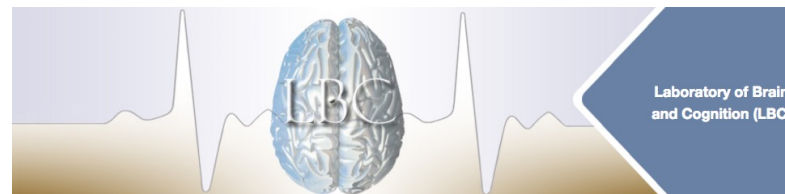




# Imaging Changes in Brain Anatomy

*Cibu Thomas, PhD*

*Section on Learning and Plasticity*



# Scope of this lecture

- Cognitive Neuroscientist's perspective on imaging brain changes
- Starting or in the middle of a project looking at structural brain changes
- Ideas extend to functional brain changes also
- Some familiarity with MRI images and jargon

# Some of the factors that change the brain



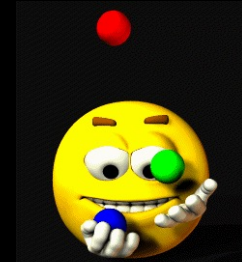
Growing up



Growing Old



Learning



Training



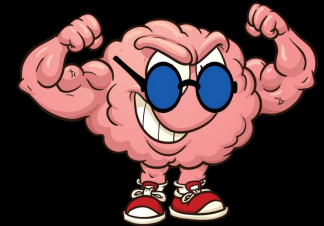
Sleeping



Mood



Stress



Exercise



Food



Genetics



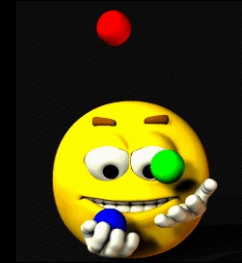
Injury



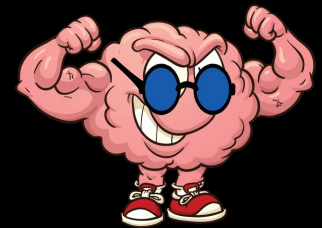
Disease

# Why imaging brain changes is important

Understanding how and what changes the brain can help:



1. Slow the effects of aging or some disease



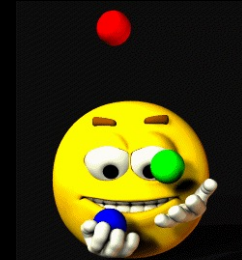
2. Measure the efficacy of a treatment strategy



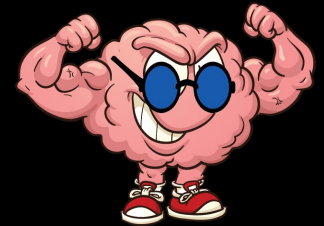
3. Guide public policy on promoting good mental health



# How do we study the living human brain?



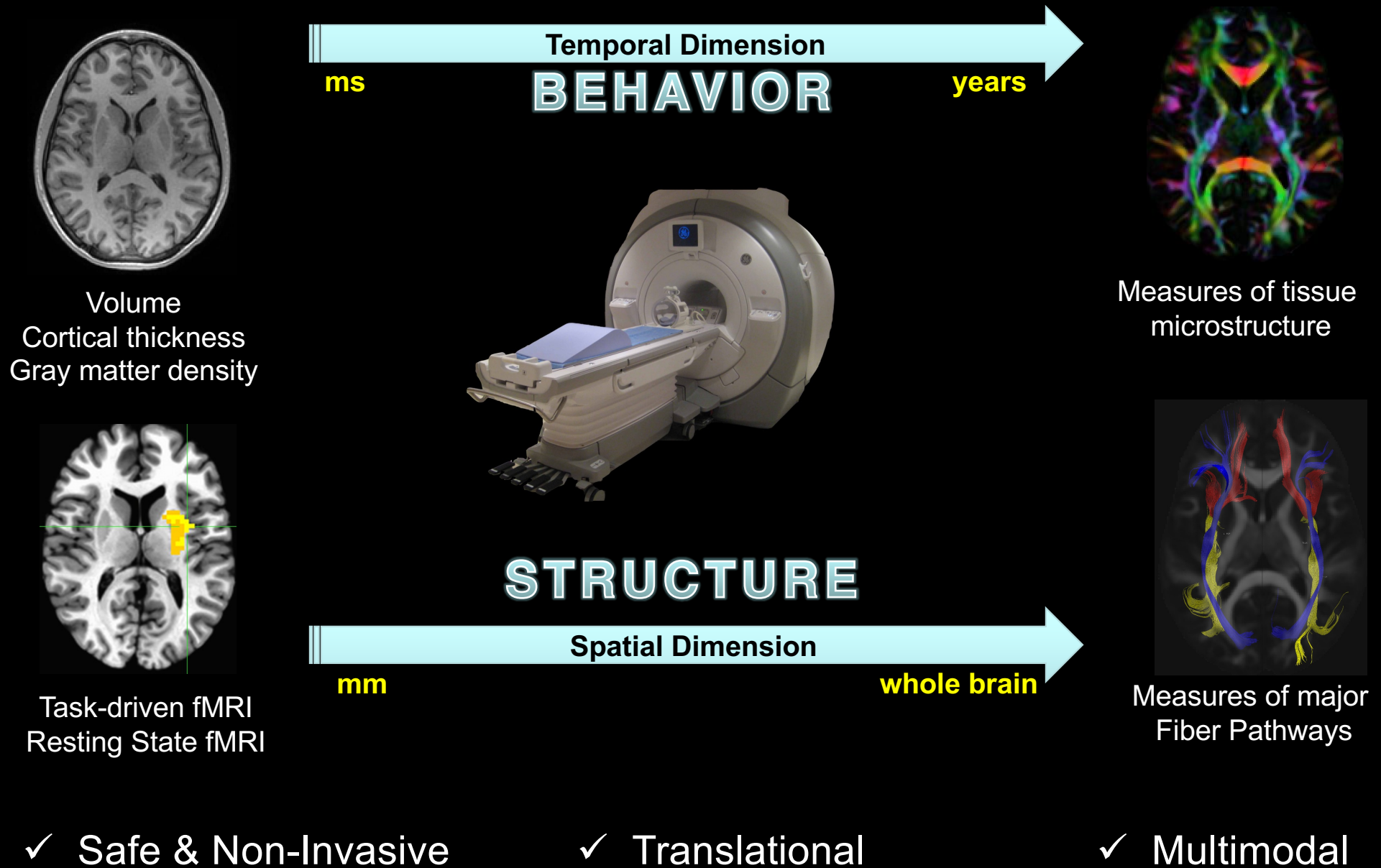
**Temporal : Years, months, weeks, Days, Hours, minutes, seconds...**



**Spatial : Whole brain, cm, mm, microns**



# MRI – a powerful tool for imaging brain changes



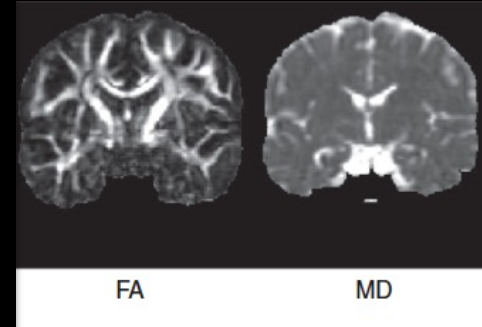
✓ Safe & Non-Invasive

✓ Translational

✓ Multimodal

# Outline

- Review popular MRI methods used for measuring brain changes

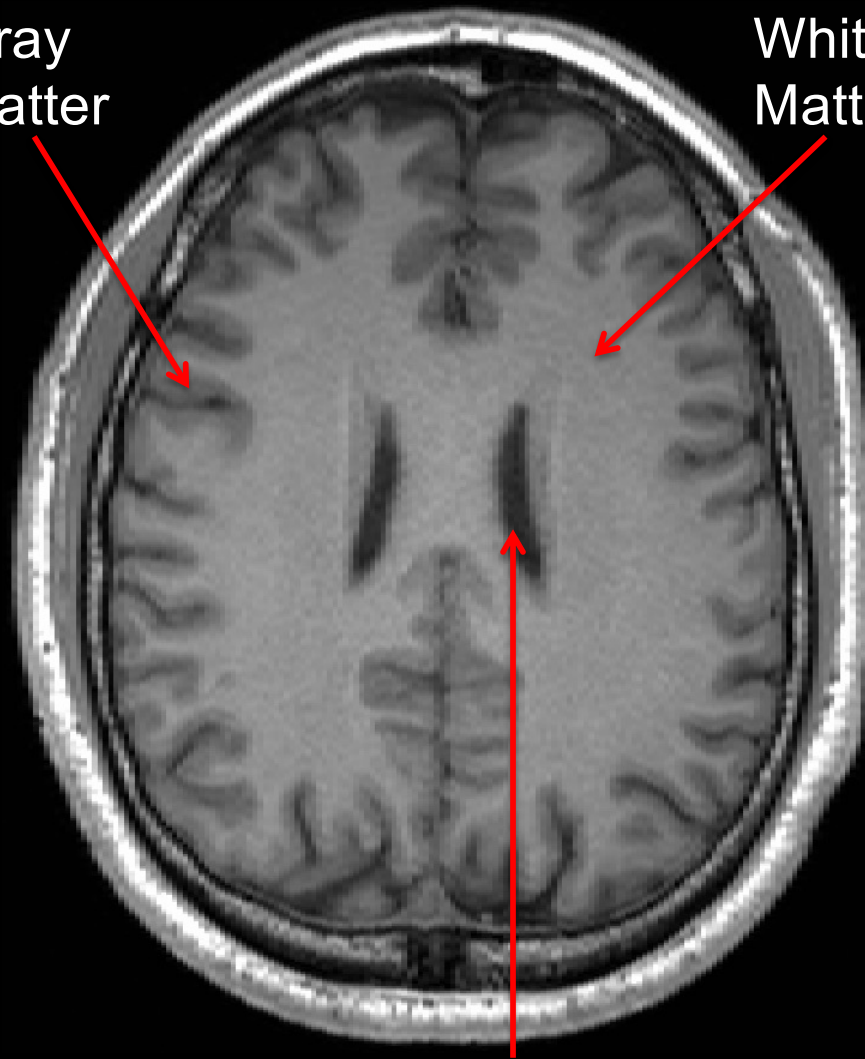


# T<sub>1</sub>W image - a powerful tool for Radiologists

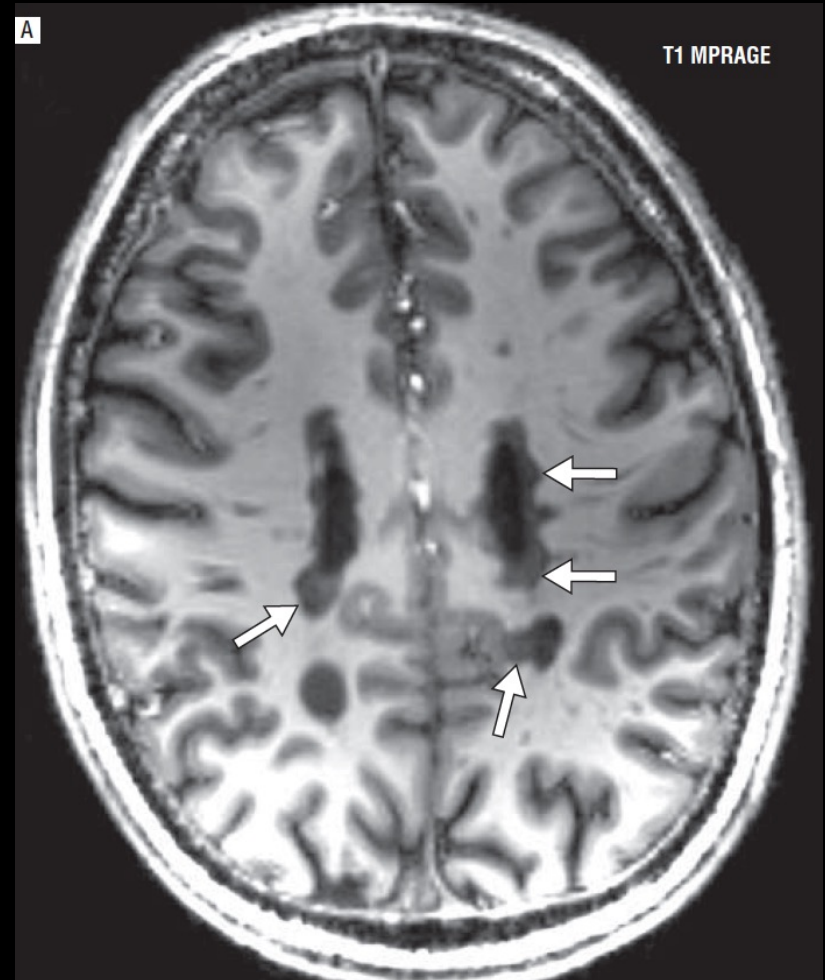
< 6 minutes

Gray Matter

White Matter



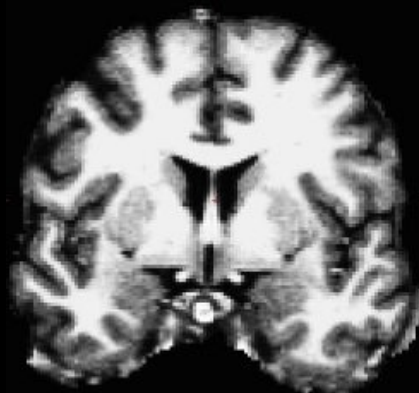
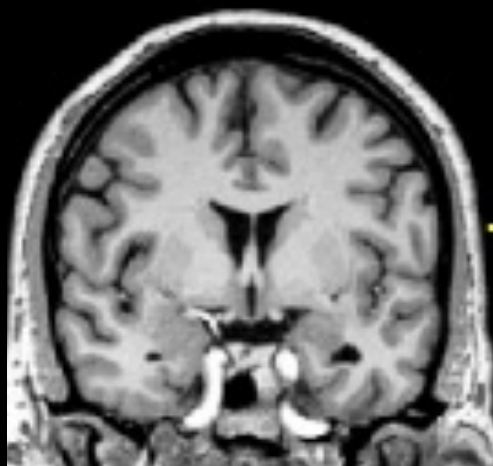
Cerebrospinal Fluid (CSF)



Neuroinflammatory Lesion



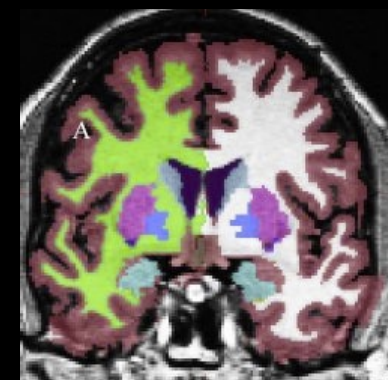
# Automatically derive anatomically meaningful measures of Volume



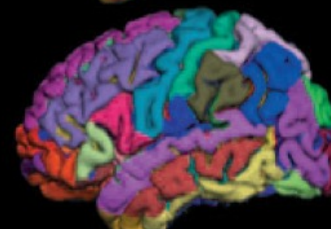
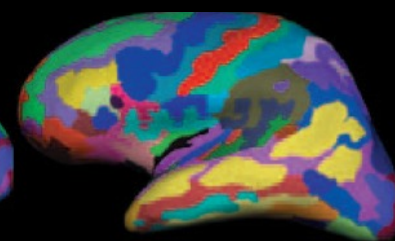
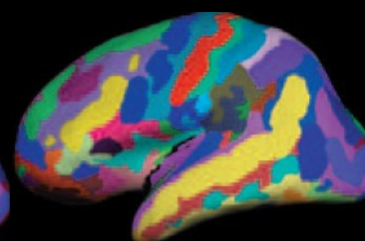
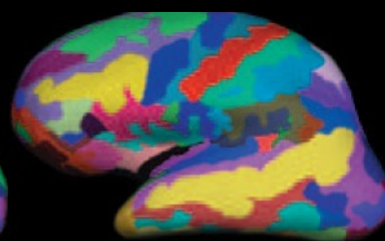
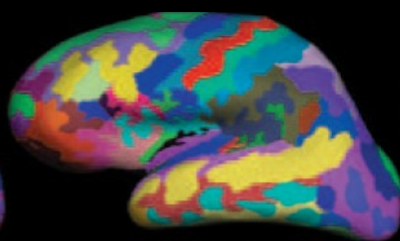
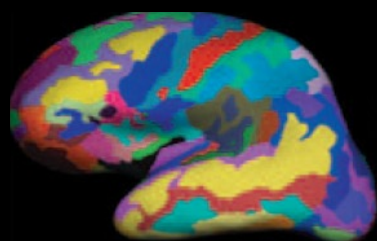
Skull strip



