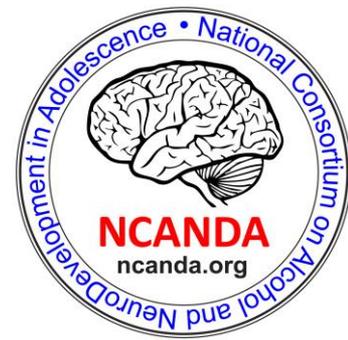


Research Society on Alcoholism
Denver, CO
26 June 2017



Harmonization of Multimodal Neuroimaging to Examine Age, Sex, and Alcohol-Related Changes in Brain Structure Through Adolescence and Young Adulthood

**Adolf Pfefferbaum, Bonnie J. Nagel, Eva M. Müller-Oehring,
Edith V. Sullivan, Kilian M. Pohl**

Center for Health Sciences, SRI International
Department of Psychiatry & Behavioral Sciences, Stanford University
School of Medicine



Supported by NIH/NIAAA



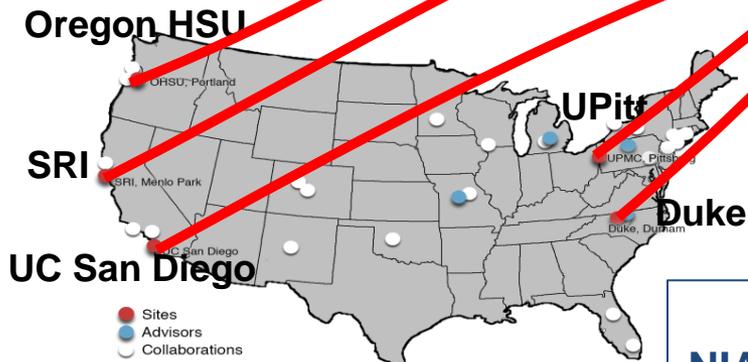
Extending Analysis of Imaging Data

Subcortical Brain Iron

Cortical Myelin

Effects of Initiation of Drinking

5 U.S. Recruitment Sites



SRI+Stanford

Neuro

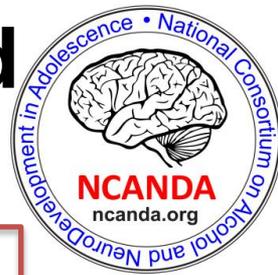
Informatics

Platform



FUNDING
NIAAA, NIDA, NIMH, NICHD

National Consortium on Alcohol and NeuroDevelopment in Adolescence

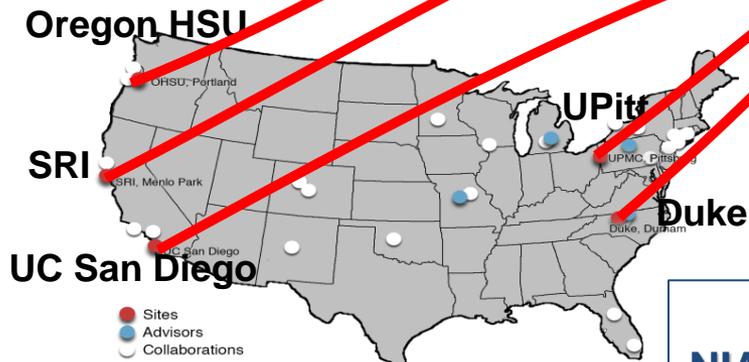


Prospective monitoring of brain development in 831 adolescents annually for 5 years to

- determine the effects of early, heavy alcohol use on brain structure and function before drinking onset

- 647 no/low drinking
- 134 exceeded criteria
- Cohort sequential design
age 12-14, 15-17, 18-21 years

5 U.S. Recruitment Sites



SRI+Stanford

Neuro

Informatics

Platform



FUNDING
NIAAA, NIDA, NIMH, NICHD

Extending Analysis of Imaging Data

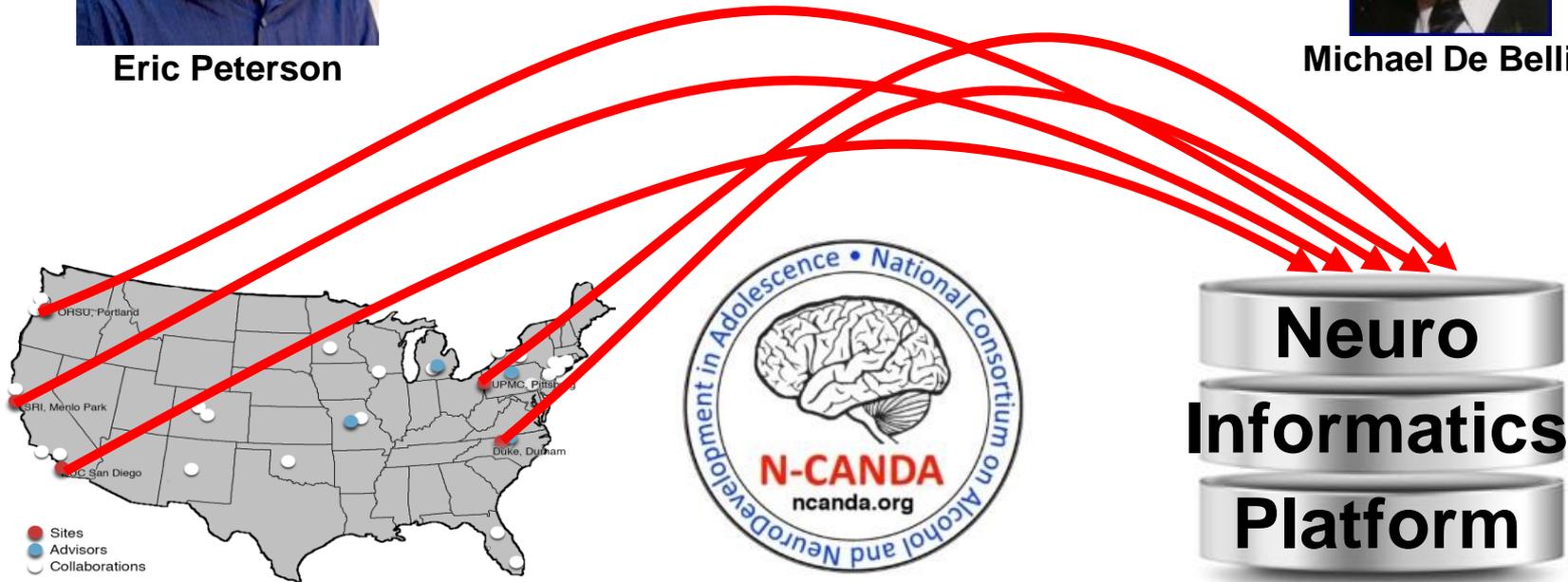
Subcortical Brain Iron



Eric Peterson



Michael De Bellis



$$R2 / R2 * Estimate = \frac{Mean\ Posterior\ Corpus\ Callosum\ Signal\ Intensity}{Voxel\ Signal\ Intensity}$$

Iron in the Brain

- **Non-heme iron in the brain**
 - primary iron deposition not from bleeding
 - necessary for dopamine transmitter function

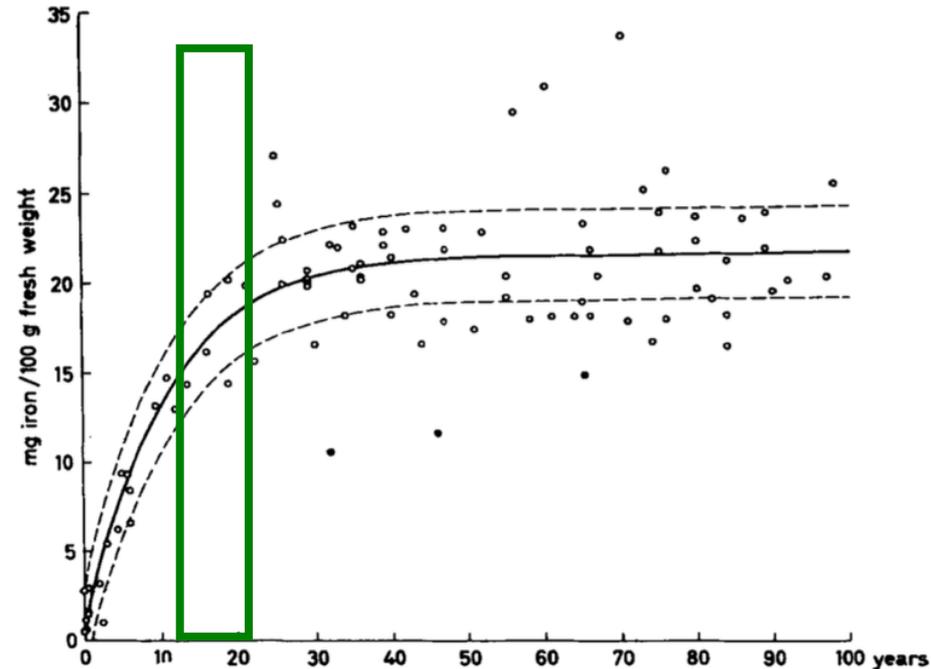


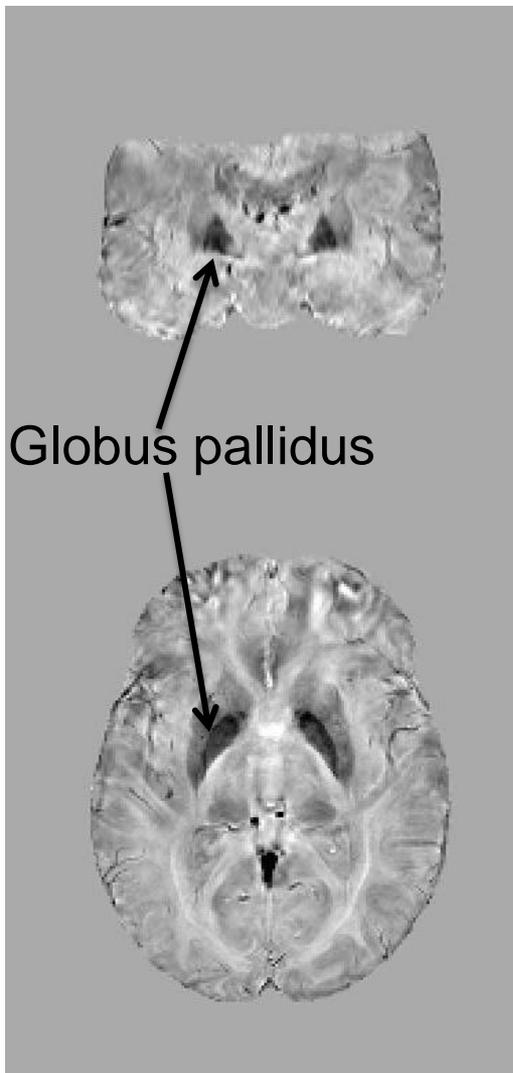
FIG. 2. Non-haemin iron in the globus pallidus at different ages. The filled circles represent cases with large intestinal haemorrhages. The calculated regression lines have been drawn in Figs. 2-6. The dotted lines denote the s.e. of estimate; for globus pallidus s.e. = ± 3.07 .

Hallgren and Sourander, Journal of Neurochemistry, 1958

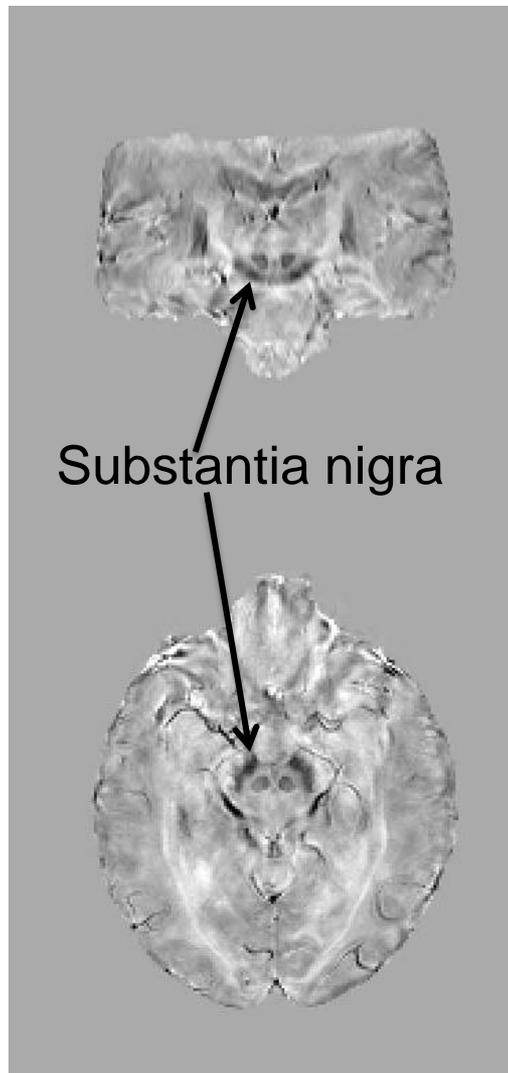
Susceptibility Weighted Imaging (SWI) (T2* Weighted)



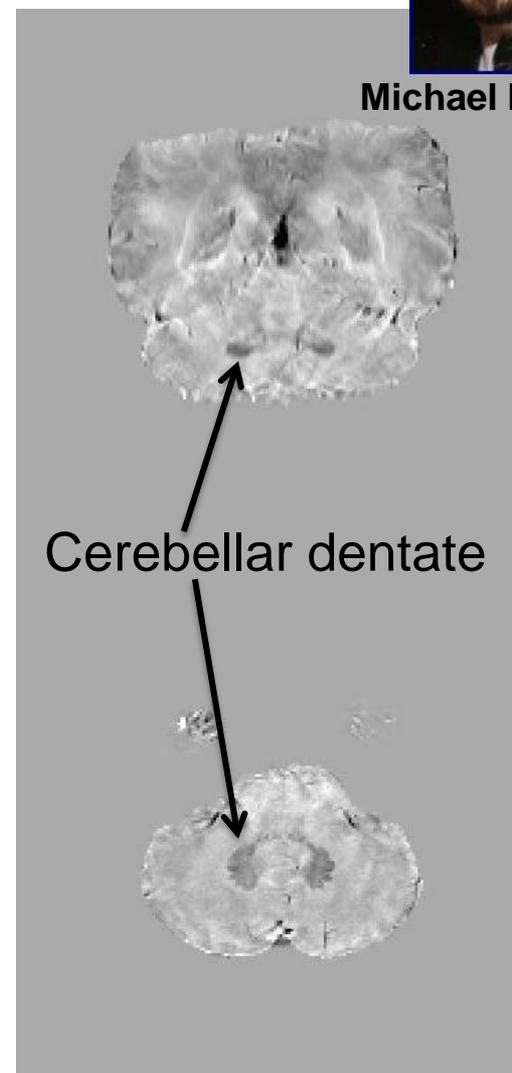
Michael De Bellis



Globus pallidus



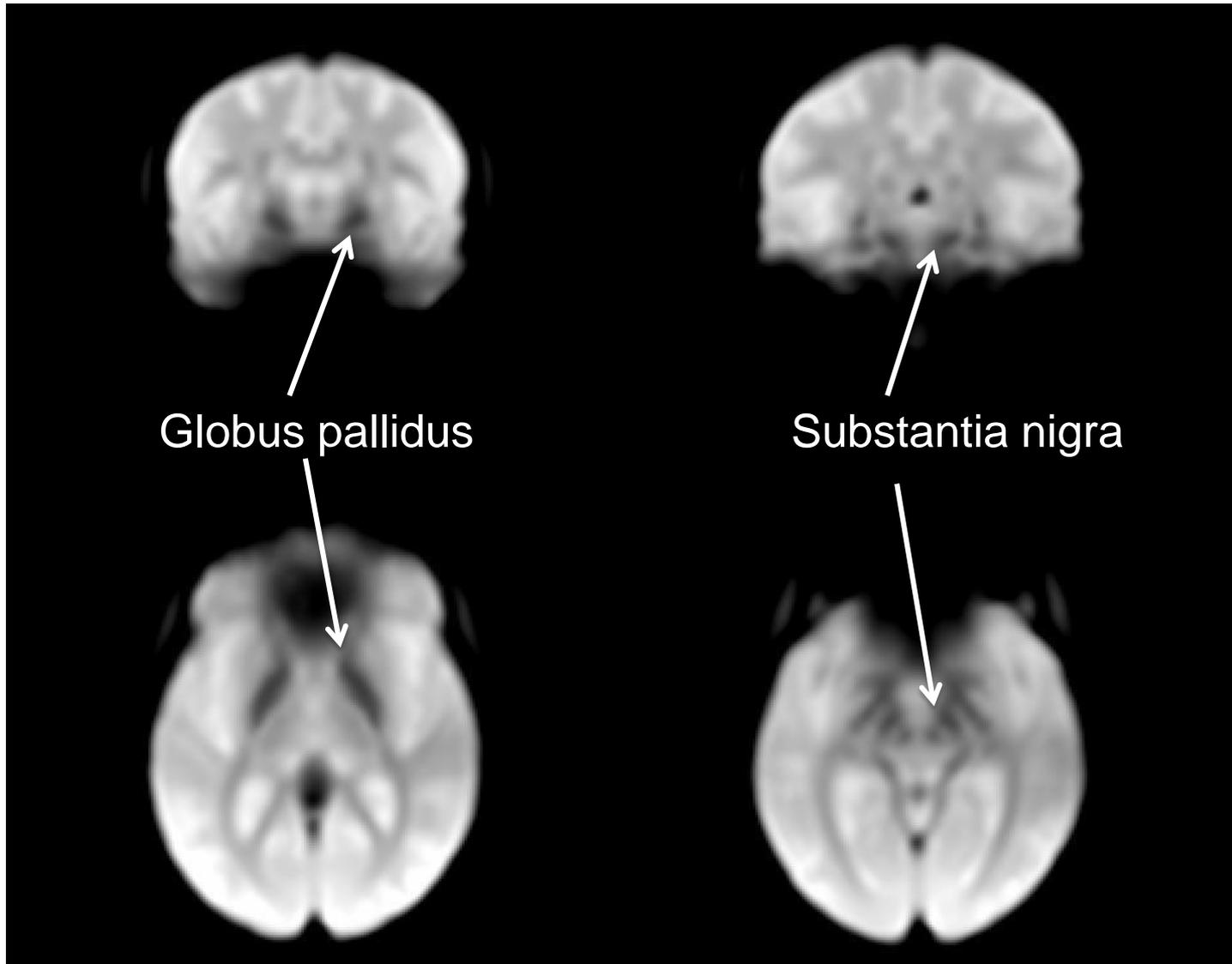
Substantia nigra



Cerebellar dentate

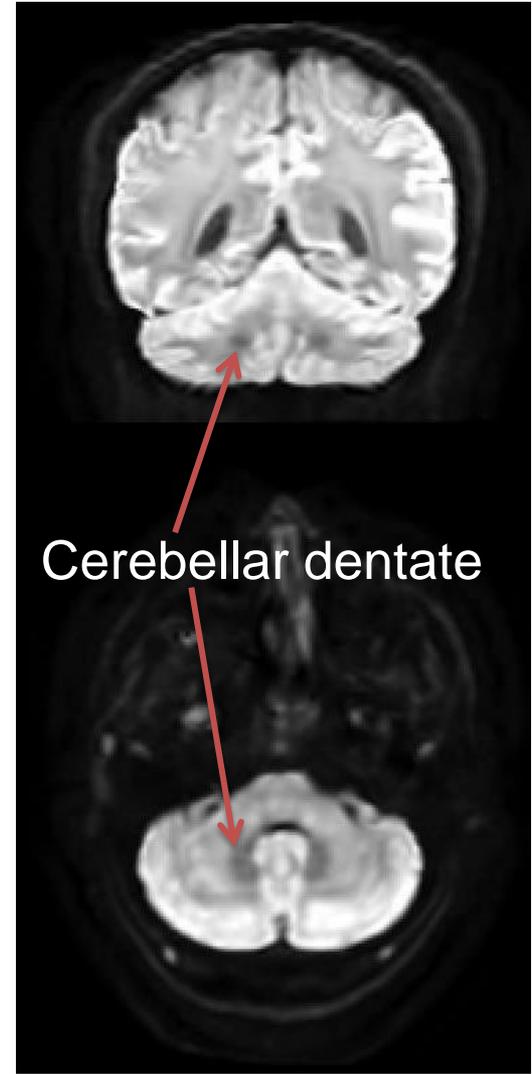
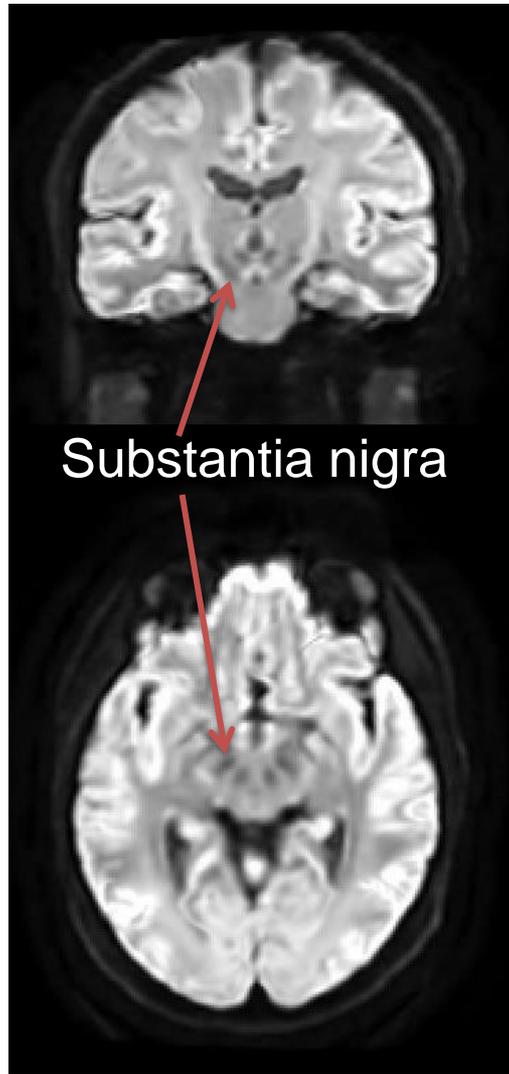
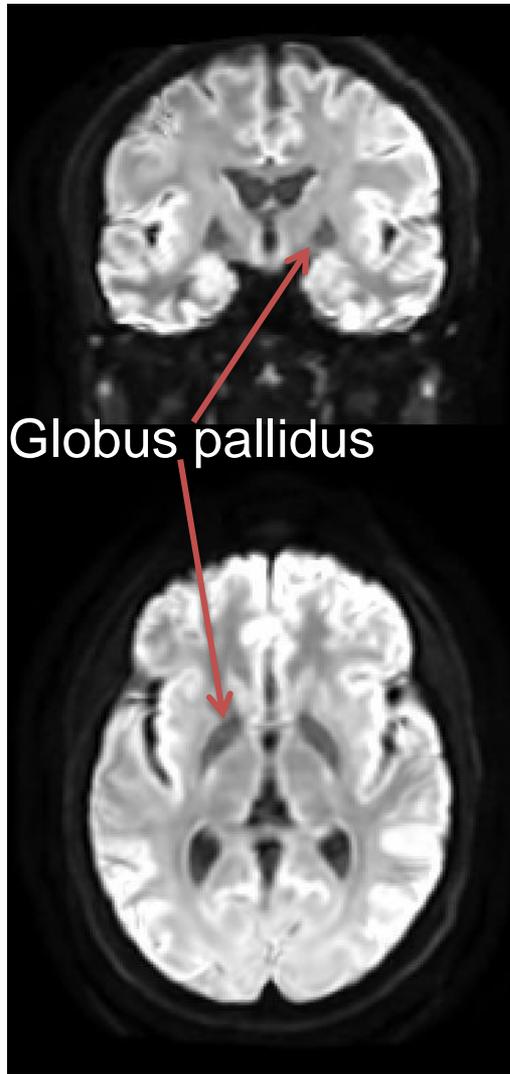
Measurement of protons is "susceptible" to the presence of iron causing signal loss.

