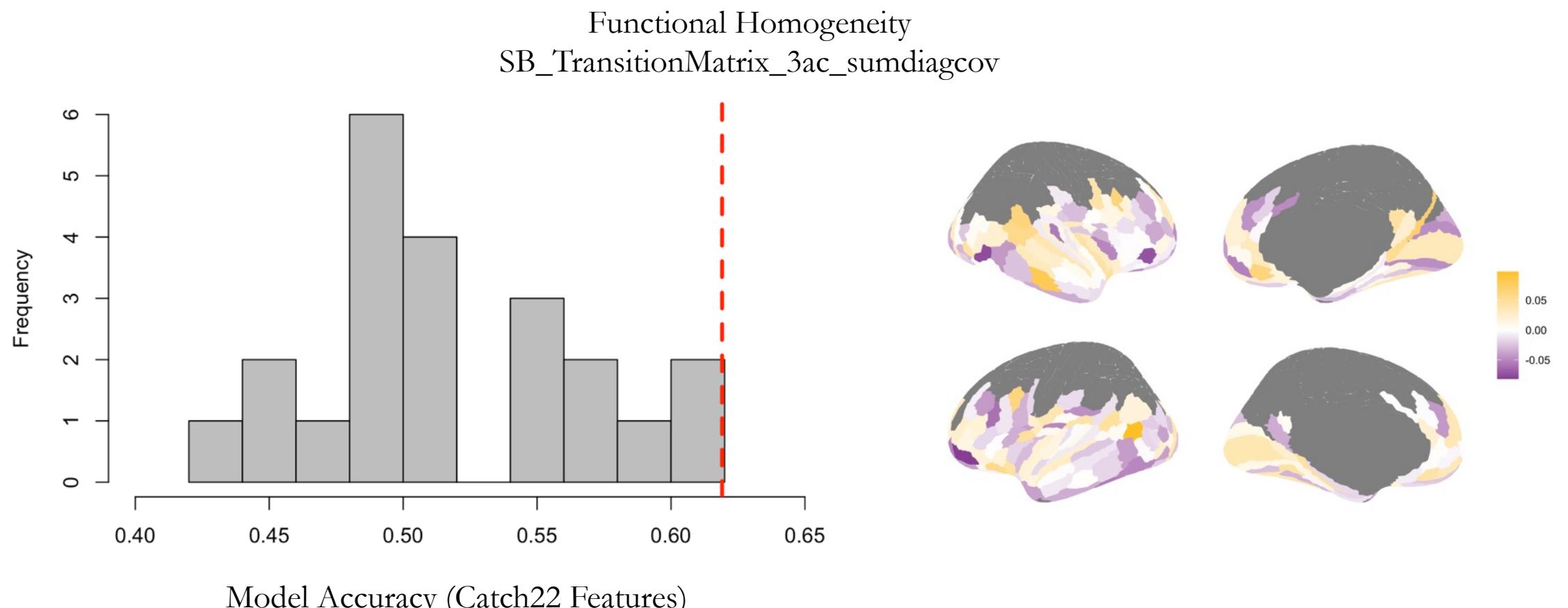
In Vivo Imaging of Inhibition: CATCH 22



In Vivo Imaging of Inhibition: CATCH 22



In Vivo Imaging of Inhibition: CATCH 22

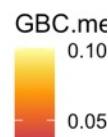
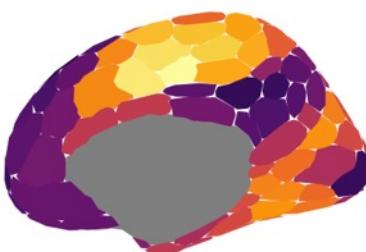
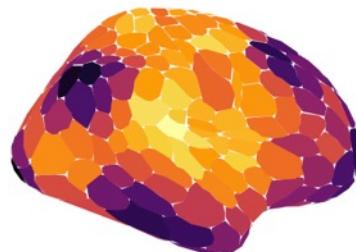


N = 42 subjects (84 scans)

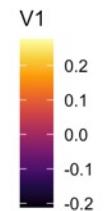
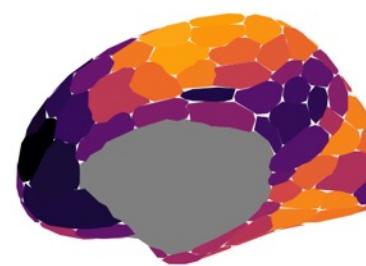
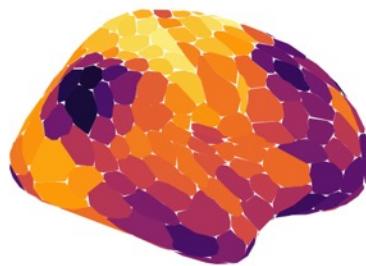
In Vivo Imaging of Inhibition: GBC (lol)

Regional global brain connectivity development

Average GBC



GBC Development Effects



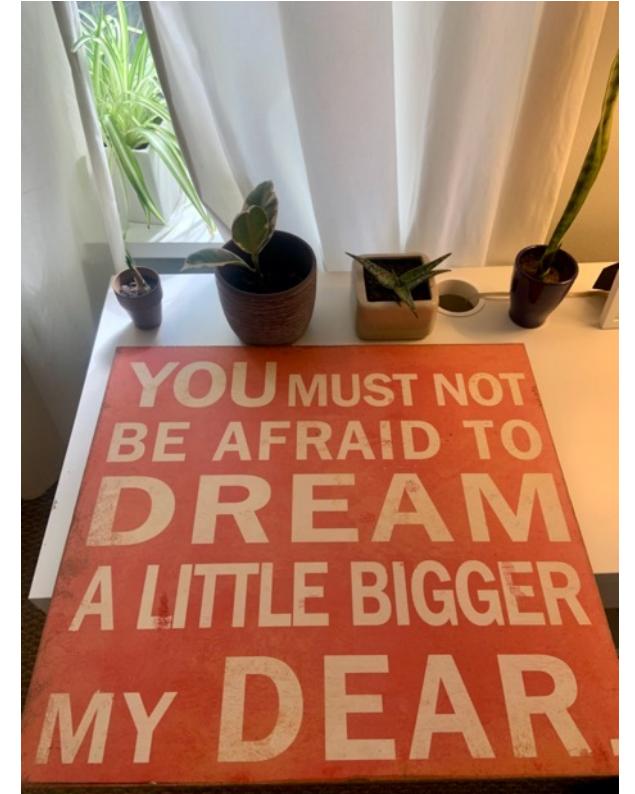
Correlation of Age Effects with Mean Map

```
##  
## Spearman's rank correlation rho  
##  
## data: GBC.age.effects.schaefer.estimate$V1 and GBC.mean.map.schaefer$GBC.mean.map.schaefer  
## S = 2318794, p-value < 2.2e-16  
## alternative hypothesis: true rho is not equal to 0  
## sample estimates:  
## rho  
## 0.7826117
```

INHIBITION: FAILED!

What I learned:

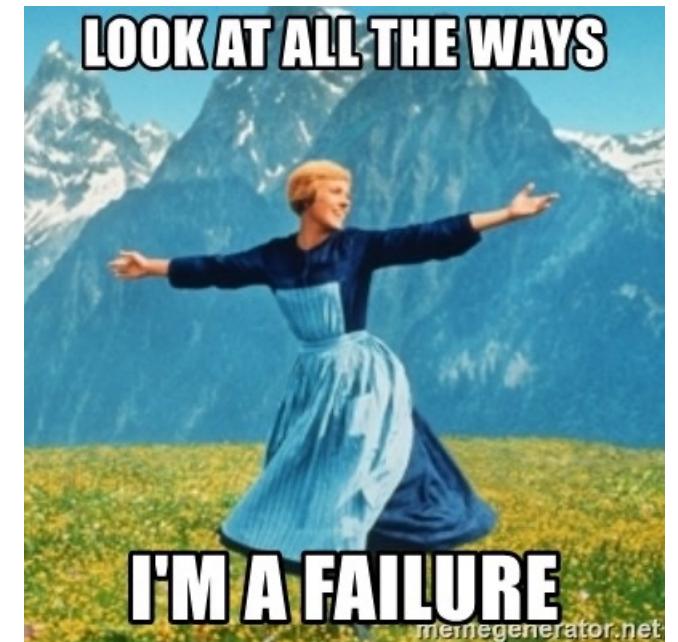
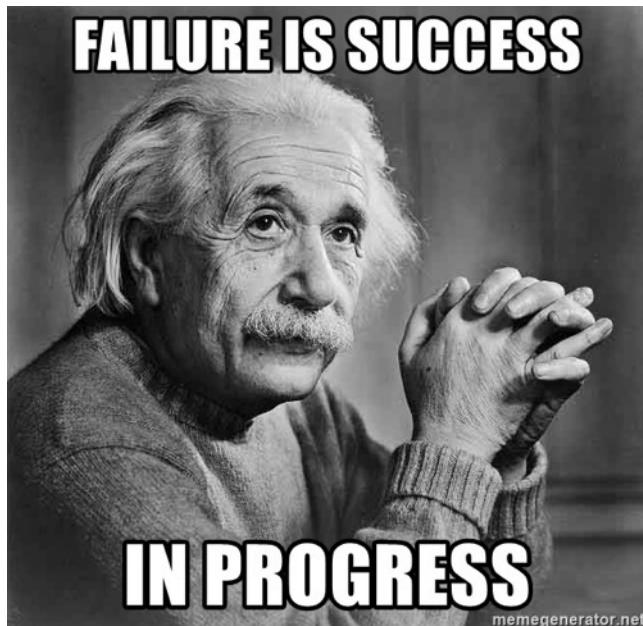
- Dream big, let your PI and thesis committee be the realistic ones



INHIBITION: FAILED!

What I learned:

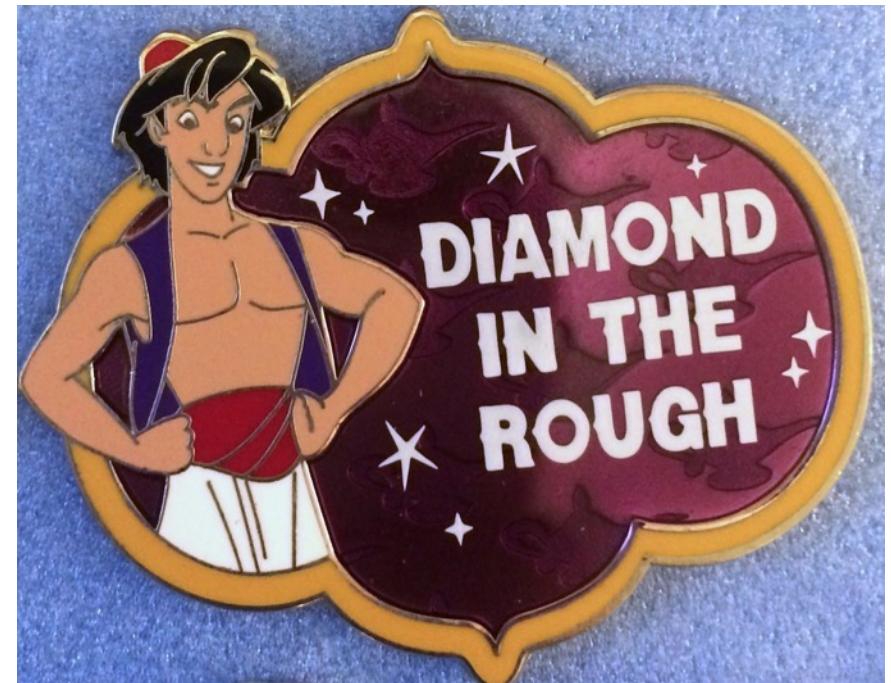
- Dream big, let your PI and thesis committee be the realistic ones
- When to let go of a failed analysis/approach



INHIBITION: FAILED!

What I learned:

- Dream big, let your PI and thesis committee be the realistic ones
- When to let go of a failed analysis/approach
- GBC, a diamond in the rough



INHIBITION: FAILED!

What I learned:

- How to run fmriprep and xcp (with task regres

Alpraz Preprocessing: fMRIPrep, xcp-abcd

To reprocess Alpraz using an RBC-like approach, I am running fMRIPrep 20.2.3 on BIDS data downloaded from flywheel, followed by xcp-abcd. Scripts are on cubic in [/cbica/projects/spatiotemp_dev_plasticity/Inhibition/Alpraz/scripts](#)

1. Run [getBIDS_fwtocubic.sh](#) to download BIDSified data from flywheel to [spatiotemp_dev_plasticity/Inhibition/Alpraz/BIDS](#)

 [getBIDS_fwtocubic.sh](#)

154 B

2. Run [build_fmriprep20.2.3_singularityimage.sh](#) to build the [fmriprep](#) singularity image

 [build_fmriprep20.2.3_singularityim...](#)

124 B

3. Run [run_fmriprep_20.2.3.sh](#), which calls [fmriprep_call.py](#) to submit qsub jobs to run fmriprep on all participants

 [run_fmriprep_20.2.3.sh](#)

1 kB

 [fmriprep_call.py](#)

725 B

- 7/30/21: checking success of [fMRIprep](#) runs. [fMRIprep](#) did not run on 8 subjects/16 sessions, despite them having func data. The [qsub](#) logs all show a similar error: "FileExistsError: [Errno 17] File exists: '/cbica/projects/spatiotemp_dev_plasticity/.cache/templateflow/tpl-Fischer344'", or "FileExistsError: [Errno 17] File exists: '/cbica/projects/spatiotemp_dev_plasticity/.cache/templateflow/tpl-MNI152Lin'". One shows "fmriprep: error: argument --skull-strip-template: invalid from_string value: 'OASIS30ANTs'"
- Re-launching [fMRIprep](#) on the missing subjects using [run_fmriprep_20.2.3.sh](#)

 [fmriprep_run1check_7.30.21.txt](#)

4 kB

- 8/1/21: checking success of [fMRIprep](#) runs. All subjects now have completed [fmriprep](#) aside from 1, sub-013541,

INHIBITION: FAILED!

What I learned:

- How to run fmriprep and xcp (with task regression)
- SVM basics

INHIBITION: FAILED!

What I learned:

- How to run fmriprep and
- SVM basics
- Catch22

The image shows a Jupyter Notebook interface with a sidebar and a main content area.

Left Sidebar:

- User profile: valeri...
- Search bar: Search
- Buttons: + New, Home, Tasks, Notebooks, Neuroimaging Methods, Subcortical Development, Prior Lit, Thalamic Development, TMSfMRI-dMRI, New Notebook, Tags, Shared with Me, Trash, What's New (1).

Main Content Area (Notebook View):

Alpraz Inhibition

6 notes

Testing
Catch 22 Features and Smoothing Looking at the difference of running catch22 on unsmoothed ts data and then smoothing the output measures, versus running catch2...

8/19/21

Alpraz Quality Control
Framewise Displacement (Emotion ID task scan) Larson et al.

Neuroimaging Methods
Participants with complete or otherwise incomplete data (sub-012097, sub-01...

8/19/21

Alpraz Preprocessing: fMRIPrep, xcp-abcd
To reprocess Alpraz using an RBC-like approach, I am running FMRIprep 20.2.3 on BIDS data downloaded from flywheel, followed by xcp-abcd. Scripts ar...

8/18/21

Right Panel (Notebook Content):

Alpraz Inhibition

Only you Share ...