Segment

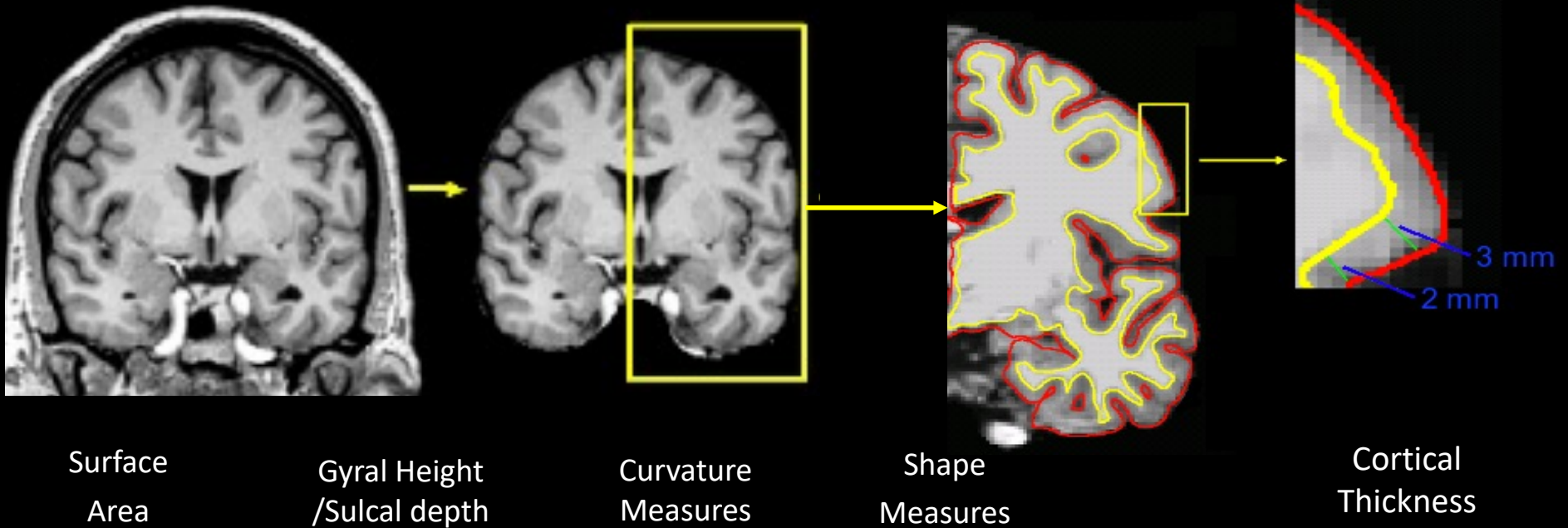


Parcellate



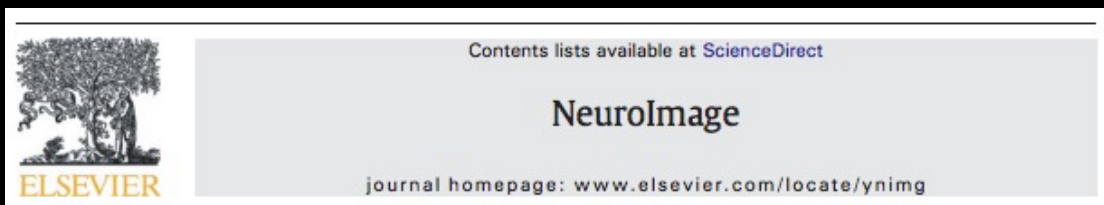
Compute Subject – Specific Measure of volume of cortical areas

# Automatically compute second-order measures like Cortical Thickness & Gray Matter Density



Gray Matter Density

# T<sub>1</sub>W Morphometry - A powerful tool for Brain Research



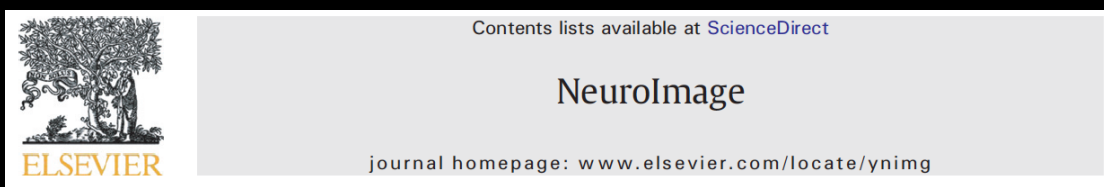
Aging

Longitudinal changes in cortical thickness associated with normal aging



Autism

Longitudinal changes in cortical thickness in autism and typical development



Brain Training

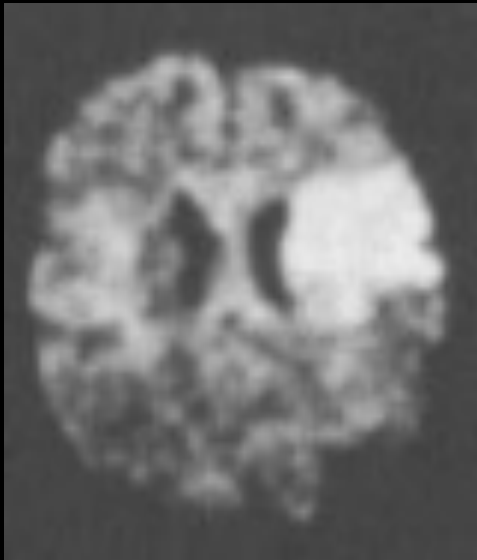
Effects of memory training on cortical thickness in the elderly



# Diffusion MRI - a powerful tool for Radiologists



- T<sub>2</sub>W image ~3 hrs post onset of stroke symptoms
- Shows a chronic infarct in subcortical WM



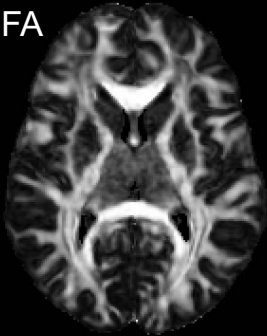
- DWI image ~3 hrs post onset of symptoms
- Decrease in water diffusion shows an acute infarct extending from temporal to frontal lobe





# Maps from the Diffusion Tensor

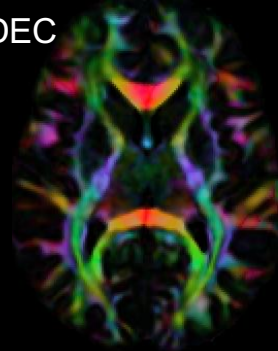
FA



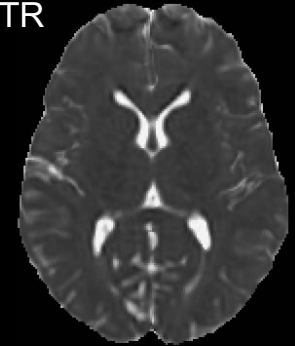
$$\frac{\sqrt{(\lambda_1 - \lambda_2)^2 + (\lambda_1 - \lambda_3)^2 + (\lambda_2 - \lambda_3)^2}}{\sqrt{(\lambda_1 + \lambda_2 + \lambda_3)^2}}$$

$$\sqrt{(\lambda_1 + \lambda_2 + \lambda_3)^2}$$

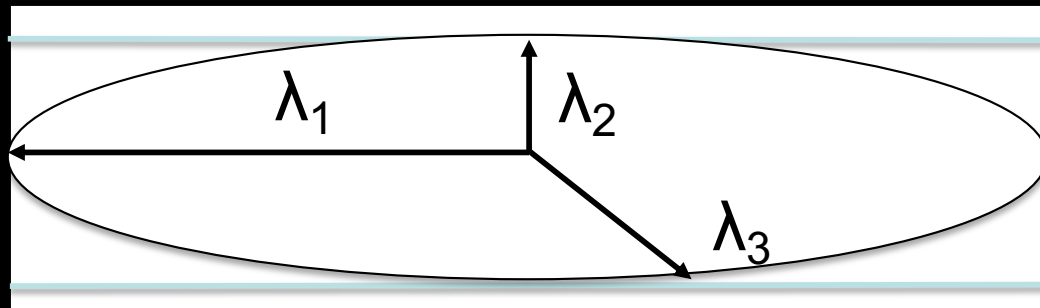
DEC



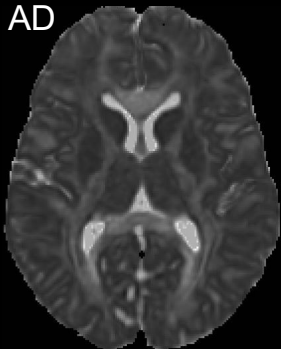
MD/TR



$$\lambda_1 + \lambda_2 + \lambda_3$$

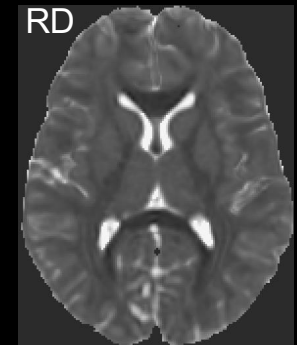


AD



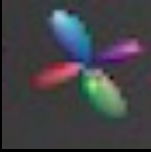
$$\lambda_1$$

RD

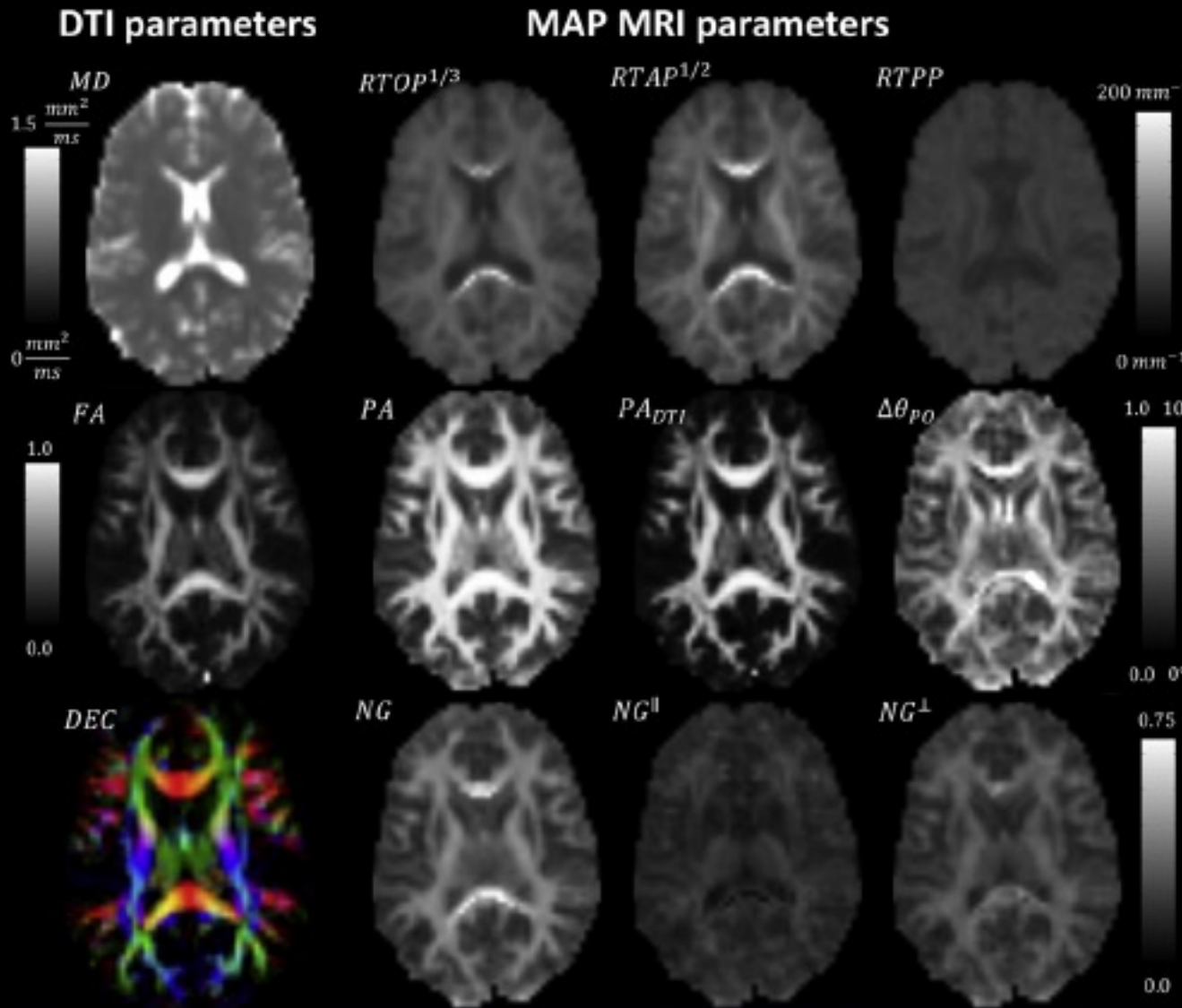


$$\frac{\lambda_2 + \lambda_3}{2}$$

2

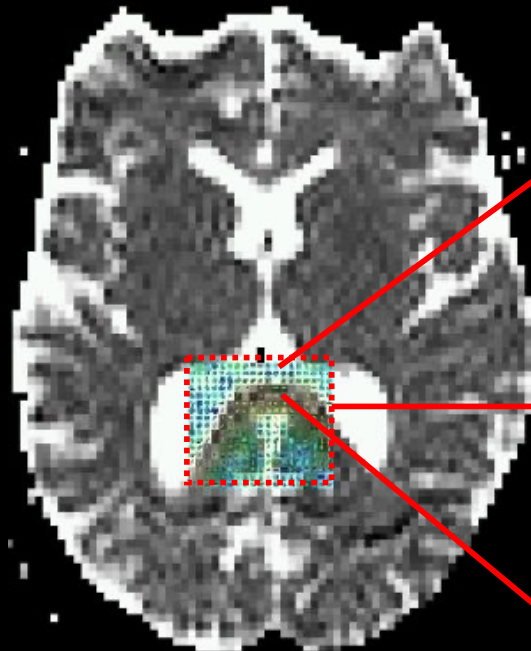


# Maps from the Diffusion Propagator

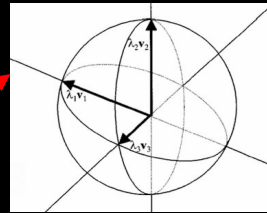


- A host of new diffusivity measures (See Avram 2016)
- Offers comprehensive characterization of tissue microstructure
- Other measures like diffusion kurtosis (Jensen et al 2005)
- Neurite orientation Dispersion and Density imaging (NODDI) (Zhang et al 2012)
- See Review by Hutchinson et al., J Neuro – Research 2017

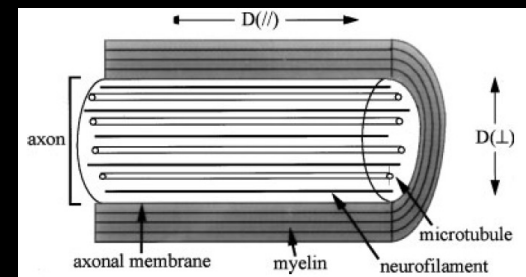
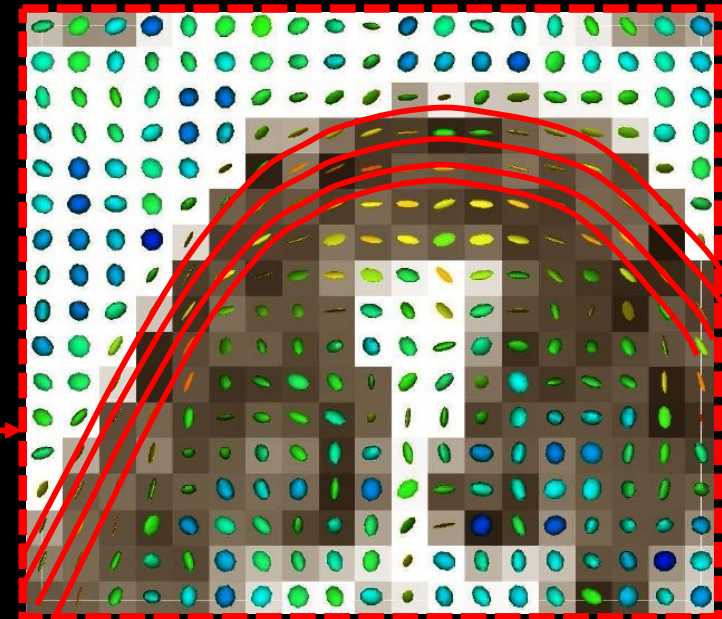
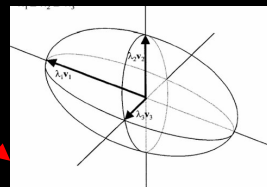
# From Diffusion displacement profile to white matter pathways