Echo-planar Imaging (EPI) fMRI Sequence (T2* Weighted)



Measurement of protons is "susceptible" to the presence of iron causing signal loss.

Spin-echo Diffusion Tensor Imaging (DTI) (T2 Weighted)



Measurement of protons is "susceptible" to the presence of iron causing signal loss.

Estimating Non-heme Iron Concentration from Standard NCANDA Protocols

Non-heme iron →

susceptibility (T2*) signal loss

transverse relaxivity (T2) signal loss

Iron effect

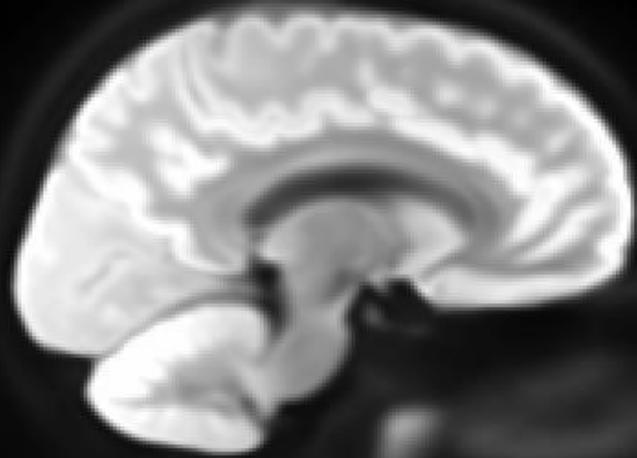
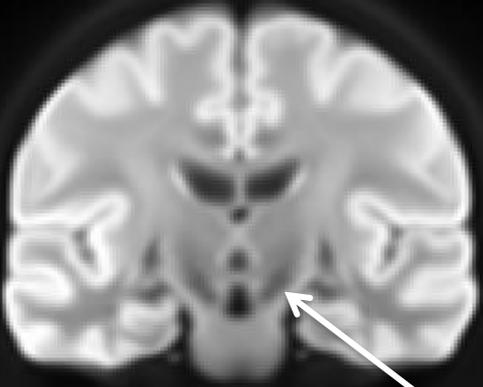
greater T2 and T2* weighting → greater iron effect

less T1 weighting → greater iron effect

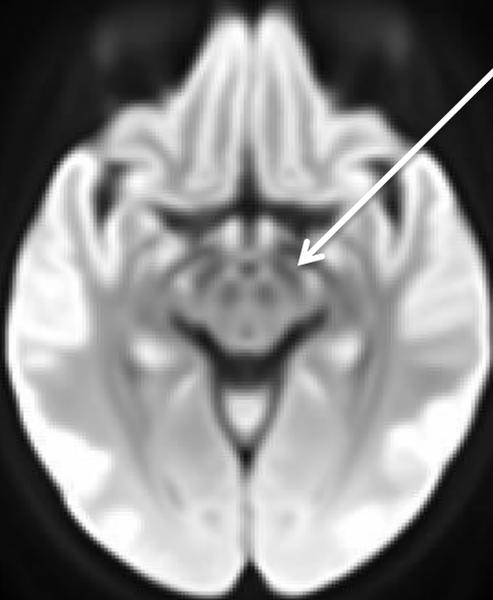
T2* > T2

DTI sequence has higher spatial resolution and less B0 spatial distortion

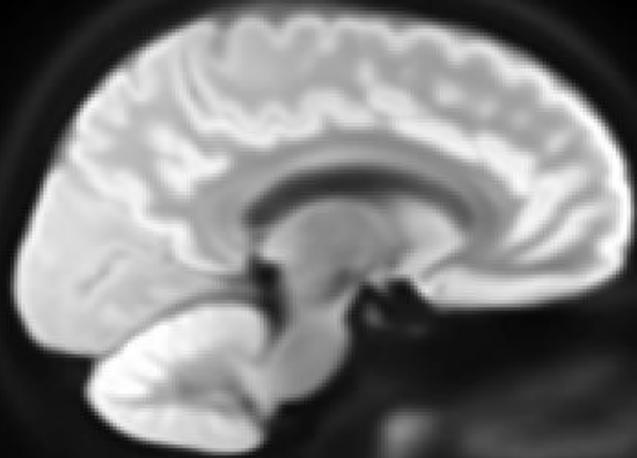
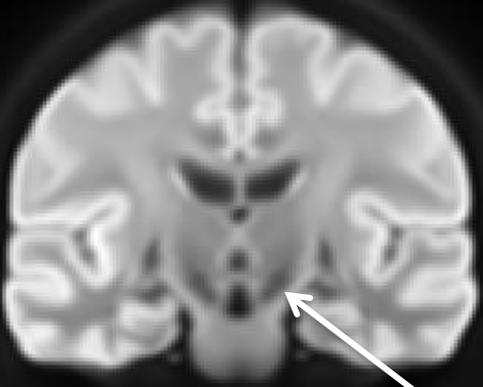
$$R2 / R2^* \text{ Estimate} = \frac{\text{Mean Posterior Corpus Callosum Signal Intensity}}{\text{Voxel Signal Intensity}}$$



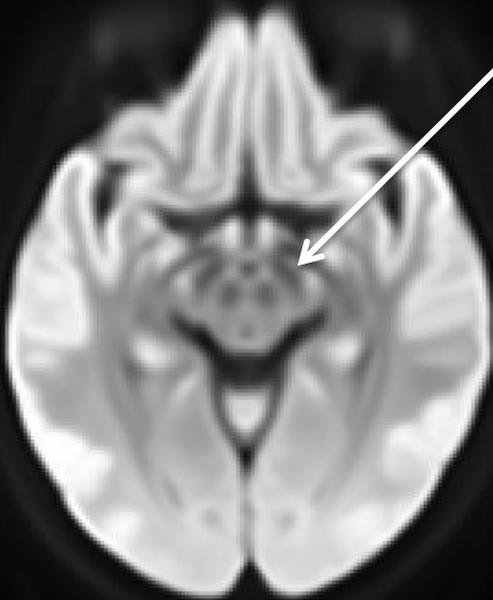
Substantia nigra



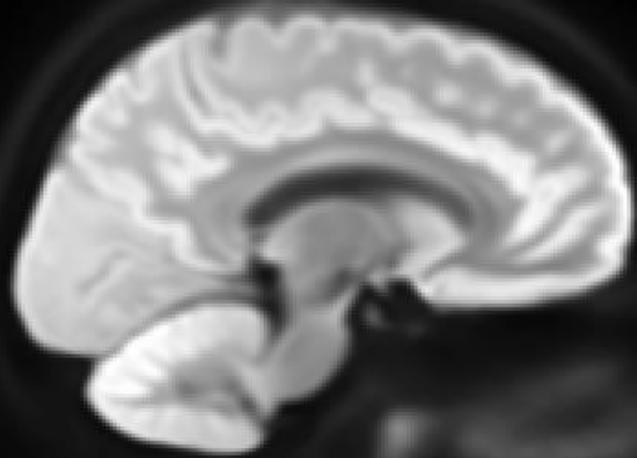
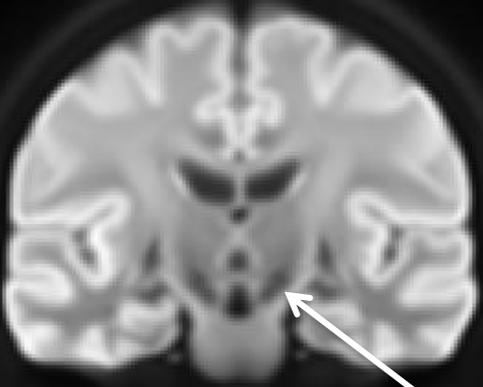
12-14 years old



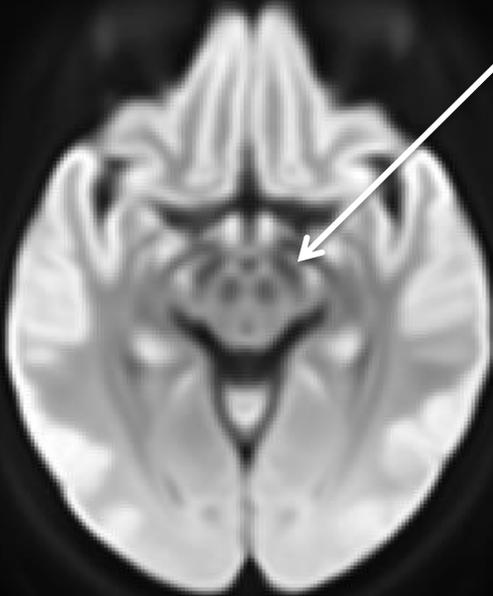
Substantia nigra



15-17 years old



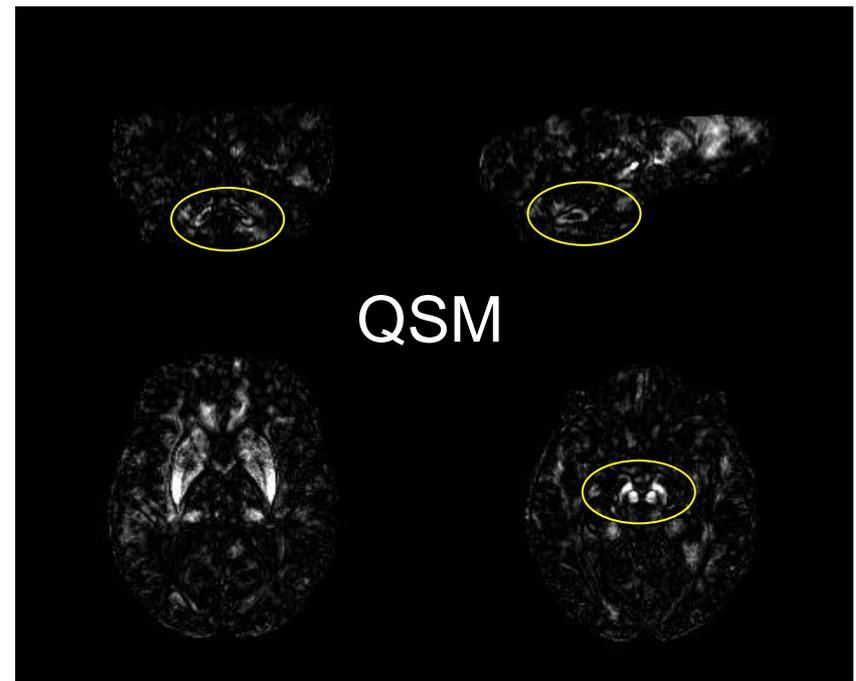
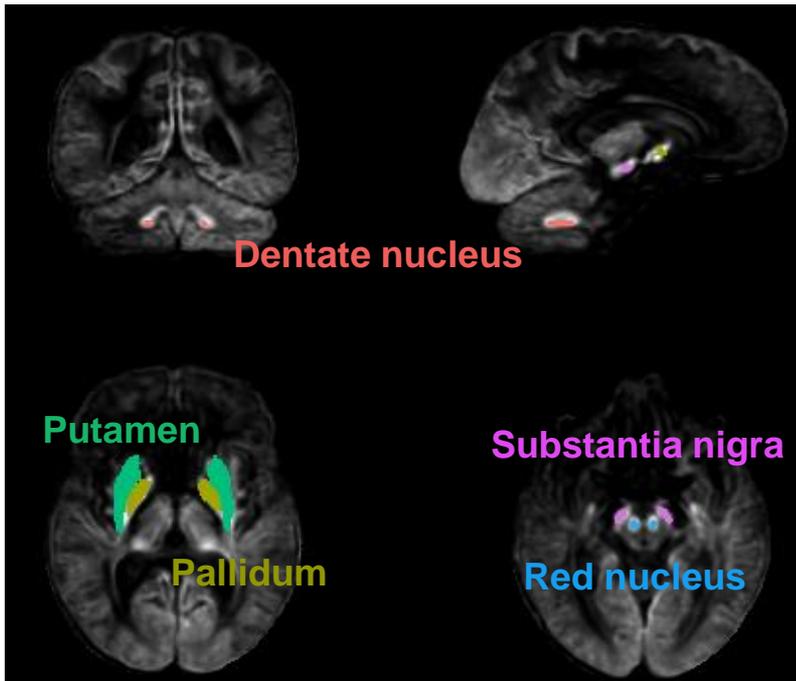
Substantia nigra



18-21 years old

Estimating Age-related Change in Non-heme Iron Concentration from Standard NCANDA Protocols

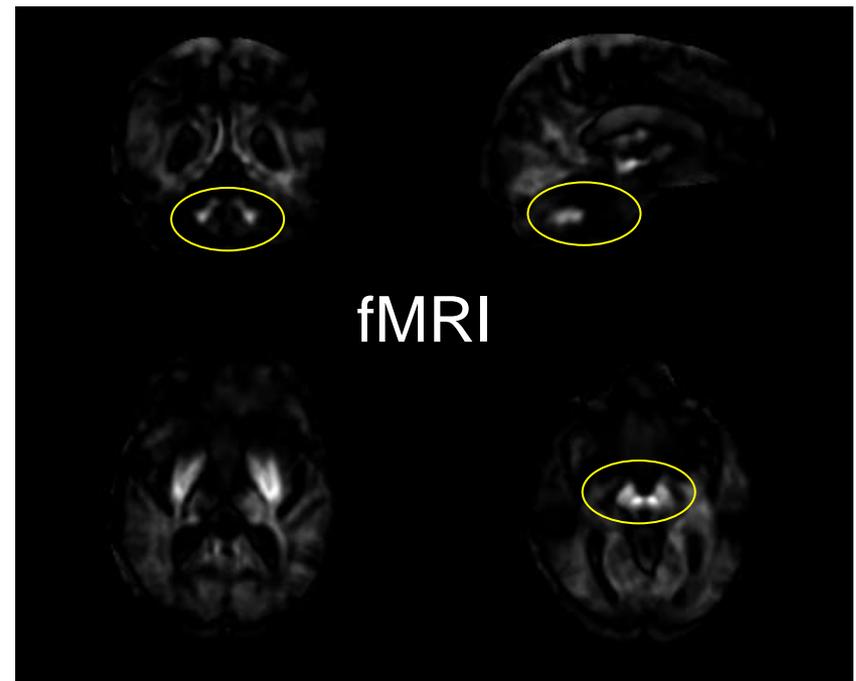
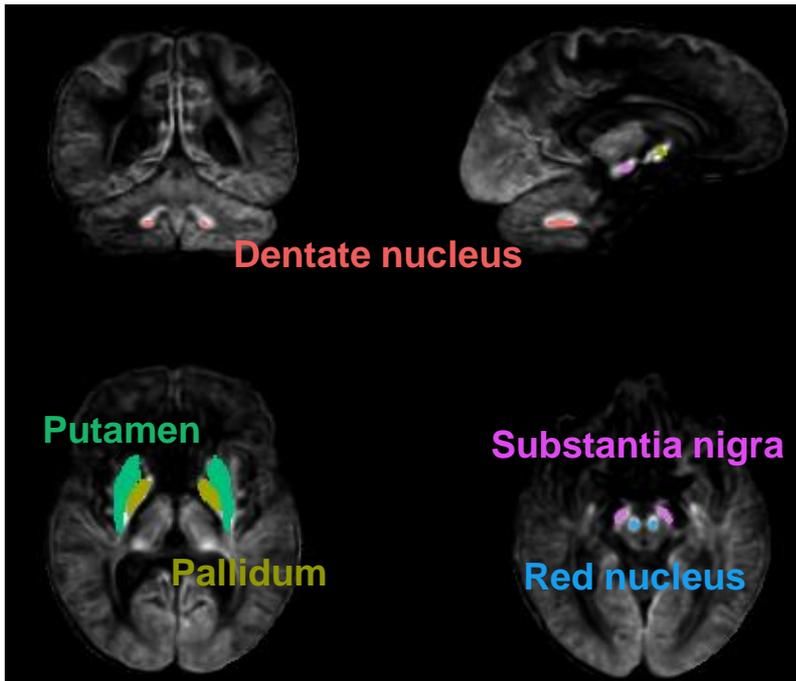
R-squared: Signal vs. Age



$$R2 / R2^* \text{ Estimate} = \frac{\text{Mean Posterior Corpus Callosum Signal Intensity}}{\text{Voxel Signal Intensity}}$$

Estimating Age-related Change in Non-heme Iron Concentration from Standard NCANDA Protocols

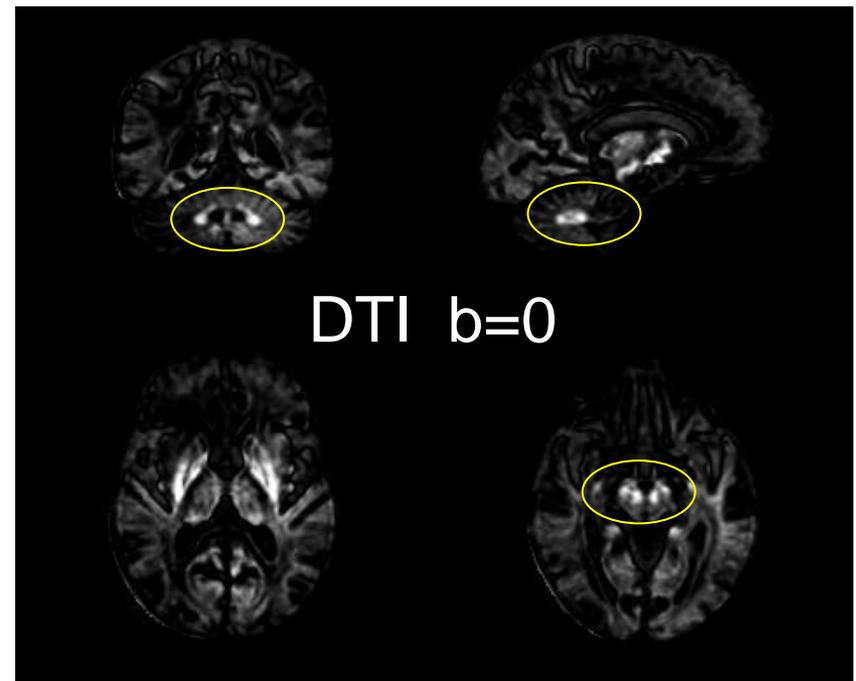
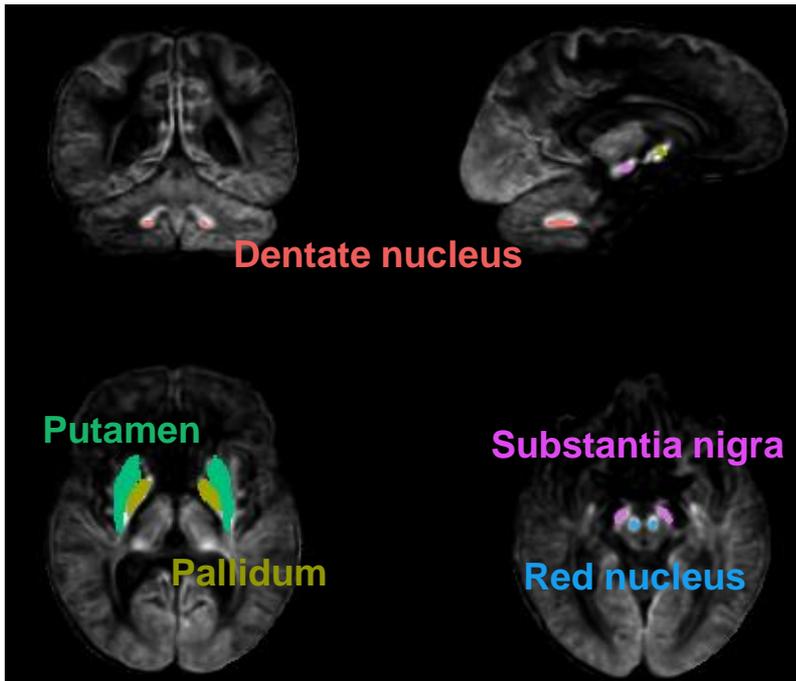
R-squared: Signal vs. Age



$$R2 / R2^* \text{ Estimate} = \frac{\text{Mean Posterior Corpus Callosum Signal Intensity}}{\text{Voxel Signal Intensity}}$$

Estimating Age-related Change in Non-heme Iron Concentration from Standard NCANDA Protocols

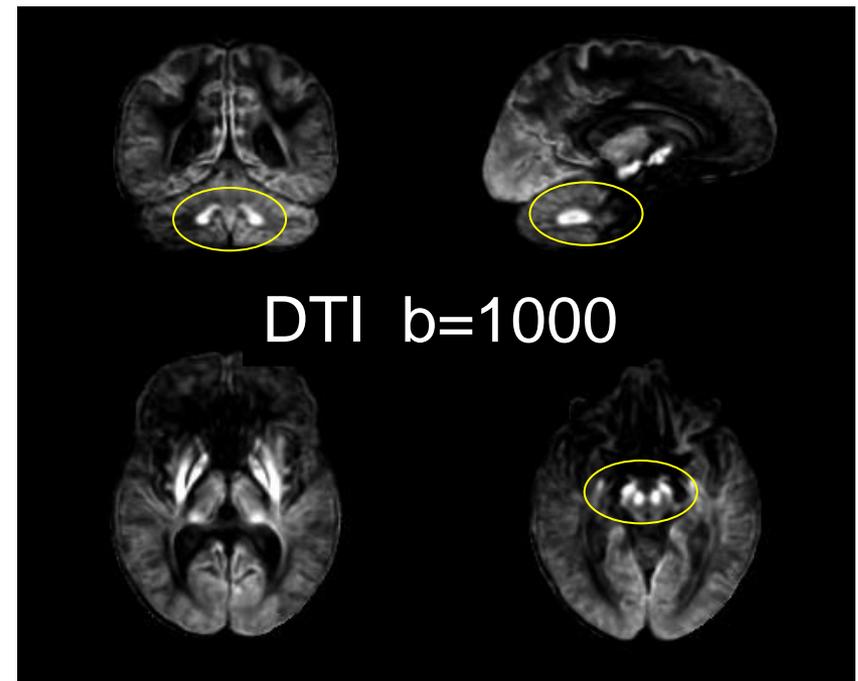
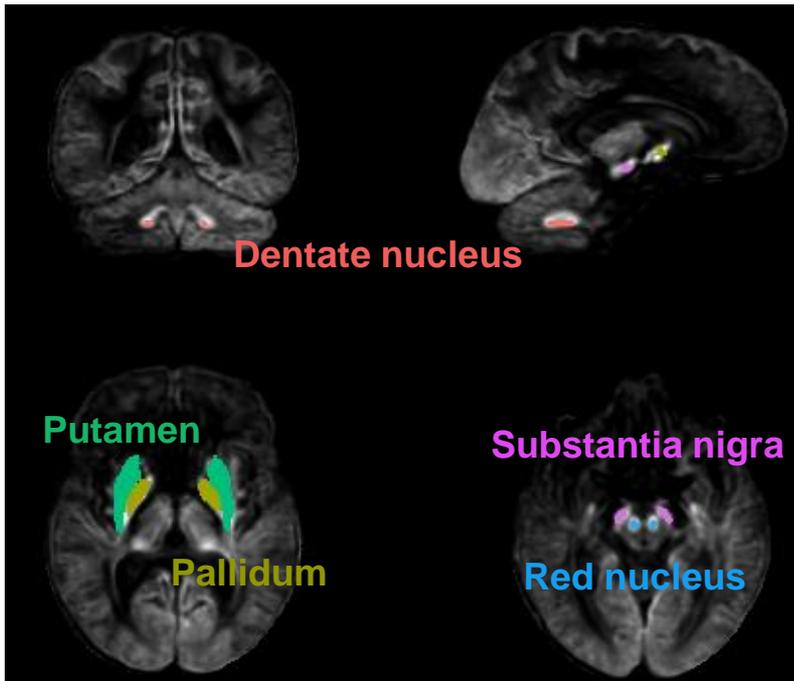
R-squared: Signal vs. Age



$$R2 / R2^* \text{ Estimate} = \frac{\text{Mean Posterior Corpus Callosum Signal Intensity}}{\text{Voxel Signal Intensity}}$$