Alpraz Catch22 Discriminatory Features: VERTEX

To identify canonical time series characteristics (catch22) that may be sensitive to level of local inhibition and thus able to discriminate between placebo and GABA agonist sessions, the following analyses were implemented at the **vertex level**. Scripts are in [/cbica/projects/spatiotemp_dev_plasticity/Inhibition/Alpraz/scripts/catch22_vertex](#)

1. Ran catch22 on all preprocessed `dtseries.nii` BOLD residual files (`unsmoothed`) with `catch22_tsfeatures.Rmd` to generate 22 timeseries features per surface vertex
 - `catch22_tsfeatures.Rmd` 5 kB
2. Created a study-level group inclusion/exclusion mask with `catch22_groupmask.Rmd` to ensure that the same vertices were included v excluded for all subjects (given the limited FOV in the alpraz data). This is necessary for further steps including PCA, SVM, etc where we need data at the same vertices across all subjects. The group mask was applied to the catch 22 output from step 1.
 - `catch22_groupmask.Rmd` 3 kB
3. Generated across-subject average feature maps for the 22 features `catch22_averagemaps.Rmd` and visualized them `catch22_averagemaps_visualization.Rmd`
 - `catch22_averagemaps_visualization... 3 kB`
 - `catch22_averagemaps.Rmd` 4 kB
4. Ran a PCA on each catch22 feature to examine the amount of variance it captured and to generate subject-specific PC scores with `catch22_pca_preparedata.R` followed by `catch22_pca.Rmd`
 - `catch22_pca_preparedata.R` 8 kB
 - `catch22_pca.Rmd` 23 kB

All changes saved

INHIBITION: FAILED!

What I learned:

- How to run fmriprep and
- SVM basics
- Catch22
- How surface data is represented, manipulate, visualize, and analyze (and giftis) in R

The screenshot shows an Evernote notebook titled "Surfaces - Evernote". The left sidebar lists notebooks: "Alpraz Inhibition", "GluCEST", "HBN QSIPrep", "Hierarchical Activit...", "My Notebook", "NeuroImaging Meth...", "AHBA", "Clusters", "GAMs", "Surfaces" (which is selected and highlighted in blue), "Timescales", "Satterthwaite Rotat...", "Subcortical Develop...", "Prior Lit", "Thalamic Develop...", "TMSfMRI-dMRI", and "New Notebook". The right pane contains two notes:

- Surfaces**

32k_fs_LR: surface space that most CIFTI files are in. The surface component of HCP 91282 greyordinate space 32k (left surface vertices) + 32k (right surface ve...)

12/10/21
- Ciftis**

Cifti2 Files CIFTI files organize the gray matter of the brain into "greyordinates": vertices representing the left and right cortical surfaces, and voxels repr...

12/10/21

Start using ciftiTools in R

```
install.packages("ciftiTools")
library(ciftiTools)

ciftiTools.setOption('wb_path', '/path/to/HCP/workbench/') #set the path to your installation of connectome workbench as 'wb_path'. Connectome workbench can be downloaded here:
https://www.humanconnectome.org/software/get-connectome-workbench

library(rgl) #to use ciftiTools graphics
rgl::setupKnitr()
```

Read in a cifti file

```
xii <- read_xifti("space-fsLR_den-91k_desc-residual_den-91k_bold.dtseries.nii") #load
```

Reads in cifti data. By default, this and read_cifti will only load cortex data. To additionally read in subcortical data, include brainstructures="all"

Add surfaces to your file

```
#add surfaces to your file
surfl_L fname <- read_surf("Q1-Q6_R440.L.midthickness.32k_fs_LR.surf.gii")
surfr_R fname <- read_surf("Q1-Q6_R440.R.midthickness.32k_fs_LR.surf.gii")
xii <- add_surf(xii, surfl=surfl_fname, surfr=surfr_fname)
```

ciftiTools will by default plot surface data using the super inflated surface (Conte69.L.inflated.32L_fs_LR, for example). You can specify what surfaces to associate the data with via add_surf, as above. Additional surface files can be found in the Connectome Workbench Tutorial data, which can be downloaded from Balsa

<https://balsa.wustl.edu/study/kN3mg>

Access NIFTI XML metadata

```
xii$meta
```

- xii\$meta\$cortex\$medial_wall_mask\$left: TRUE/FALSE as to whether each LH vertex belongs to the median wall
- xii\$meta\$cortex\$medial_wall_mask\$right: TRUE/FALSE as to whether each RH vertex belongs to the median wall
- xii\$meta\$subcort\$labels: names the subcortical structure each subcortical voxel belongs to (MNI space).

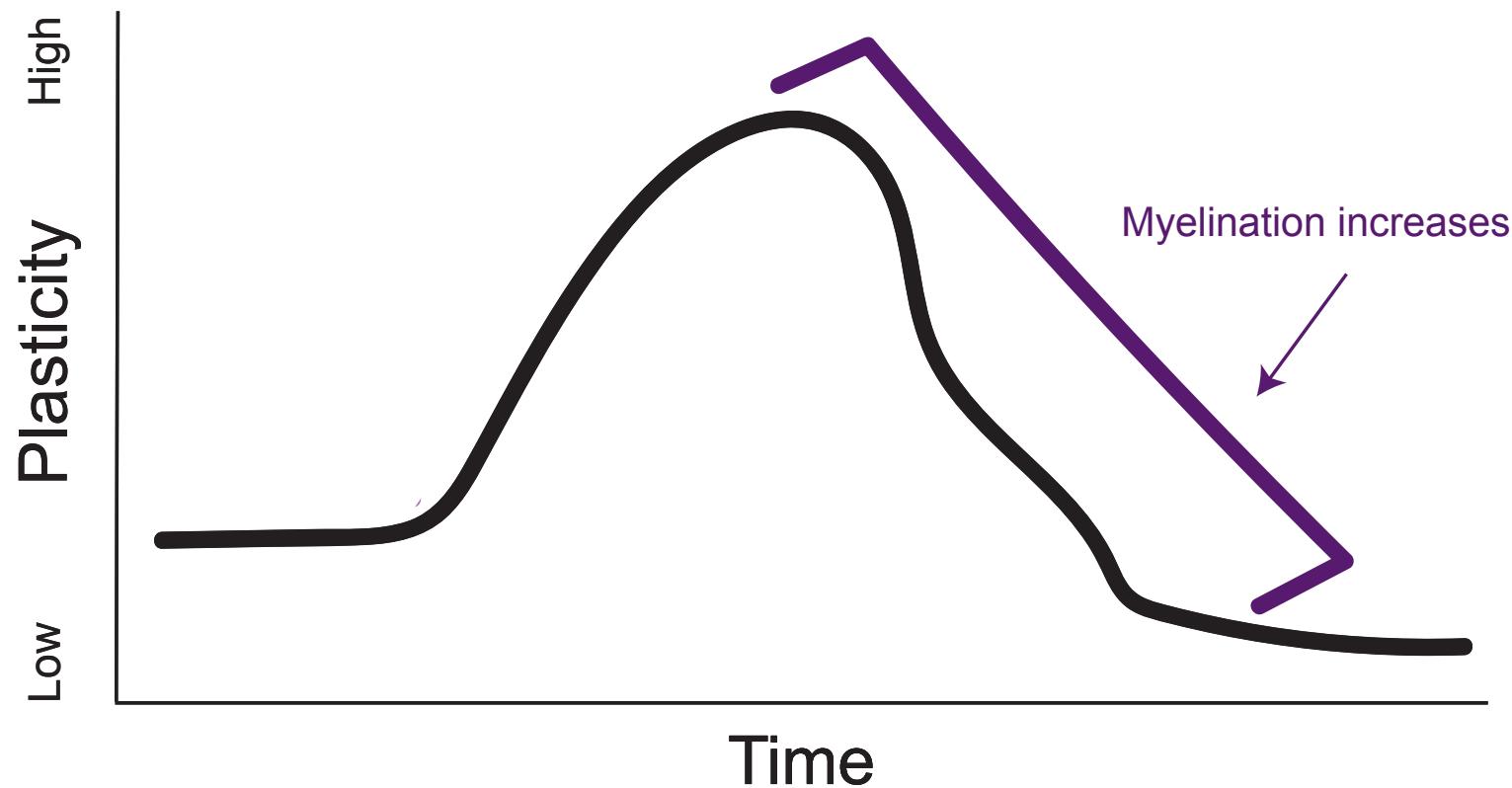
All changes saved

INHIBITION: FAILED!

What I learned:

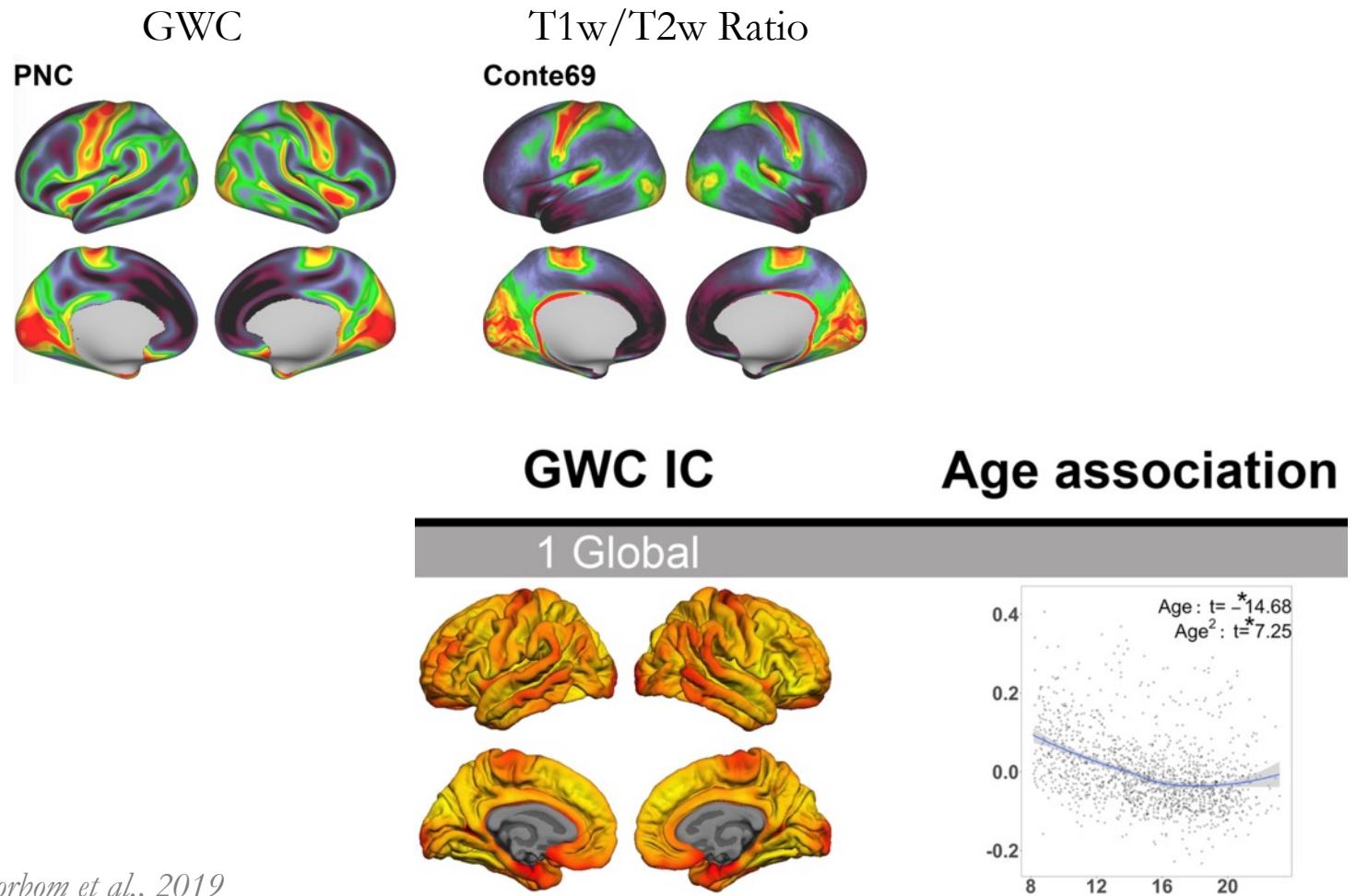
- How to run fmriprep and xcp (with task regression)
- SVM basics
- Catch22
- How surface data is represented and how to read, manipulate, visualize, and write surface data (cifits and giftis) in R
- Writing better R functions

Plasticity Signatures: Act 2



Aim 1:
To characterize the
spatiotemporal
development of
cortical plasticity

Imaging Intracortical Myelination GRAY WHITE CONTRAST (GWC)

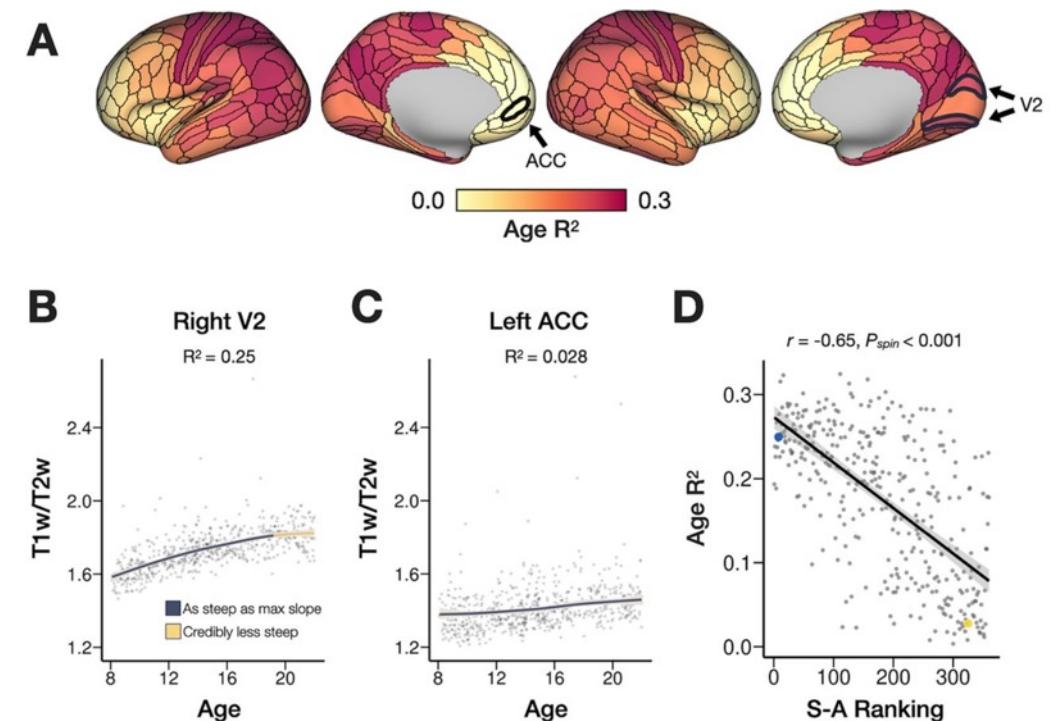
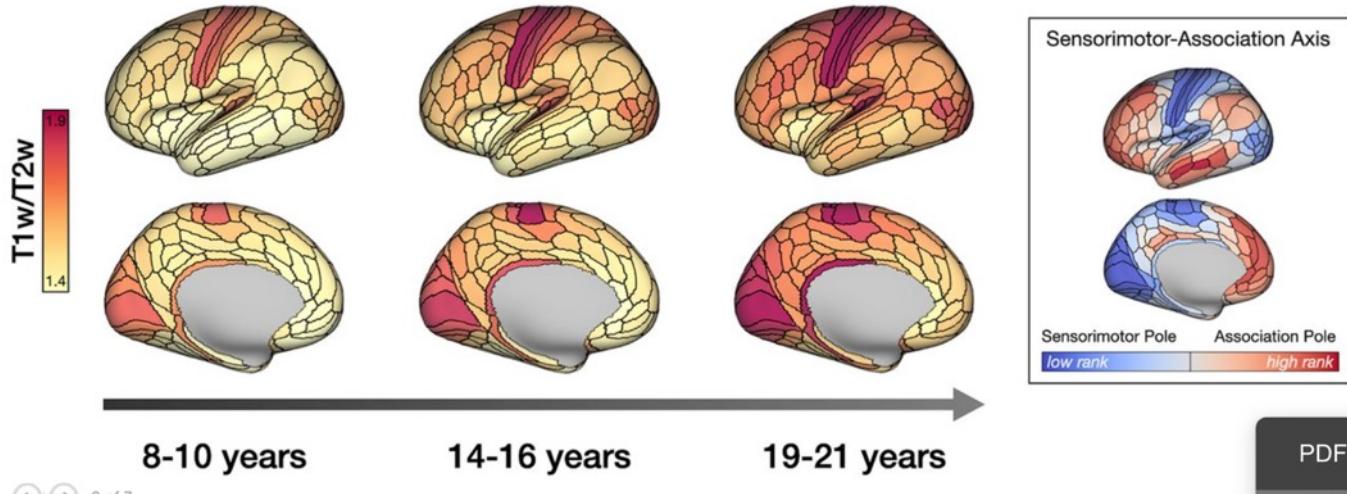