Isotropic



Anisotropic



Tract Volume, Fractional Anisotropy , Mean diffusivity, Radial Diffusivity,

# Diffusion MRI- A powerful tool for Brain Research

## Longitudinal Development of Human Brain Wiring Continues from Childhood into Adulthood

Catherine Lebel and Christian Beaulieu

Brain  
Development

## Longitudinal Changes in the Corpus Callosum following Pediatric Traumatic Brain Injury

Trevor C. Wu<sup>a</sup> Elisabeth A. Wilde<sup>d,e</sup> Erin D. Bigler<sup>a-c</sup> Xiaoqi Li<sup>d</sup>  
Tricia L. Merkley<sup>a</sup> Ragini Yallampalli<sup>d</sup> Stephen R. McCauley<sup>d,f</sup>  
Kathleen P. Schnelle<sup>d</sup> Ana C. Vasquez<sup>d</sup> Zili Chu<sup>g,i</sup> Gerri Hanten<sup>d</sup>  
Jill V. Hunter<sup>g,i</sup> Harvey S. Levin<sup>d,h</sup>

TBI

Neuron  
Article

Cell  
PRESS

## Learning in the Fast Lane: New Insights into Neuroplasticity

Yaniv Sagi,<sup>1,2</sup> Ido Tavor,<sup>1,2</sup> Shir Hofstetter,<sup>1</sup> Shimrit Tzur-Moryosef,<sup>1</sup> Tamar Blumenfeld-Katzir,<sup>1</sup> and Yaniv Assaf<sup>1,\*</sup>

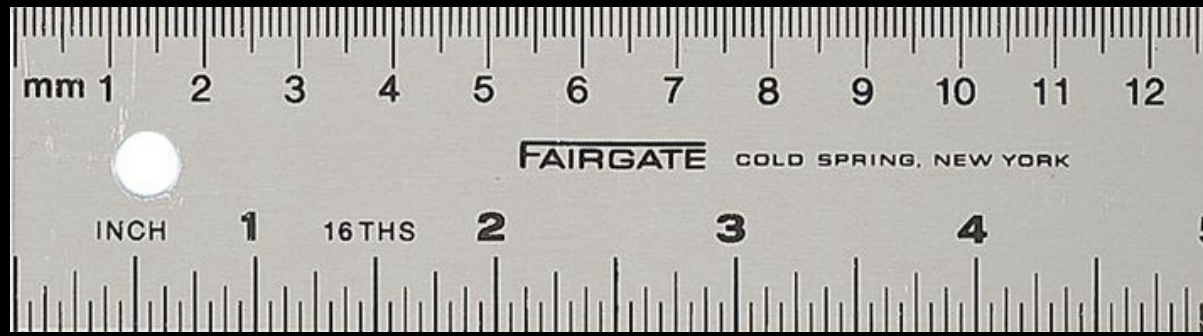
Brain Training

# Outline





# Scanner related factors that impact MRI measures



## Reliability of MRI-derived measurements of human cerebral cortical thickness: The effects of field strength, scanner upgrade and manufacturer

Xiao Han,<sup>a,b</sup> Jorge Jovicich,<sup>a,b</sup> David Salat,<sup>a,b</sup> Andre van der Kouwe,<sup>a,b</sup> Brian Quinn,<sup>a,b</sup> Silvester Czanner,<sup>a,b</sup> Evelina Busa,<sup>a,b</sup> Jenni Pacheco,<sup>a,b</sup> Marilyn Albert,<sup>d,e</sup> Ronald Killiany,<sup>f</sup> Paul Maguire,<sup>g</sup> Diana Rosas,<sup>a,b,c</sup> Nikos Makris,<sup>a,b,h</sup> Anders Dale,<sup>i</sup> Bradford Dickerson,<sup>a,c,d,j,l</sup> and Bruce Fischl<sup>a,b,k,\*,l</sup>

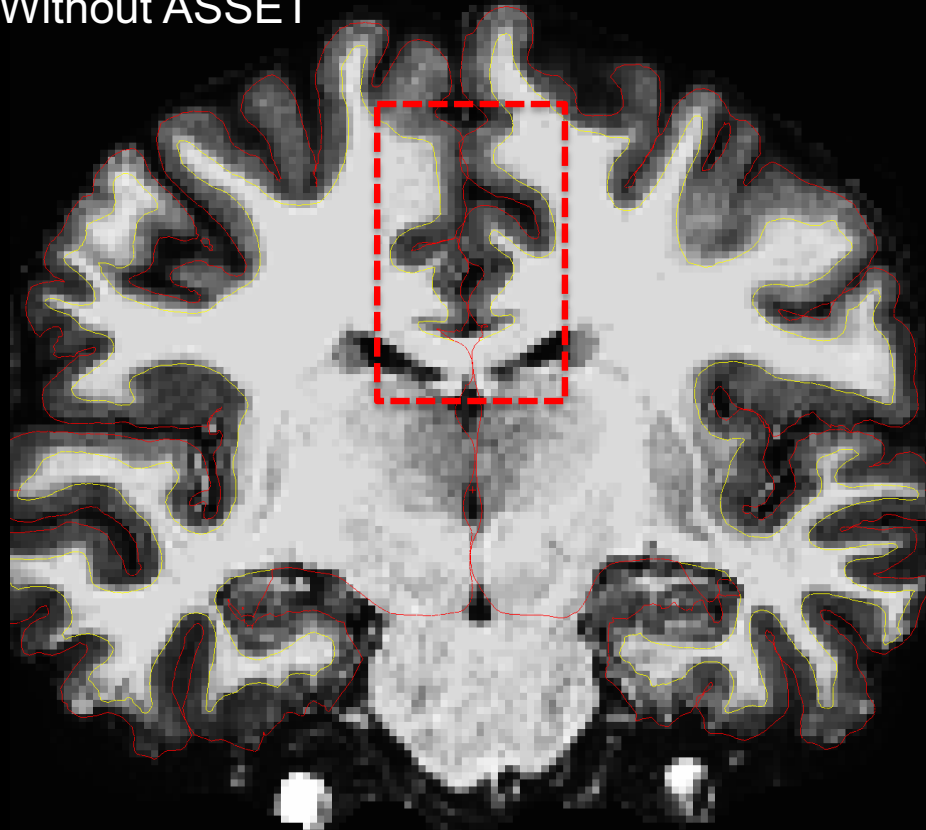
- MRI measures of brain structure can vary with
  - Scanner Type, Field Strength, Scanner OS platform, Coil ...
  - Important to keep in mind when using MRI databanks



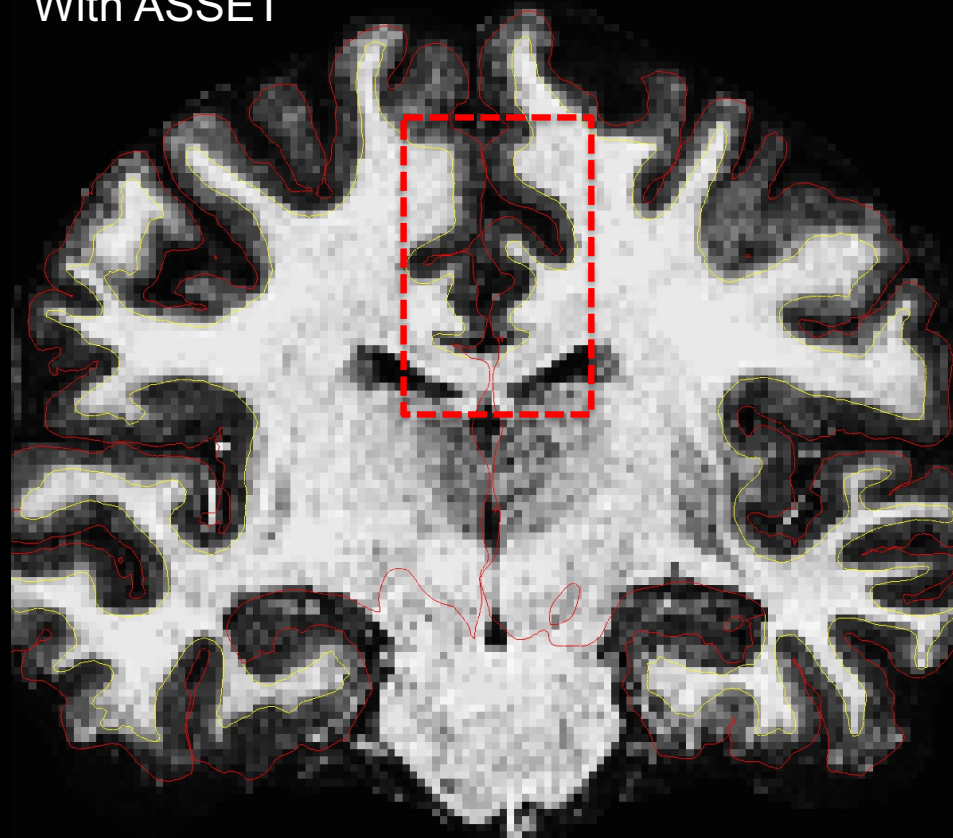
## Sequence specific factors that impact $T_1W$ -measures



Without ASSET



With ASSET



- MPRAGE, MEMPRAGE, High field MP2RAGE
- Better SNR without parallel imaging, but risk of motion
- Impacts measures like cortical thickness etc (Wonderlick et al., Neuroimage 2009)
- **Solution: Consider Subject demographics or 2 sets of accelerated  $T_1W$  images**

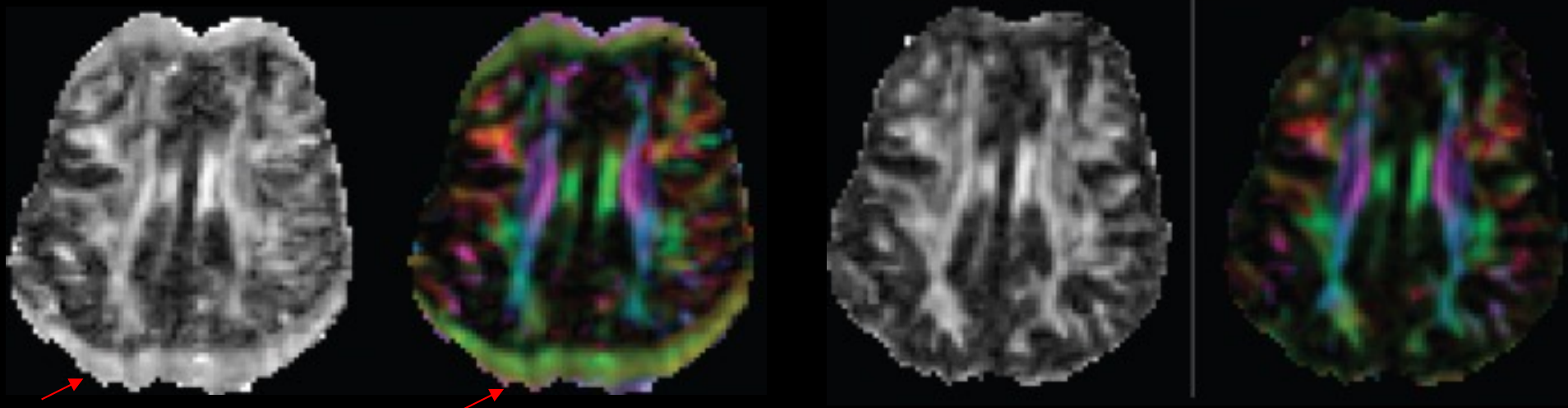


## Sequence specific factors that impact DTI measures



Eddy Current Distortions

After Correction



- Caused by rapidly switching gradients
- Distorts images, alters actual diffusion sensitization
- **Solution: Correctable in TORTOISE & latest version of FSL**



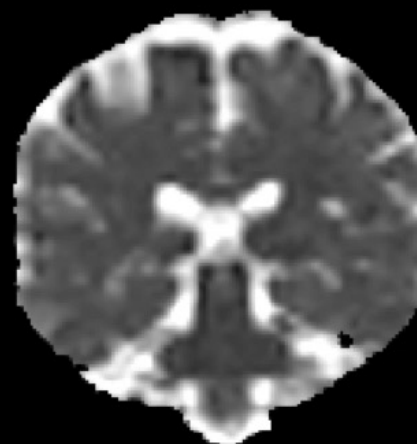
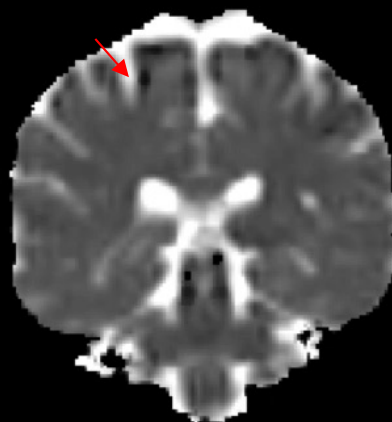
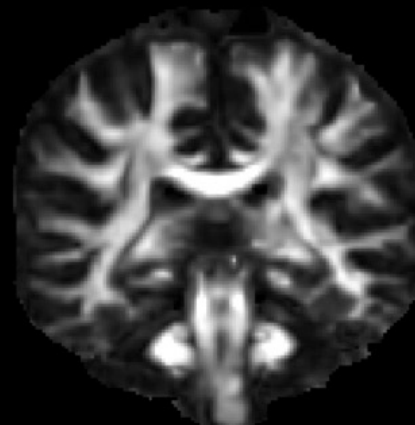
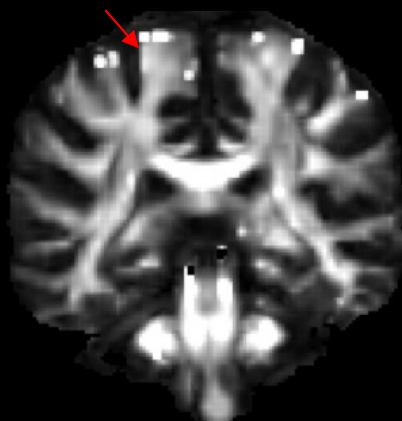


## Sequence specific factors that impact DTI measures



Gibbs Ringing

After Correction



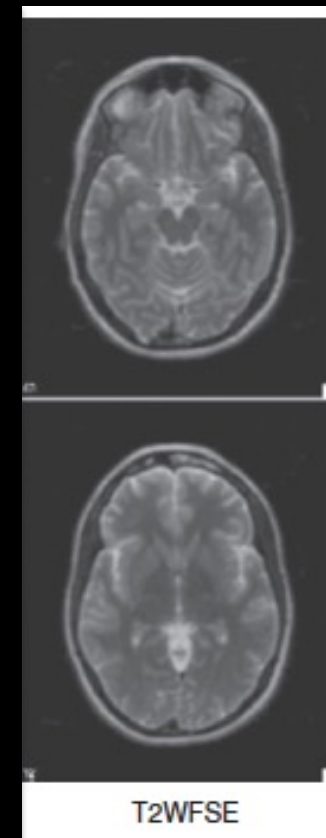
- Caused by sharp image transitions
- Distorts diffusivity measures
- **Solution: Correctable if you use TORTOISE**