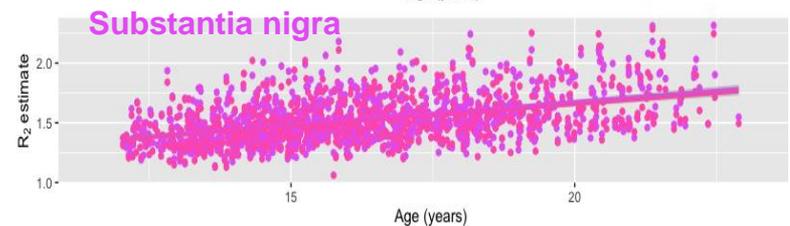
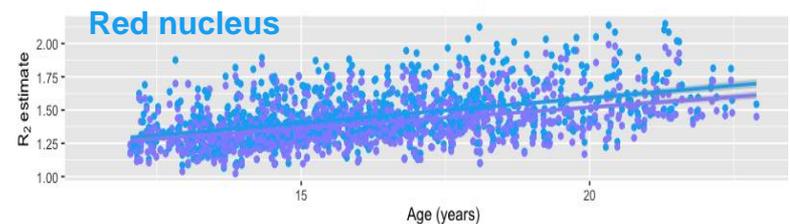
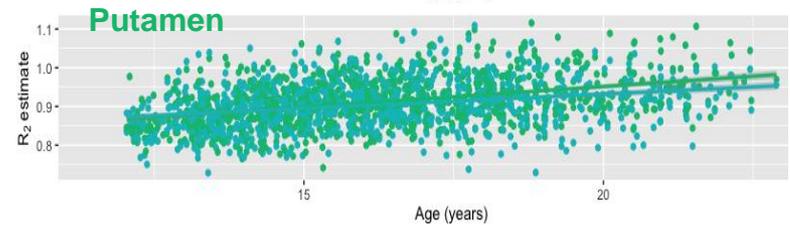
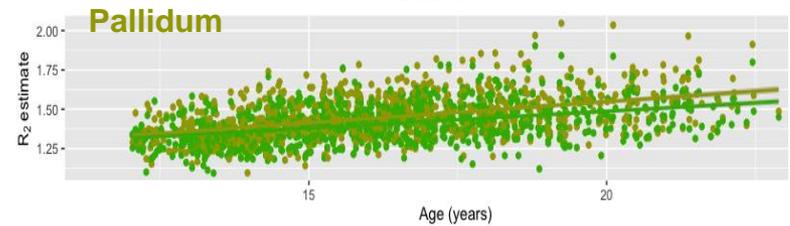
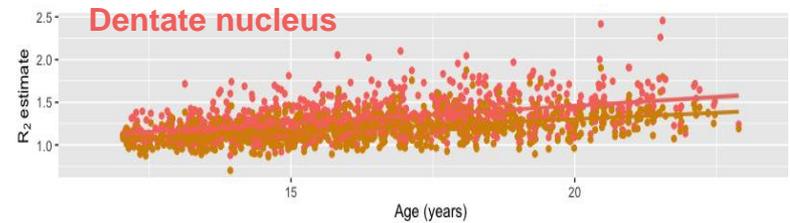
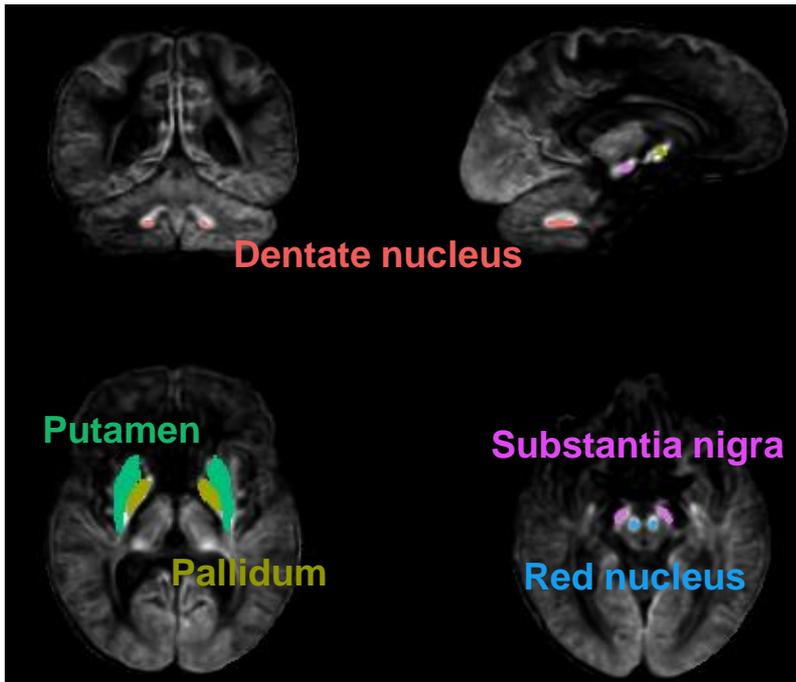
Estimating Age-related Change in Non-heme Iron Concentration from Standard NCANDA Protocols

R-squared: Signal vs. Age

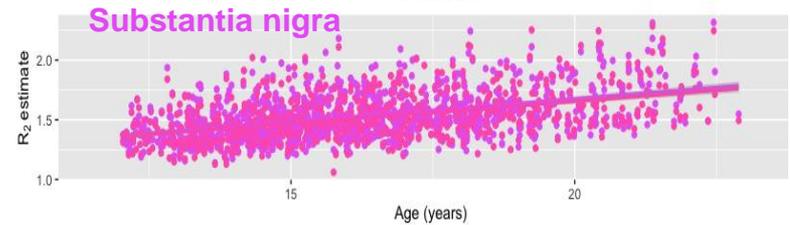
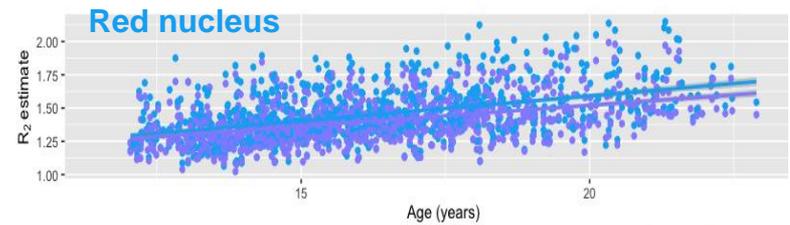
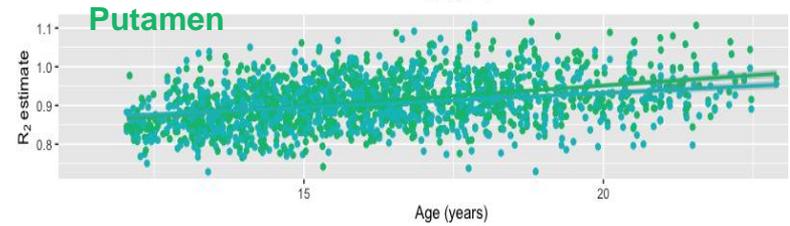
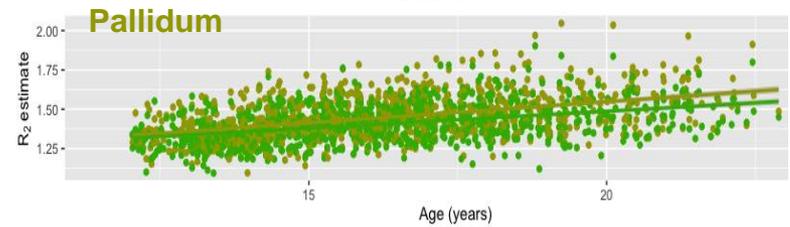
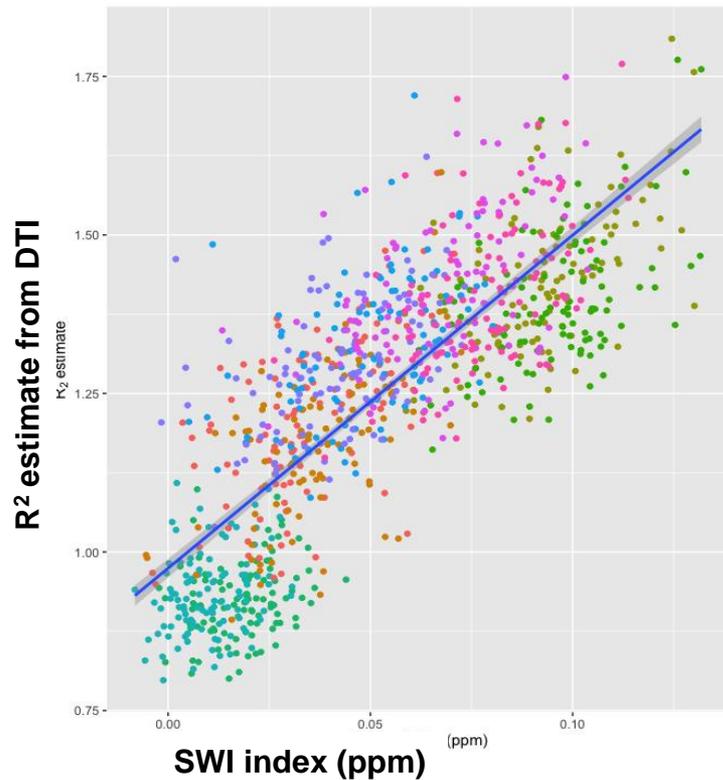


$$R2 / R2^* \text{ Estimate} = \frac{\text{Mean Posterior Corpus Callosum Signal Intensity}}{\text{Voxel Signal Intensity}}$$

Estimating Non-heme Iron Concentration from Standard NCANDA Protocols



Estimating Non-heme Iron Concentration from Standard NCANDA Protocols



Extending Analysis of Imaging Data

Subcortical Brain Iron



Eric Peterson



Michael De Bellis

It is possible to estimate iron deposition *using longitudinal and group DTI or fMRI data*

Results are more stable with diffusion-weighted DTI than fMRI

Data can be merged across GE and Siemens scanners

DTI iron estimates correlate well with *in-vivo* QSM susceptibility measures

Extending Analysis of Imaging Data

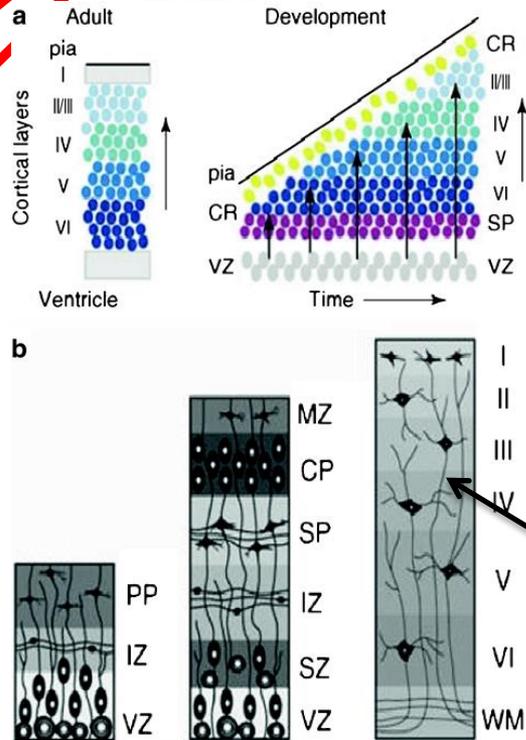
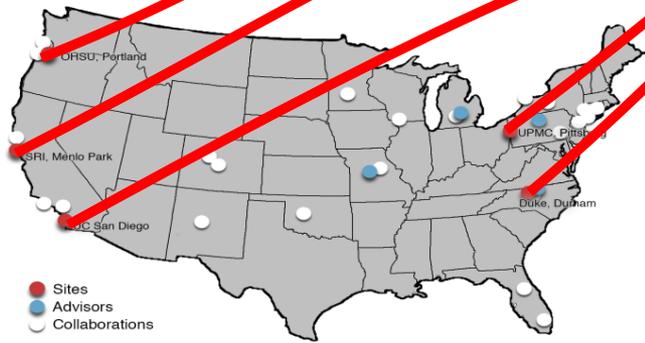
Cortical Myelin



Kilian Pohl



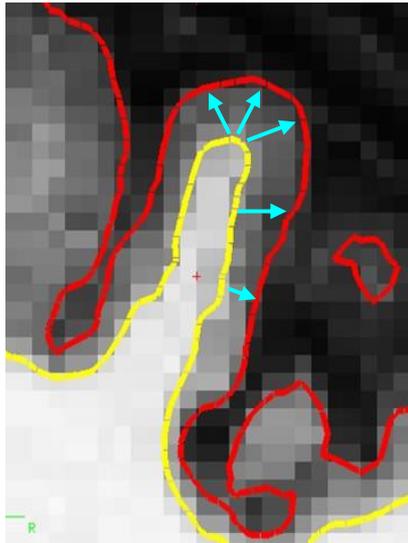
Dongjin Kwon



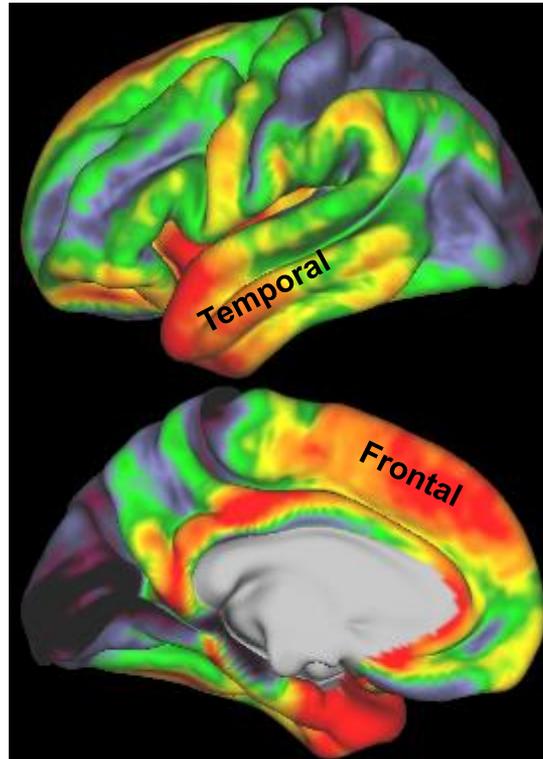
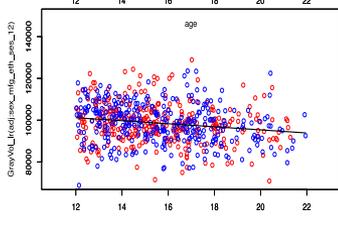
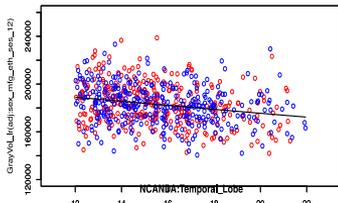
Myelinated Axons

Measuring Cortical Thickness in No/Low Adolescents at Baseline

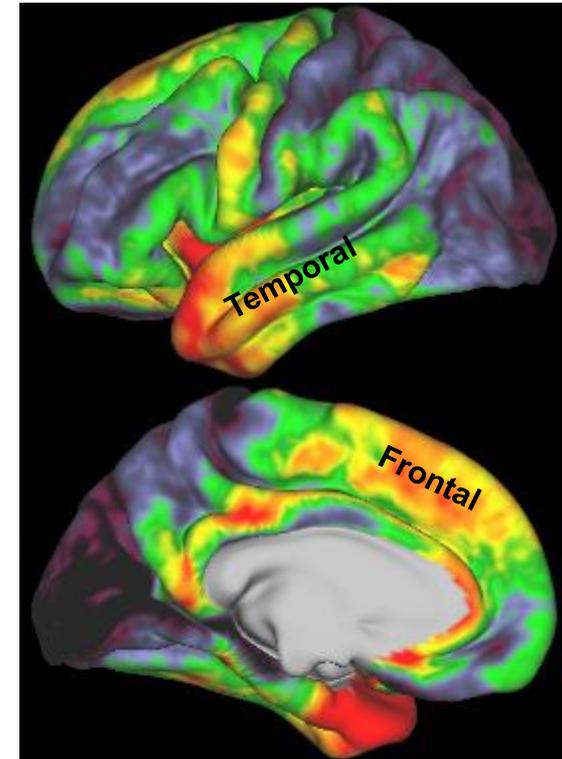
Cortical thickness



NCANDA-FrontalLobe



Average age 12.22



Average age 21.00

1.78 mm

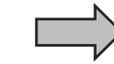
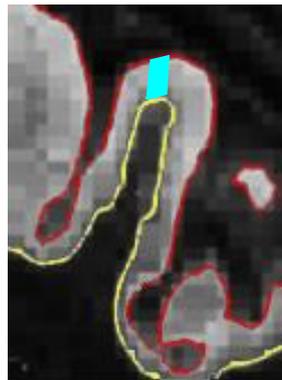
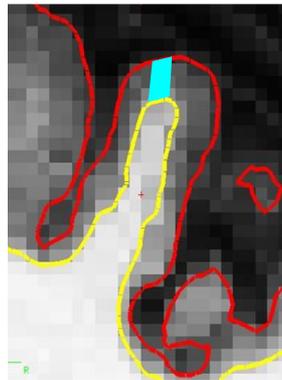
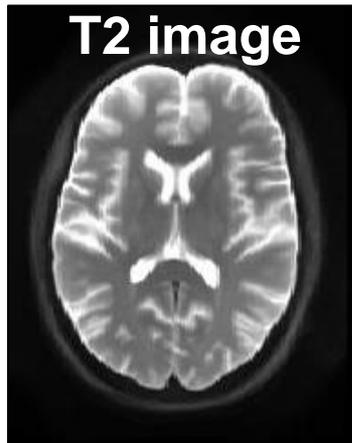
3.63 mm



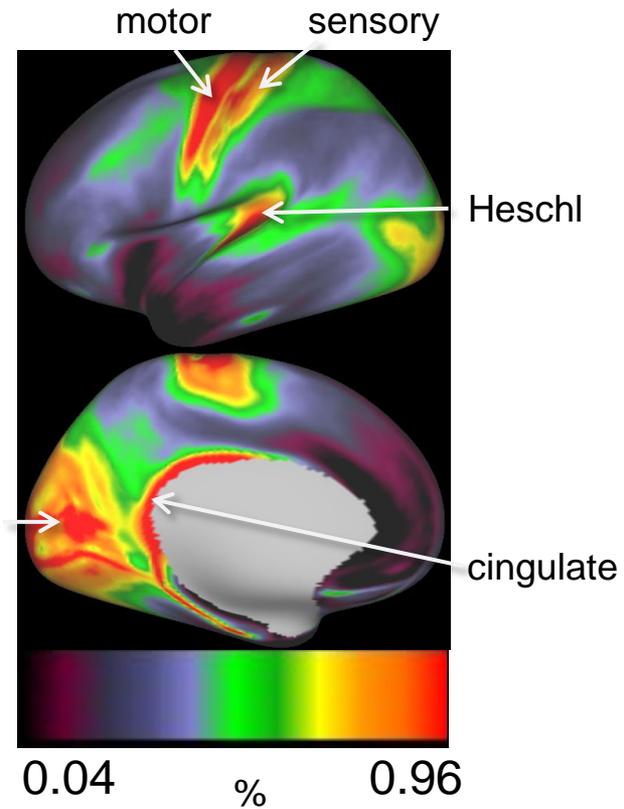
Computing Cortical Myelin from T1 and T2 MRI 226 adolescents