MYELIN:



What I learned:

- Having other people believe in and test your ideas is cooler than you doing it



MYELIN:



What I learned:

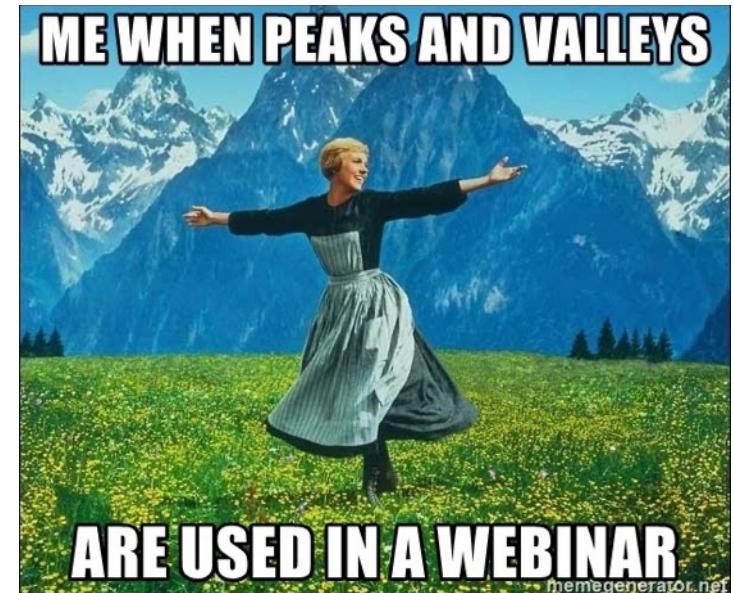
- Having other people believe in and test your ideas is cooler than you doing it
- Turn scoops (or project overlap) into collaborations!

MYELIN:

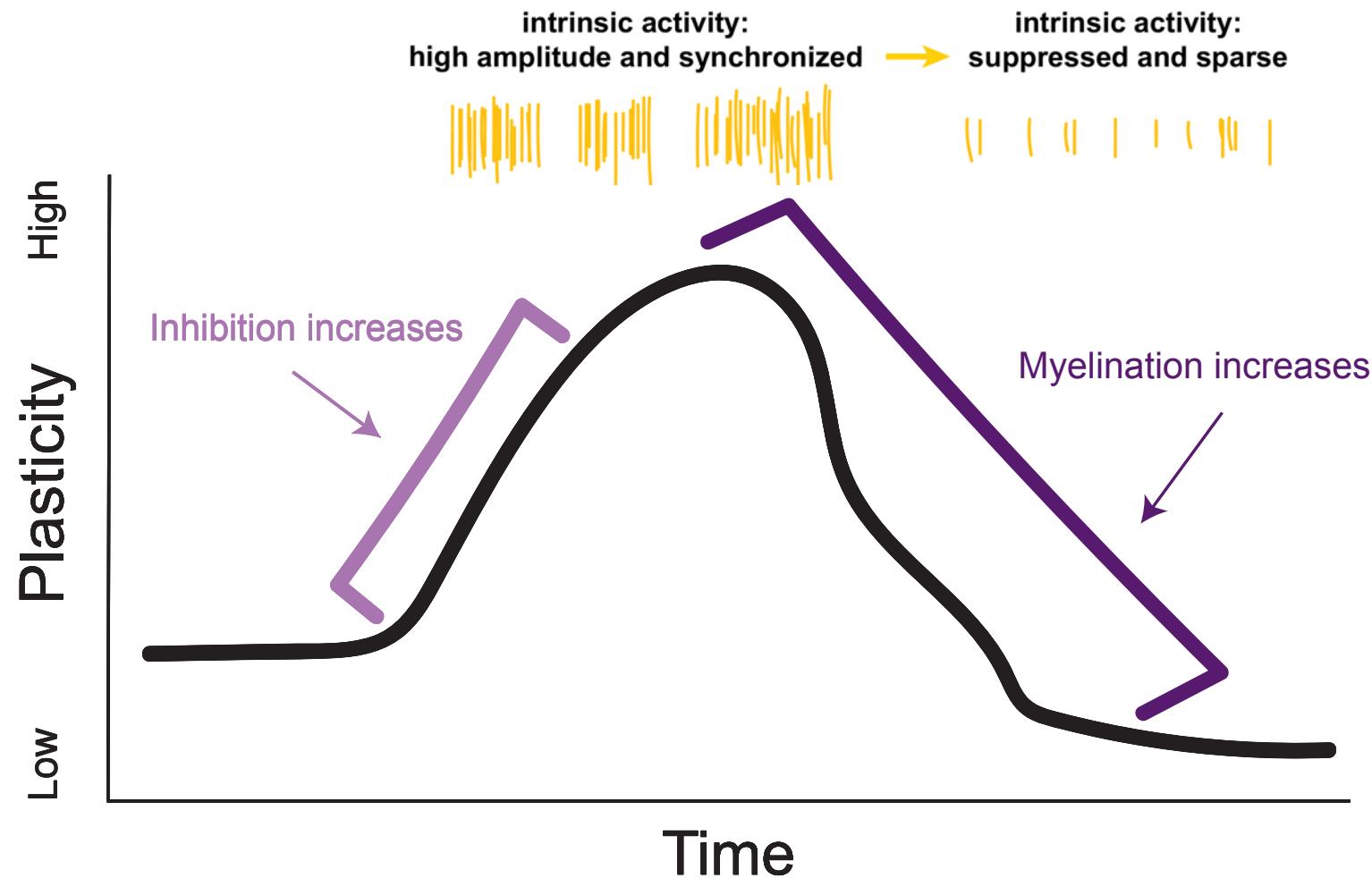


What I learned:

- Having other people believe in and test your ideas is cooler than you doing it
- Turn scoops (or project overlap) into collaborations!
- Its going to be okay, fam



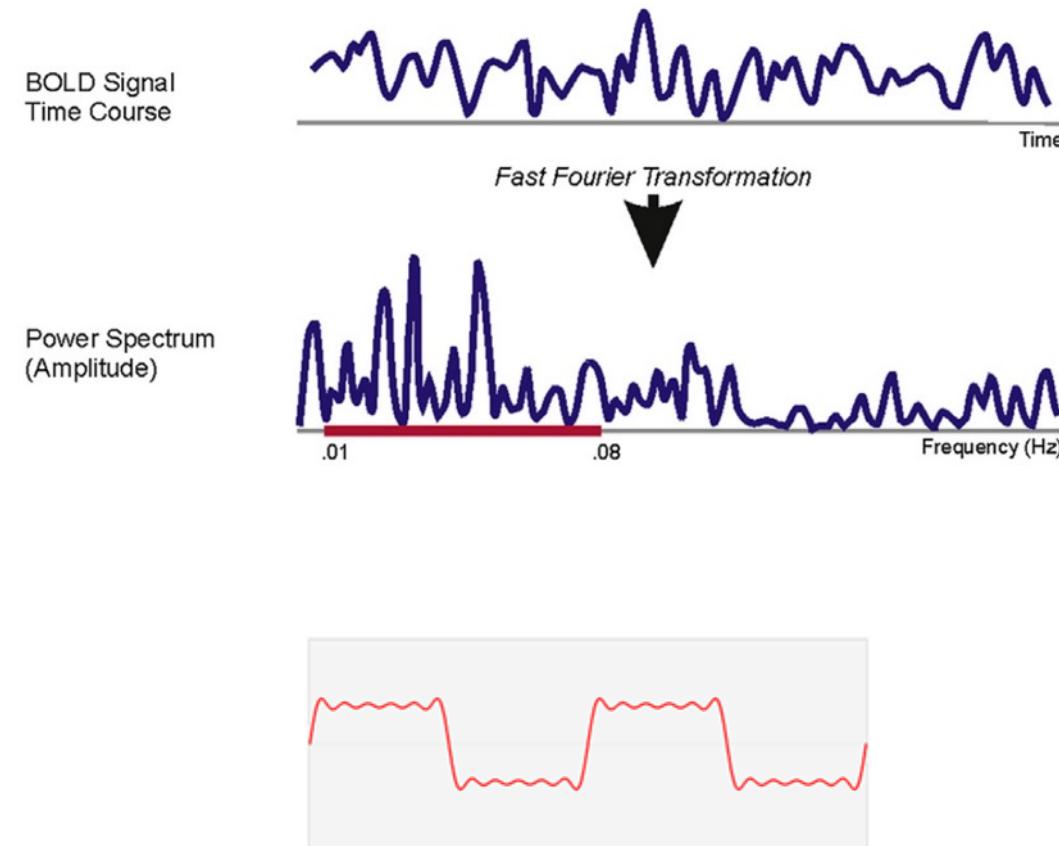
Plasticity Signatures: Act 3



Aim 1:
To characterize the
spatiotemporal
development of
cortical plasticity

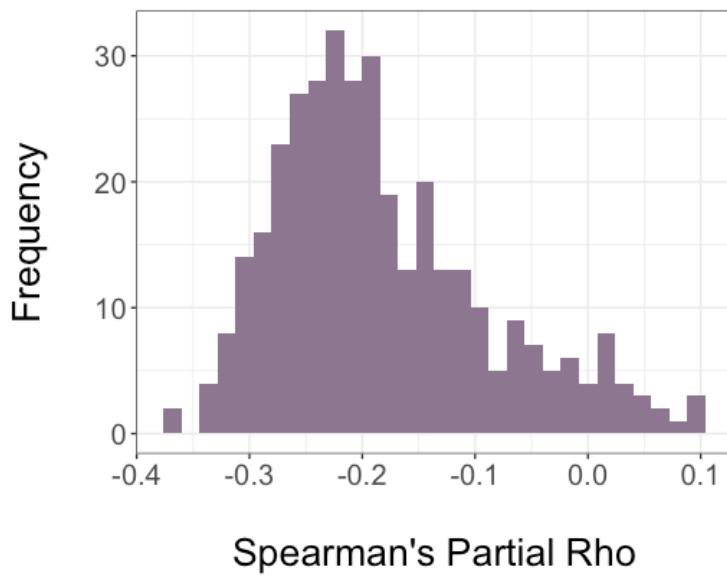
Imaging Spontaneous Activity Patterns

Fluctuation Amplitude



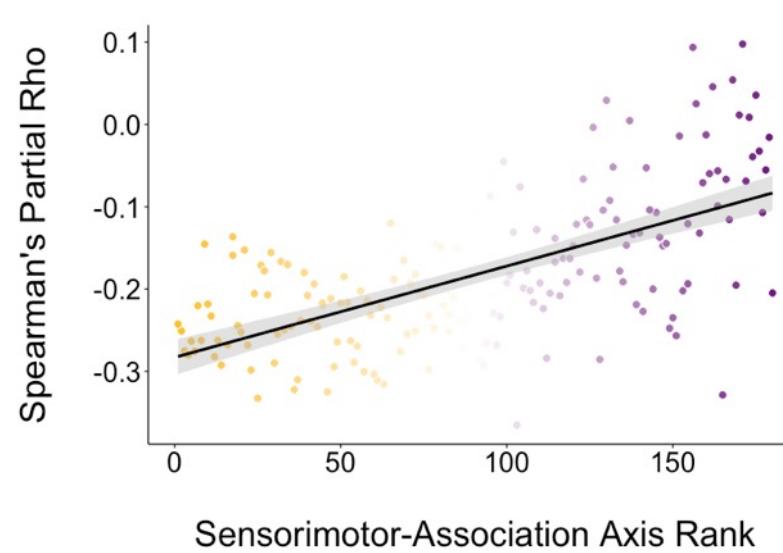
Preliminary Data: Development of ALFF

Associations Between
Fluc. Amp. and Age



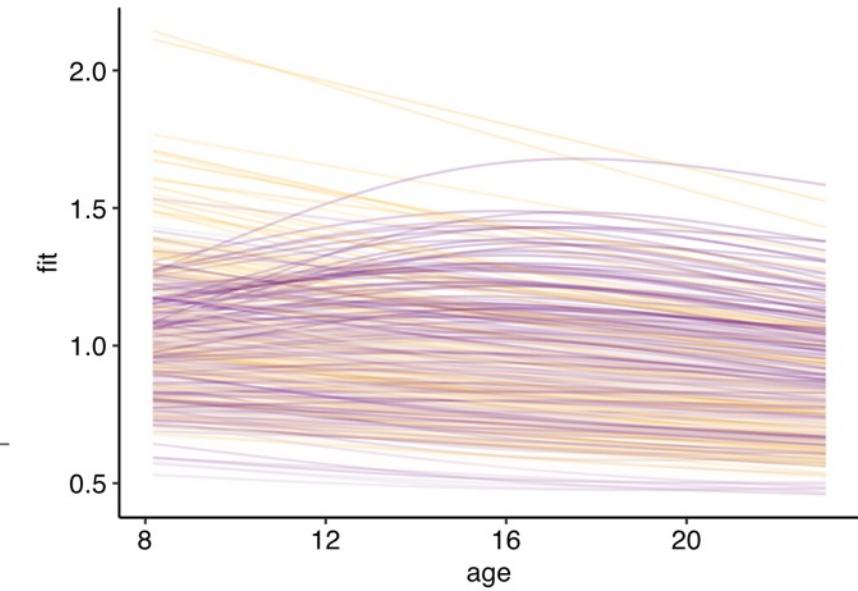
*significant in 314/360 parcels (FDR corrected)