## Sequence specific factors that impact DTI measures



### EPI Distortions



- Caused by  $B_0$  field inhomogeneities (Jezzard and Balaban, 1995)
- Distorts images in phase encode direction in some brain regions
- Messes up tractography but not DTI measures, **correctable**

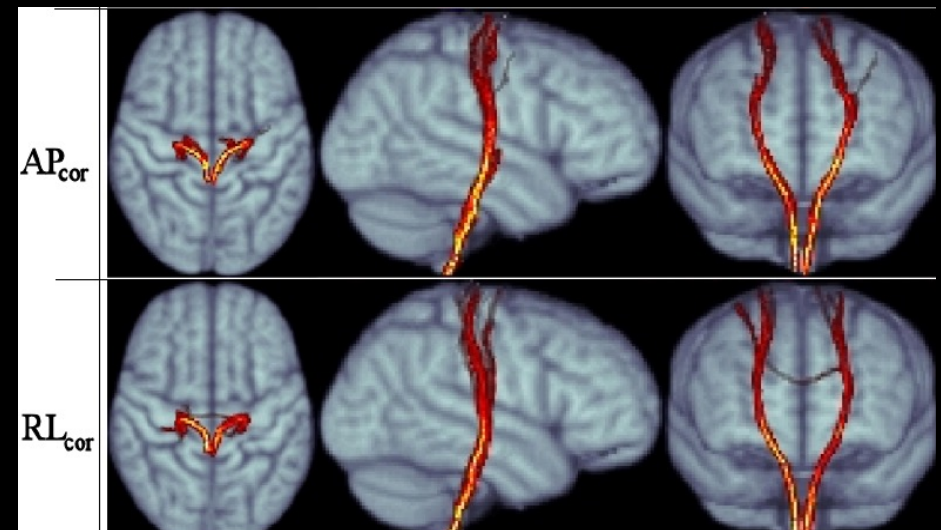
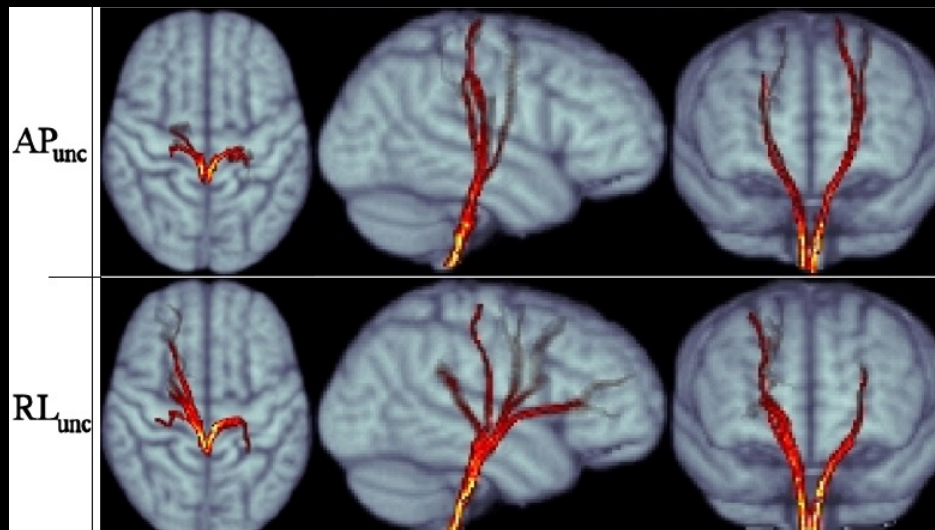


## Sequence specific factors that impact DTI measures



Before EPI Distortion Correction

After EPI Distortion Correction



*Irfanoglu et al, 2012*

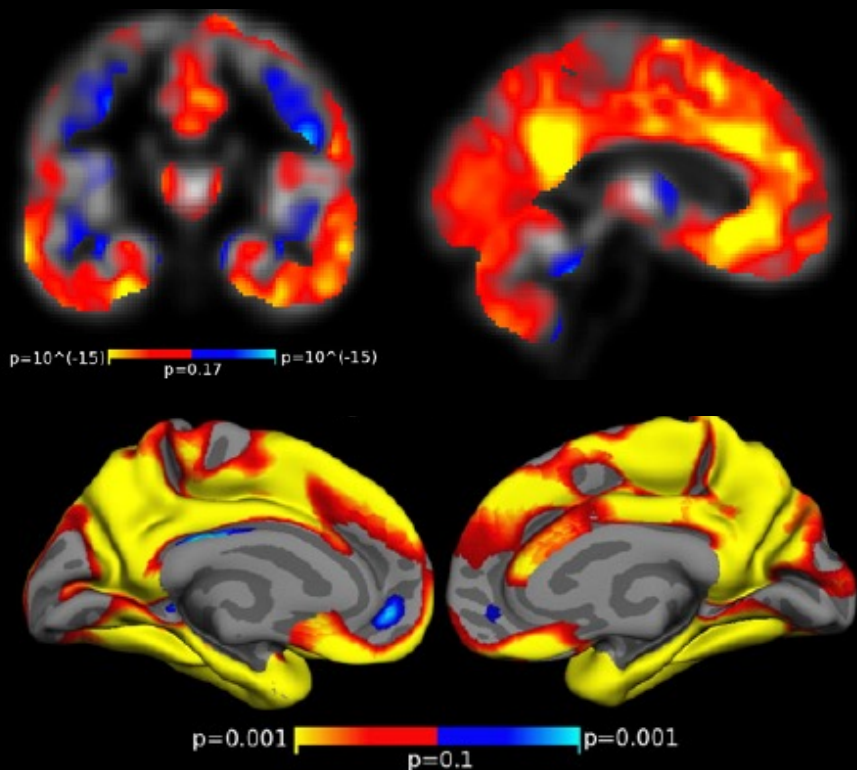
- Trajectory of the Corticospinal tracts heavily distorted without correction
- **Solution: Acquire Blip up/Down, use TORTOISE**



# Subject factors that impact measures of T<sub>1</sub>W Morphometry



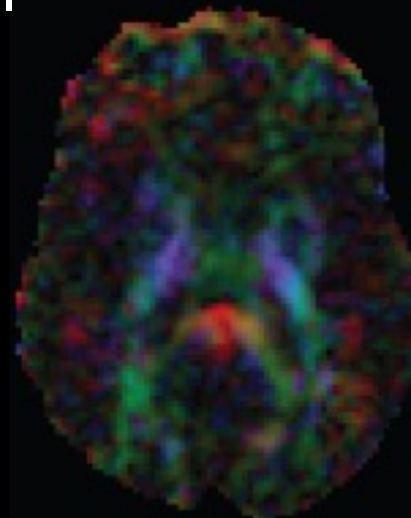
## Subject head motion (T1W)



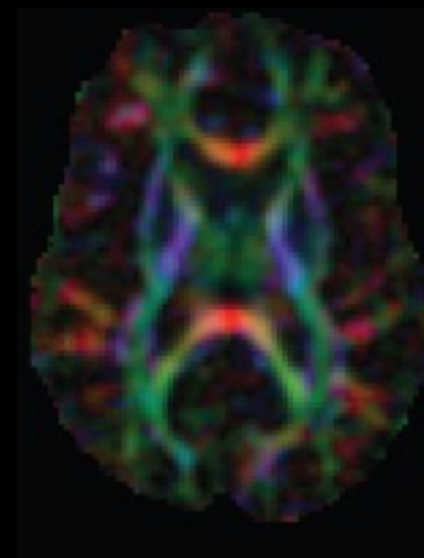
- Head motion impacts GMV and CT estimates
- 2mm/min motion -> ~1.4 – 2 % GMV loss
- **Solution: Use PROMO, better padding etc**

## DWI

Before Correction



After Correction using TORTOISE







# Subject factors that impact measures of T<sub>1</sub>W Morphometry



## Blood Pressure on T<sub>1</sub>W imaging



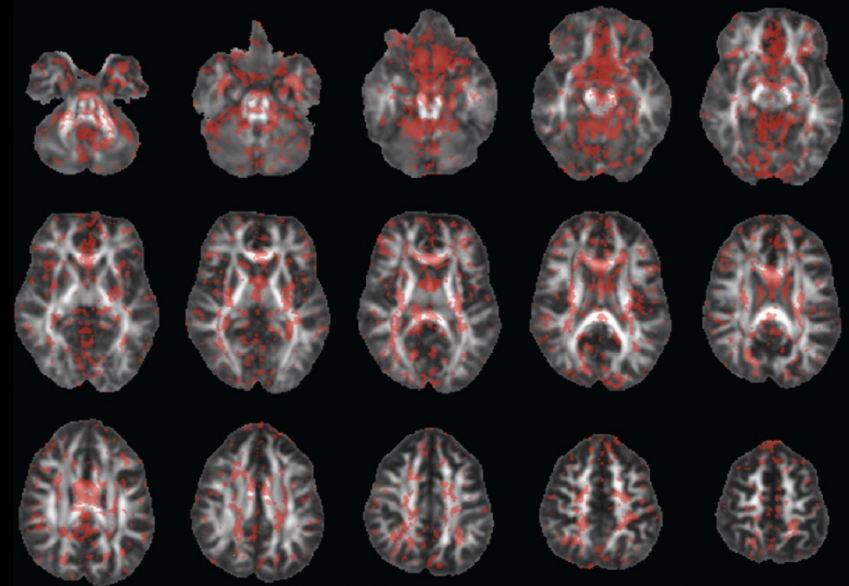
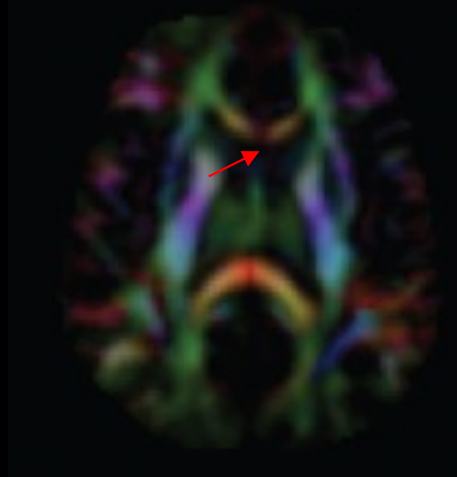
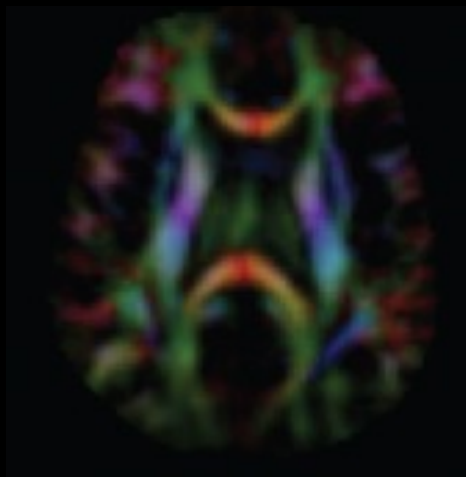
Schaare et al., HBM 2017

- GMD/GMV /CT estimates may be spurious in specific brain regions

## Cardiac Pulsation on DWI

Diastole

Systole



- Solution: identify outlier voxels and remove using TORTOISE



## Data processing factors that impact MRI measures



OPEN ACCESS Freely available online



# The Effects of FreeSurfer Version, Workstation Type, and Macintosh Operating System Version on Anatomical Volume and Cortical Thickness Measurements

Ed H. B. M. Gronenschild<sup>1,2\*</sup>, Petra Habets<sup>1,2</sup>, Heidi I. L. Jacobs<sup>1,2,3</sup>, Ron Mengelers<sup>1,2</sup>, Nico Rozendaal<sup>1,2</sup>, Jim van Os<sup>1,2,4</sup>, Machteld Marcelis<sup>1,2</sup>

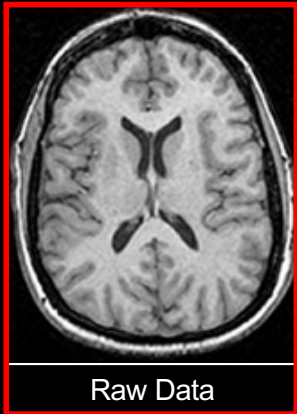
- MRI measures of brain structure can vary with Computer OS, Software Version
- **Solution: Pick a stable version and stick to it**



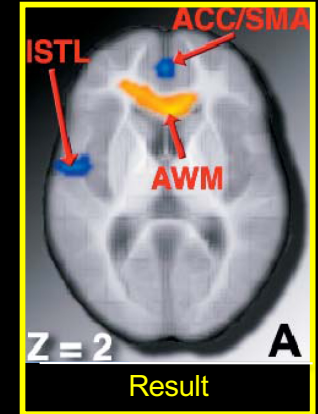
# Data processing factors that impact MRI measures



From Raw data to statistical maps data undergoes several transformations



Raw Data



Result

From Nicola Hobbs & Marianne Novak

Several biases can be introduced



NeuroImage

www.elsevier.com/locate/ynimg  
NeuroImage 26 (2005) 546–554

Results and inferences differ with smoothing levels

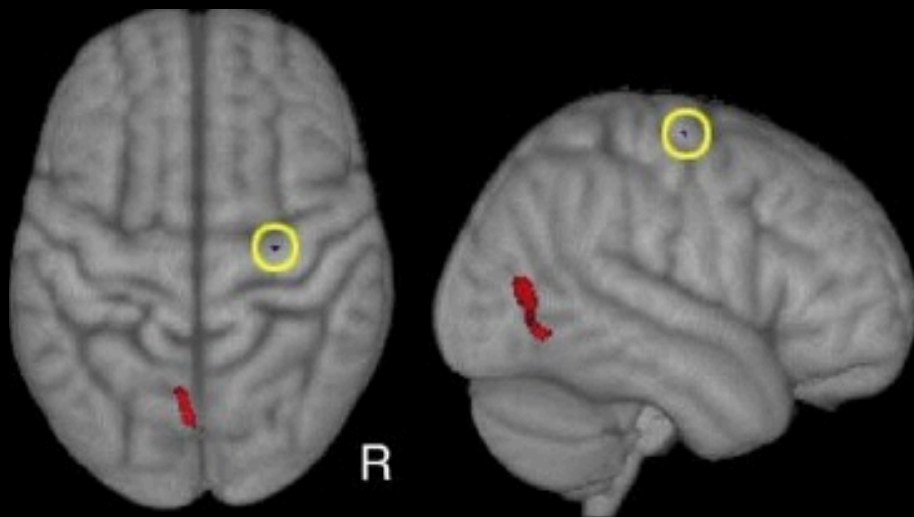
The effect of filter size on VBM analyses of DT-MRI data

Derek K. Jones,<sup>a,b,\*</sup> Mark R. Symms,<sup>c</sup> Mara Cercignani,<sup>d</sup> and Robert J. Howard<sup>e</sup>

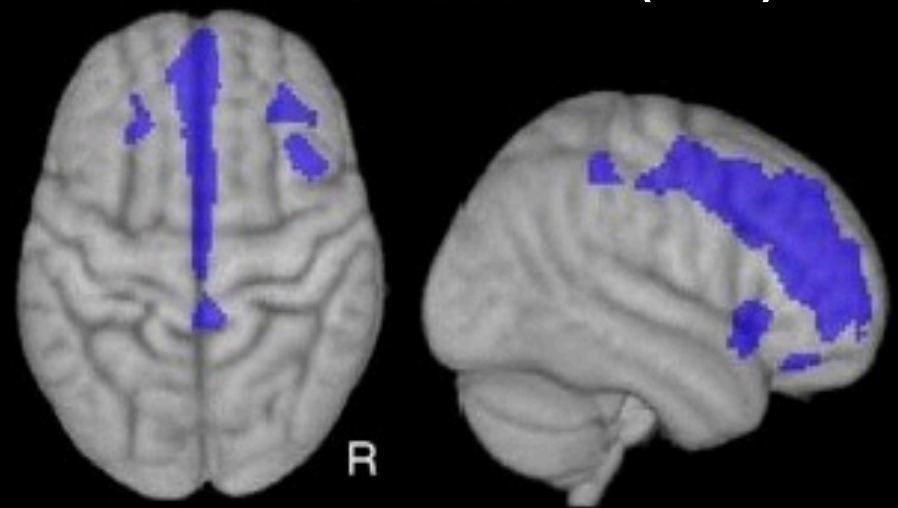
## Same data – different software – different results

Subject trained in a visuo-motor task  
Behavioral evidence for training effect  
fMRI evidence for training effect  
Structural changes following training?