Register

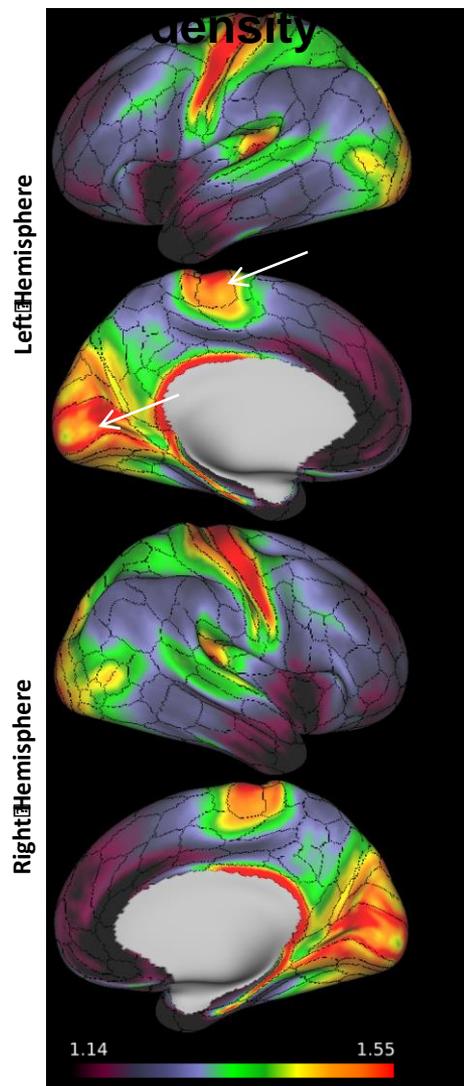


occipital



NCANDA

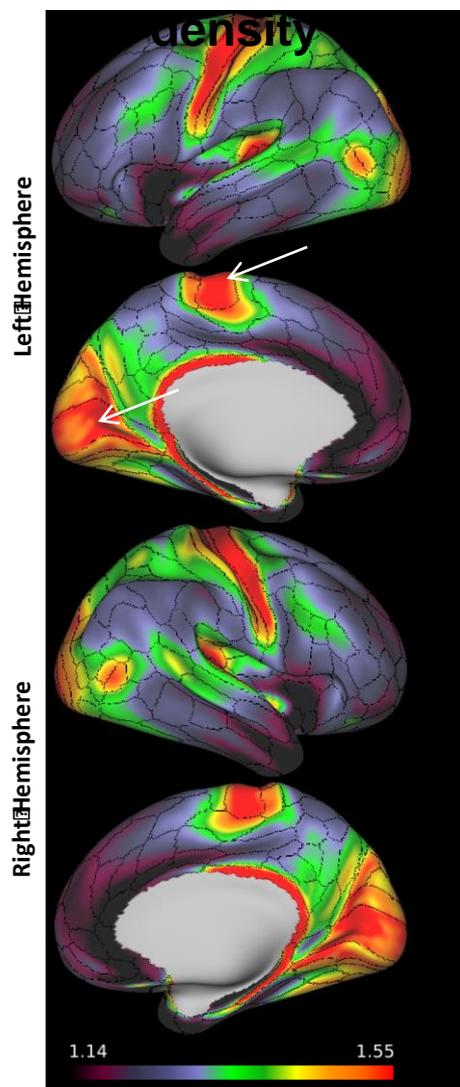
Myelin density



(a) Dense myelin

HCP

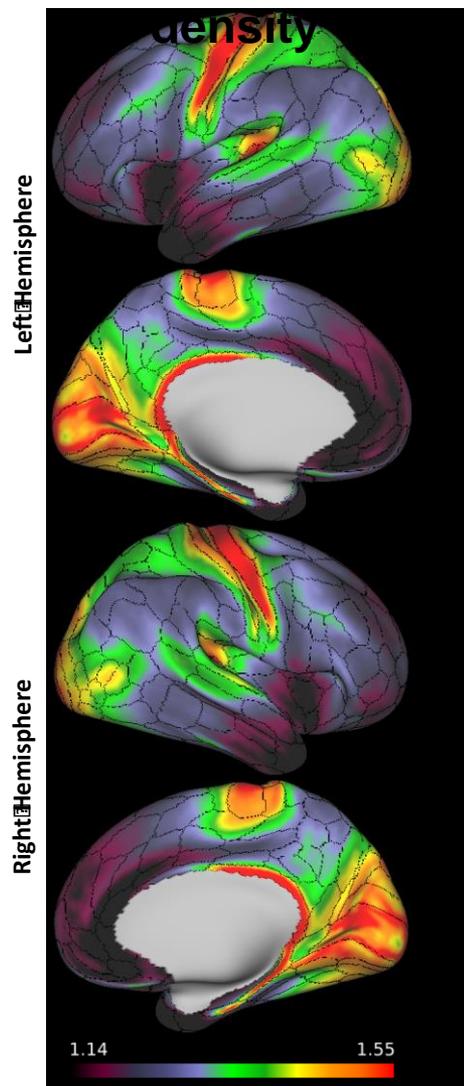
Myelin density



(a) Dense myelin

NCANDA

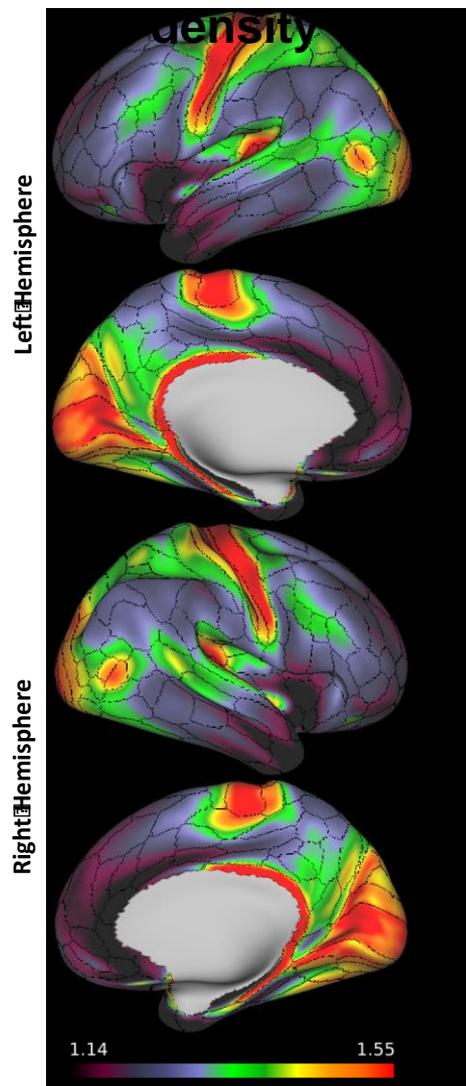
Myelin density



(a) Dense myelin

HCP

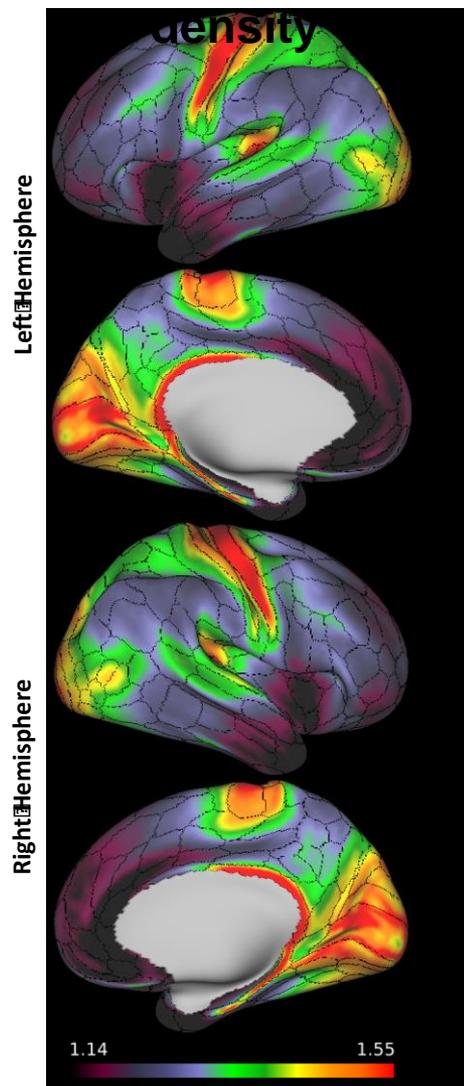
Myelin
density



(a) Dense myelin

NCANDA

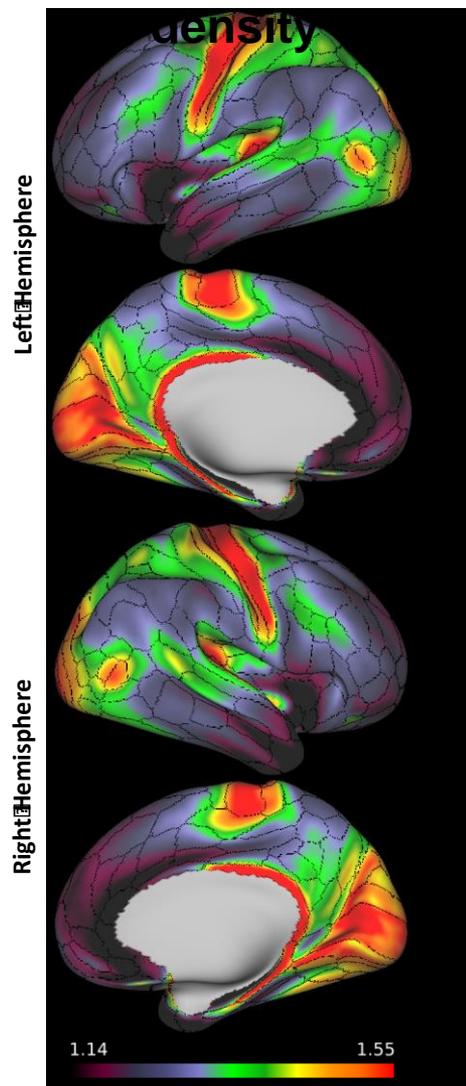
Myelin density



(a) Dense myelin

HCP

Myelin
density



(a) Dense myelin

Age-related Differences in Myelin Content

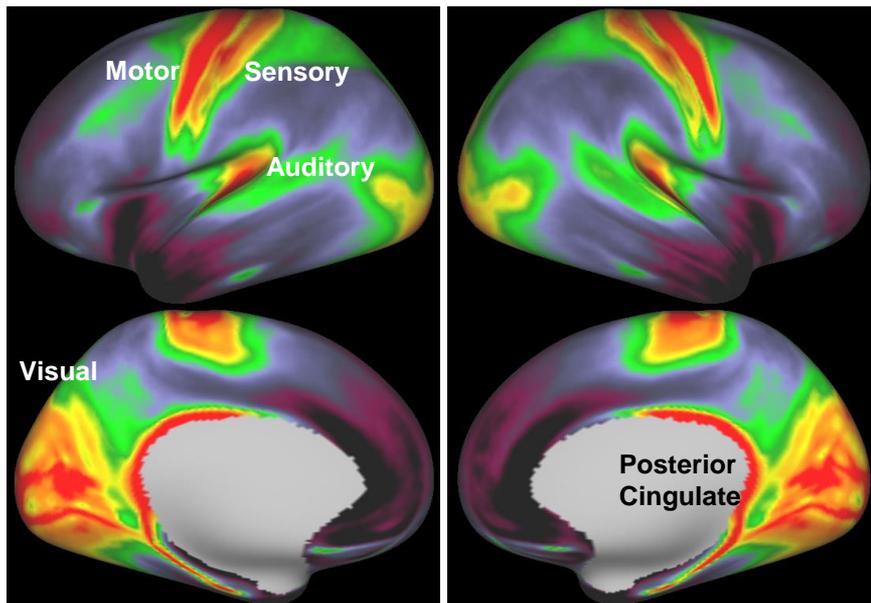


Kilian Pohl



Dongjin Kwon

Average Myelin Density

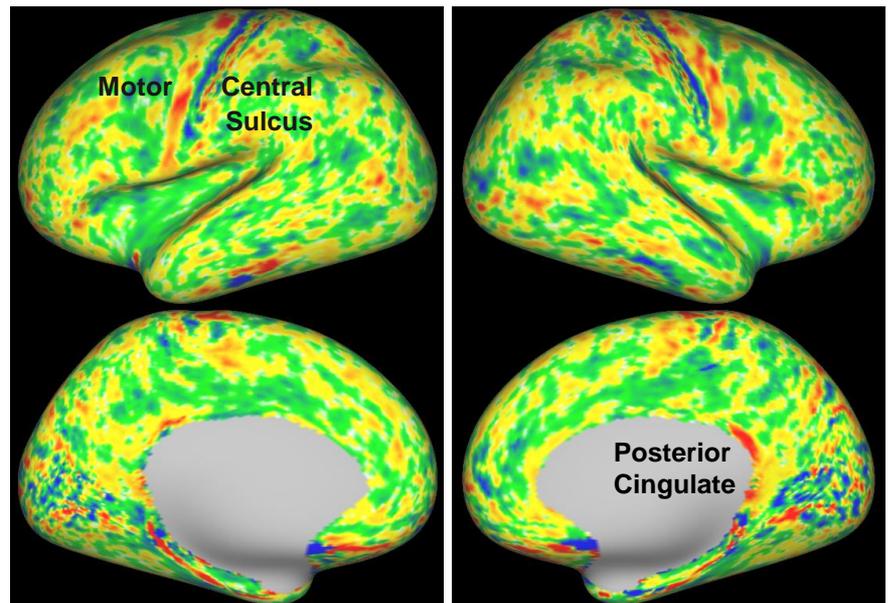


0.04

%

0.96

Difference Across Adolescence



-0.01

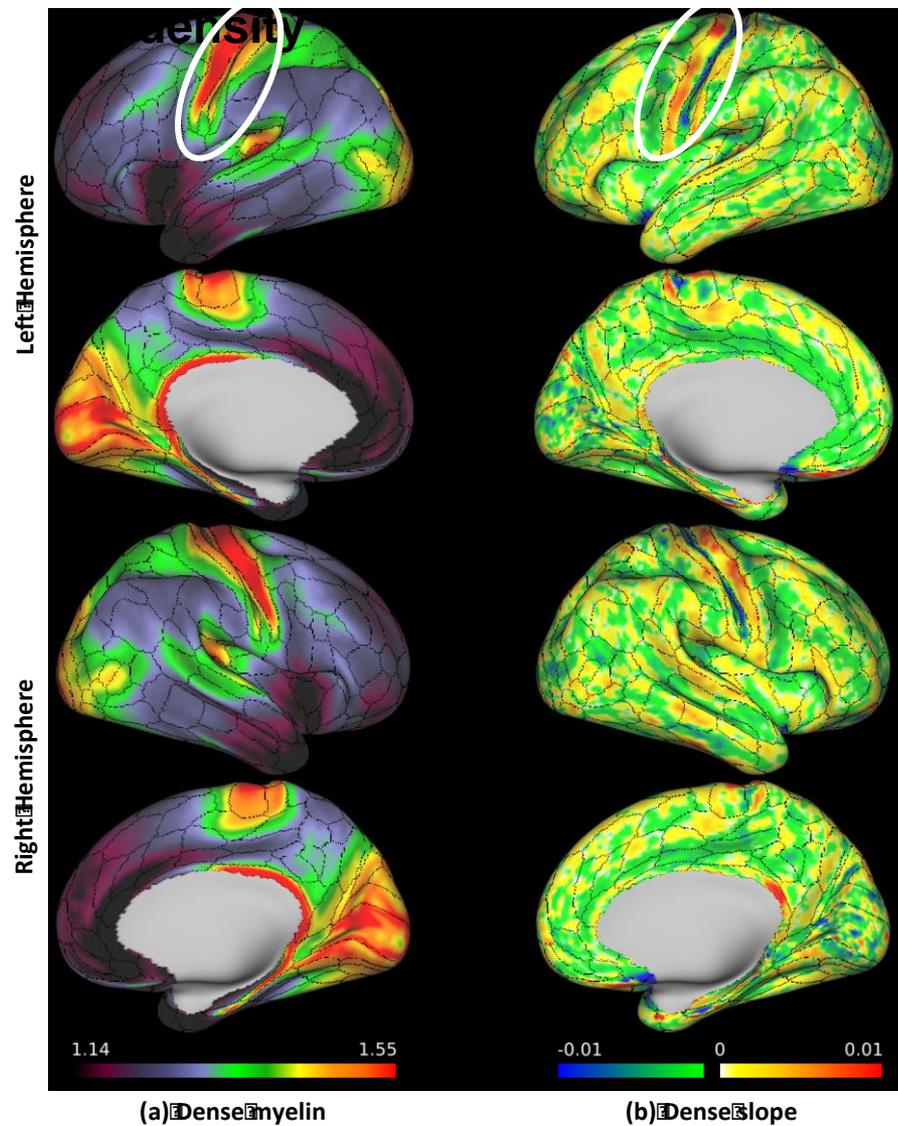
% / Age

0.01

NCANDA 12-21 years

Myelin

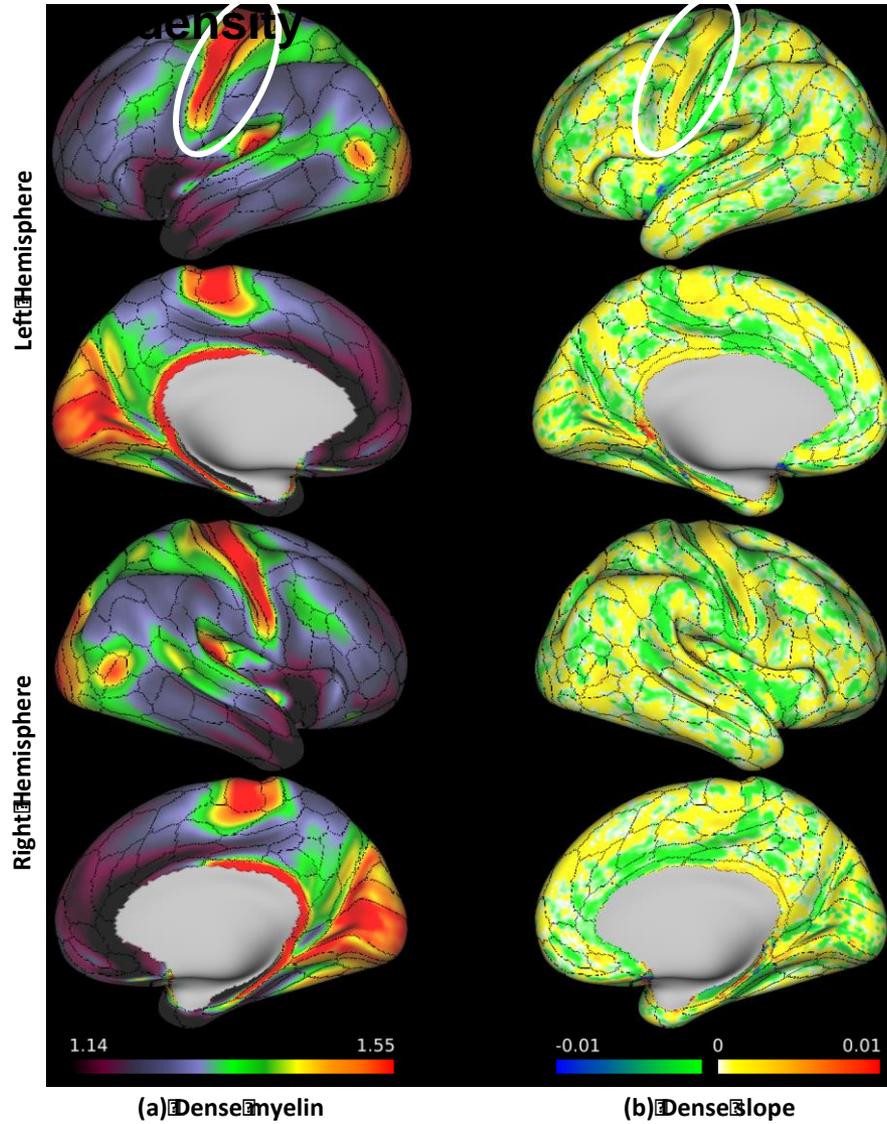
Difference across age



HCP 22-38 years

Myelin

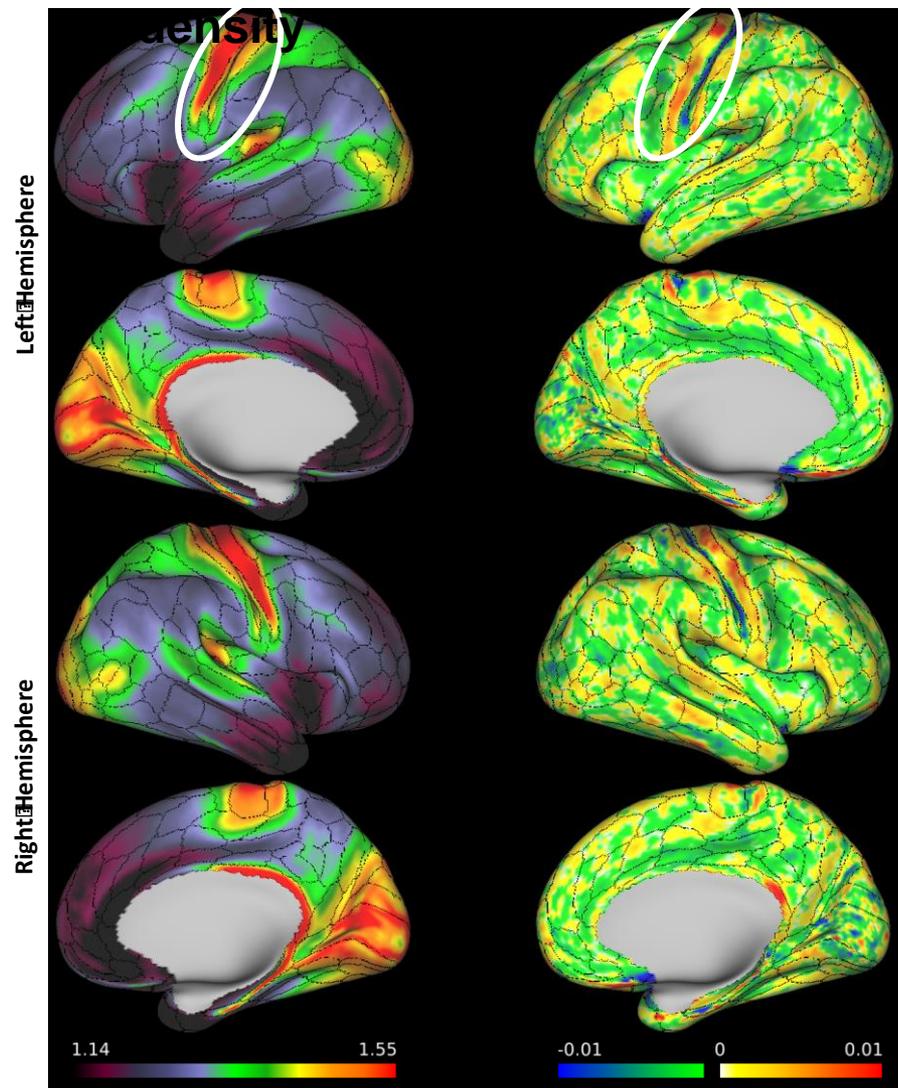
Difference across age



NCANDA 12-21 years

Myelin density

Difference across age



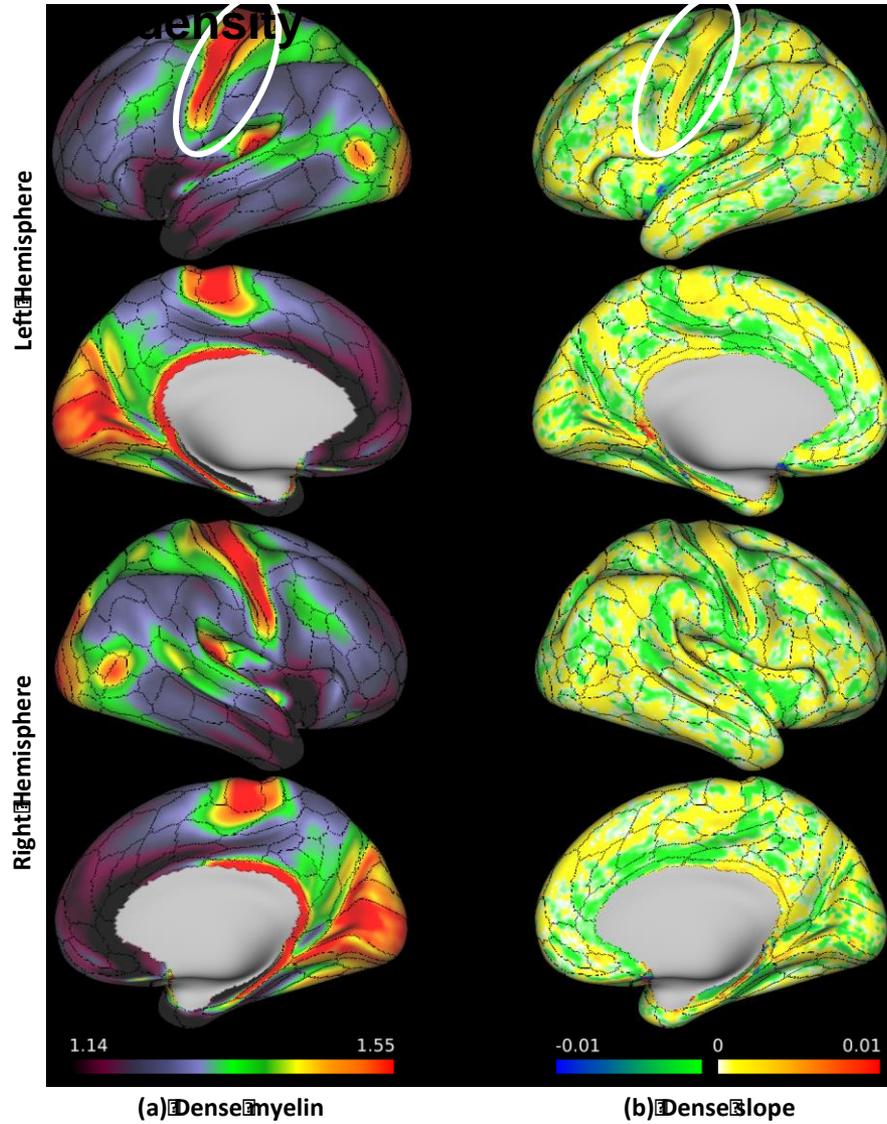
(a) Dense myelin

(b) Dense slope

HCP 22-38 years

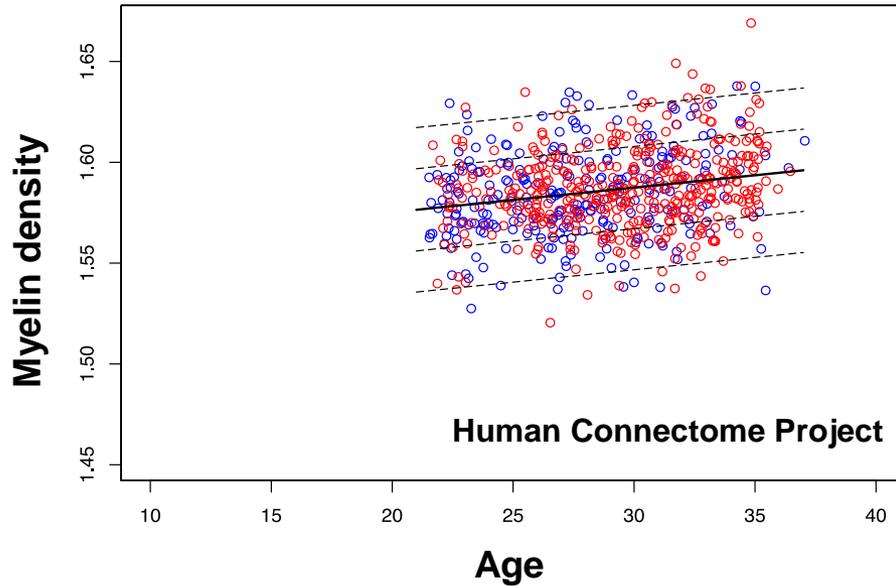
Myelin

Difference across age



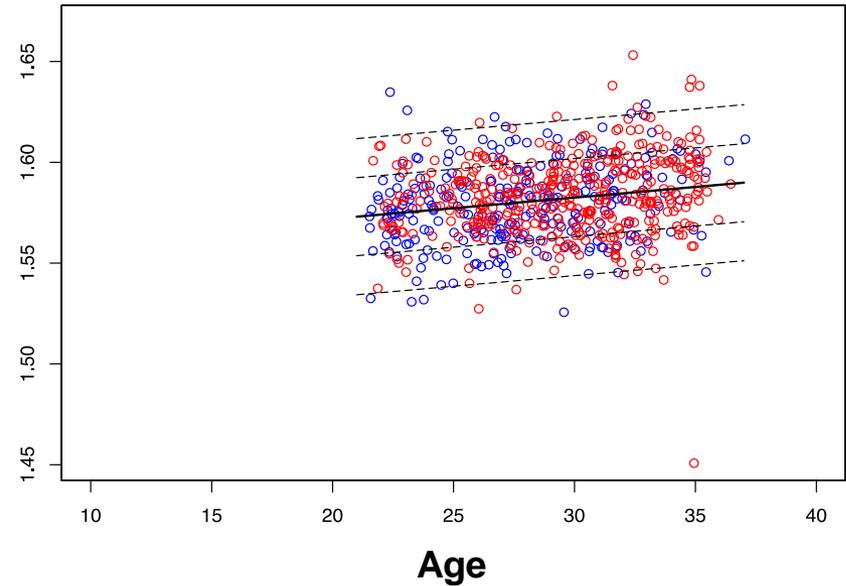
Age-related Differences in Myelin Content in Motor Cortex (area 4)

Left Motor Cortex



HCP (N=686): left
 $r = 0.220$
 $t = 5.899$
 $p = 5.74E-09$
slope = 0.001

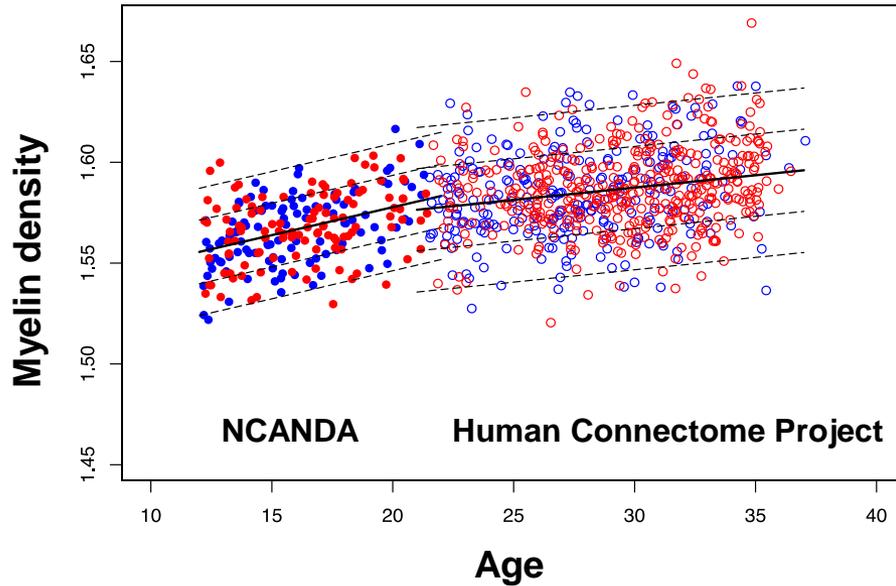
Right Motor Cortex



HCP (N=686): right
 $r = 0.200$
 $t = 5.343$
 $p = 1.24E-07$
slope = 0.001