Correlation Between Age Effect
and S-A Axis Rank



Spearman's $\rho = 0.61, p = < 2.2\text{e-}16$

Regional Developmental
Trajectories



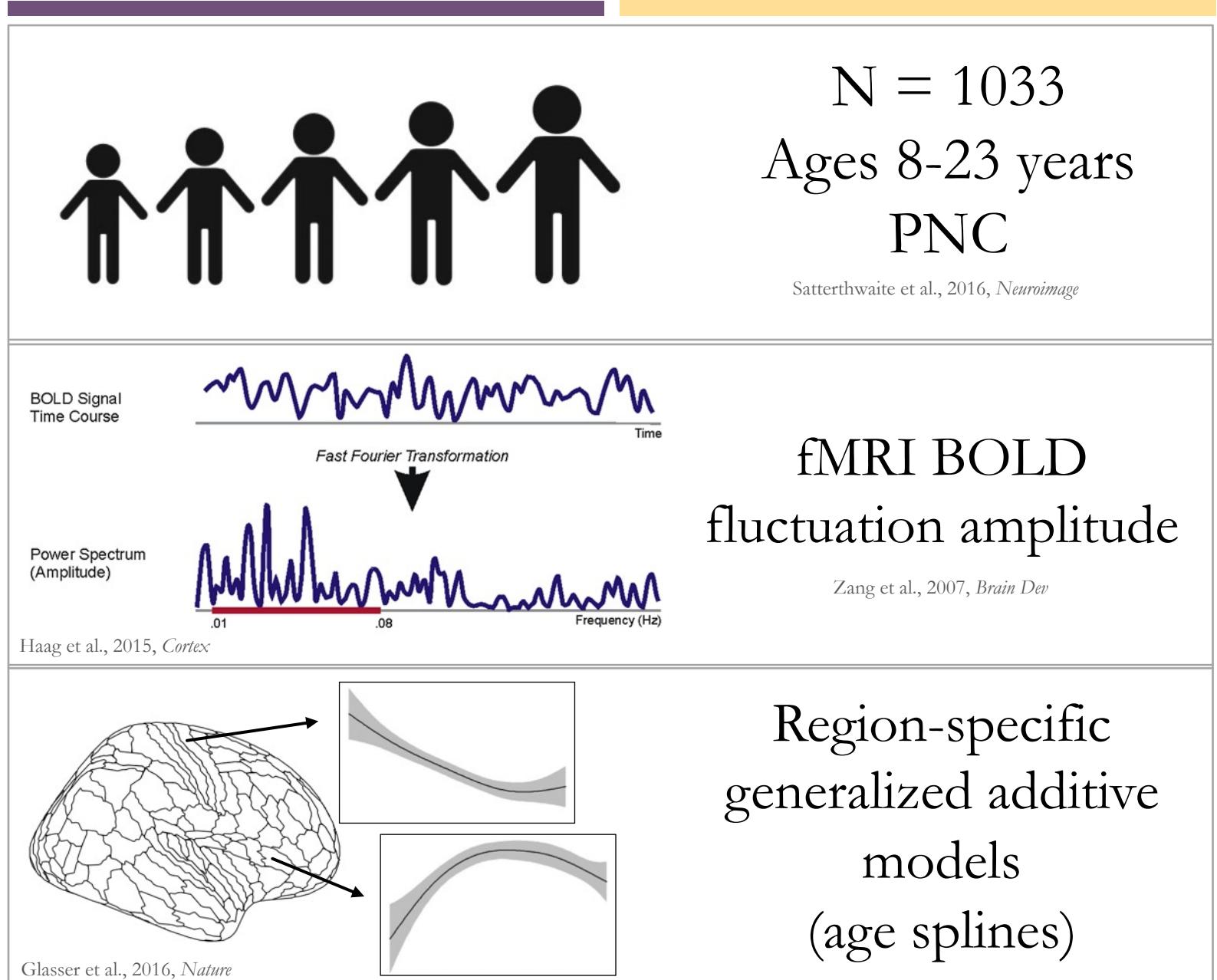
ALFF: IS BACK!

What I learned:

- Have mentors who lift you up
- Get other people's perspectives on your data
- Follow the data brick road



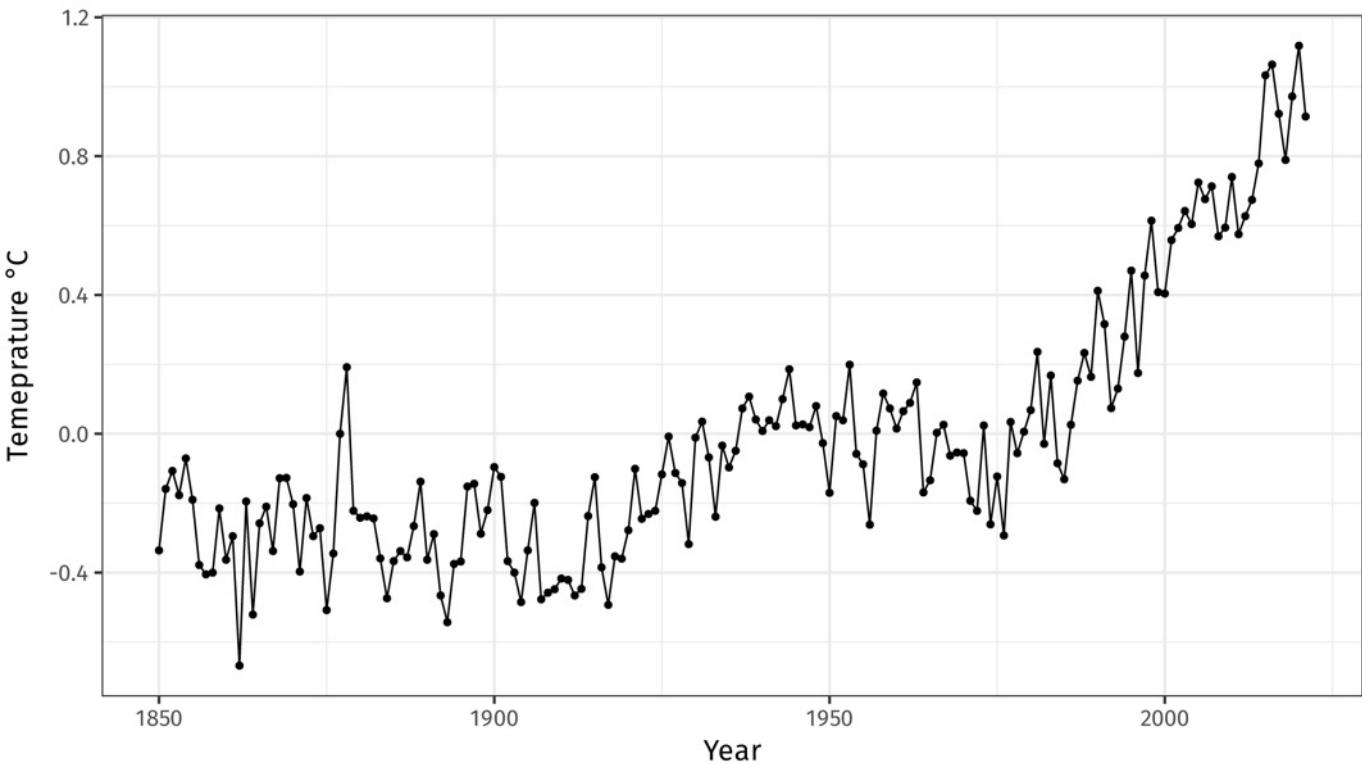
Study Design



Study Design

Generalized Additive Models (GAMs)

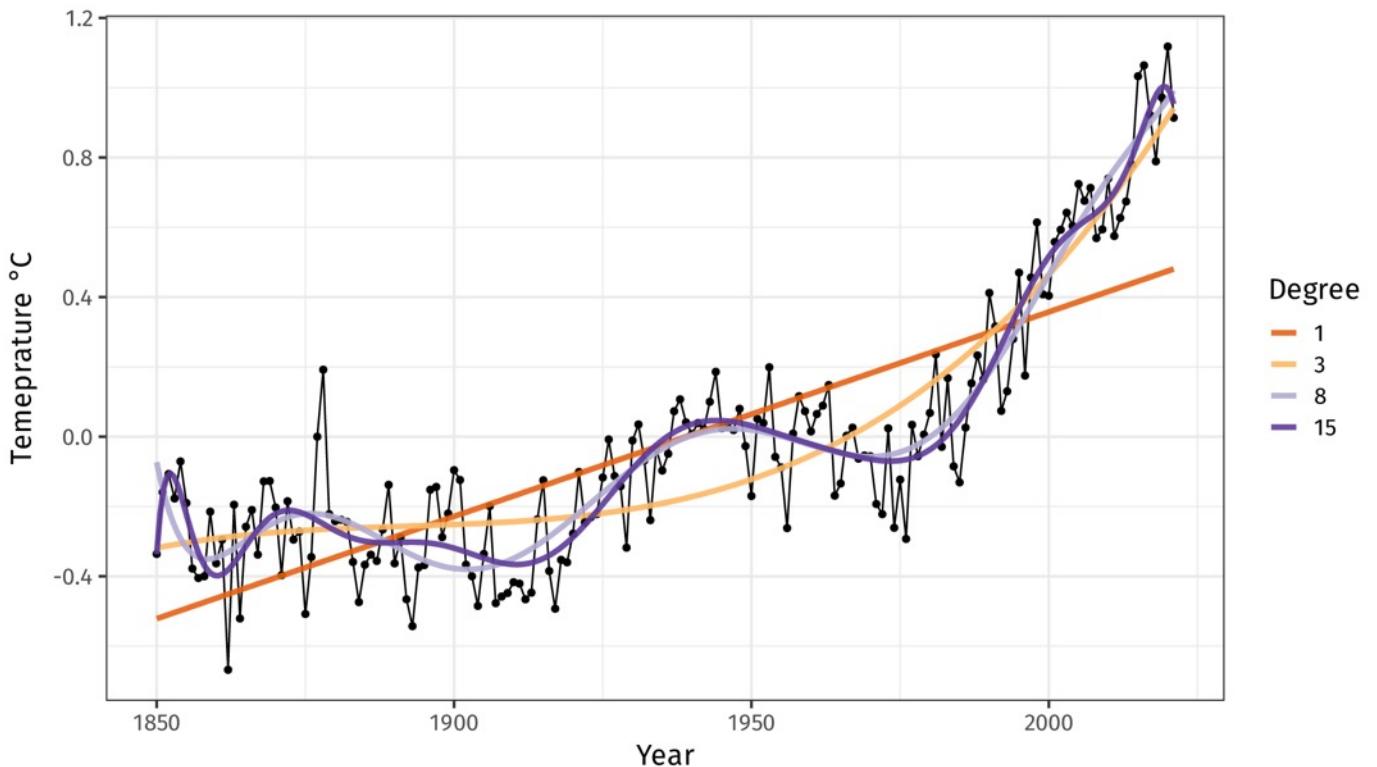
Is this linear?



Study Design

Generalized Additive Models (GAMs)

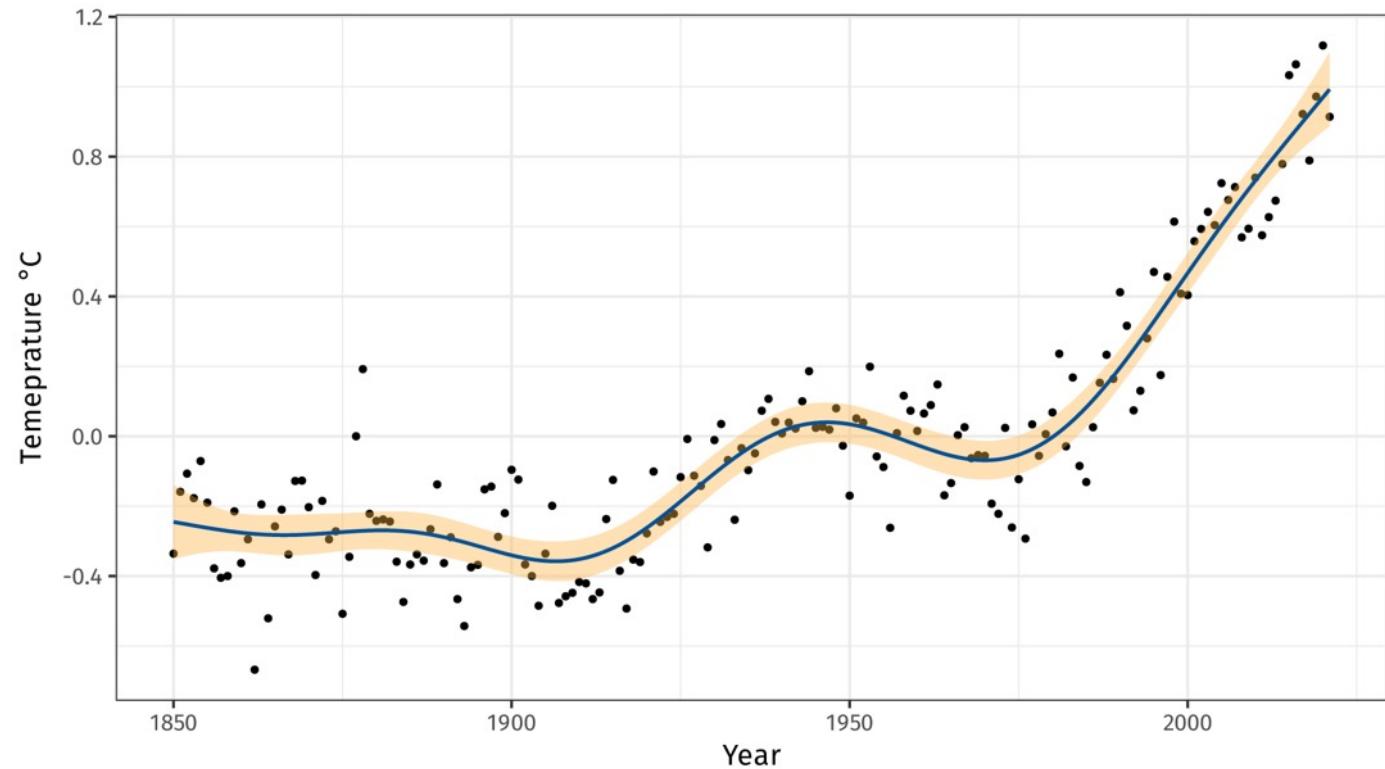
Polynomials perhaps...



Study Design

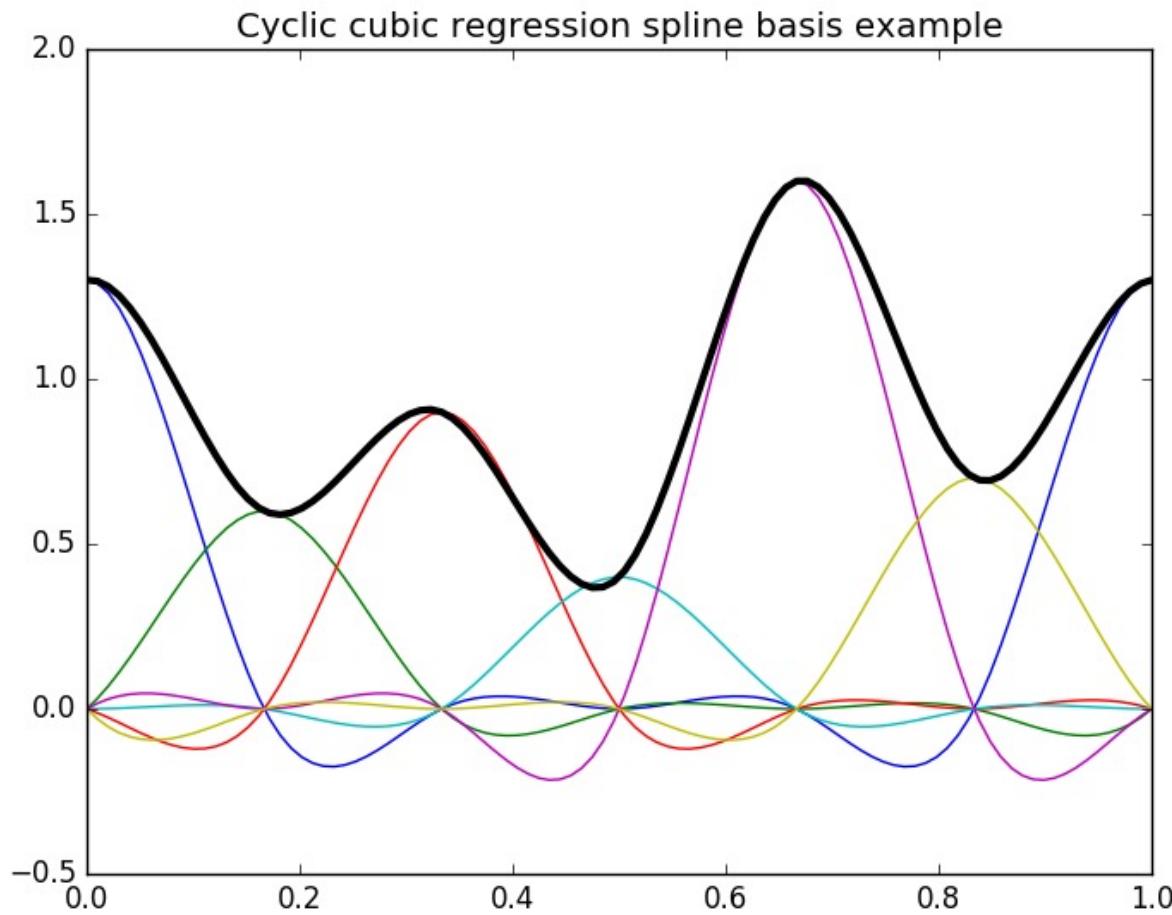
Generalized Additive Models (GAMs)