**Method A (SPM2)**



**Method B (FSL)**



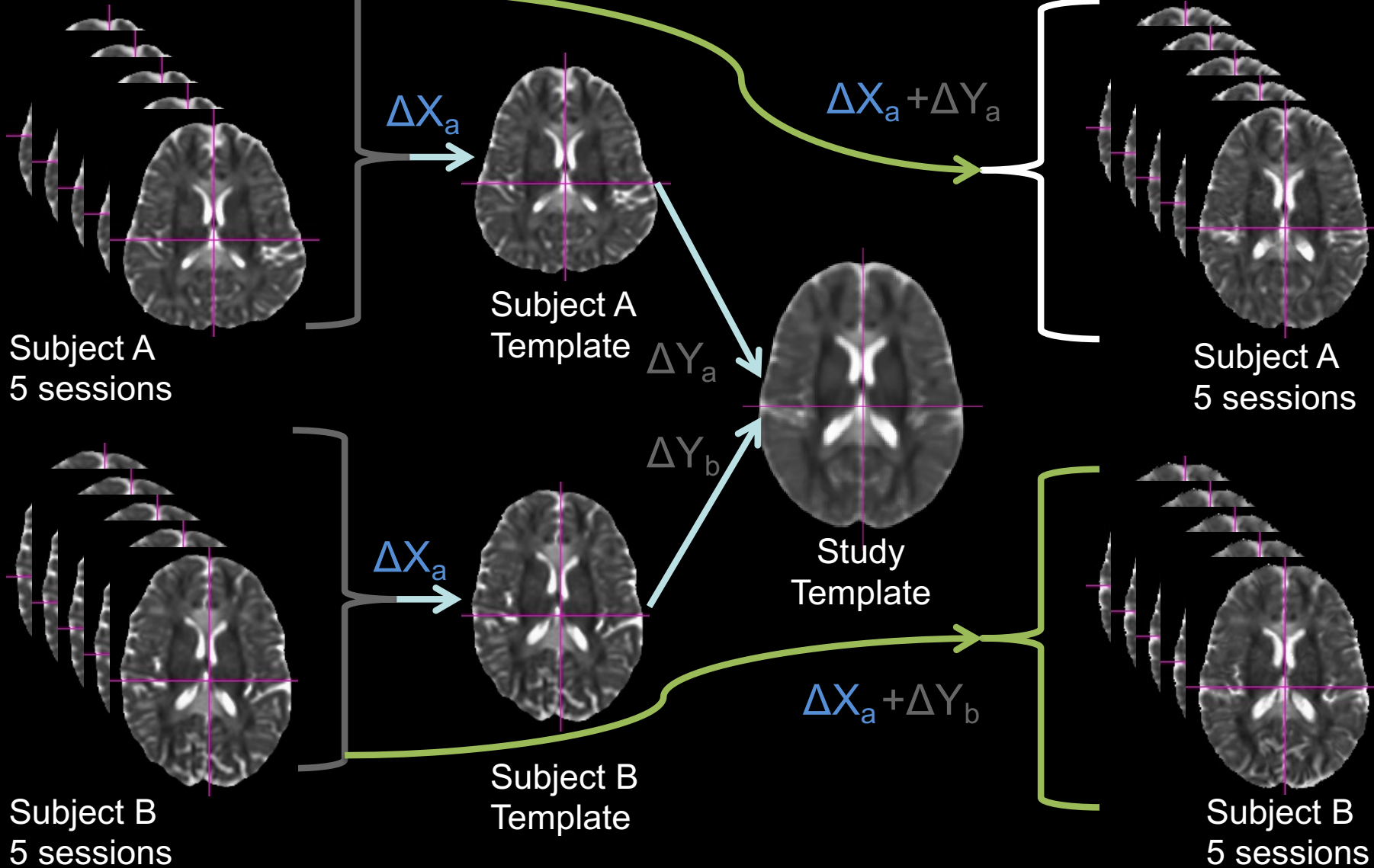
- Solution: Be aware of these issues, test reproducibility with different packages
- Talk to your local statistics guru



# Transforming brains from native space to a standard space using the full diffusion tensor (DR-TAMAS)

Native Space

Study Space





## Some Practical recommendations



- Pick a stable scanner – Stick to it
- Pick a robust MRI sequence
  - Talk to an MRI physicist about the study goals
  - Better data comes at a cost
- Pick a stable pipeline for data processing – Stick to it
  - Freesurfer for surface based analysis
  - FSL/SPM – VBM pipeline
  - TORTOISE - Diffusion MRI processing (Corrects for Eddy, Gibbs ringing, motion, EPI)
- QC images as you collect them at the scanner, QC after!
- Be consistent with your instructions to the subject




# Some reading recommendations



Contents lists available at ScienceDirect

**NeuroImage**


journal homepage: [www.elsevier.com/locate/ynimg](http://www.elsevier.com/locate/ynimg)



Full Length Articles

**Advanced MRI techniques to improve our understanding of experience-induced neuroplasticity**

Christine Lucas Tardif <sup>a,\*</sup>, Claudine Joëlle Gauthier <sup>a,b,\*\*</sup>, Christopher John Steele <sup>a</sup>, Pierre-Louis Bazin <sup>a</sup>, Andreas Schäfer <sup>c</sup>, Alexander Schaefer <sup>d</sup>, Robert Turner <sup>c</sup>, Arno Villringer <sup>a</sup>



## REVIEW

FOCUS ON HUMAN BRAIN MAPPING

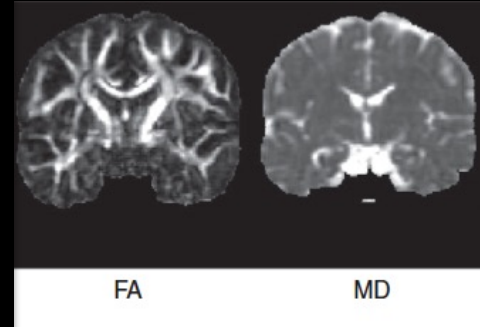
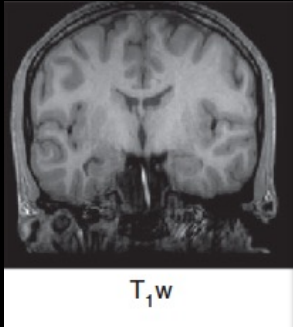
nature  
neuroscience

## Studying neuroanatomy using MRI

Jason P Lerch<sup>1,2</sup>, André J W van der Kouwe<sup>3,4</sup>, Armin Raznahan<sup>5</sup>, Tomáš Paus<sup>6-8</sup>, Heidi Johansen-Berg<sup>9</sup>, Karla L Miller<sup>9</sup>, Stephen M Smith<sup>9</sup>, Bruce Fischl<sup>3,4,10</sup> & Sotirios N Sotiropoulos<sup>9,11</sup>

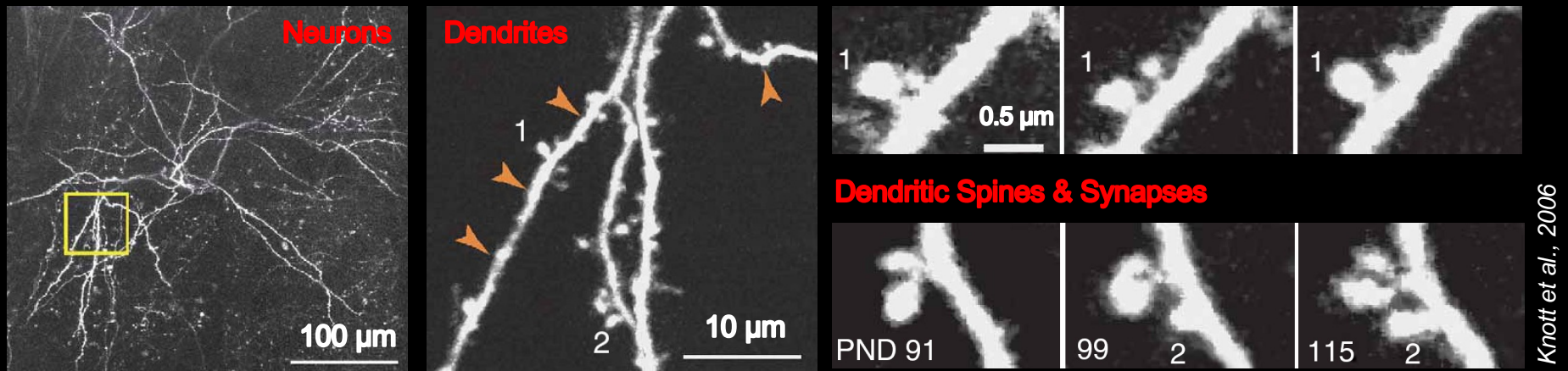
# Outline

- Review popular MRI methods used for measuring brain changes

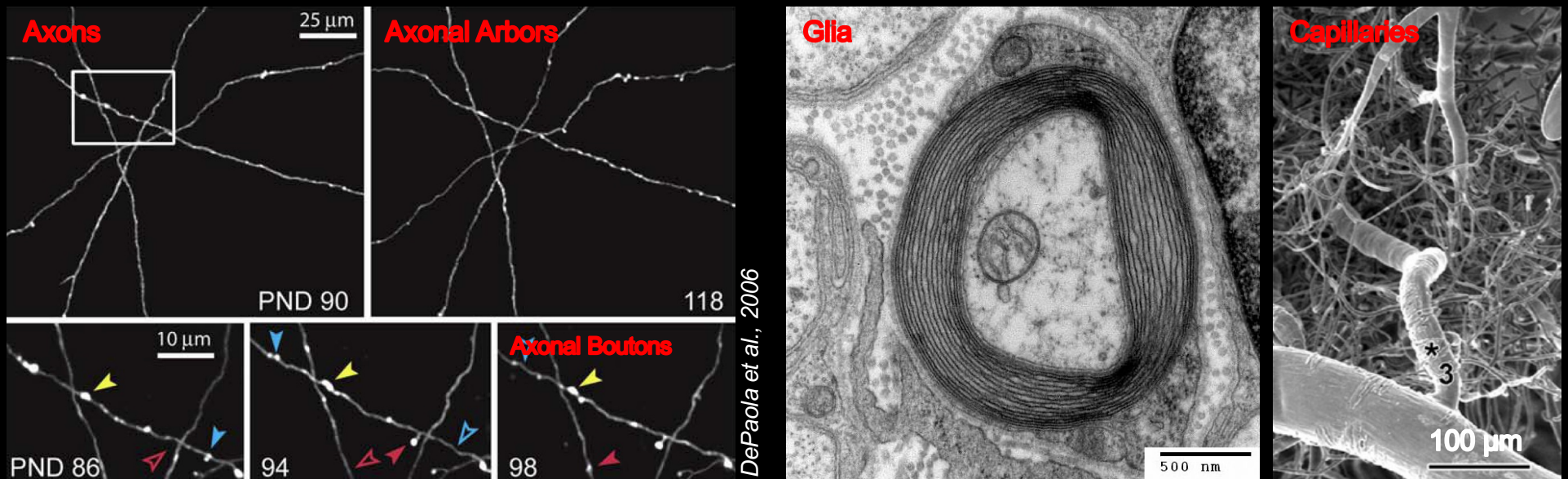


- The most important tool for imaging brain changes
- Good Experiment Design

# Some candidate brain structures that are likely to change

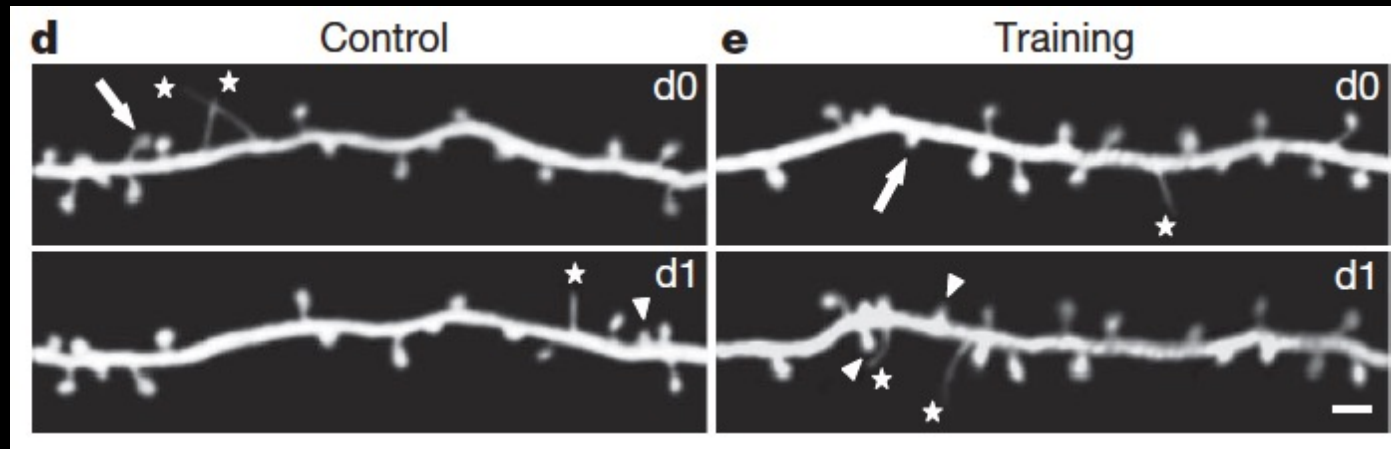
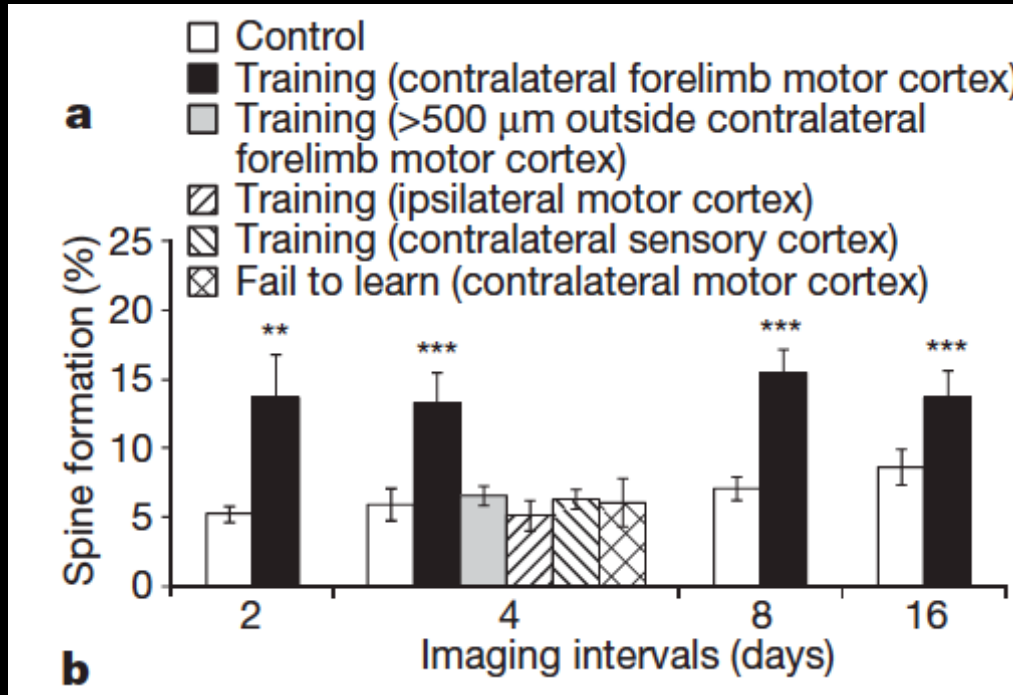
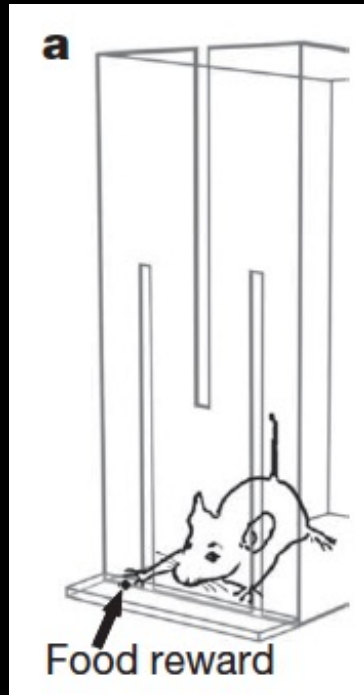