Age-related Differences in Myelin Content in Motor Cortex (area 4)

Left Motor Cortex



NCANDA (N=226): left

$r = 0.410$

$t = 6.732$

$p = 1.38E-10$

slope = 0.003

HCP (N=686): left

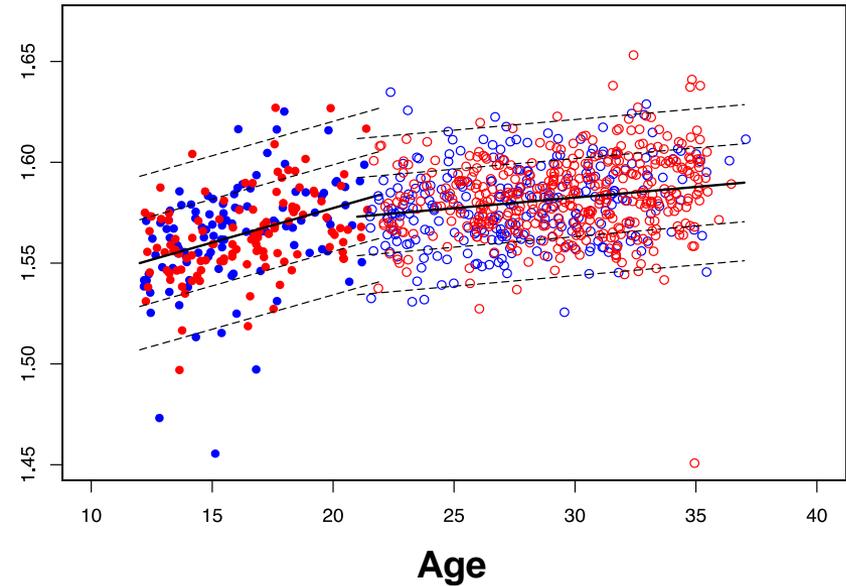
$r = 0.220$

$t = 5.899$

$p = 5.74E-09$

slope = 0.001

Right Motor Cortex



NCANDA (N=226): right

$r = 0.375$

$t = 6.060$

$p = 5.70E-09$

slope = 0.003

HCP (N=686): right

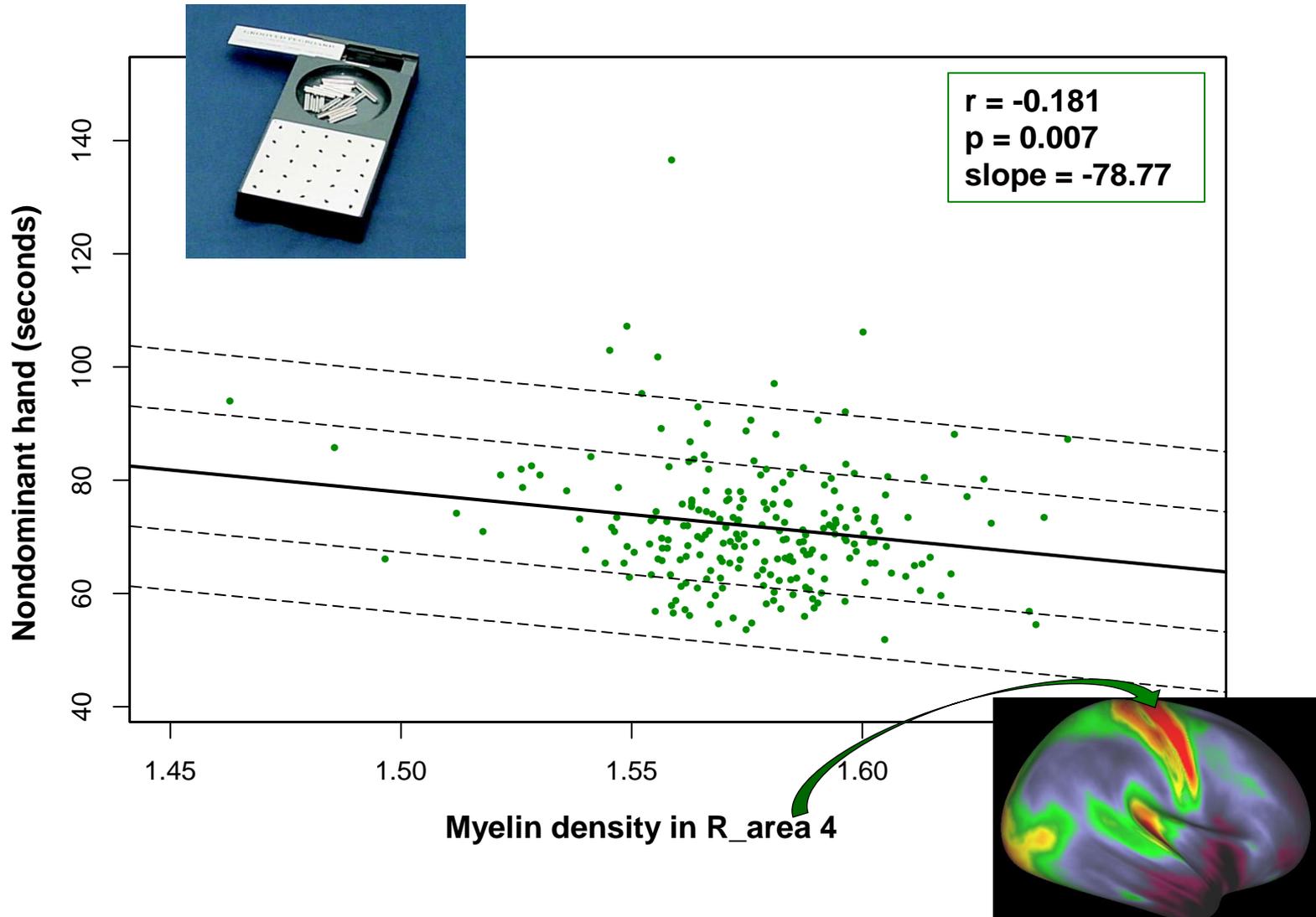
$r = 0.200$

$t = 5.343$

$p = 1.24E-07$

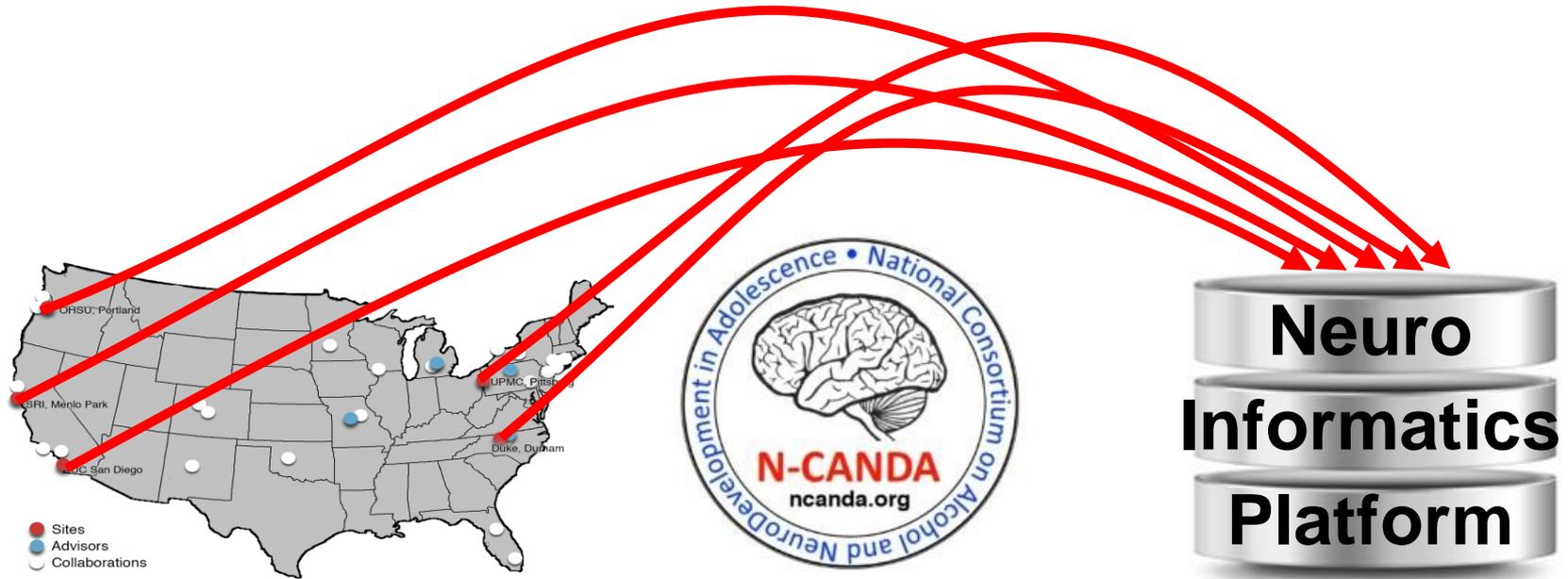
slope = 0.001

Grooved Pegboard and Myelin Content in the Motor Cortex (area 4)



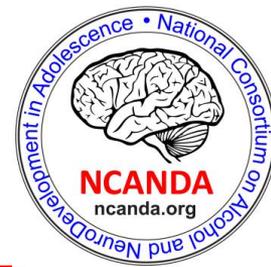
Extending Analysis of Imaging Data

Effects of Initiation of Drinking





NCANDA 2 Year Follow-up



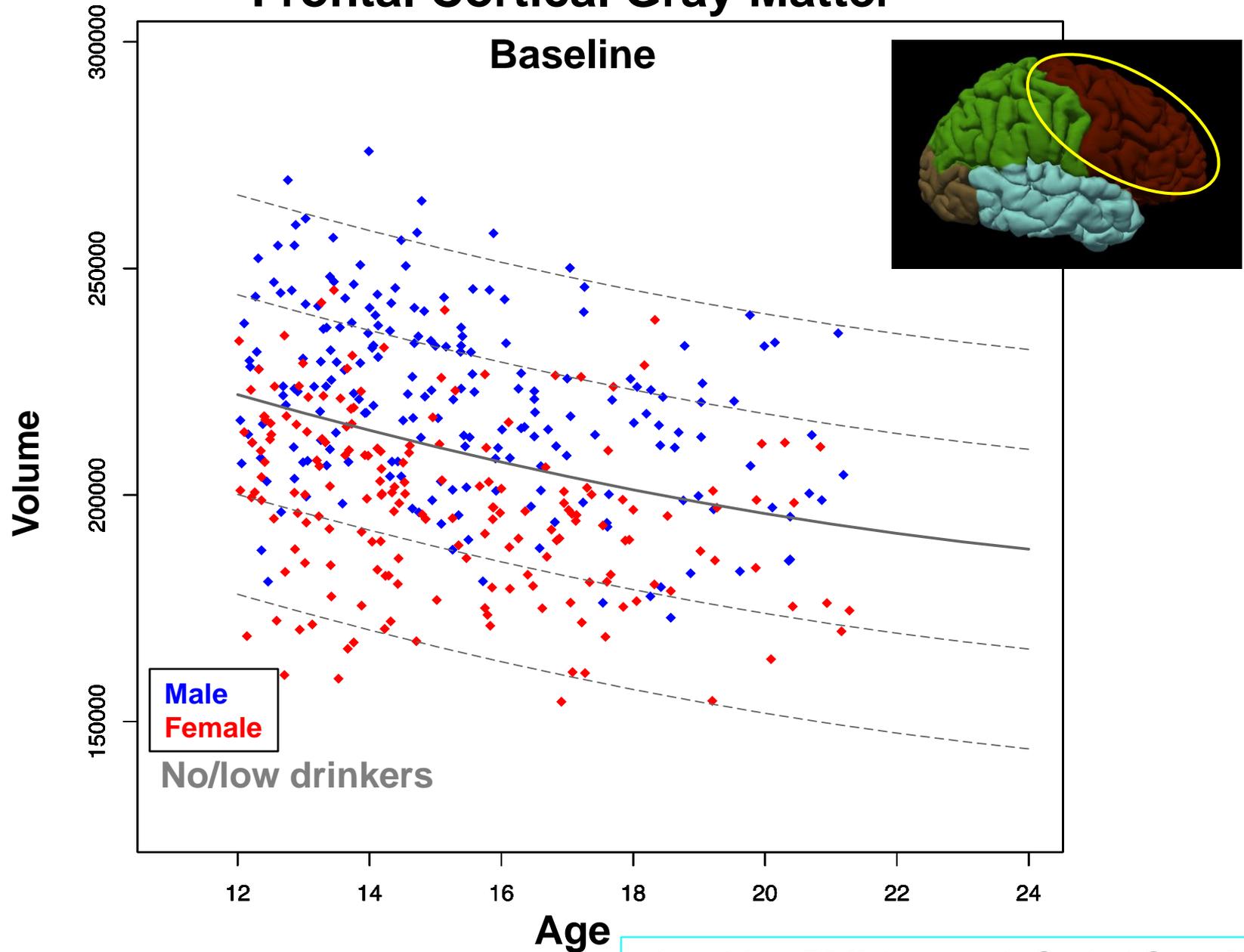
Regional cortical volume trajectories in 483 of 647 no-to-low drinking adolescents meeting imaging and drinking criteria followed longitudinally for 2 years

- 65 transitioned into moderate drinking
- 62 transitioned into heavy drinking
- 356 remained no-to-low drinker
- 1423 MRI brain scans

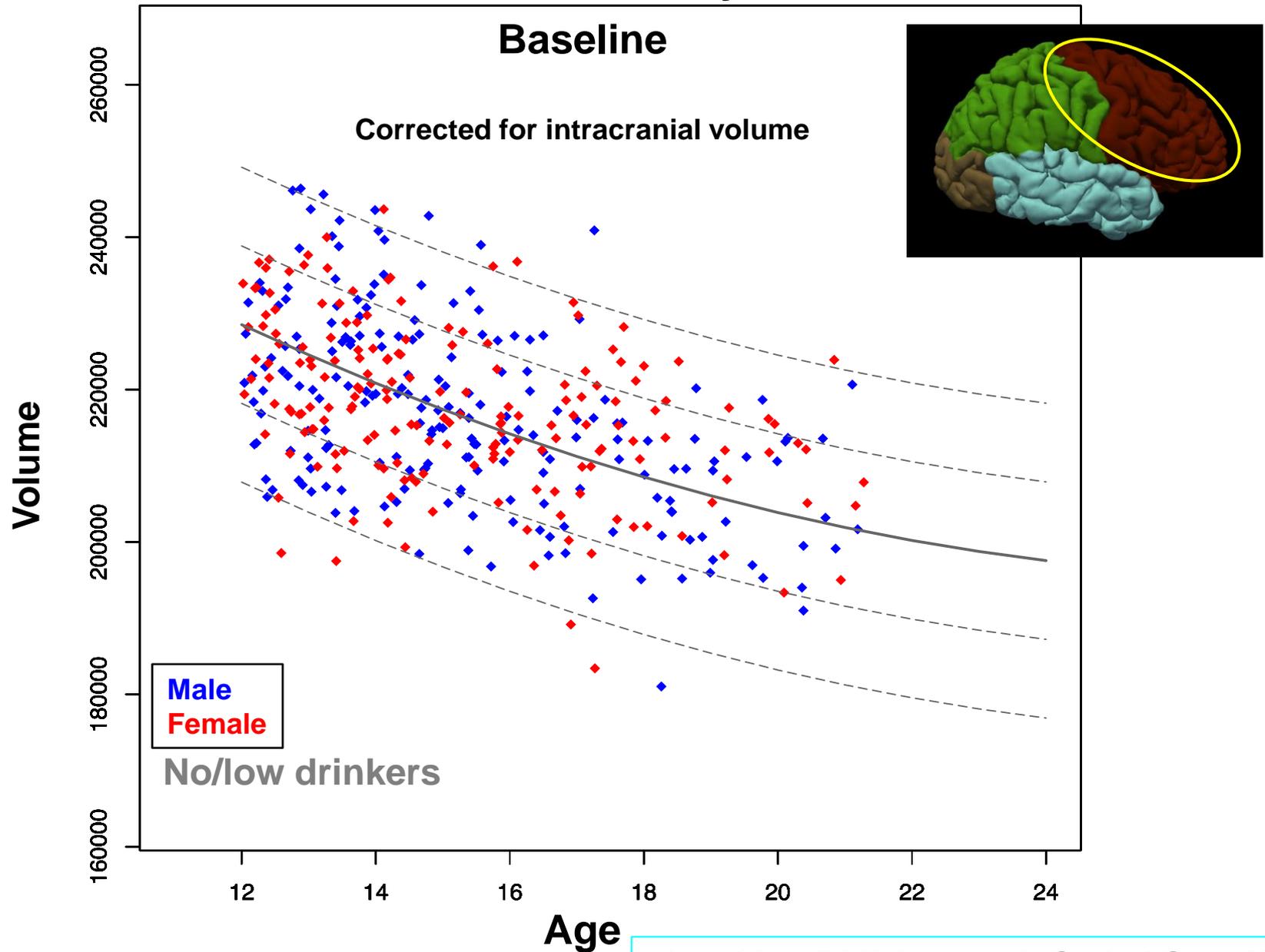
Cahalan et al. Criteria

		1-2	1-2	1-2	3-4	3-4	>4
Average drinks per occasion (last 3months):		1-2	1-2	1-2	3-4	3-4	>4
Largest # drinks in year:		1-2	3-4	>4	3-4	>4	>4
Frequency	<1x/year	Control (N=356)		Moderate Drinker (N=65)			
	<1x/month	Control (N=356)		Moderate Drinker (N=65)			
	1-3x/month	Control (N=356)		Moderate Drinker (N=65)			
	4-8x/month	Control (N=356)		Moderate Drinker (N=65)			
	>8x/month	Control (N=356)		Heavy Drinker (N=62)			
	Daily	Control (N=356)		Heavy Drinker (N=62)			