Fitted GAM



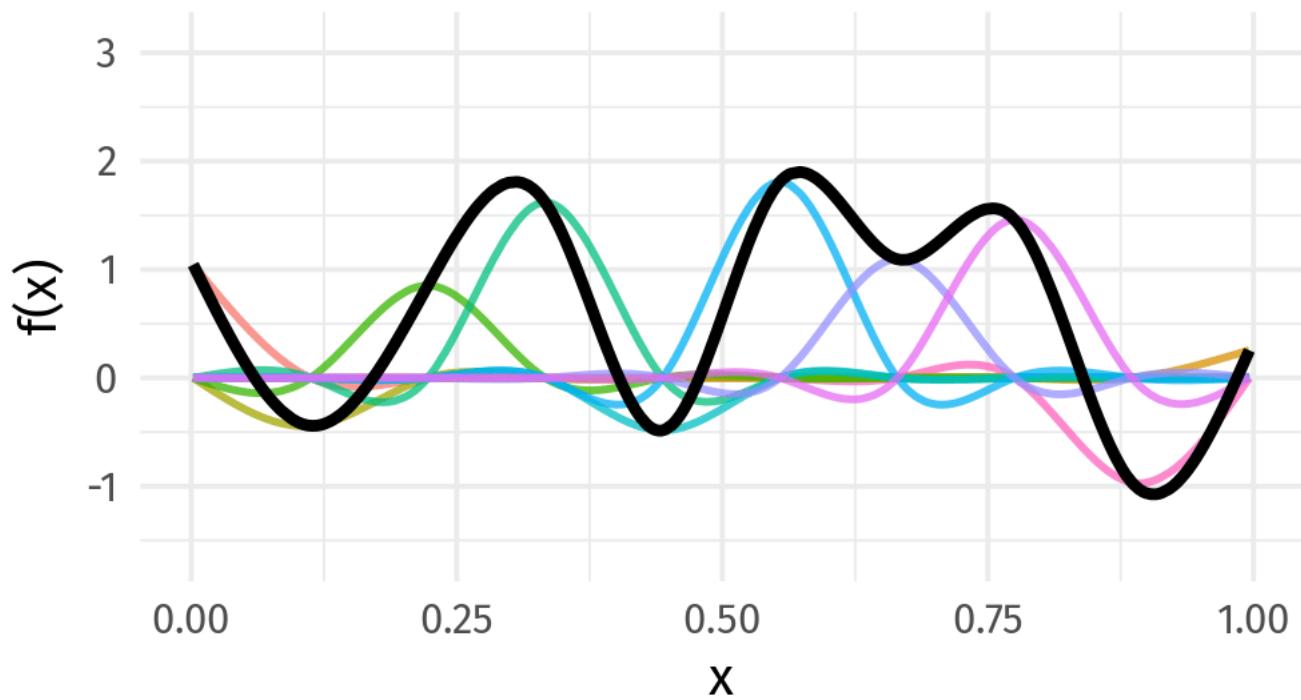
Study Design

Generalized Additive Models (GAMs)



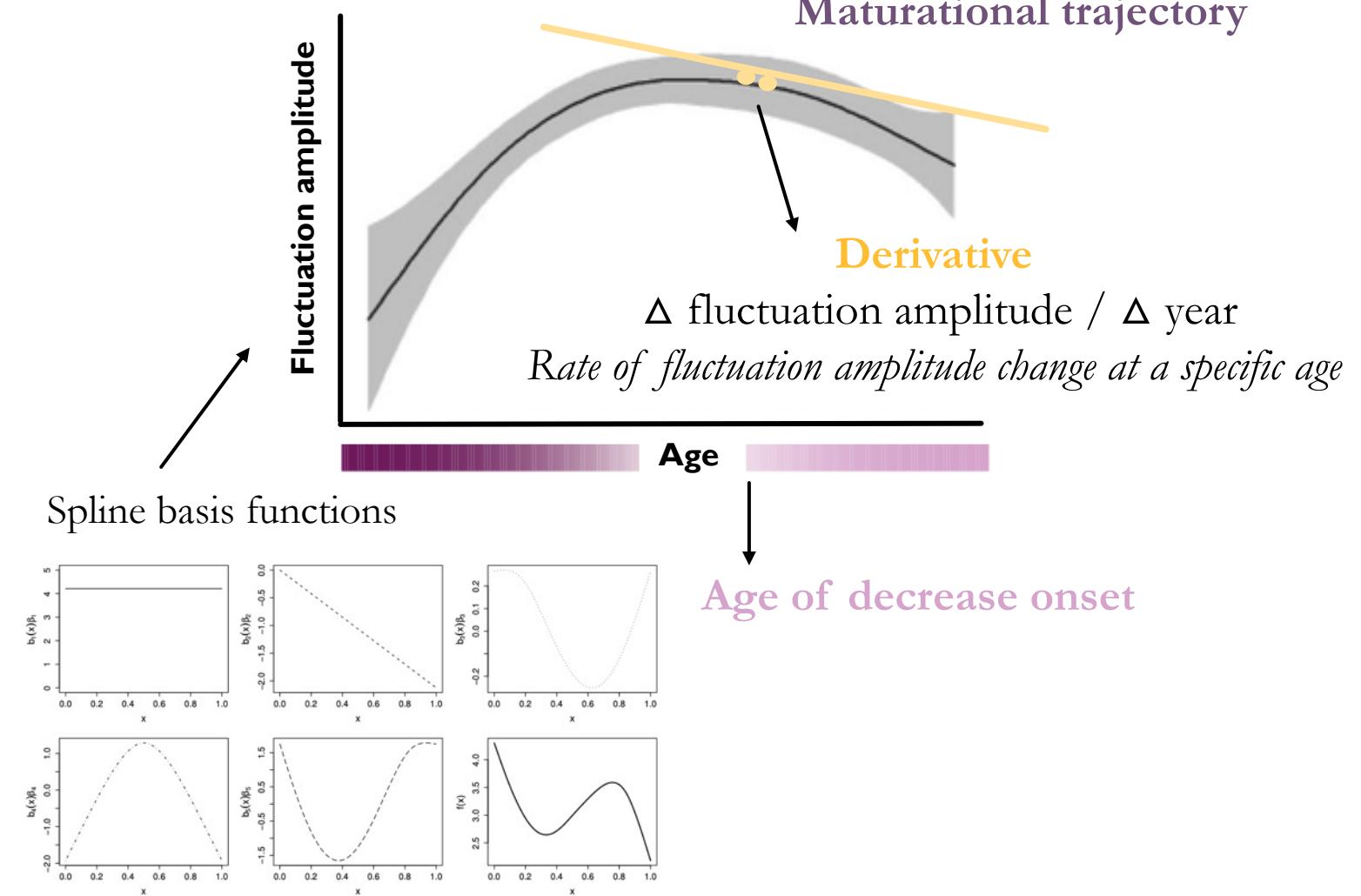
Study Design

Generalized Additive Models (GAMs)

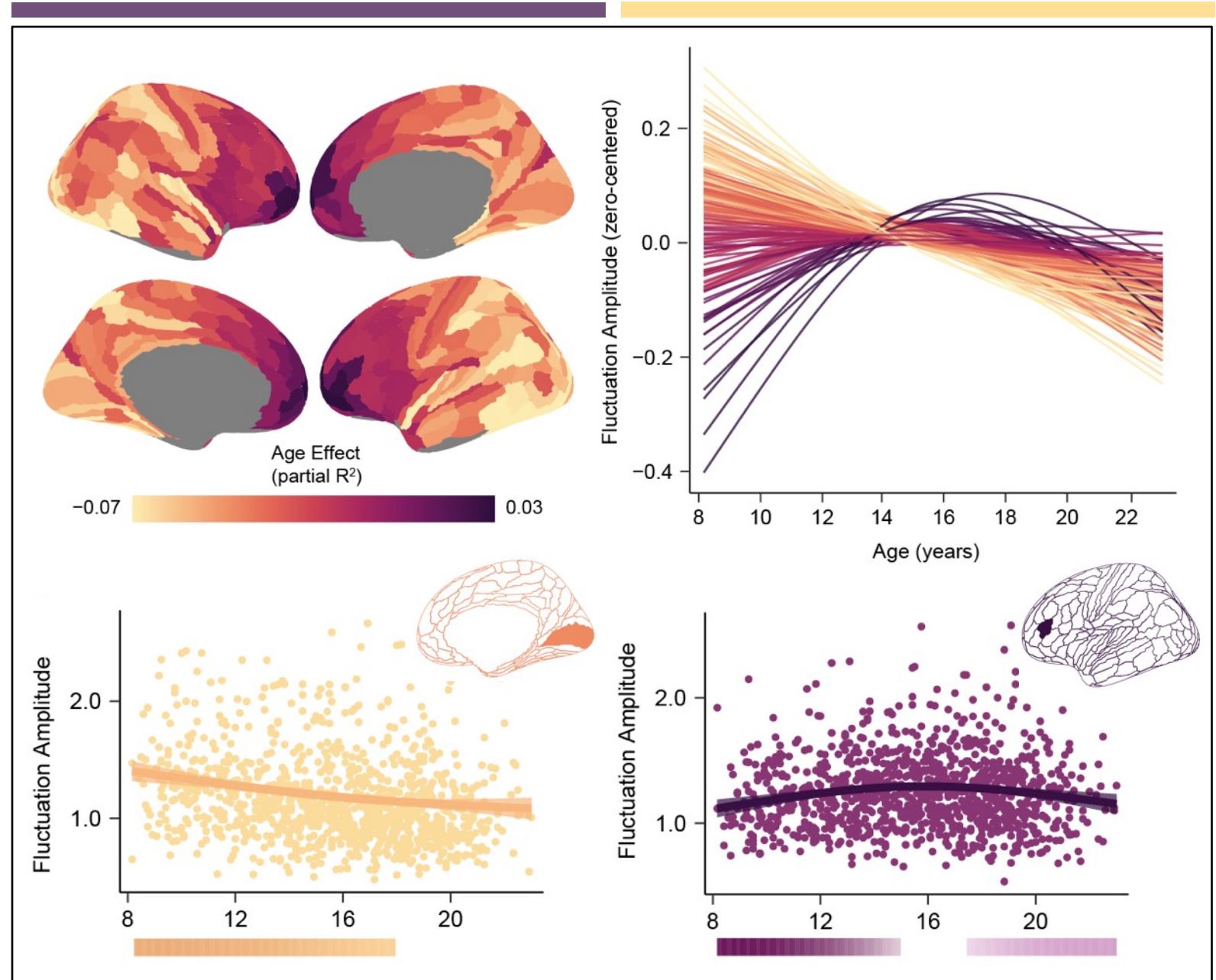
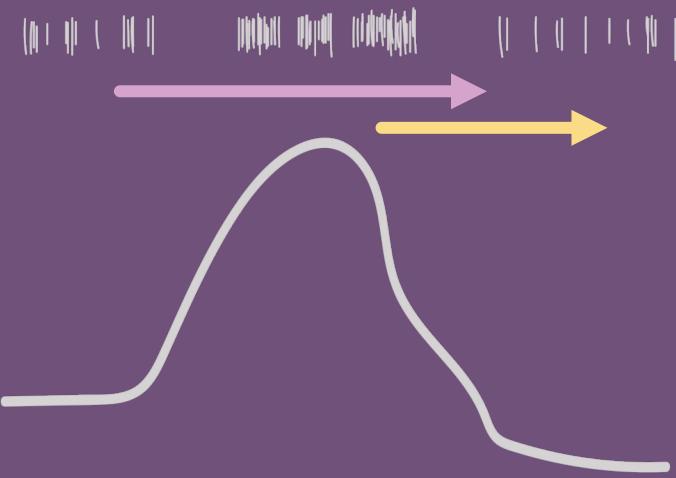


Study Design

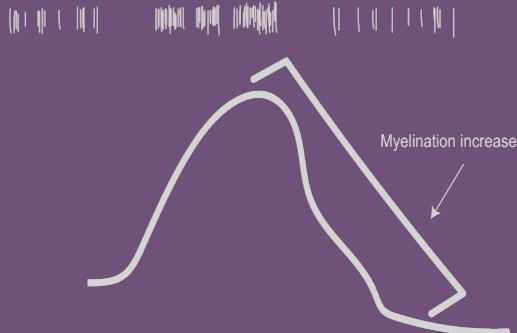
Generalized Additive Models (GAMs)



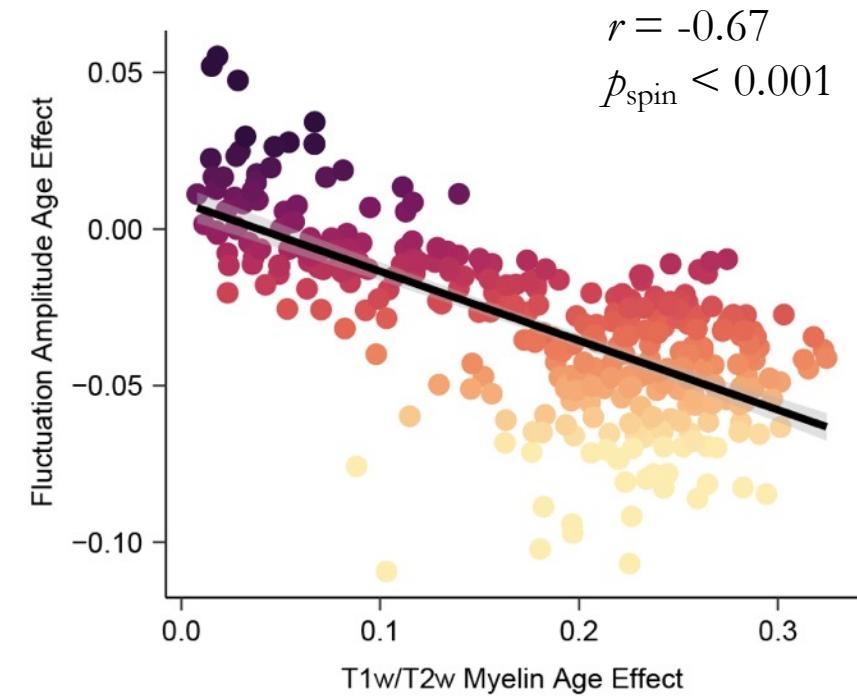
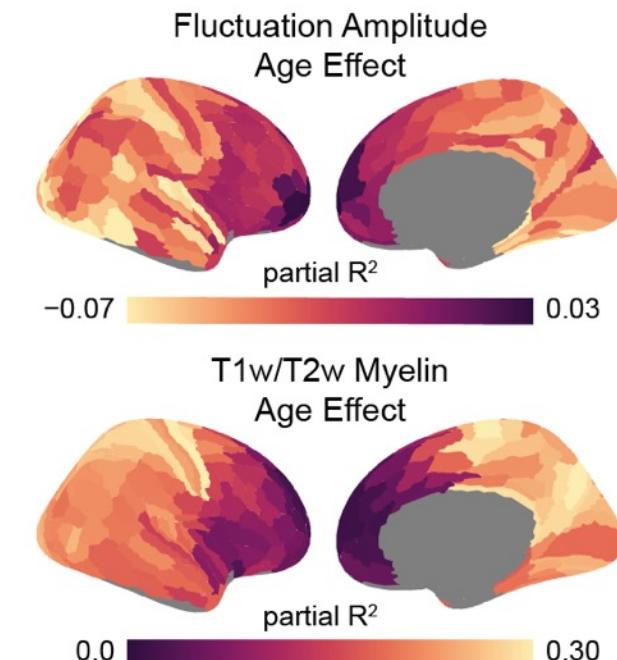
Fluctuation Amplitude Development Varies Across the Cortex