**Challenge: Is MRI robust enough to detect subtle structural changes given what we know of its limitations?**





# Lessons from animal models



- Motor learning in the adult brain is mediated by changes in dendritic spines
- Specificity to the trained group, task and brain region
- Human MRI – lower spatial resolution poor biological specificity
- Is there an experiment specific change?
- Where in the brain are the changes?
- “What” is changing is difficult

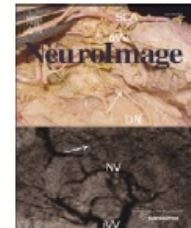
# A framework for assessing the robustness of training-dependent structural changes



Contents lists available at SciVerse ScienceDirect

NeuroImage

journal homepage: [www.elsevier.com/locate/ynimg](http://www.elsevier.com/locate/ynimg)



Review

Teaching an adult brain new tricks: A critical review of evidence for training-dependent structural plasticity in humans<sup>☆</sup>

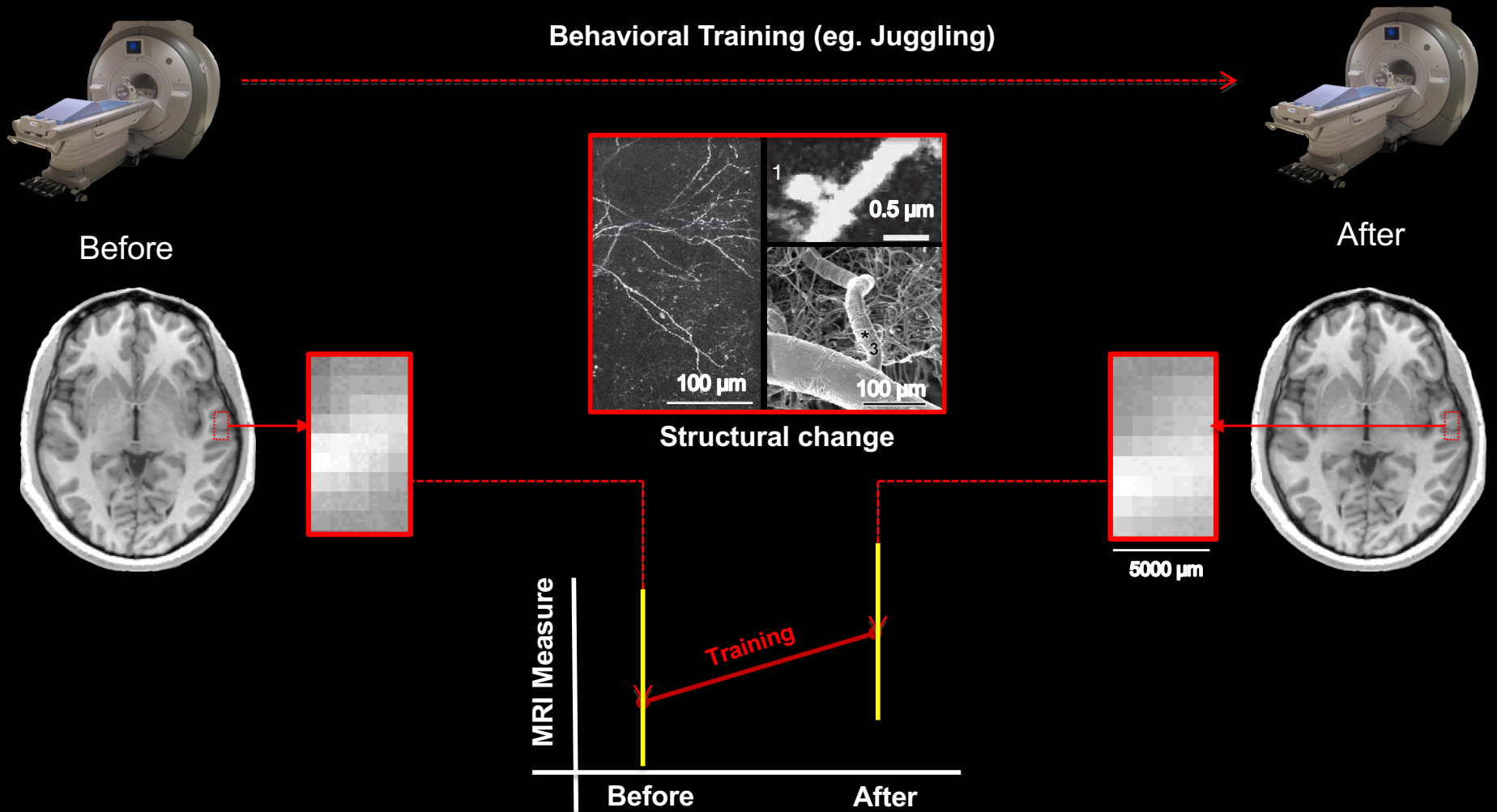
Cibu Thomas<sup>\*</sup>, Chris I. Baker

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Center for Neuroscience and Regenerative Medicine at the Uniformed Services University of the Health Sciences, Bethesda, MD, USA*

## 1. How specific are the changes?

- a. Training group
- b. Task
- c. Brain region

# Longitudinal Design - to demonstrate causality



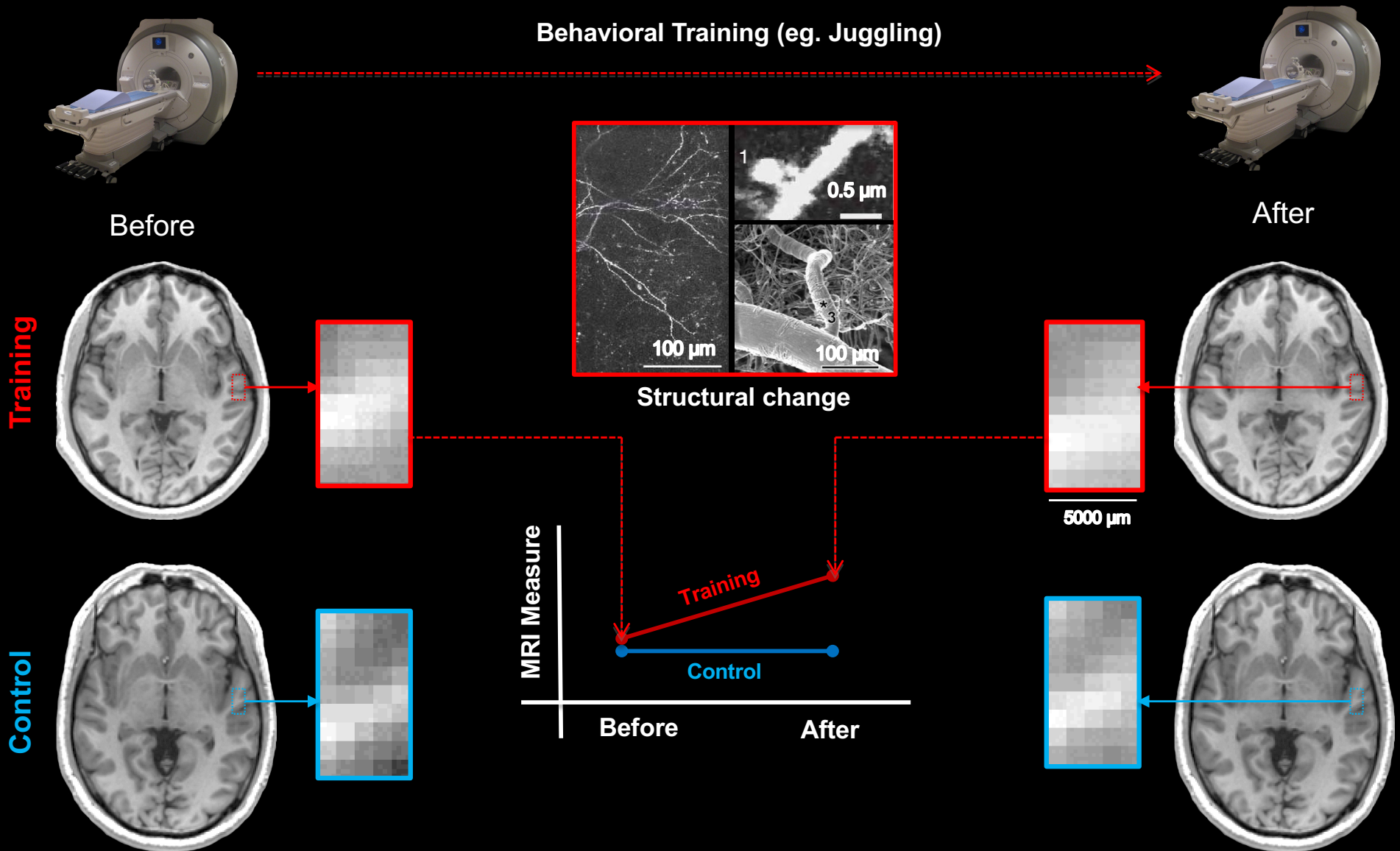
Training induced change in gray matter concentration/volume?

Difference could be due to measurement error or some other confound

Need to show specificity to group.

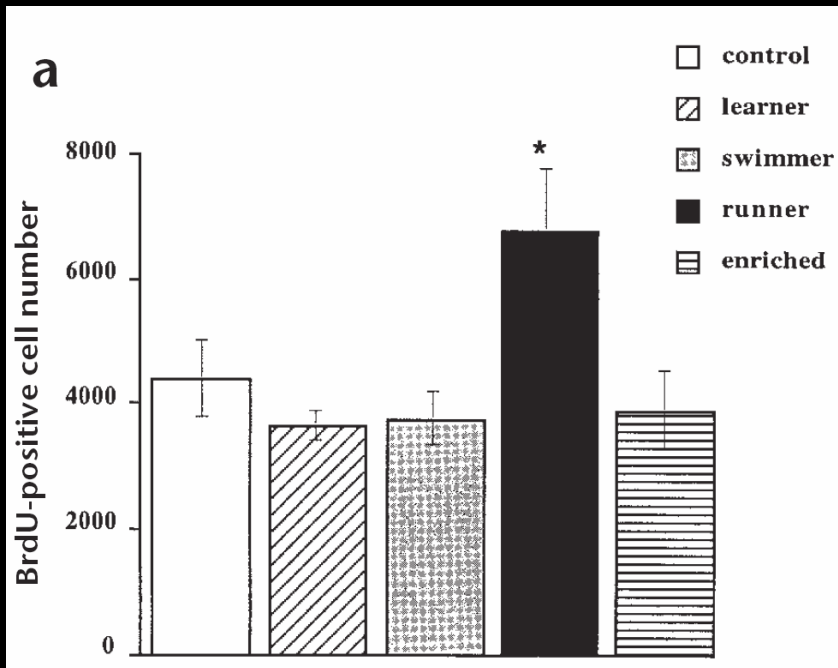


# Demonstrate specificity to the training group



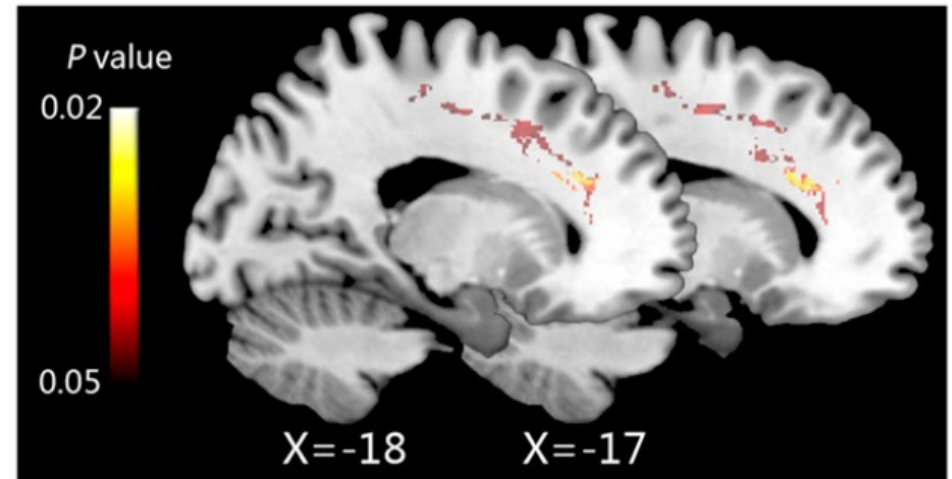
Test for a Group X Timepoint interaction

# Demonstrate specificity to the training task



*Van Praag et al 1999*

Increase in neurogenesis  
specific to running

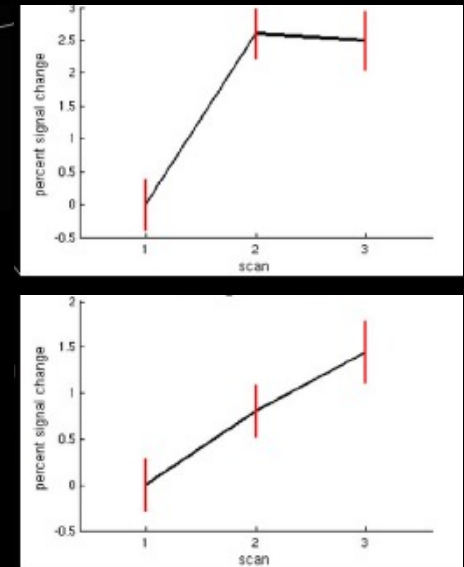
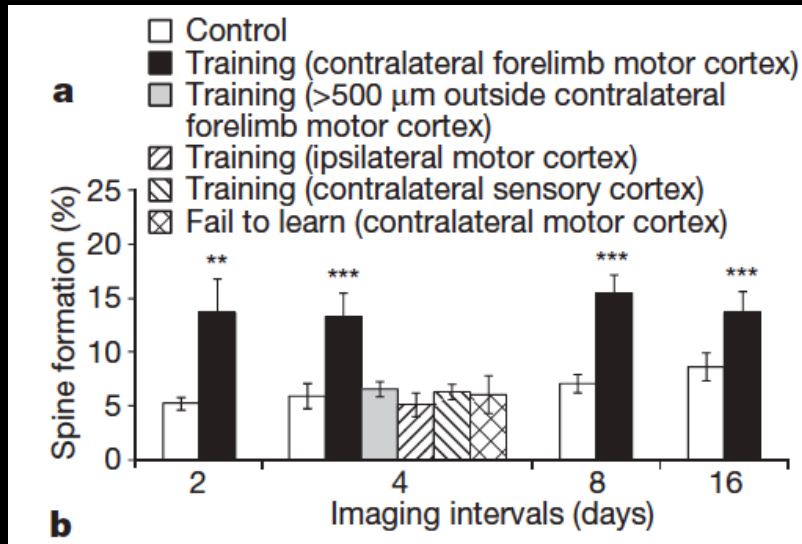


**Fig. 1.** Eleven hours of IBMT increases fiber integrity in the left anterior corona radiata (after versus before training, two sagittal sections,  $x = -17$  and  $-18$ ).

*Tang et al 2010*

- Two groups should be equated in terms of overall experience
- Control group more anxious, more head motion?
- Other confounds: difference in BP, respiration etc...

# Directly test if effect of training is specific to a brain region



*Draganski et al., J of Neuroscience, 2006*

Training effects specific to brain region.