Frontal Cortical Gray Matter

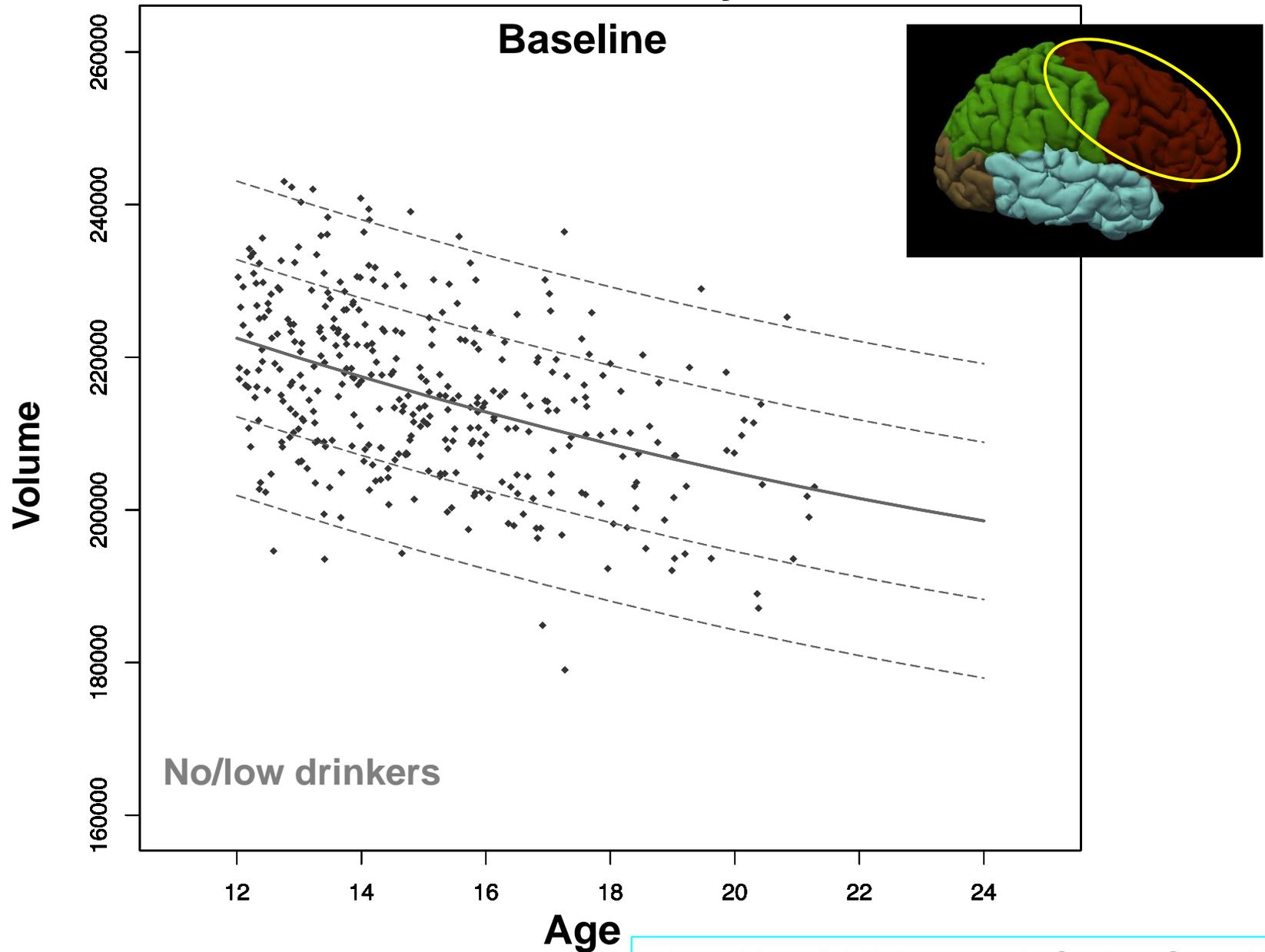


Frontal Cortical Gray Matter



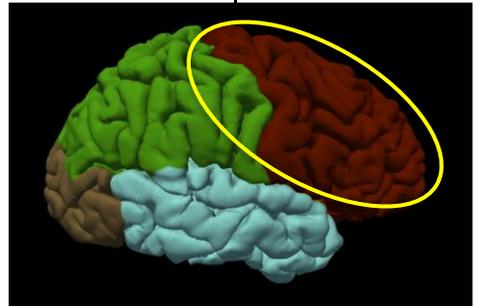
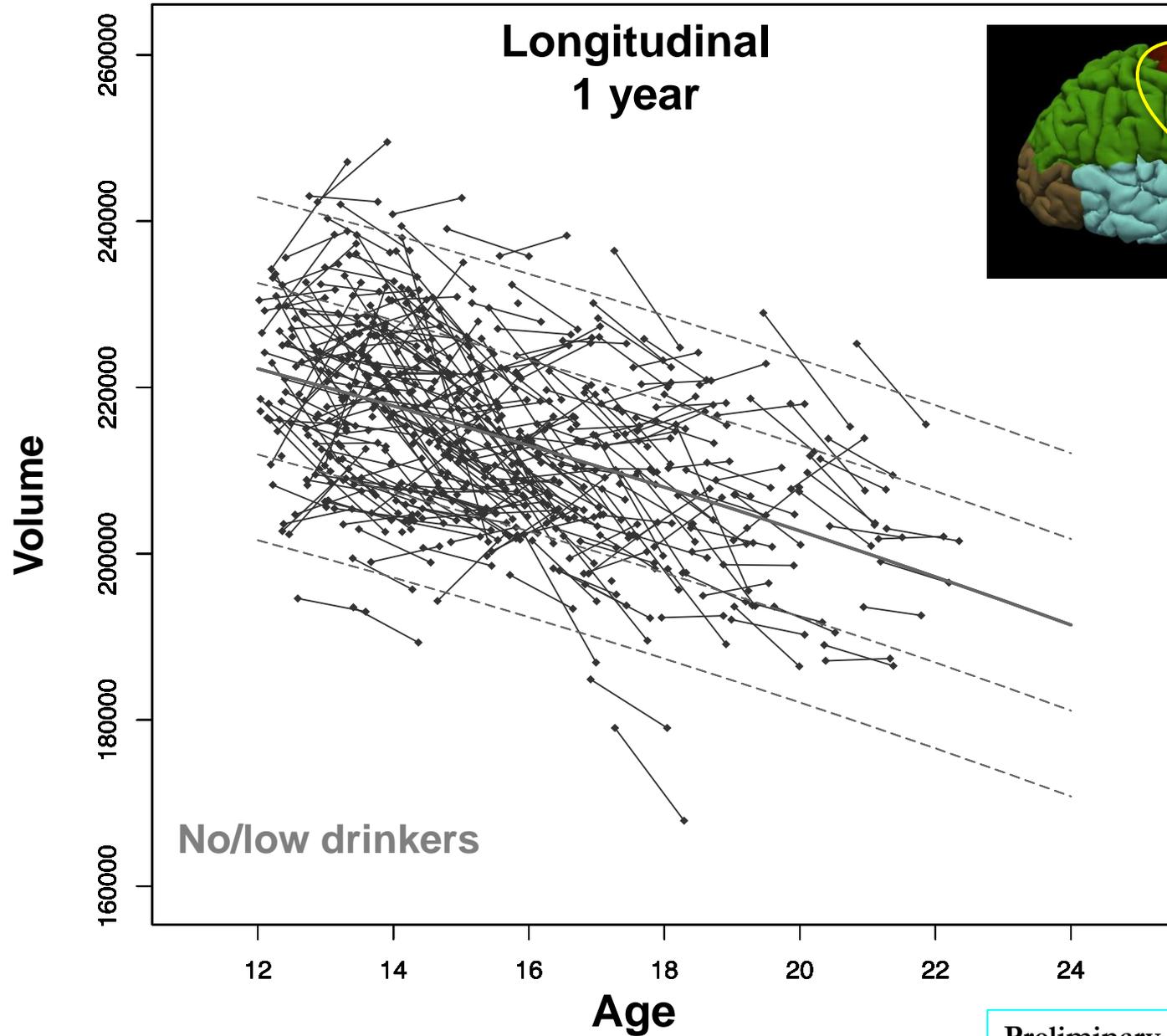
adapted from Pfefferbaum et al. *Cerebral Cortex* 2016

Frontal Cortical Gray Matter



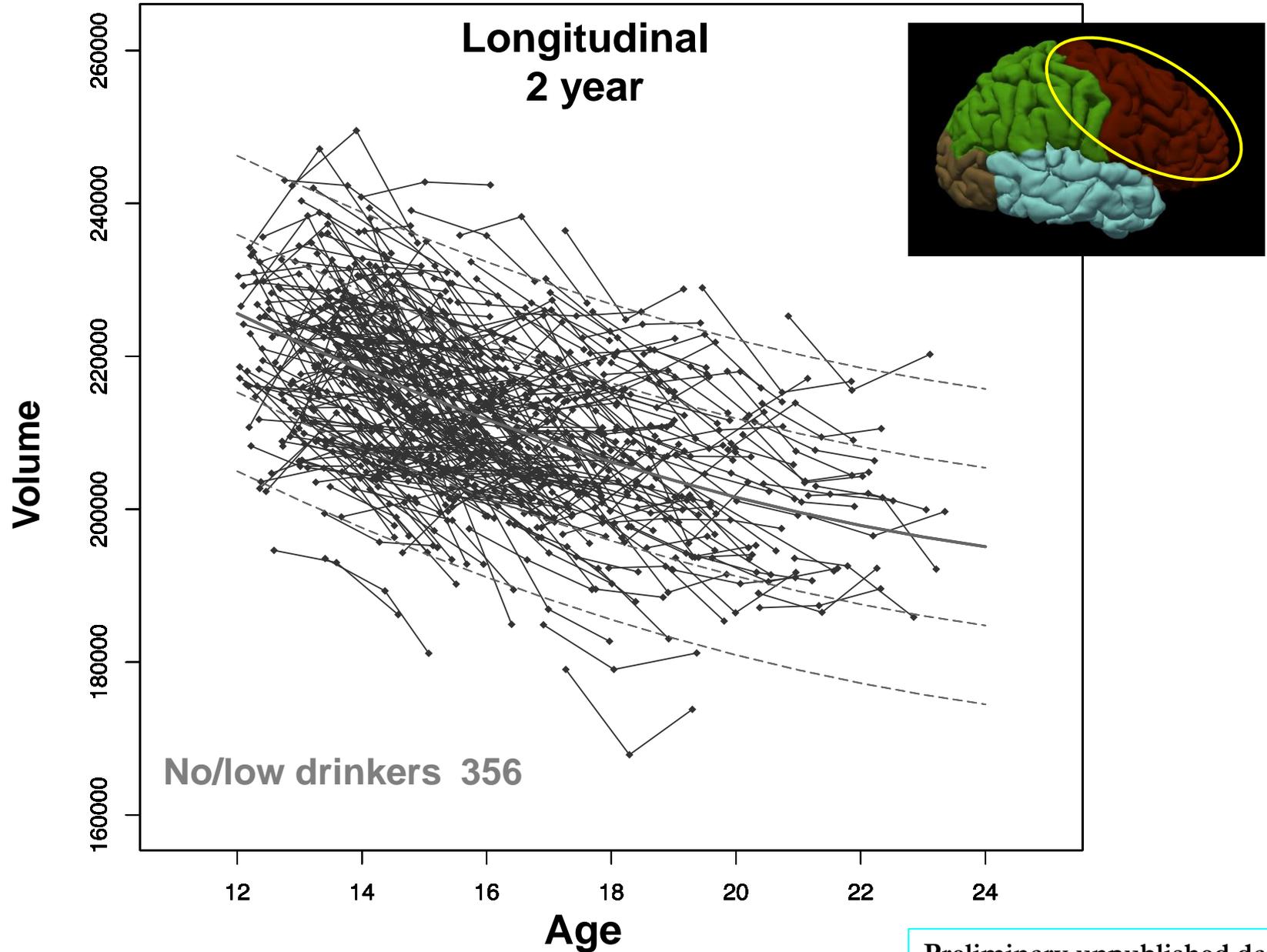
adapted from Pfefferbaum et al. *Cerebral Cortex* 2016

Frontal Cortical Gray Matter



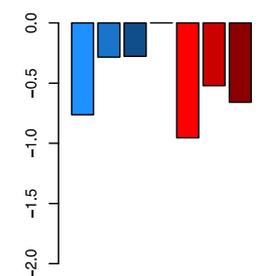
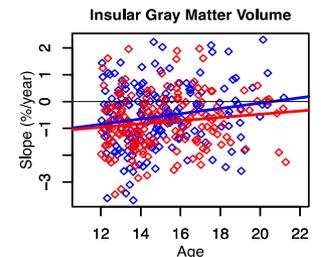
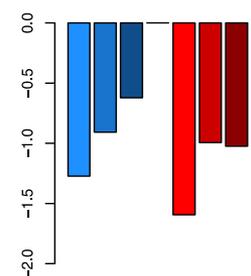
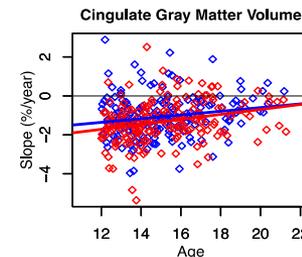
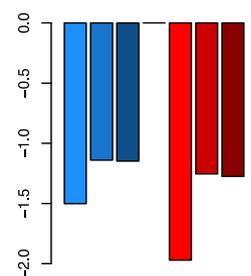
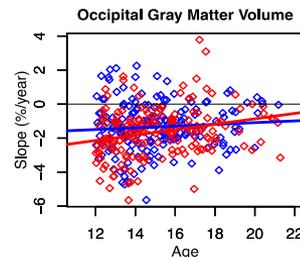
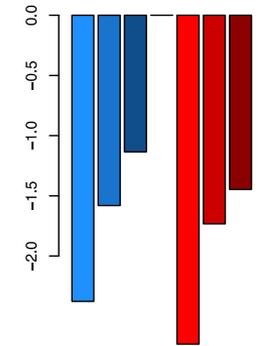
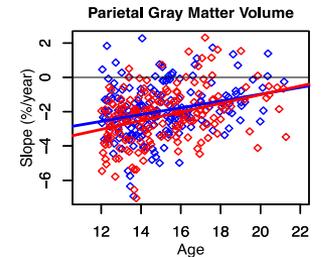
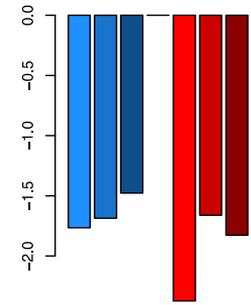
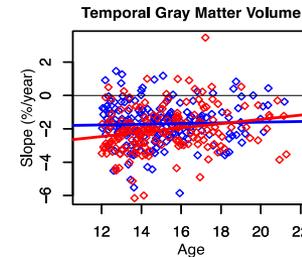
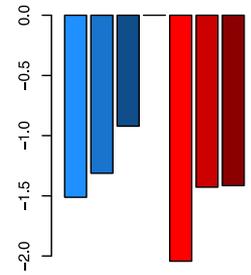
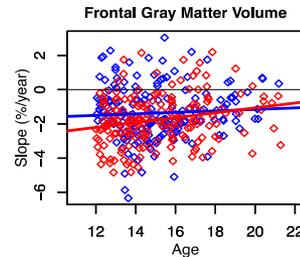
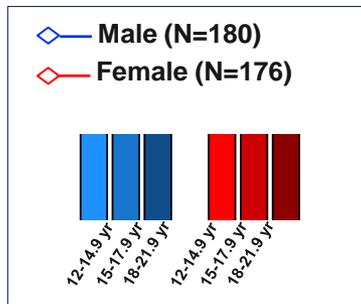
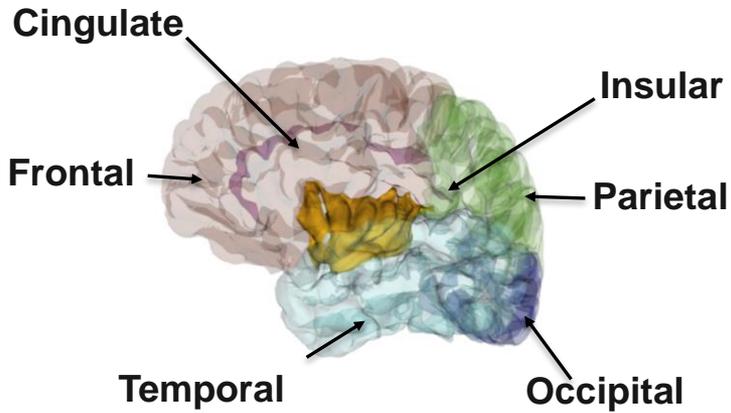
Preliminary unpublished data