Fluctuation Amplitude Development Parallels Myelin Maturation



Larger increases in myelin content were associated with larger decreases in BOLD fluctuation amplitude

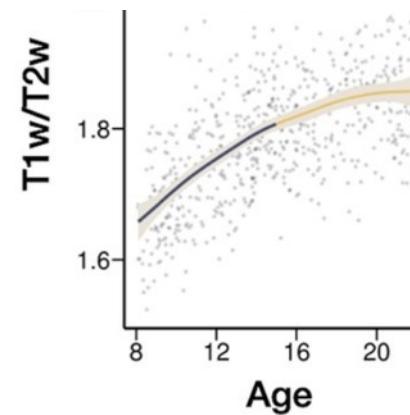
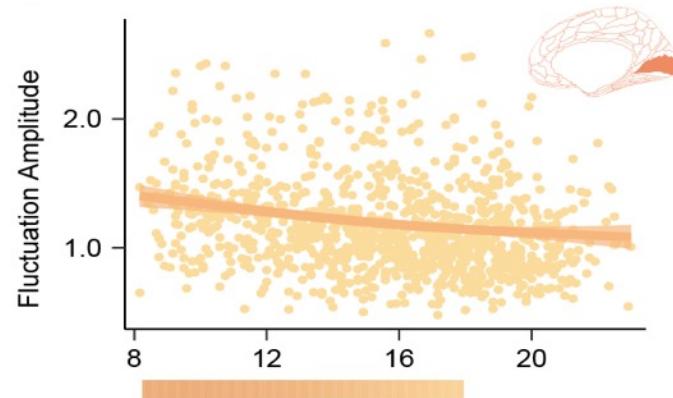
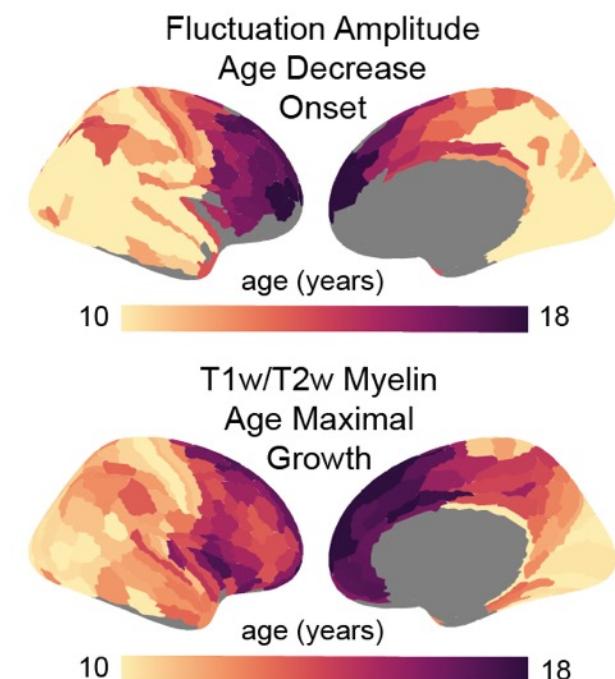


T1w/T2w data from Baum et al., 2022

Fluctuation Amplitude Development Parallels Myelin Maturation

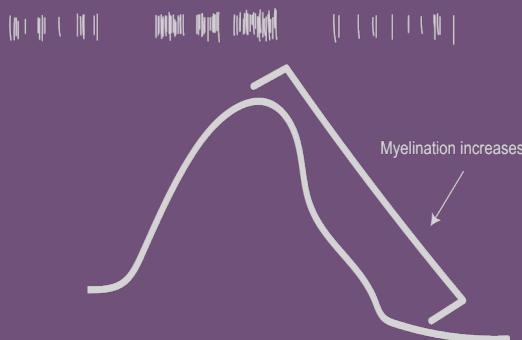


Later increases in myelin content were associated with later decreases in BOLD fluctuation amplitude

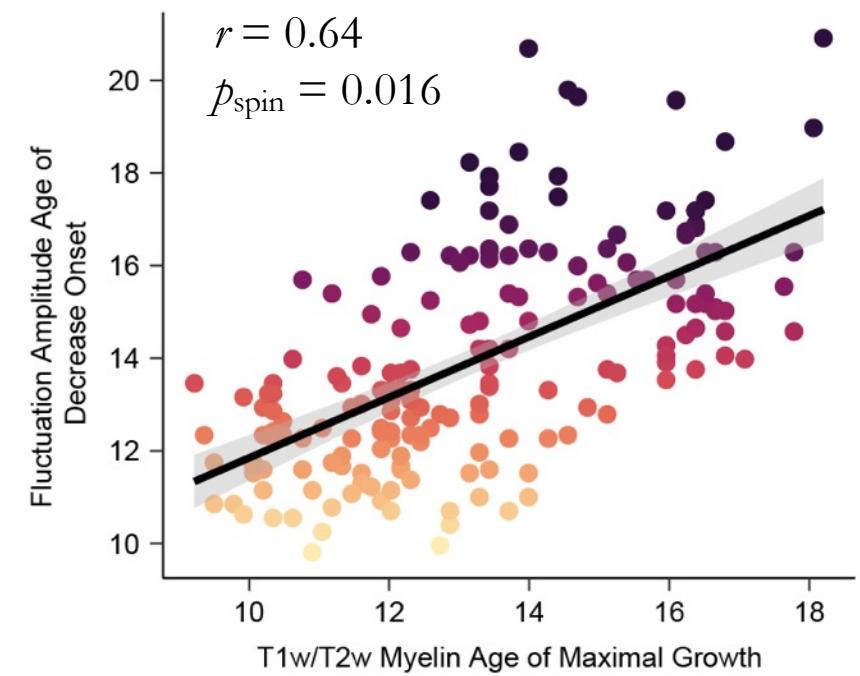
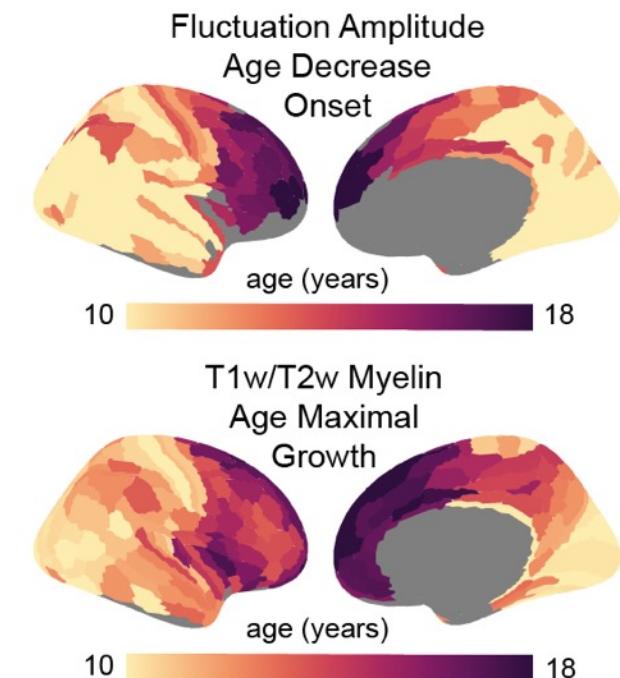


T1w/T2w data from Baum et al., 2022

Fluctuation Amplitude Development Parallels Myelin Maturation

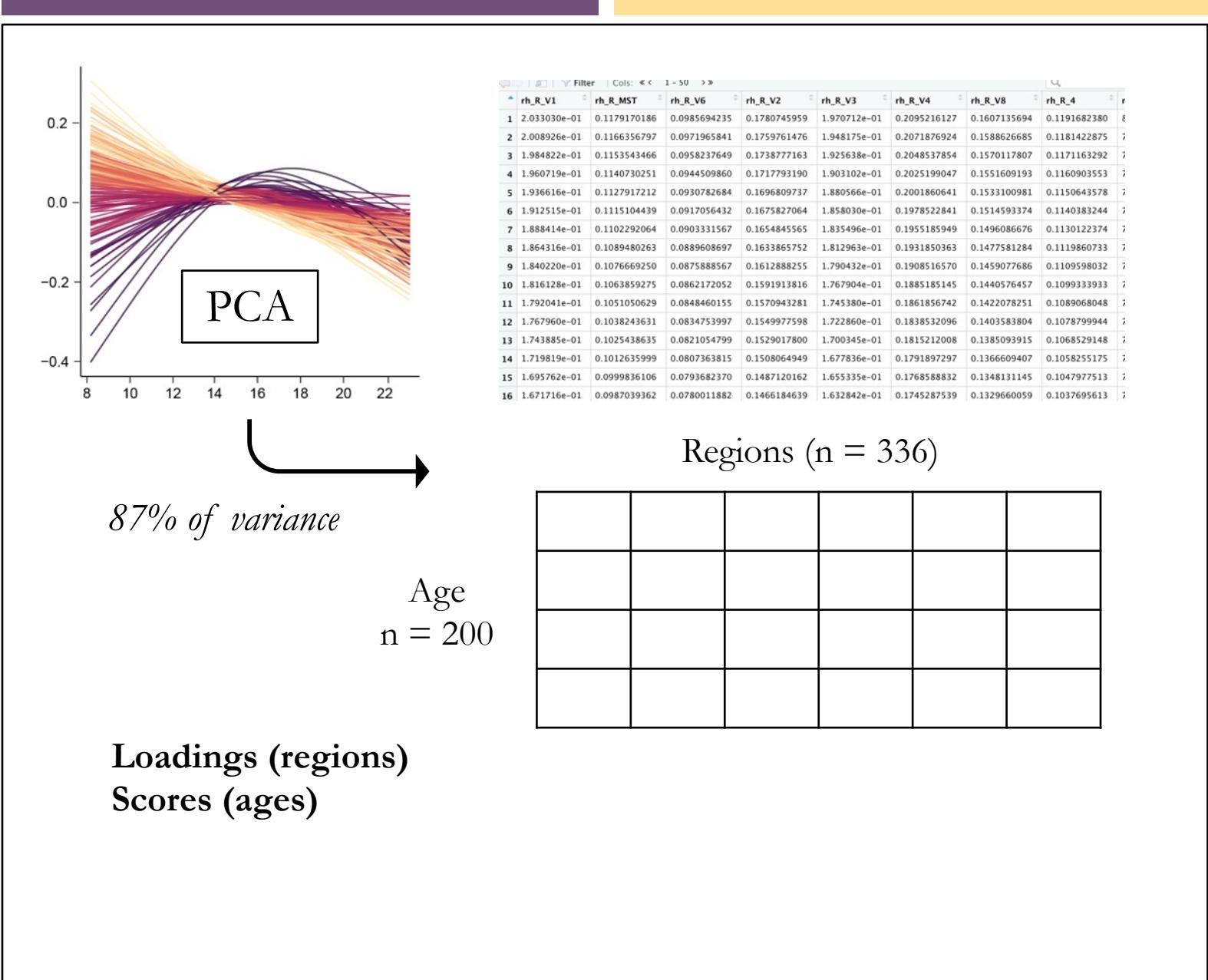


Later increases in myelin content were associated with later decreases in BOLD fluctuation amplitude