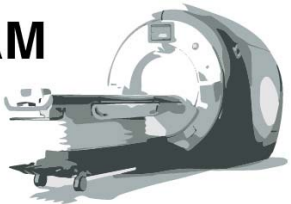
- Maps only show change relative to baseline
- Claim: Profile of structural change different across brain regions
- Test using Group x time x region interaction

# How does learning vs mastering a motor skill change the human brain?

Visit 1

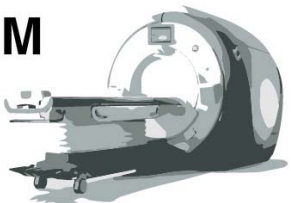
N = 20, 11 F, Age Range: 20-38

AM



Rest

PM

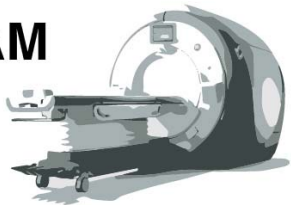


# How does learning vs mastering a motor skill change the human brain?

Visit 1

Visit 2

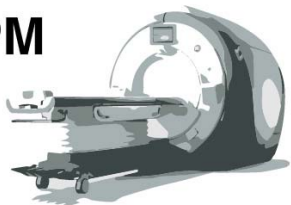
AM



Rest

Right Lateralized  
Visuo-Spatial Training  
Video Game

PM





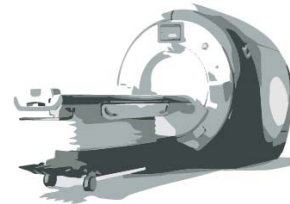
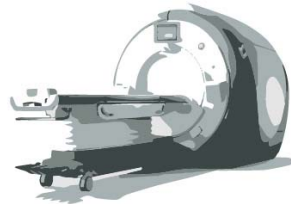
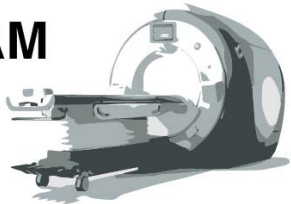
# How does learning vs mastering a motor skill change the human brain?

Visit 1

Visit 2

Visit 3

AM

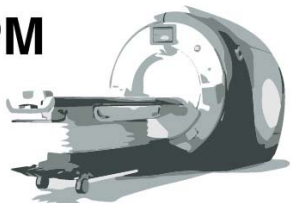


Rest

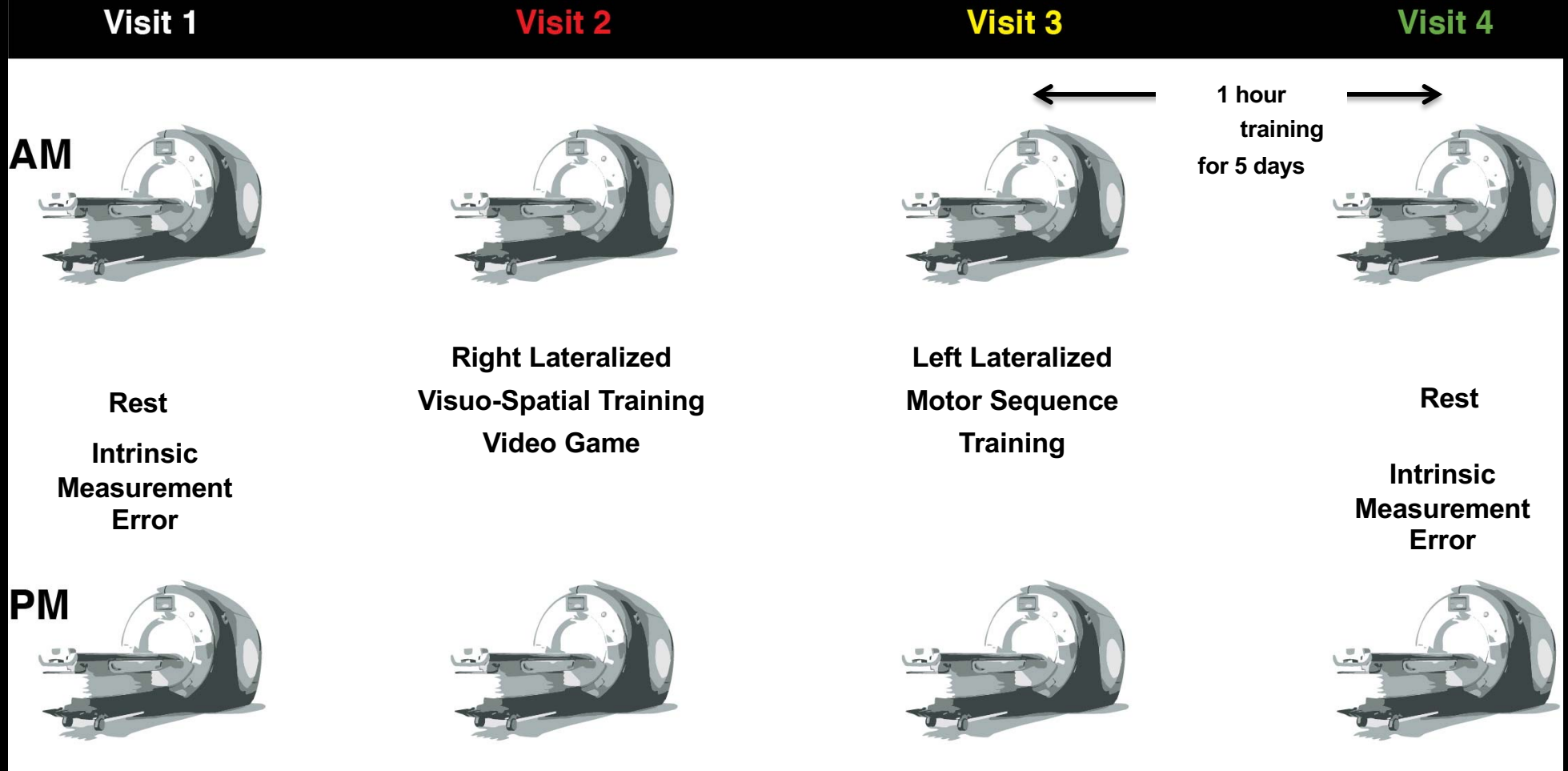
Right Lateralized  
Visuo-Spatial Training  
Video Game

Left Lateralized  
Motor Sequence  
Training

PM

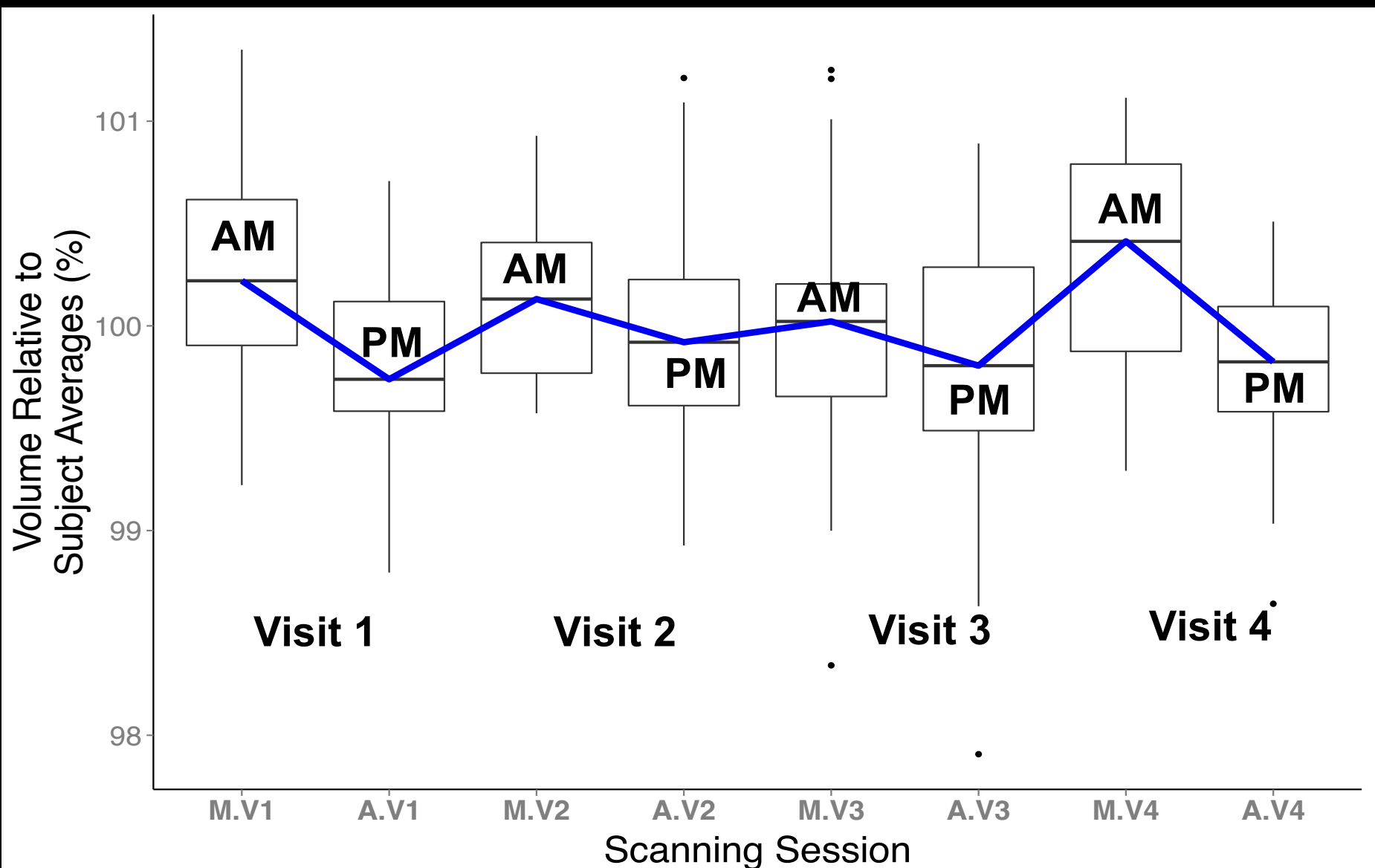


# How does learning vs mastering a motor skill change the human brain?



Multimodal MRI: T1W images, advanced DWI, Resting State fMRI (Two Datasets each)

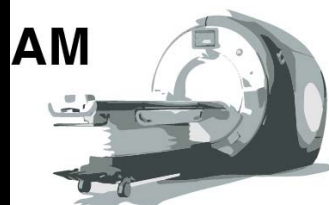
# Significant changes in total brain volume from AM to PM