Frontal Cortical Gray Matter



Regional Gray Matter Volume Slopes

Decline with Age

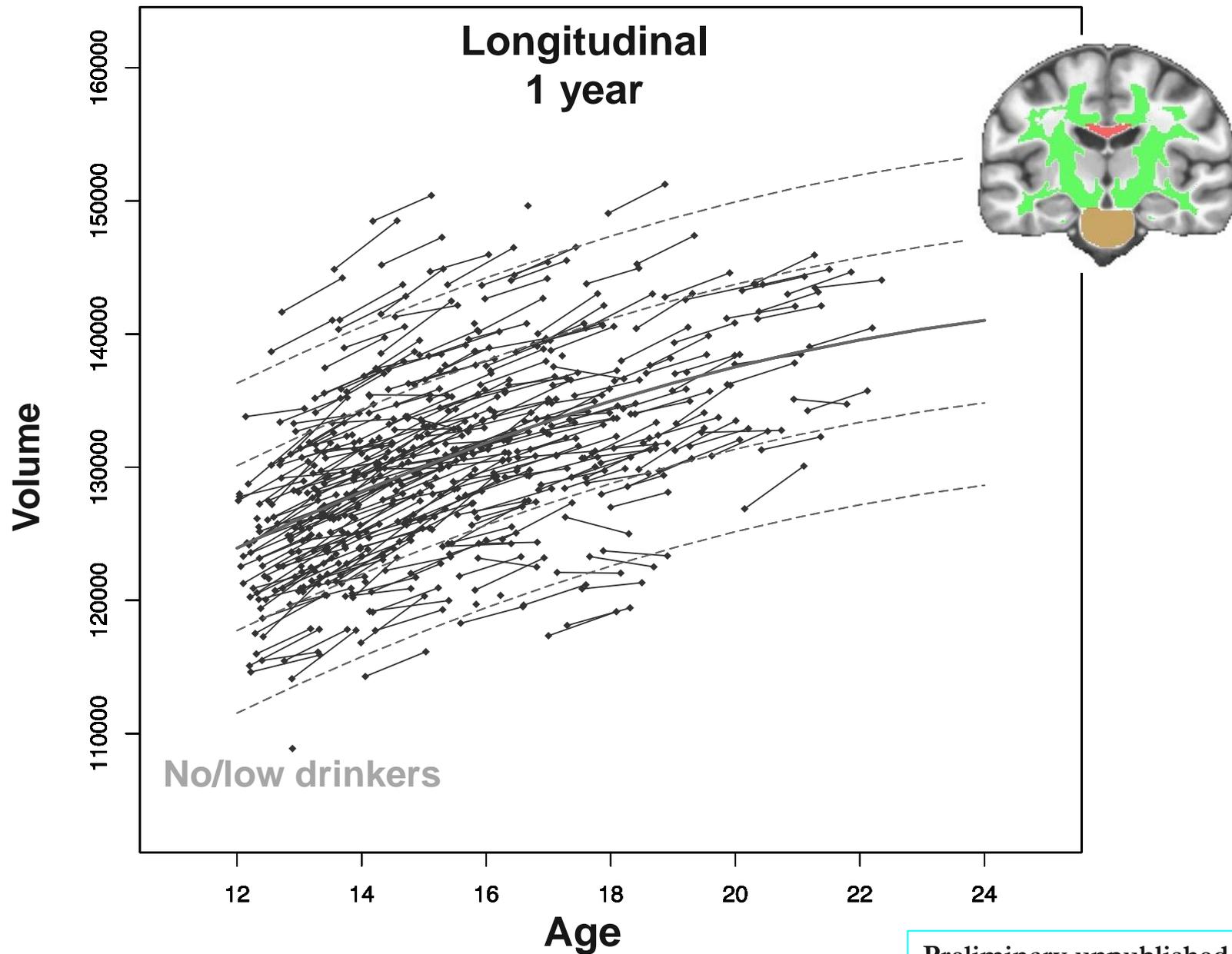


Central White Matter

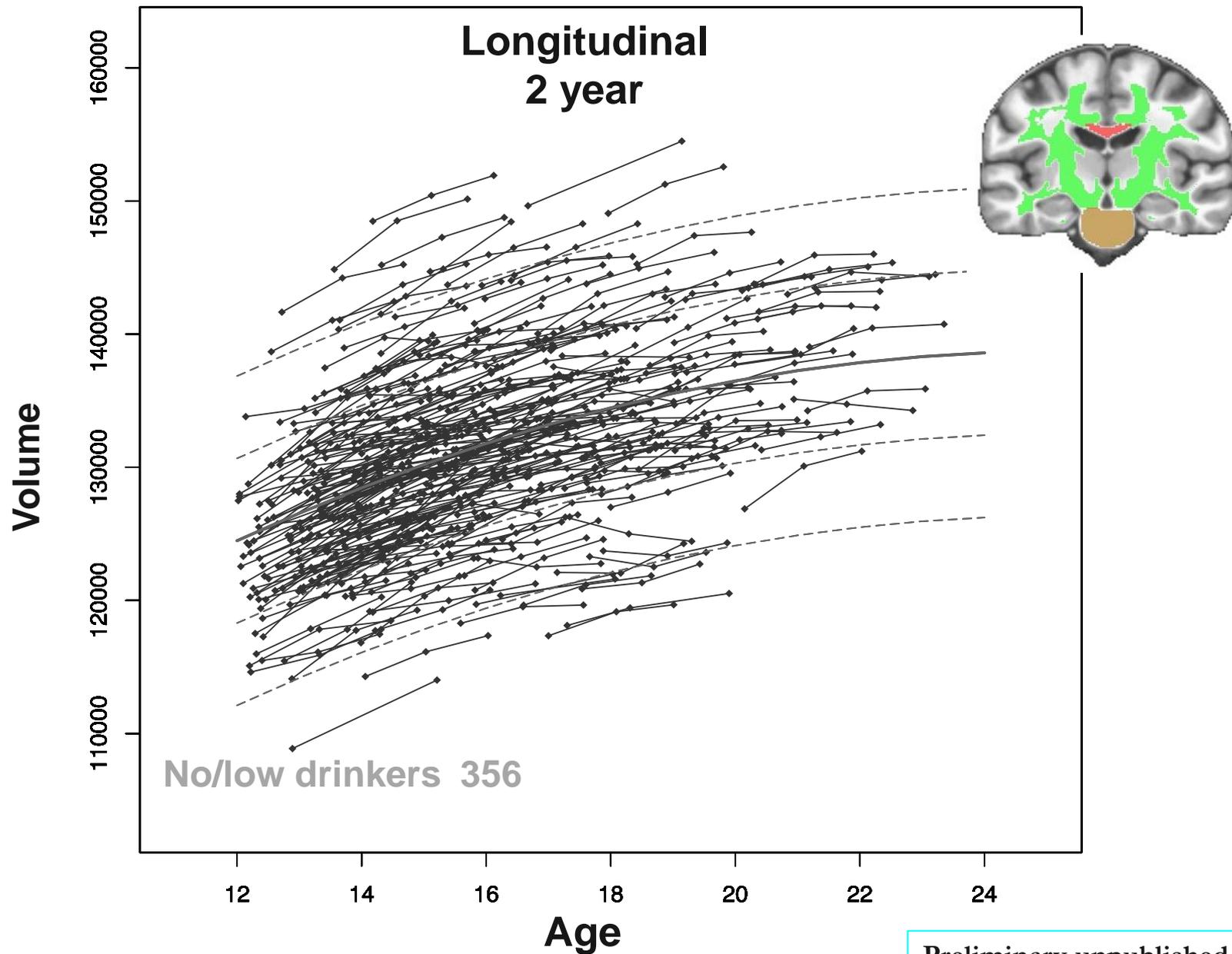


adapted from Pfefferbaum et al. *Cerebral Cortex* 2016

Central White Matter

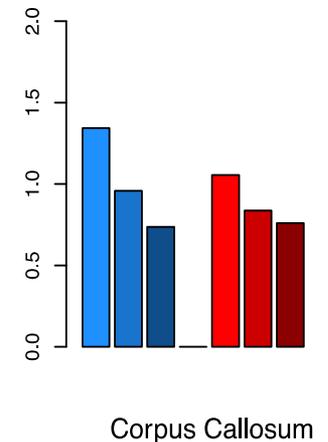
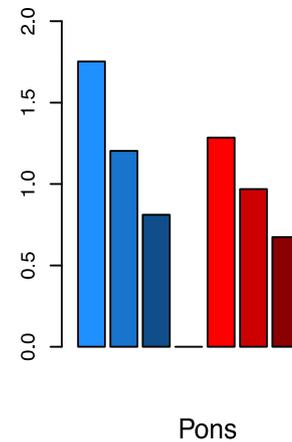
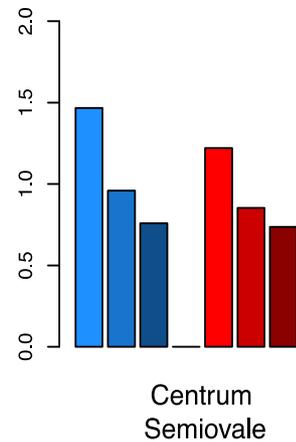
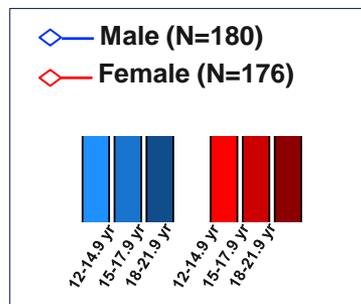
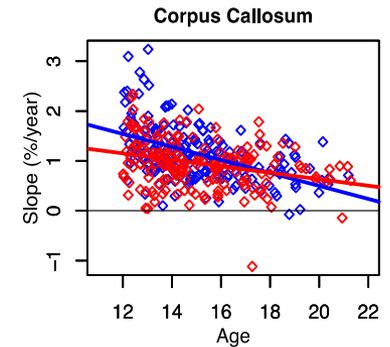
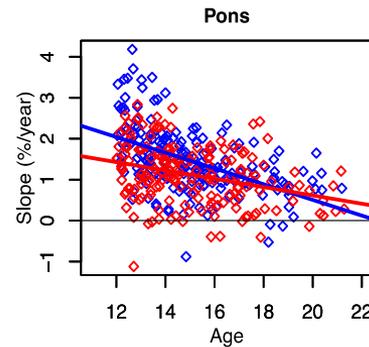
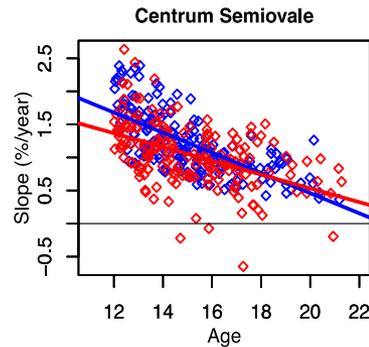
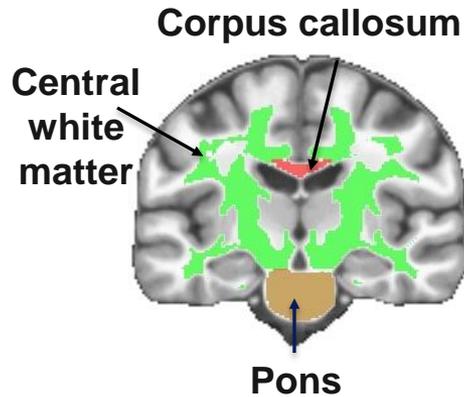


Central White Matter

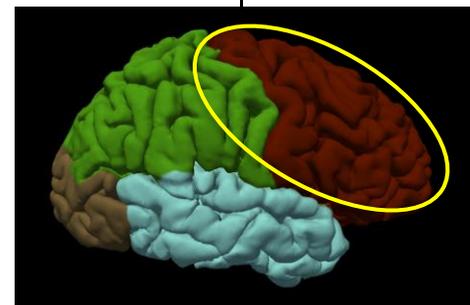
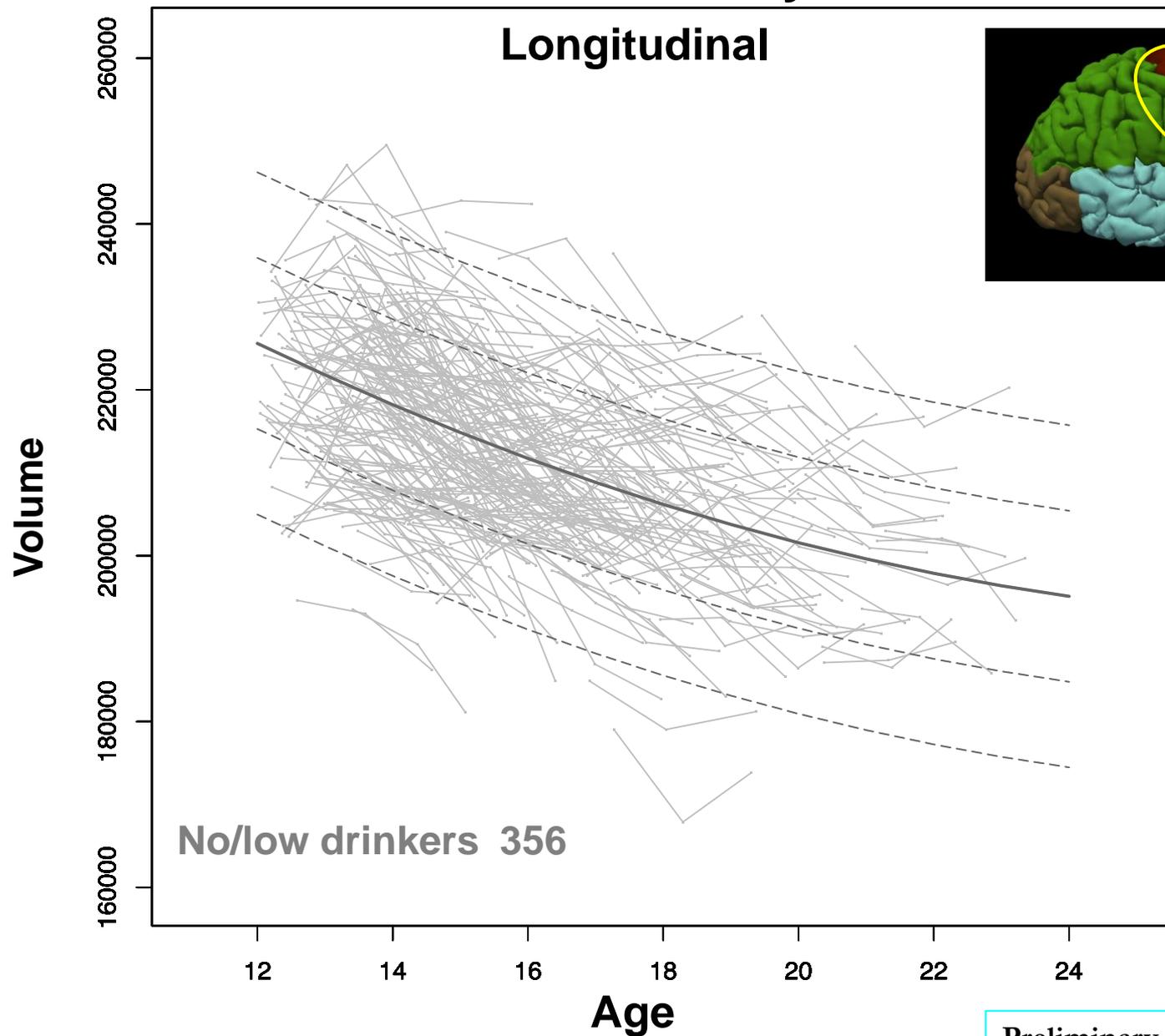


Regional White Matter Volume Slopes

Decelerating Growth with Age

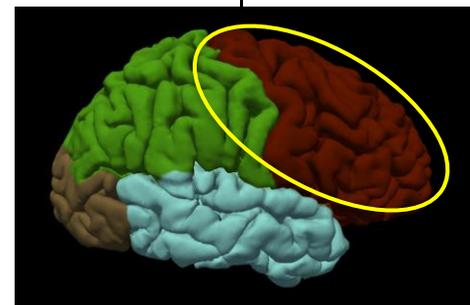
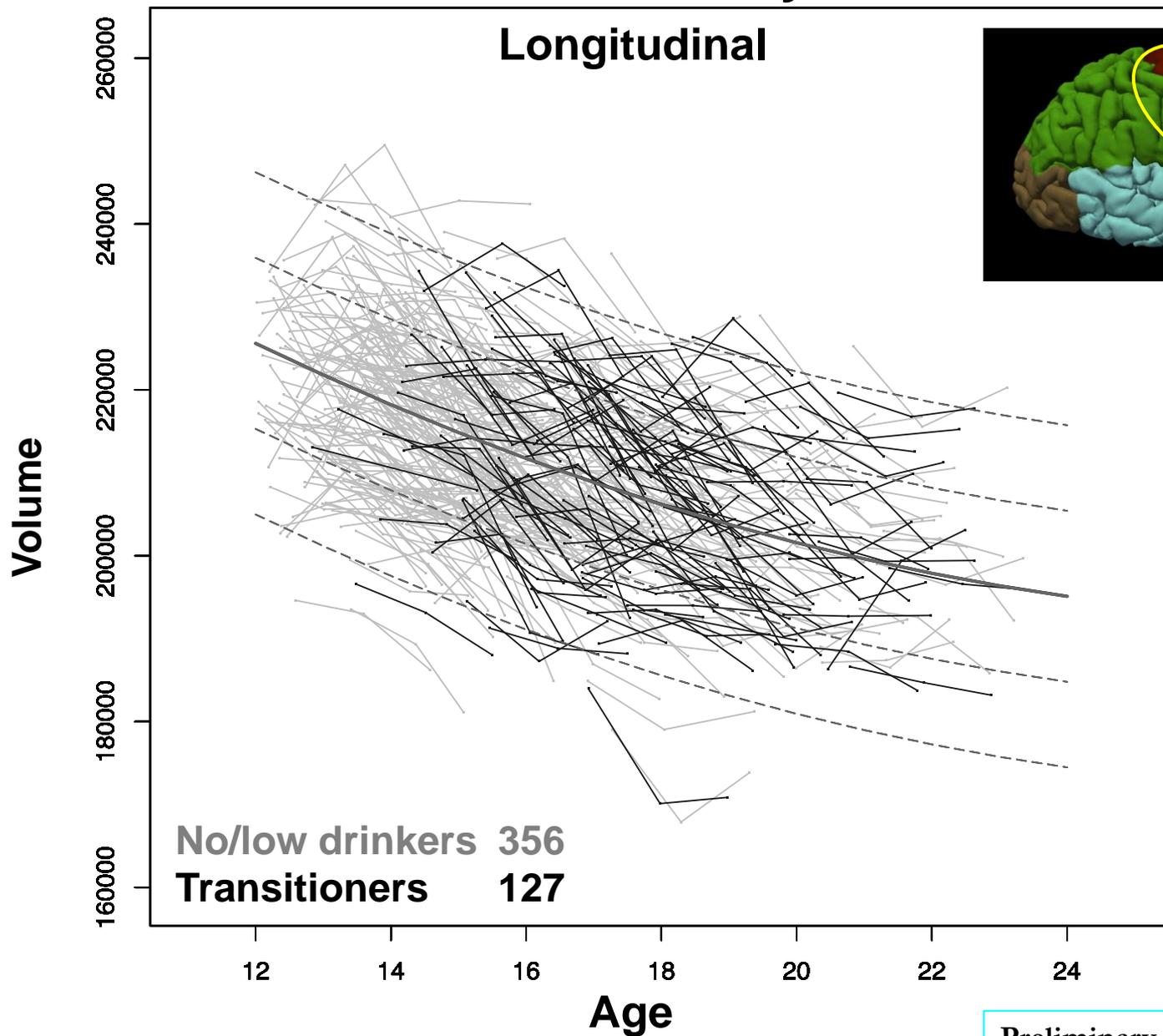


Frontal Cortical Gray Matter



Preliminary unpublished data

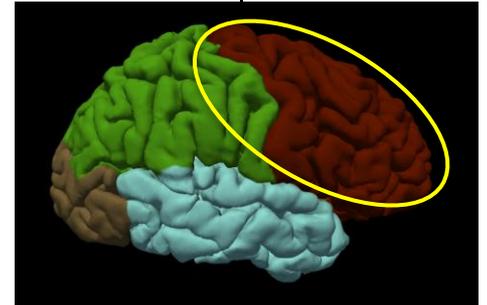
Frontal Cortical Gray Matter



Preliminary unpublished data

Frontal Cortical Gray Matter

Longitudinal



Volume

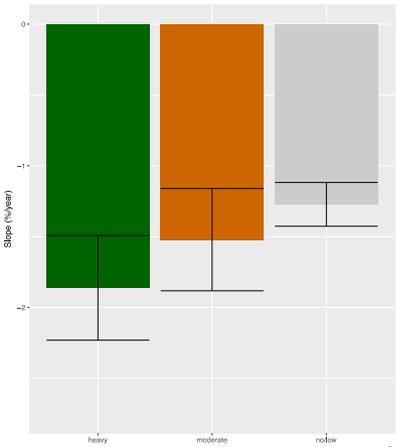
220000
200000
180000
160000

No/low drinkers 356
Moderate drinkers 65

12 14 16 18 20 22 24

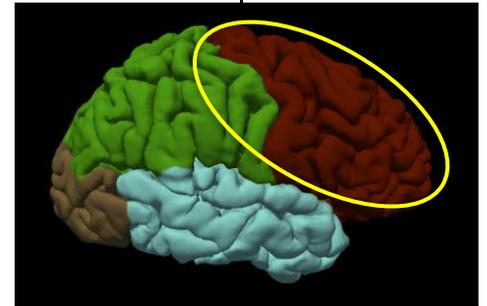
Age

Preliminary unpublished data



Frontal Cortical Gray Matter

Longitudinal



Volume

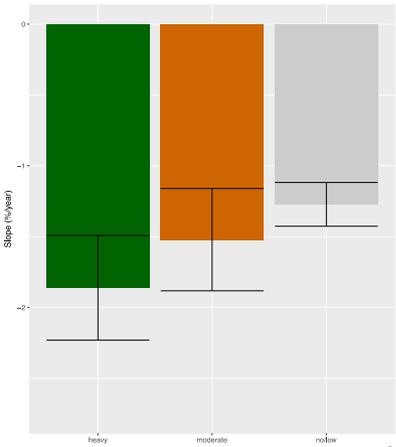
220000
200000
180000
160000

No/low drinkers 356
Heavy drinkers 62

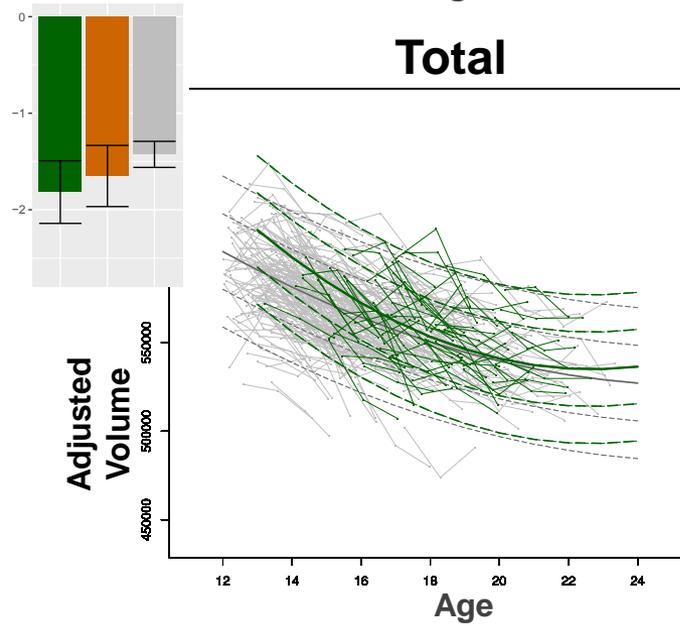
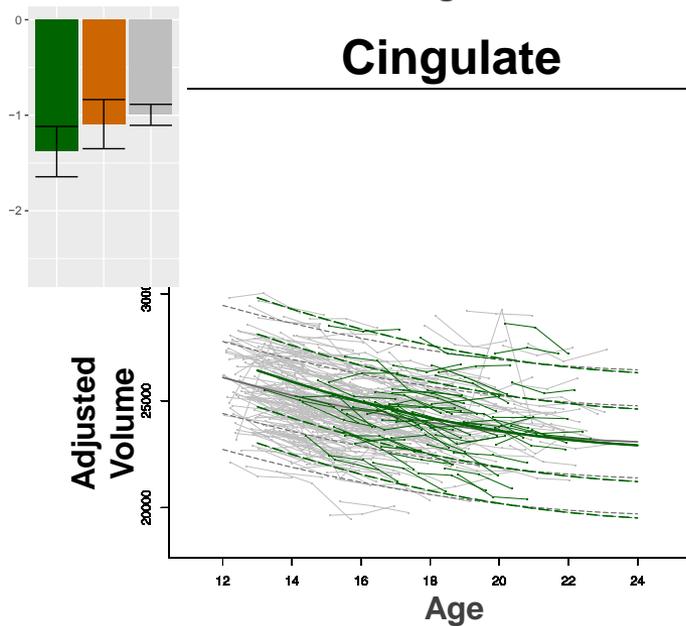
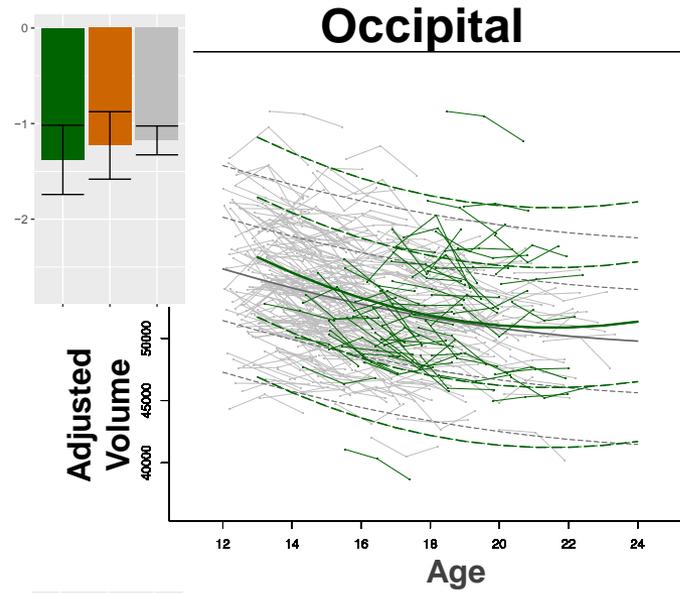
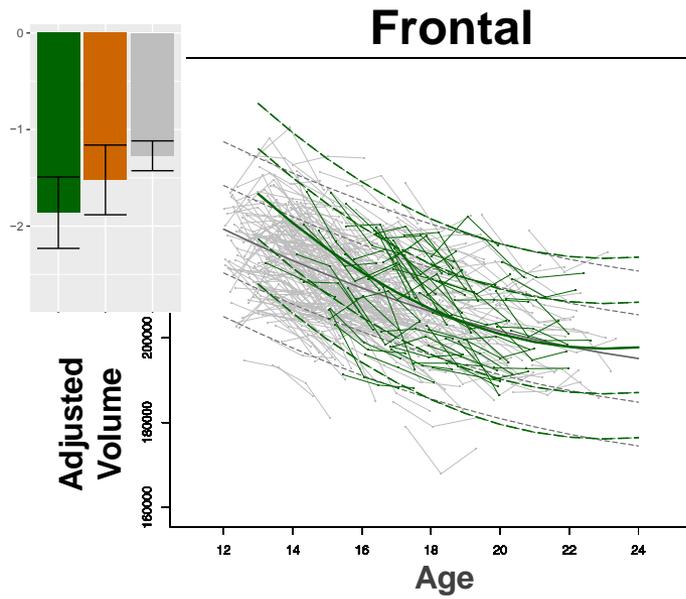
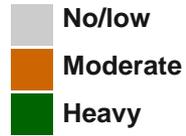
12 14 16 18 20 22 24