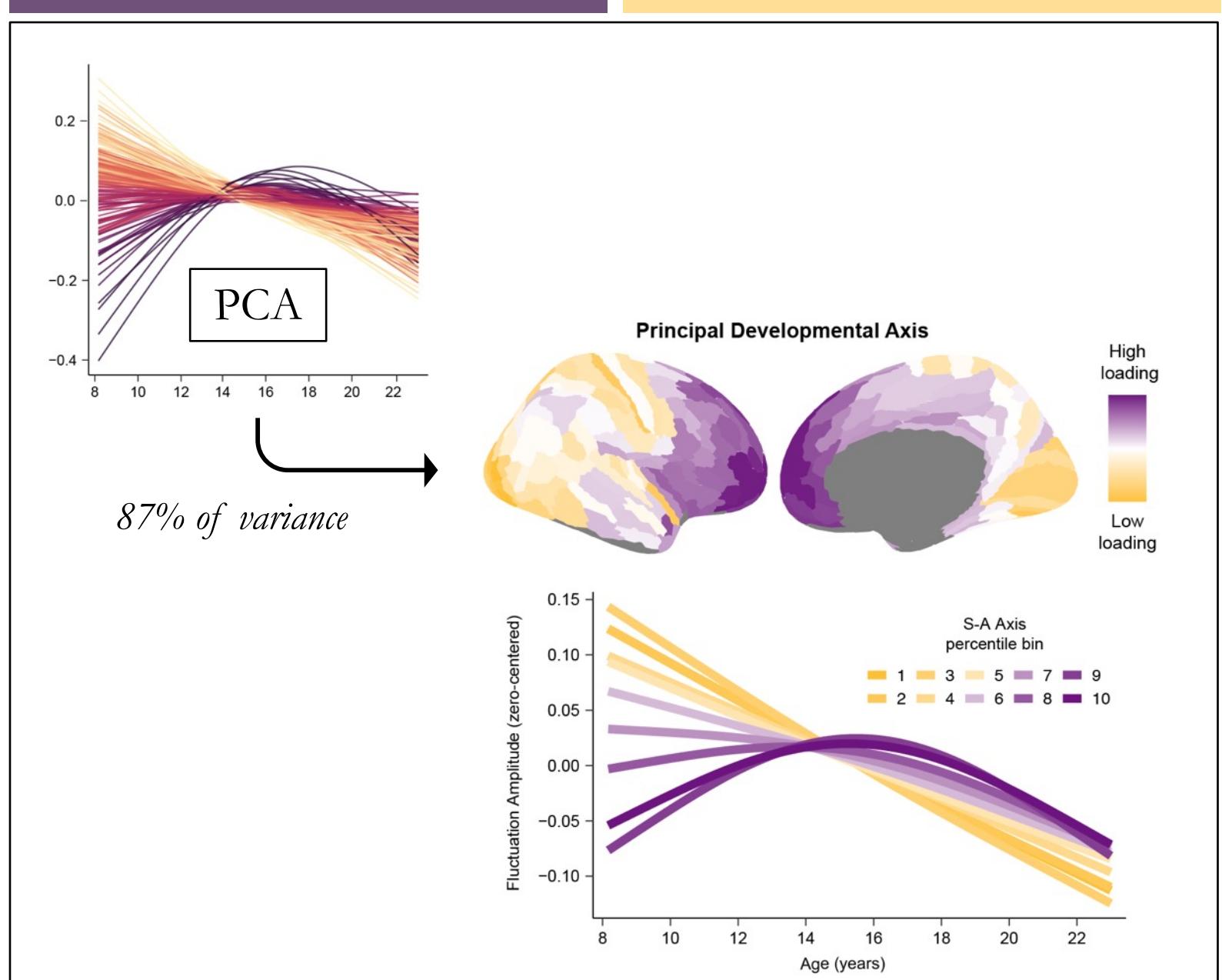


T1w/T2w data from Baum et al., 2022

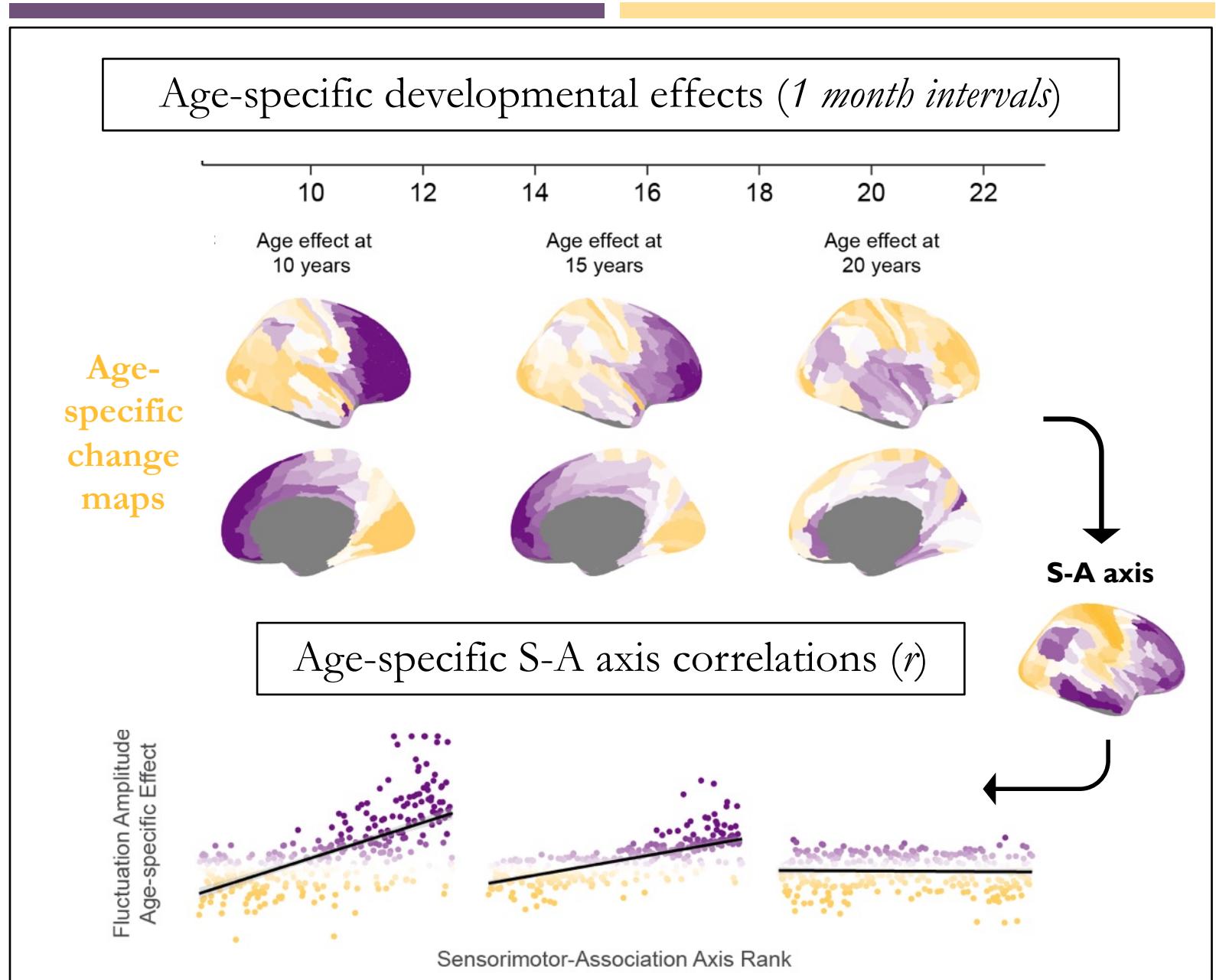
The Principal Developmental Axis is Sensorimotor to Associative



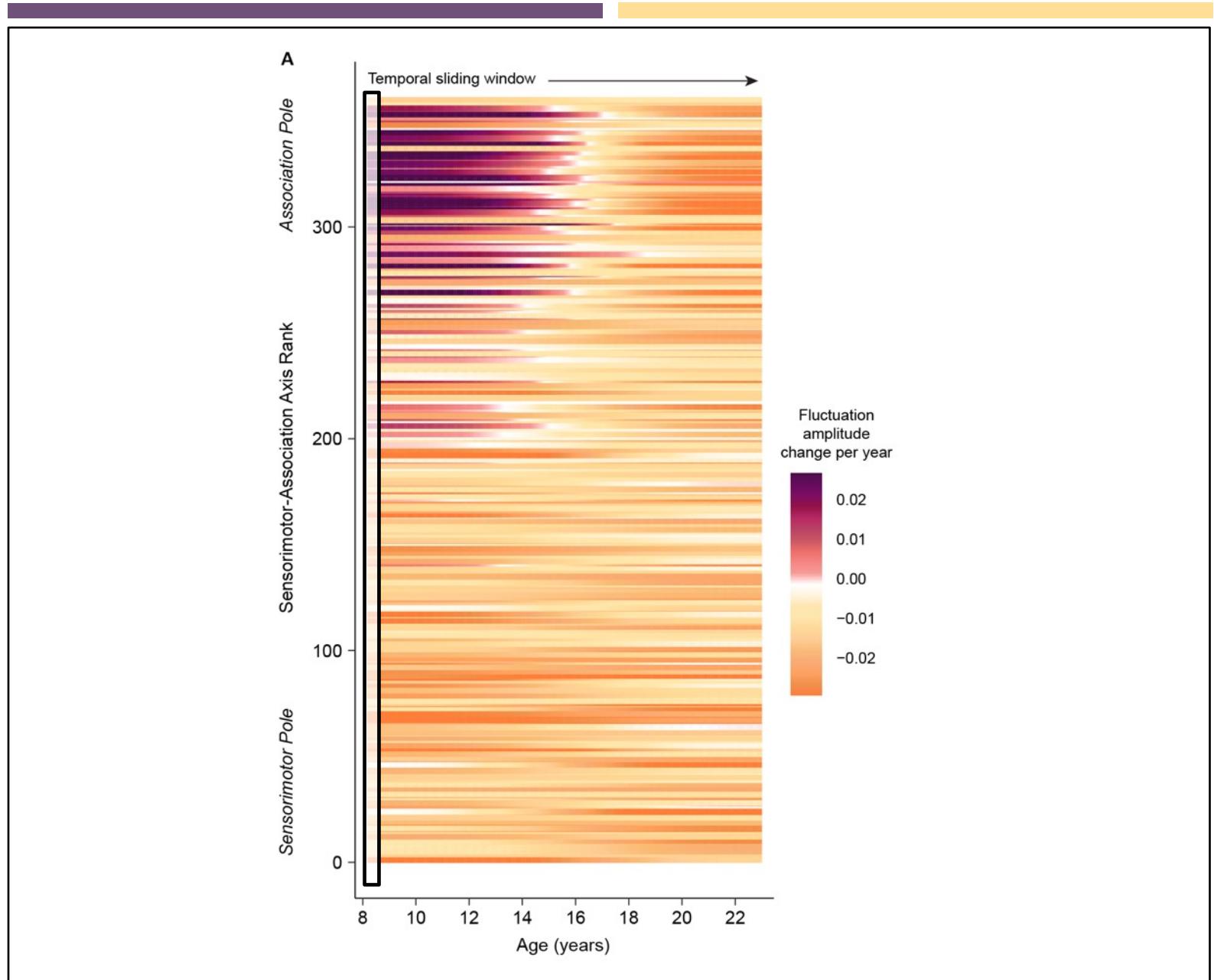
The Principal Developmental Axis is Sensorimotor to Associative



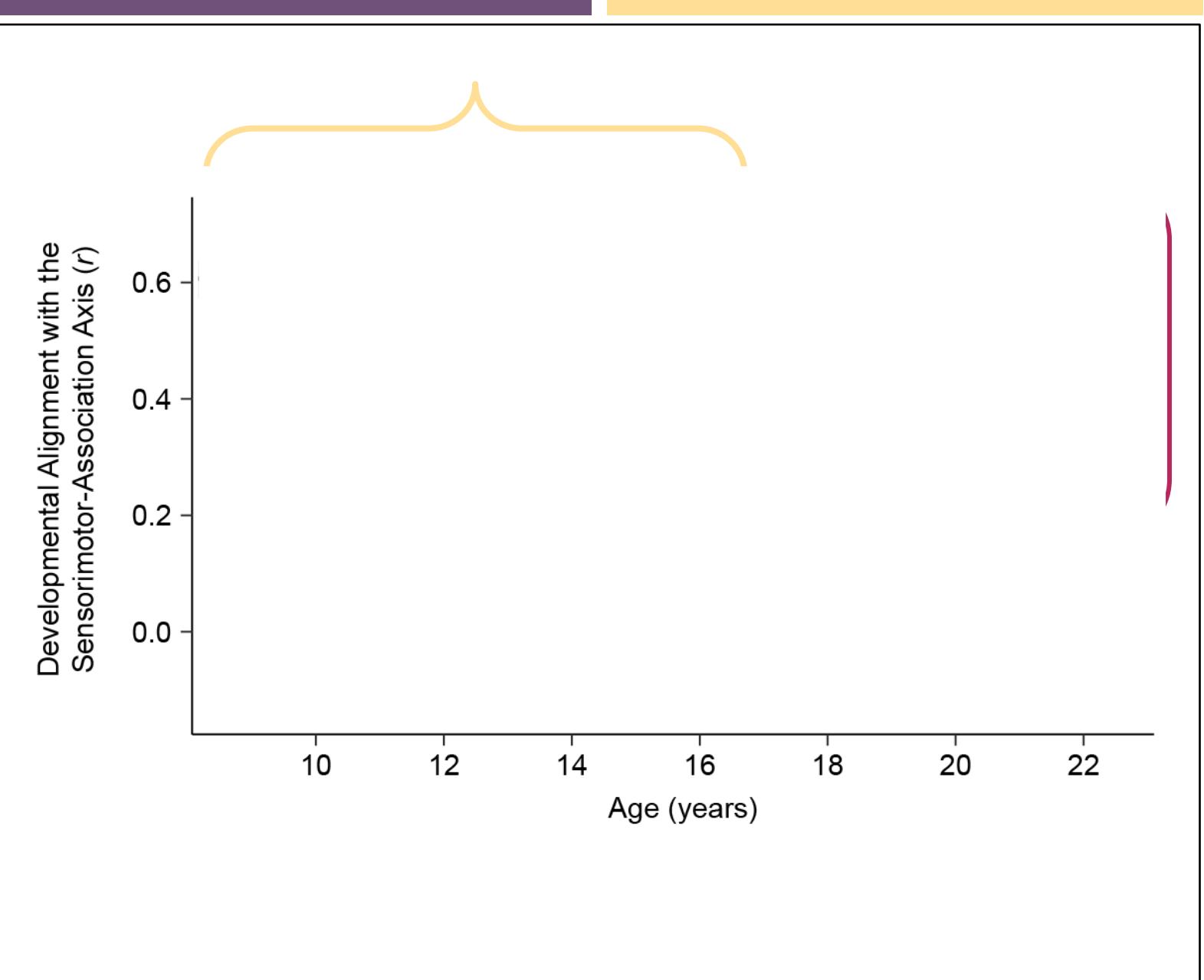
Development Aligns with the S-A Axis through Adolescence



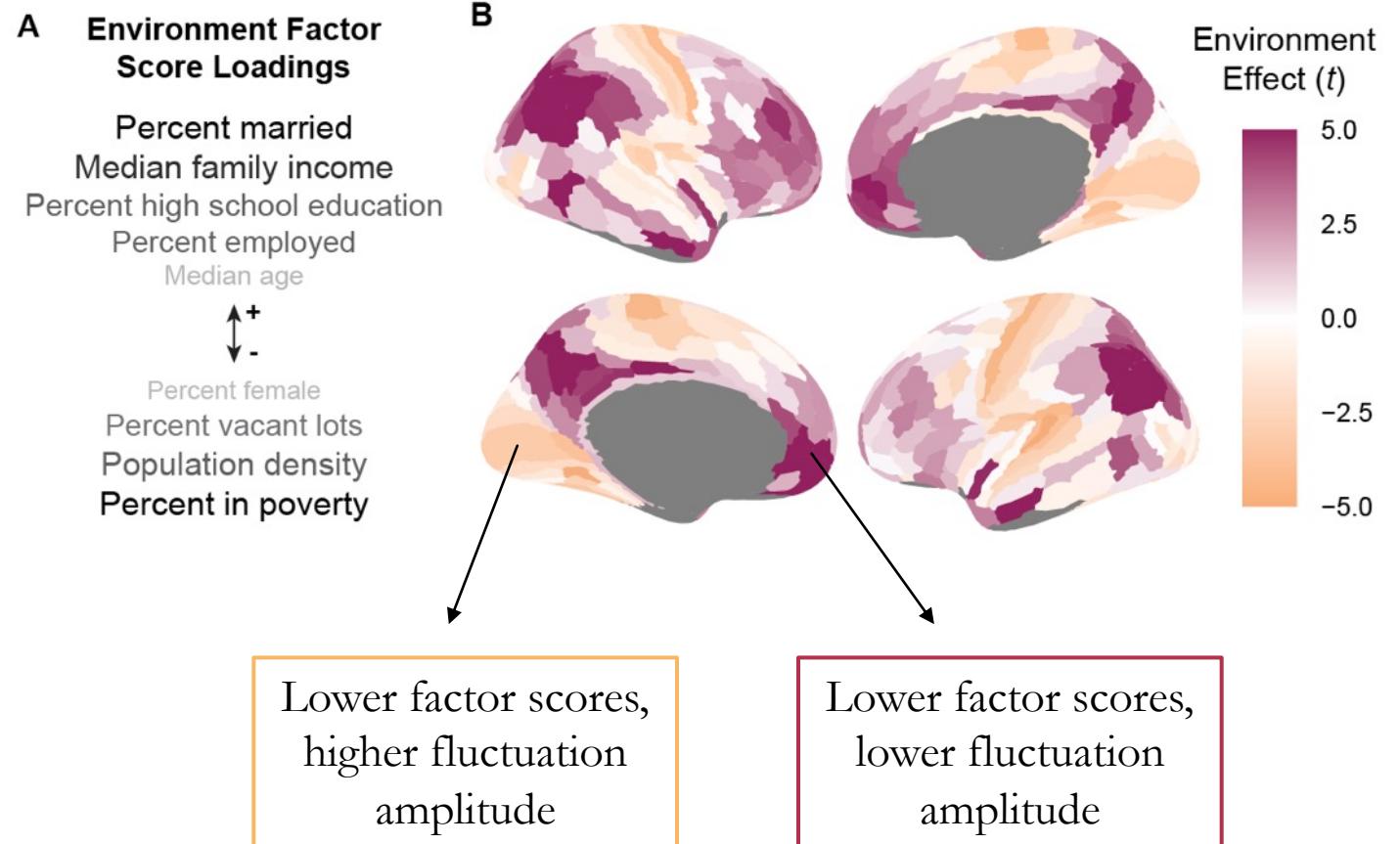
Development Aligns with the S-A Axis through Adolescence



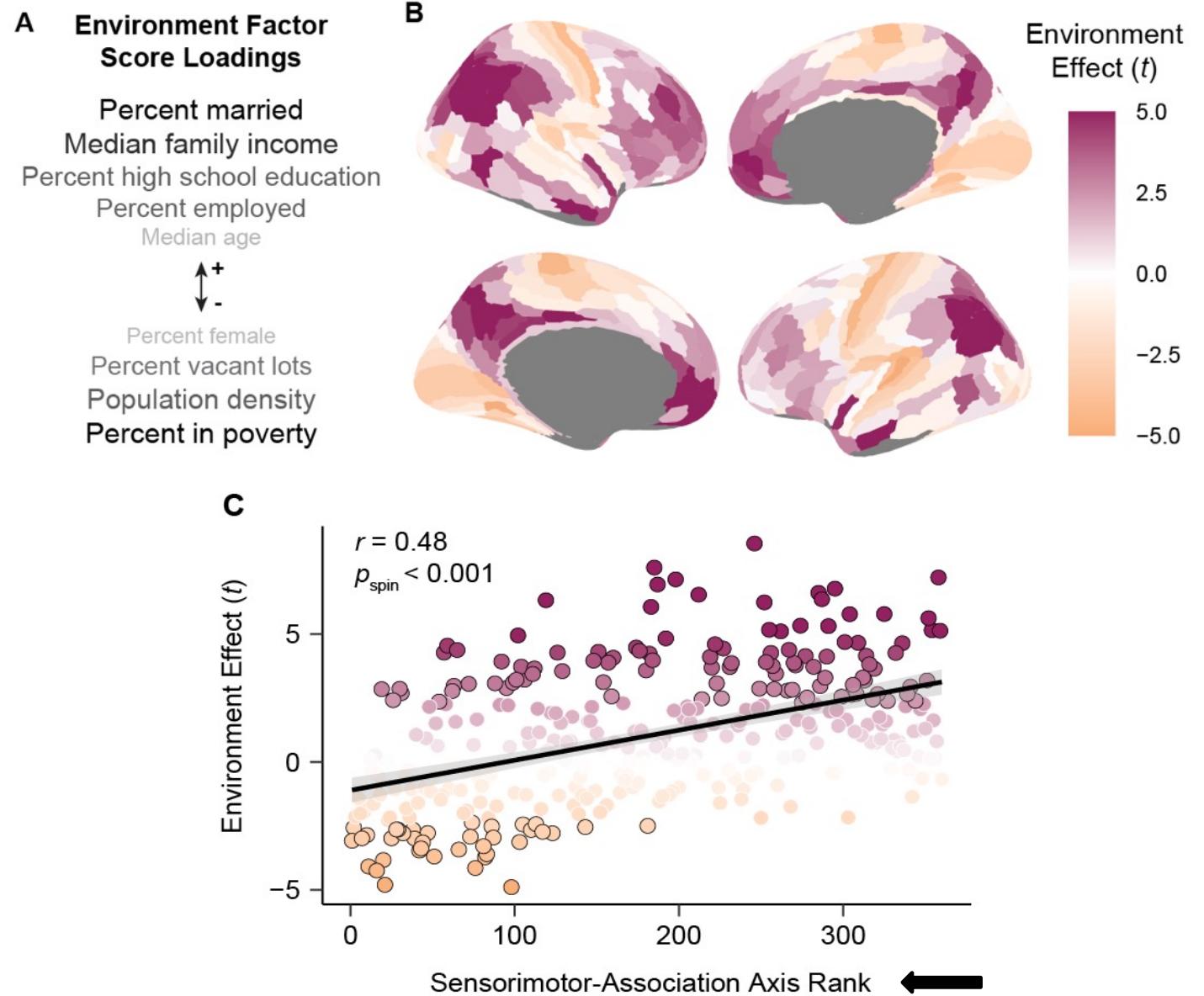
Development Aligns with the S-A Axis through Adolescence



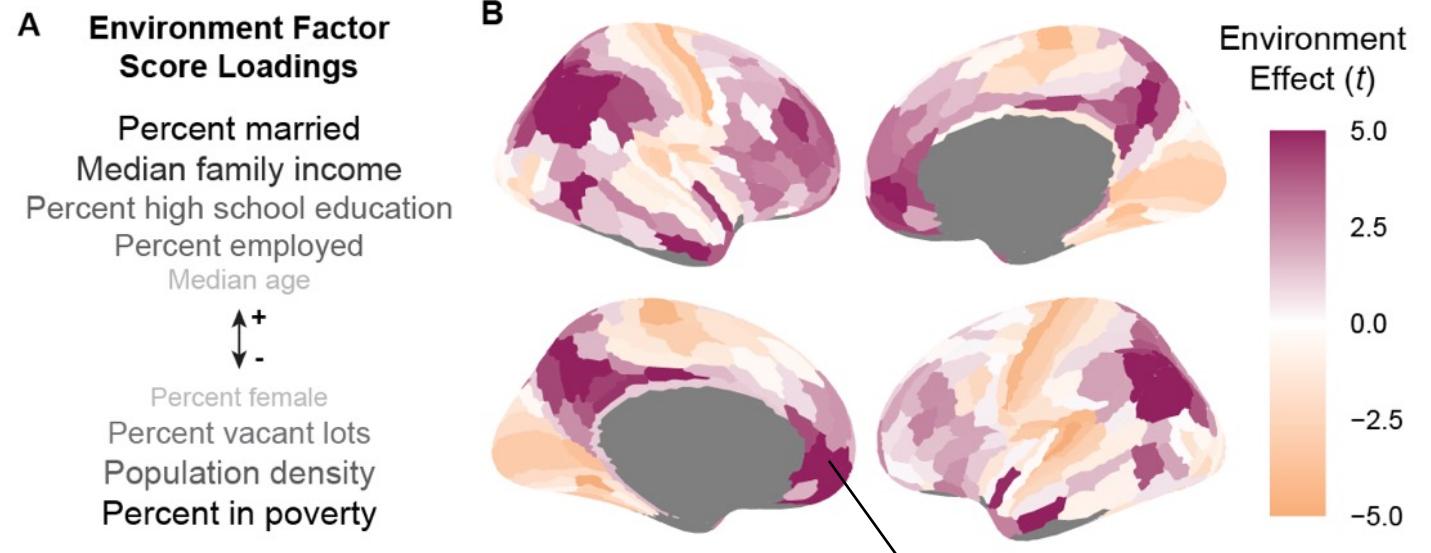
Environmental Effects on Cortical Spontaneous Activity



Environmental Effects on Cortical Spontaneous Activity



Environmental Effects on Cortical Spontaneous Activity

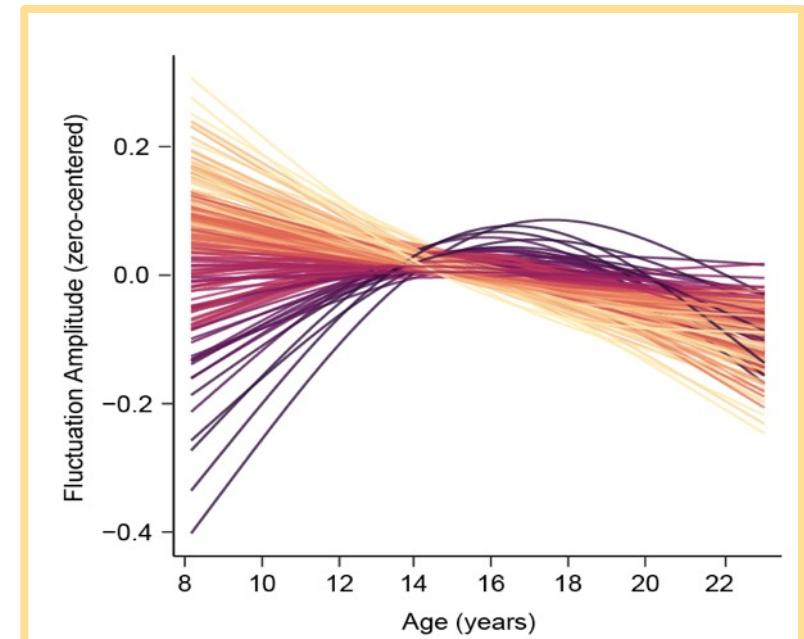


Lower factor scores,
lower fluctuation amplitude

more mature cortex
a reduced potential for plasticity
accelerated development

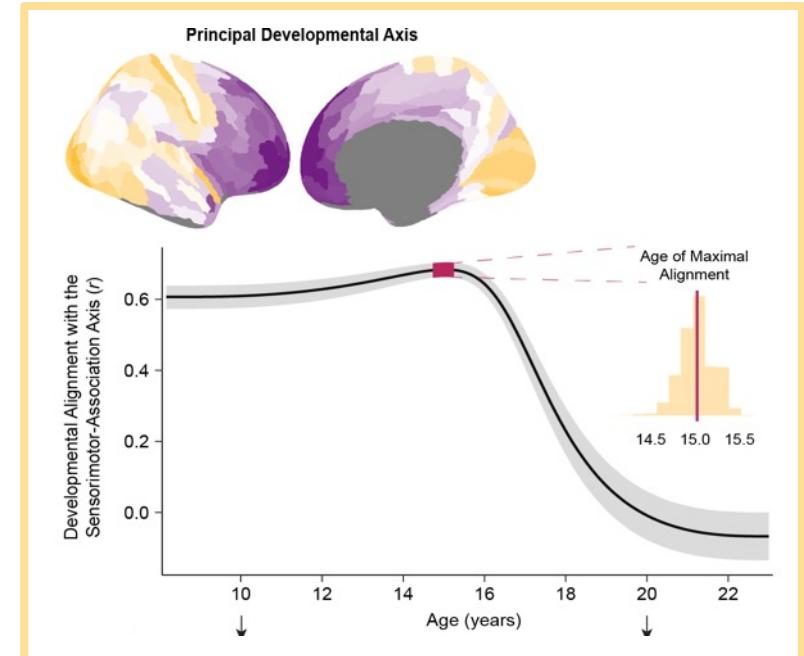
Study Conclusions

- A non-invasive functional marker of activity-indexed plasticity heterochronously declines across the cortex during childhood and adolescence



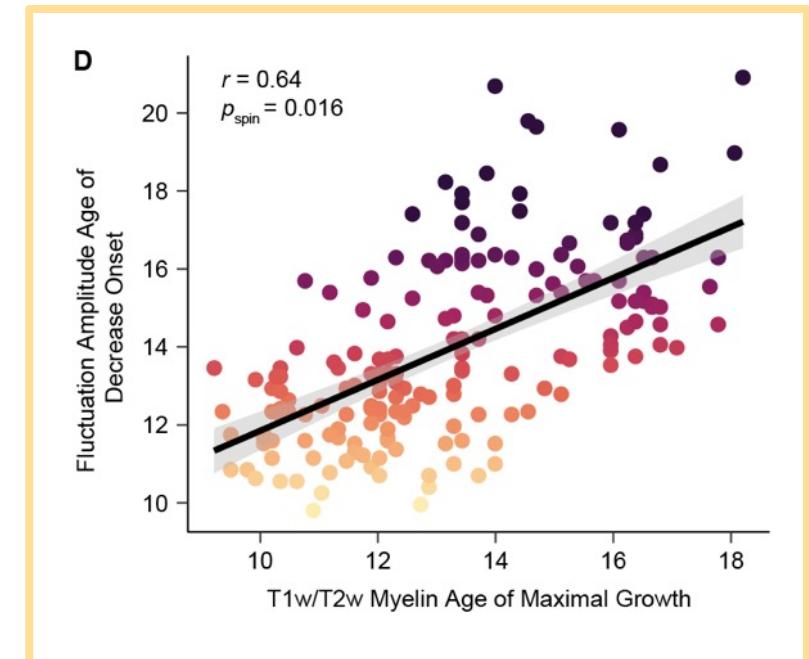
Study Conclusions

- A non-invasive functional marker of activity-indexed plasticity heterochronously declines across the cortex during childhood and adolescence
- Variance in developmental trajectories can be parsimoniously explained by the S-A axis until the end of adolescence



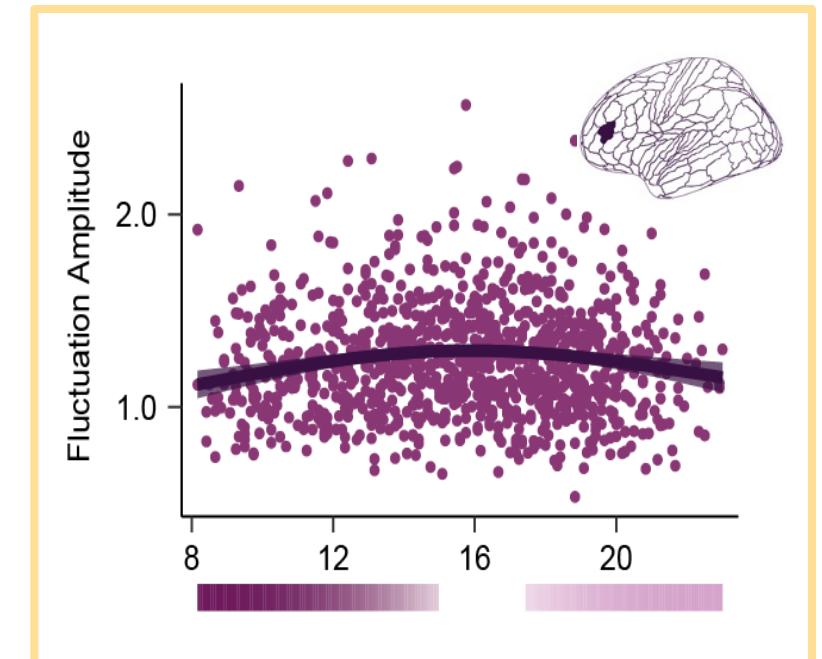
Study Conclusions

- A non-invasive functional marker of activity-indexed plasticity heterochronously declines across the cortex during childhood and adolescence
- Variance in developmental trajectories is parsimoniously explained by the S-A axis
- Reductions in plasticity are patterned hierarchically across the cortex



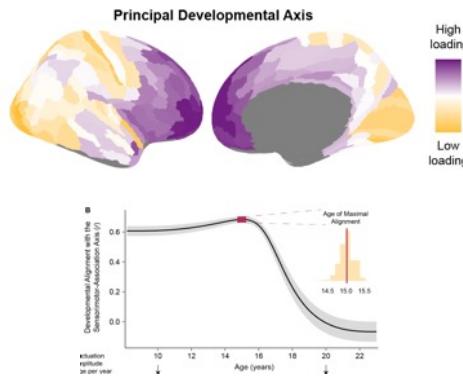
Study Conclusions

- A non-invasive functional marker of activity-indexed plasticity heterochronously declines across the cortex during childhood and adolescence
- Variance in developmental trajectories is parsimoniously explained by the S-A axis
- Reductions in plasticity are patterned hierarchically across the cortex
- Adolescence may be a sensitive period for development of transmodal association cortex



Future Directions

PATTERNS

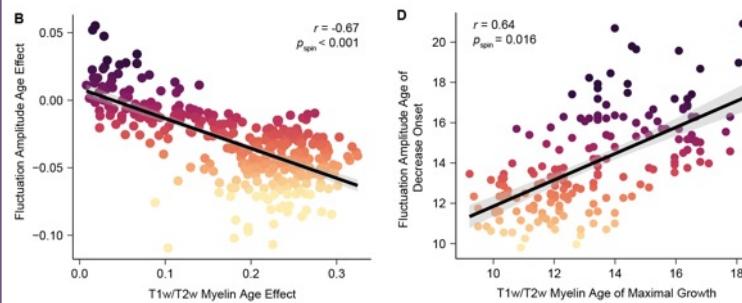


Developmental axes from infancy to adulthood

Subcortical developmental hierarchy

Alignment to gradients of patterning molecules and circadian genes

PLASTICITY

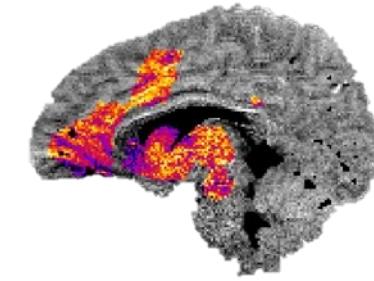


Neuroimaging of plasticity mechanisms

Sensitive periods (mechanisms and experiences)

Effect of interventions on plasticity-associated features

PSYCHO-PATHOLOGY



Studying psychiatric symptoms for a developmental plasticity perspective

Associations between developmental timing, psychiatric symptoms, and environment/experience