Age

Preliminary unpublished data

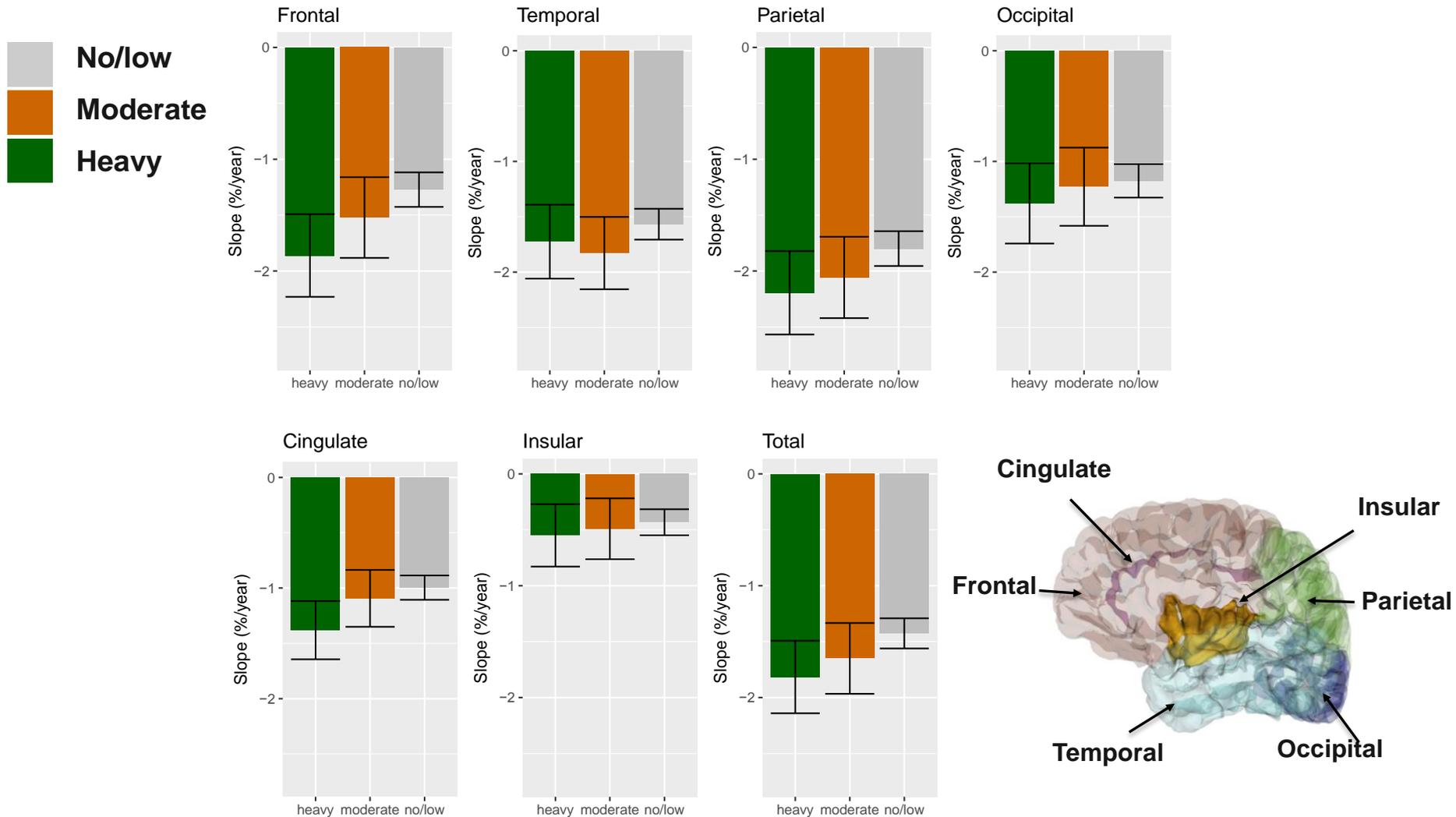


Regions where heavy drinkers have significantly steeper reduction in gray matter volume than no-low drinkers



Regional Gray Matter Volumes

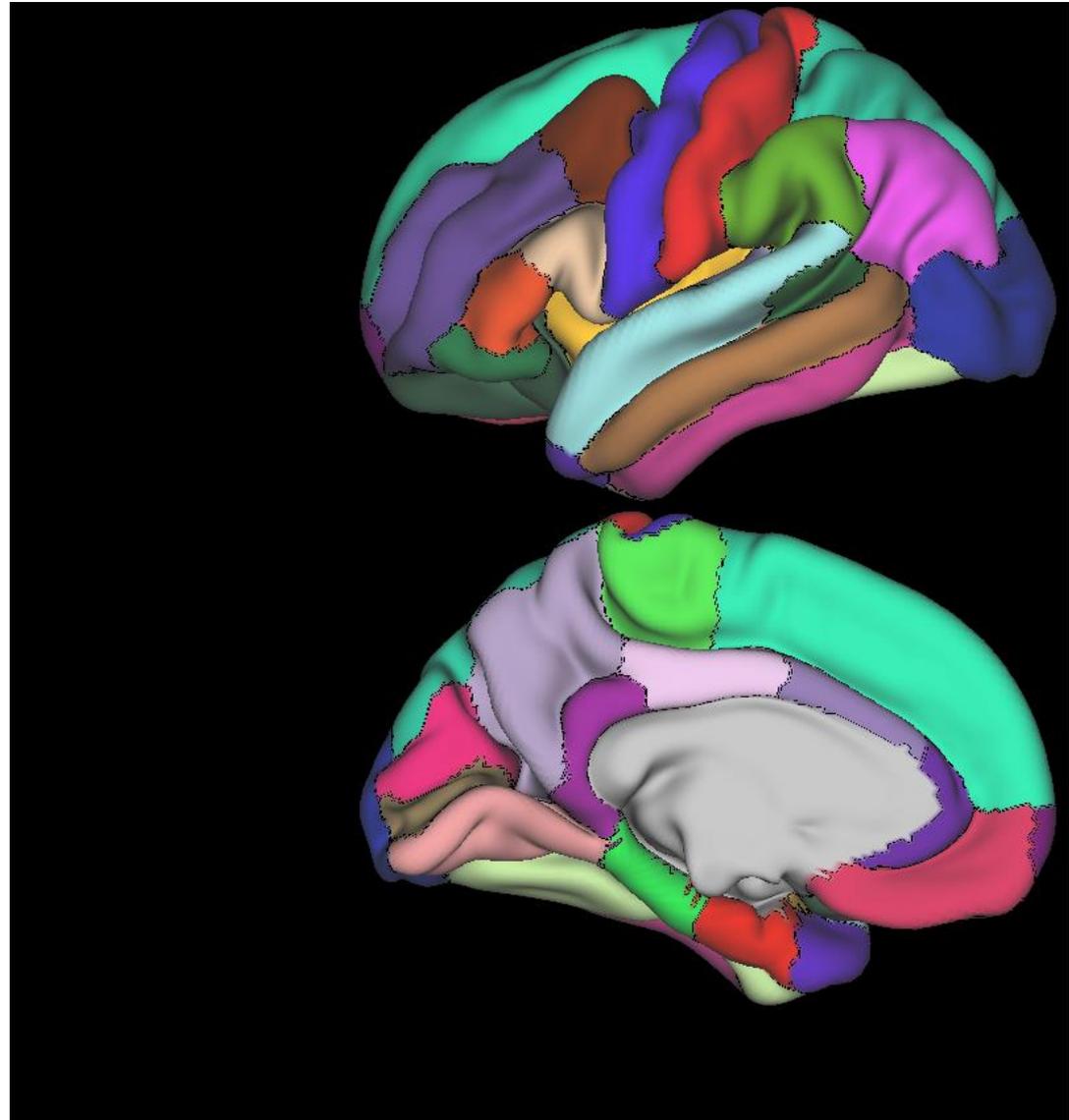
Accelerated Decline with Initiation of Heavy Drinking



FreeSurfer Parcellated Cortical Regions

34 Regions

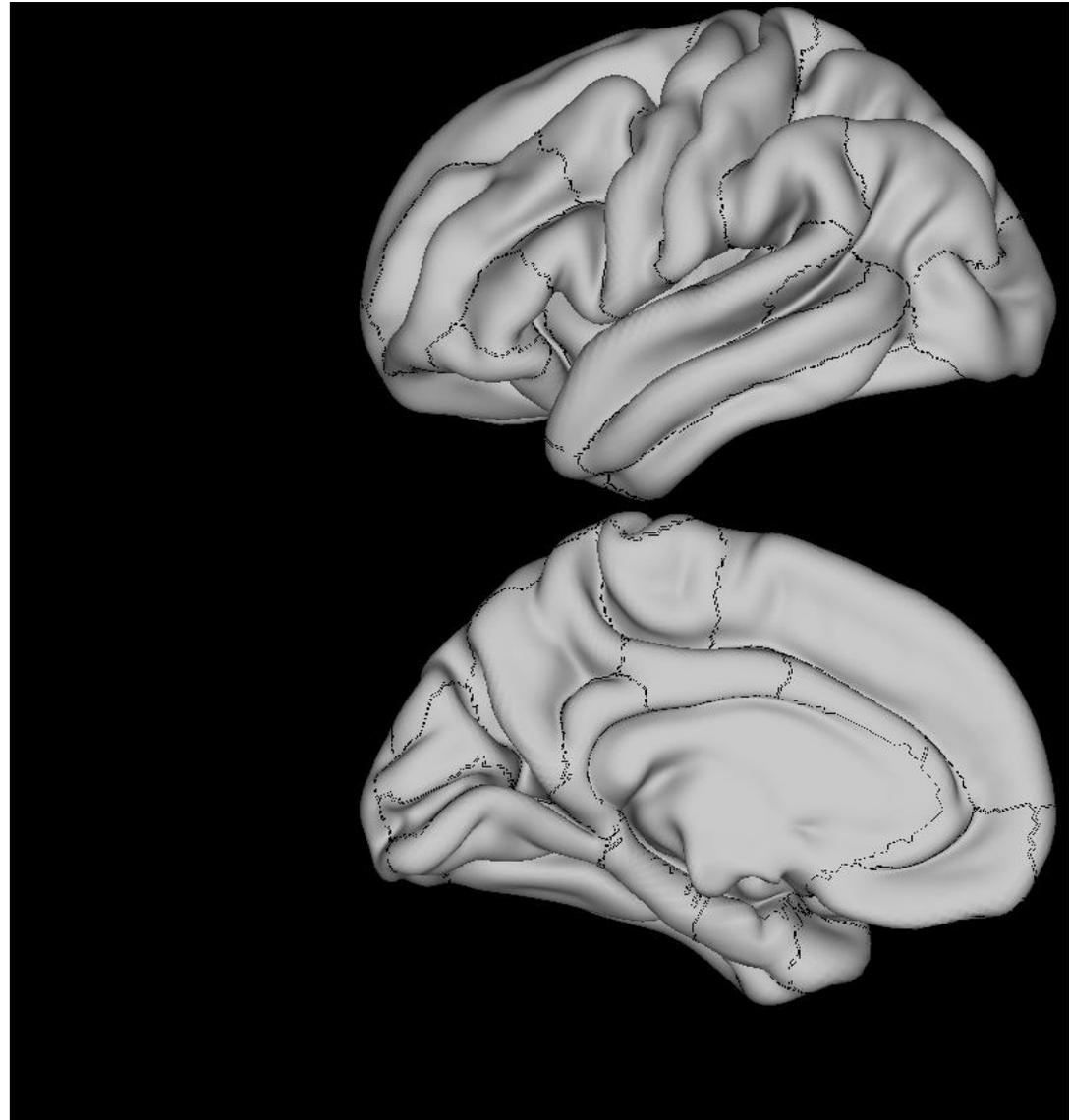
- L_bankssts
- L_caudalanteriorcingulate
- L_caudalmiddlefrontal
- L_corpuscallosum
- L_cuneus
- L_entorhinal
- L_frontalpole
- L_fusiform
- L_inferiorparietal
- L_inferiortemporal
- L_insula
- L_isthmuscingulate
- L_lateraloccipital
- L_lateralorbitofrontal
- L_lingual
- L_medialorbitofrontal
- L_middletemporal
- L_paracentral
- L parahippocampal
- L_parsopercularis
- L_parsorbitalis
- L_parstriangularis
- L_pericalcarine
- L_postcentral
- L_posteriorcingulate
- L_precentral
- L_precuneus
- L_rostralanteriorcingulate
- L_rostralmiddlefrontal
- L_superiorfrontal
- L_superiorparietal
- L_superiortemporal
- L_supramarginal
- L_temporalpole
- L_transversetemporal



FreeSurfer Parcellated Cortical Regions

34 Regions

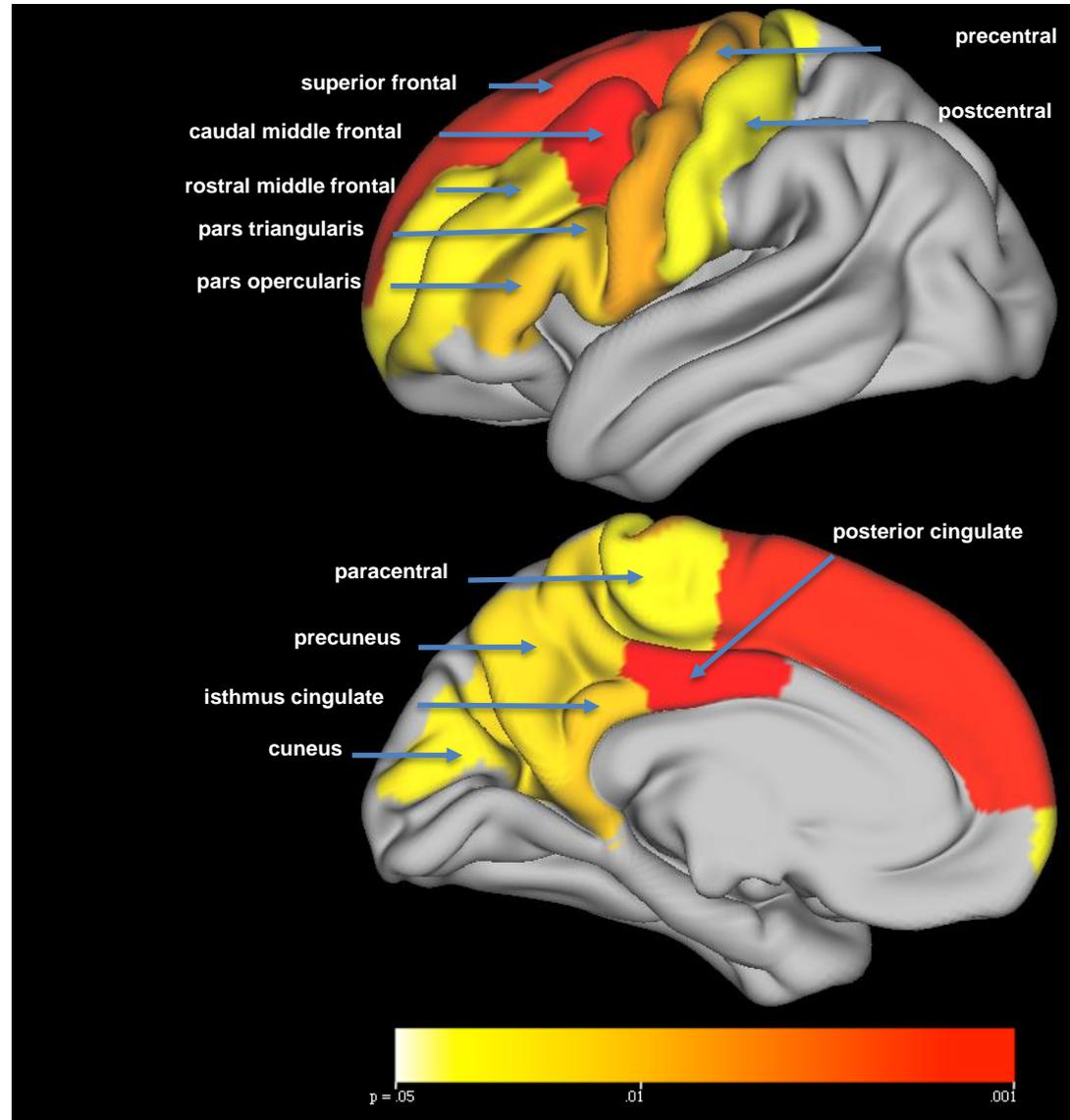
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■	L_caudalanteriorcingulate
■	L_caudalmiddlefrontal
■	L_corpuscallosum
■	L_cuneus
■	L_entorhinal
■	L_frontalpole
■	L_fusiform
■	L_inferiorparietal
■	L_inferiortemporal
■	L_insula
■	L_isthmuscingulate
■	L_lateraloccipital
■	L_lateralorbitofrontal
■	L_lingual
■	L_medialorbitofrontal
■	L_middletemporal
■	L_paracentral
■	L parahippocampal
■	L_parsopercularis
■	L_parsorbitalis
■	L_parstriangularis
■	L_pericalcarine
■	L_postcentral
■	L_posteriorcingulate
■	L_precentral
■	L_precuneus
■	L_rostralanteriorcingulate
■	L_rostralmiddlefrontal
■	L_superiorfrontal
■	L_superiorparietal
■	L_superiortemporal
■	L_supramarginal
■	L_temporalpole
■	L_transversetemporal



FreeSurfer Parcellated Cortical Regions

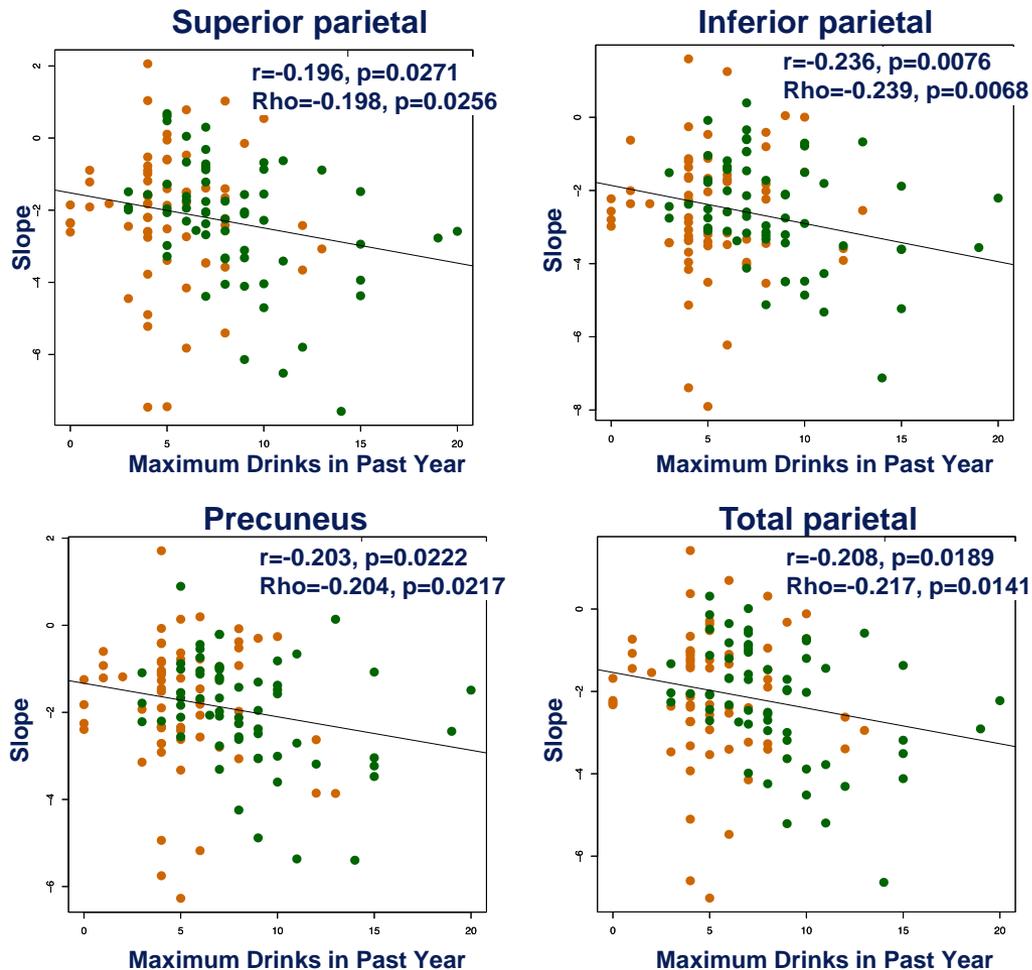
34 Regions

- L_bankssts
- L_caudalanteriorcingulate
- L_caudalmiddlefrontal
- L_corpuscallosum
- L_cuneus
- L_entorhinal
- L_frontalpole
- L_fusiform
- L_inferiorparietal
- L_inferiortemporal
- L_insula
- L_isthmuscingulate
- L_lateraloccipital
- L_lateralorbitofrontal
- L_lingual
- L_medialorbitofrontal
- L_middletemporal
- L_paracentral
- L parahippocampal
- L_parsopercularis
- L_parsorbitalis
- L_parstriangularis
- L_pericalcarine
- L_postcentral
- L_posteriorcingulate
- L_precentral
- L_precuneus
- L_rostralanteriorcingulate
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- L_supramarginal
- L_temporalpole
- L_transversetemporal



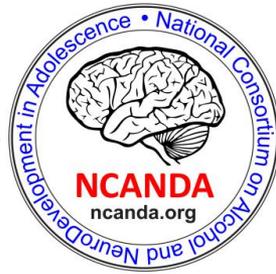
Steeper Regional Parietal Trajectories

Correlations with Greater Maximum Drinks in Past Year



Moderate drinkers
Heavy drinkers

Extending Analysis of Imaging Data



Subcortical Brain Iron

There is a developmental trajectory of subcortical non-heme iron deposition

Cortical Myelin

There is a developmental trajectory of cortical myelin increase

Effects of Initiation of Drinking

Initiation of heavy drinking alters structural cortical developmental trajectory

Extending Analysis of Imaging Data

Subcortical Brain Iron

There is a developmental trajectory of subcortical non-heme iron deposition

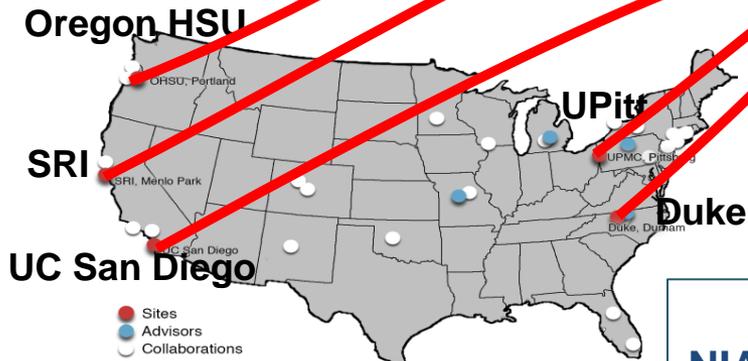
Cortical Myelin

There is a developmental trajectory of cortical myelin increase

Effects of Initiation of Drinking

Initiation of heavy drinking alters structural cortical developmental trajectory

5 U.S. Recruitment Sites



SRI+Stanford

Neuro

Informatics

Platform



FUNDING
NIAAA, NIDA, NIMH, NICHD