# 16/19 participants shows a reduction in total brain parenchymal volume

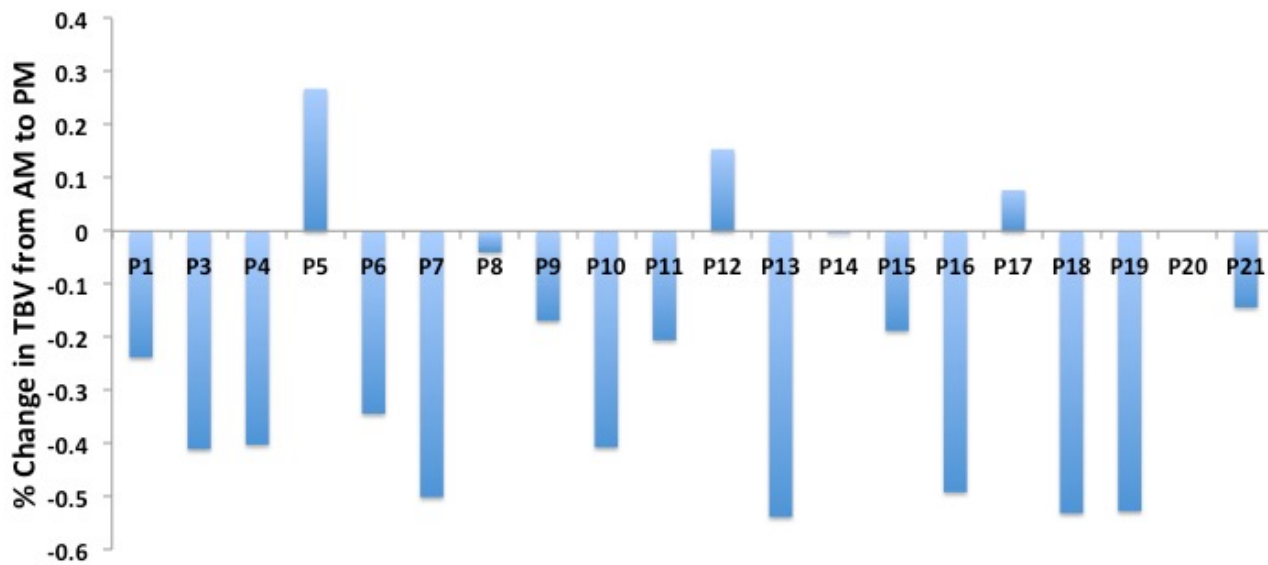
Visit 1

Visit 4

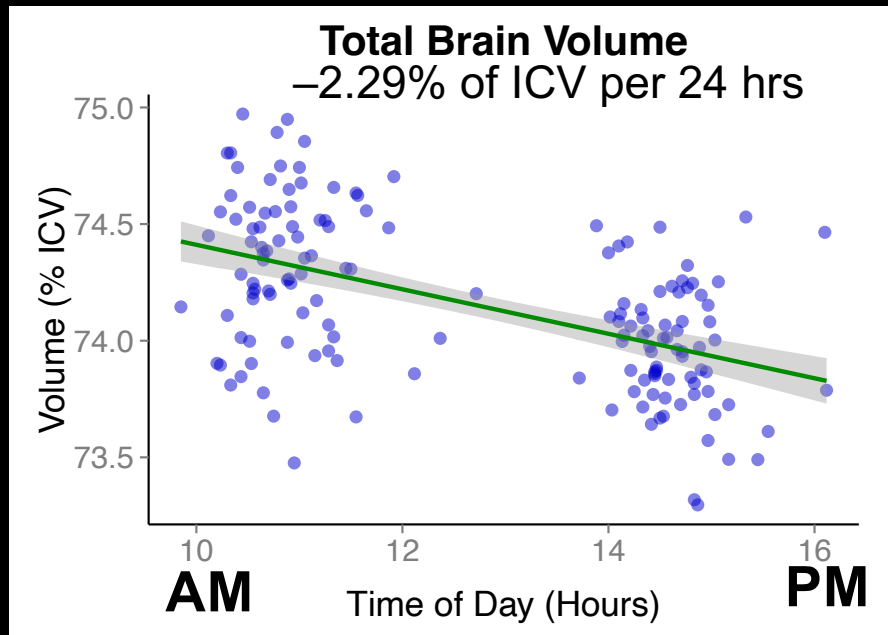


Rest  
Intrinsic  
Measurement  
Error

Rest  
Intrinsic  
Measurement  
Error



# TOD impacts the apparent volume of GM, WM, and CSF

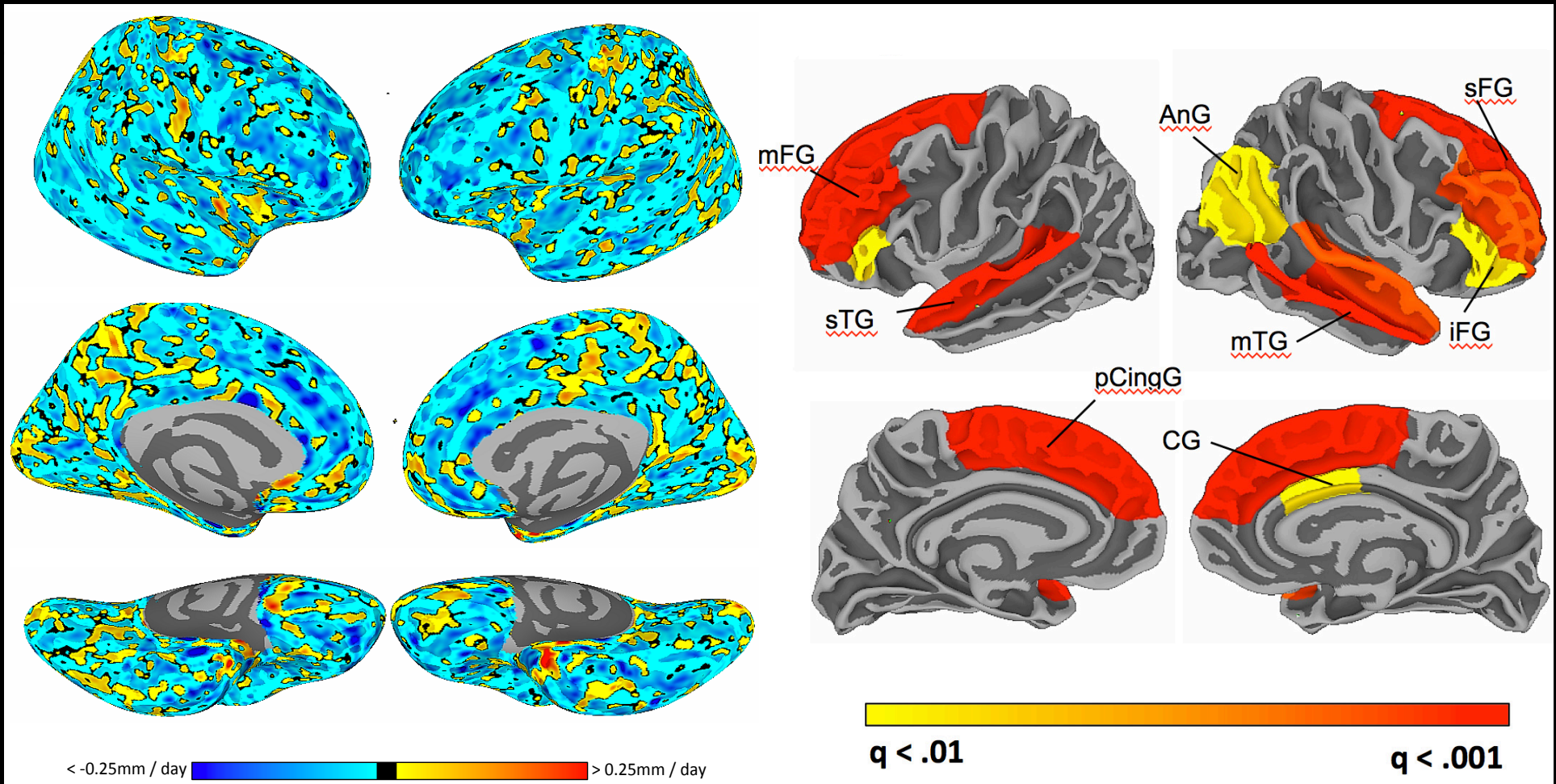




# TOD impacts surface based morphometric measures: cortical thickness, and surface area

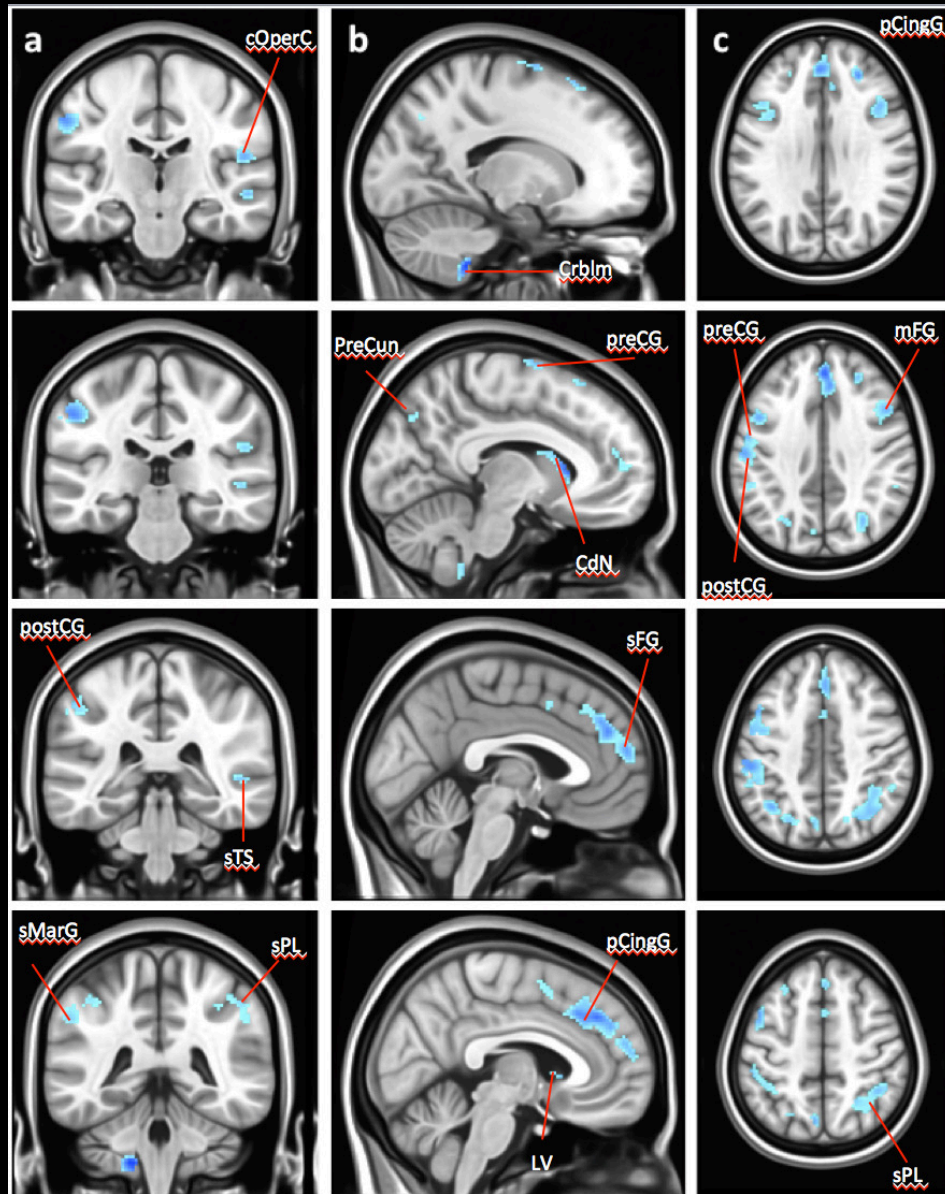
Change in magnitude of cortical thickness

Statistically significant differences



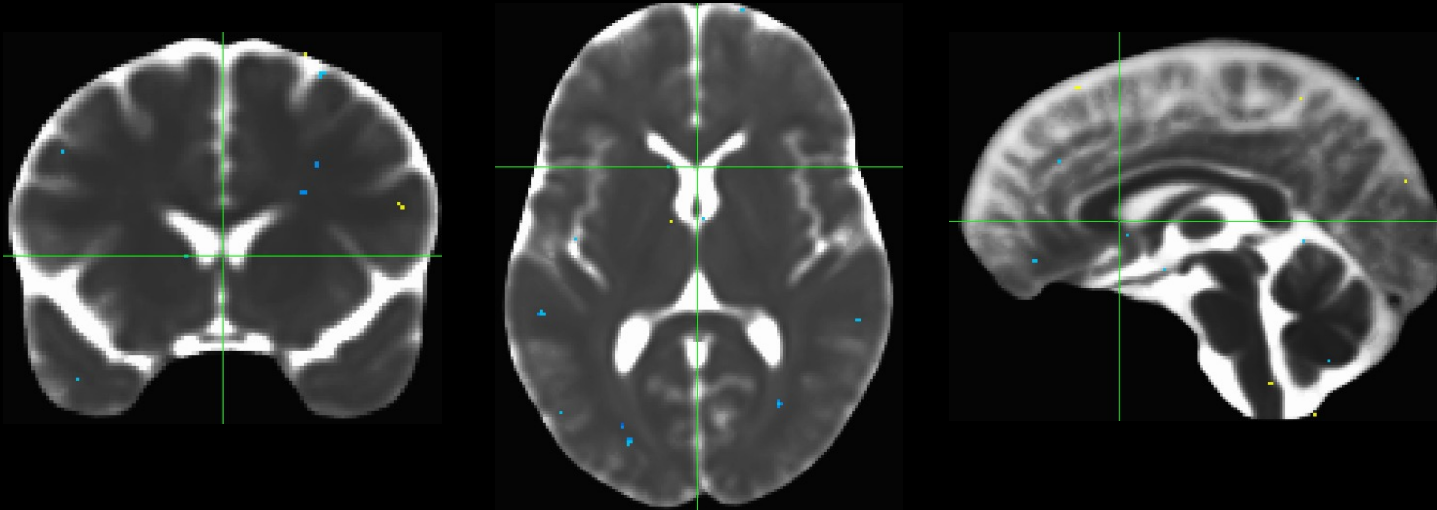
**No significant impact on apparent gyrification index, sulcal depth**

# TOD impact Volume based morphometric measures of apparent gray matter density

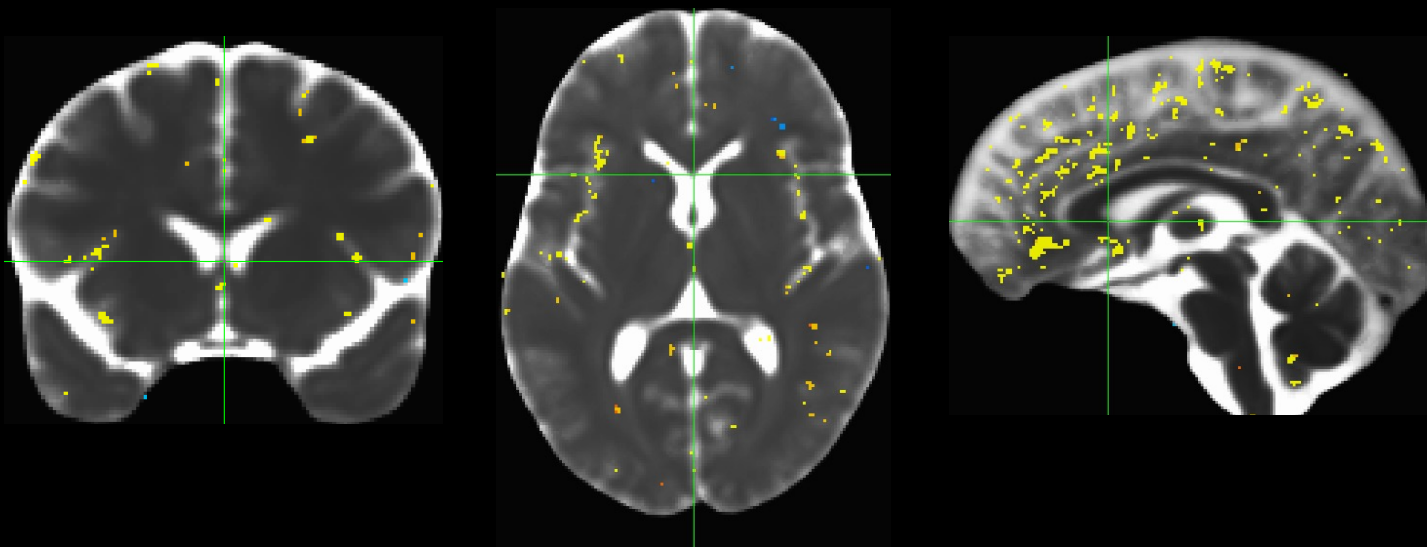


## TOD impacts DTI measures of brain structure

Visit 4 AM – Visit 1 AM (3 weeks apart)

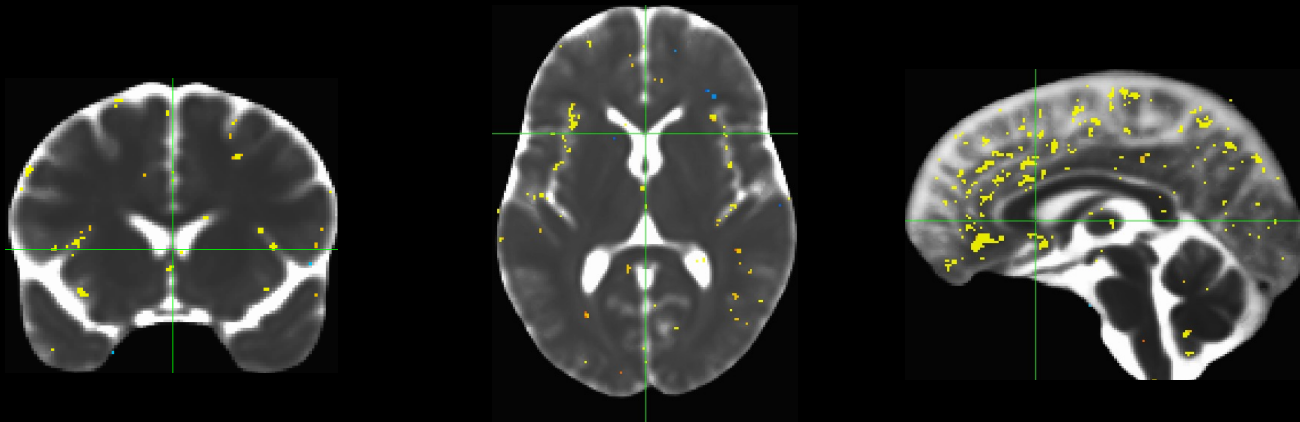


Visits 4 & 1 PM – AM (3 hours apart)

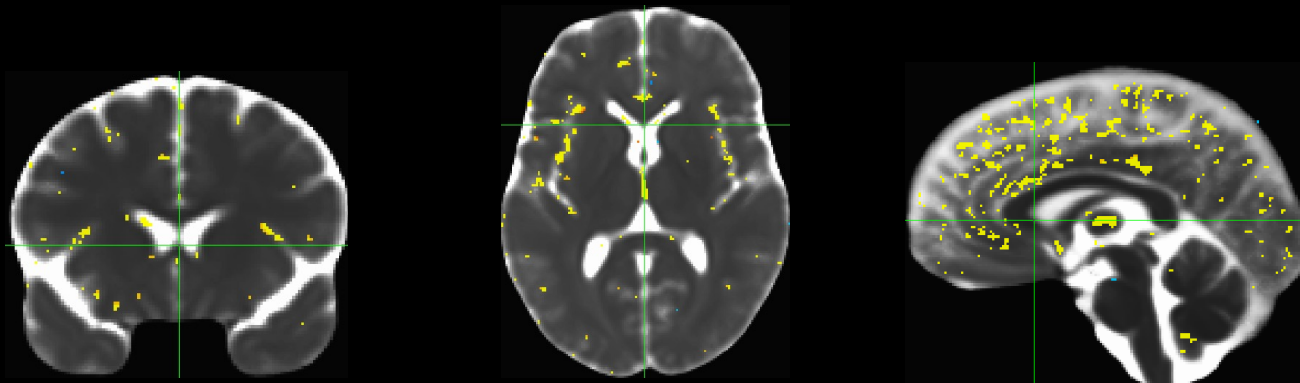


# TOD impact on DTI measures of brain structure is reproducible

Trace - Visits 4 & 1 : PM – AM (Blip-Up Dataset)



Trace - Visits 4 & 1 : PM – AM (Blip-Down Dataset)







## Study Summary



- The rest controls helped identify time-of-day as a significant confound
- Important to keep in mind for longitudinal and cross-sectional designs
- Time-of-day impacts  $T_1W$ , DTI, and Resting state measures
- Multimodal data helps understand possible mechanism
- It's not just a confound – physiological phenomenon
- Data replicates help test reproducibility
- To test impact of training: Time of day x Visit interaction





## Some Experimental Design recommendations



- Well matched control group
- Give the control group a effort-matched task
- Use multimodal MRI
- Collect 2 sets of data if possible
- Consider the potential confounds
  - Biological rhythms: Circadian, post lunch dip, infradian, Seasonal....
  - Chronotype, Hydration level, Caffeine, Sleep Quality, Medication, Body temperature, cortisol levels,
- If you can't screen/control for it measure it or be mindful of it
- Report the methods you use, in as much detail as possible




# Some “Inference” recommendations




- Second-order measures of brain structure are only estimates derived from the MR signal
- Cortical Thickness vs Apparent cortical thickness

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Journal of Neuroscience Methods


journal homepage: [www.elsevier.com/locate/jneumeth](http://www.elsevier.com/locate/jneumeth)



Quantitative grey matter histological measures do not correlate with grey matter probability values from *in vivo* MRI in the temporal lobe

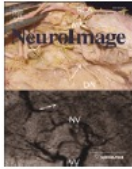
S.H. Eriksson<sup>\*</sup>, S.L. Free, M. Thom, M.R. Symms, L. Martinian, J.S. Duncan, S.M. Sisodiya

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Comments and Controversies

White matter integrity, fiber count, and other fallacies: The do's and don'ts of diffusion MRI

Derek K. Jones<sup>a,b,\*</sup>, Thomas R. Knösche<sup>c</sup>, Robert Turner<sup>c</sup>



**Image brain changes boldly, but cautiously**



**Thank you for your attention!**

**Thanks also to members of the  
Baker lab and Pierpaoli lab**

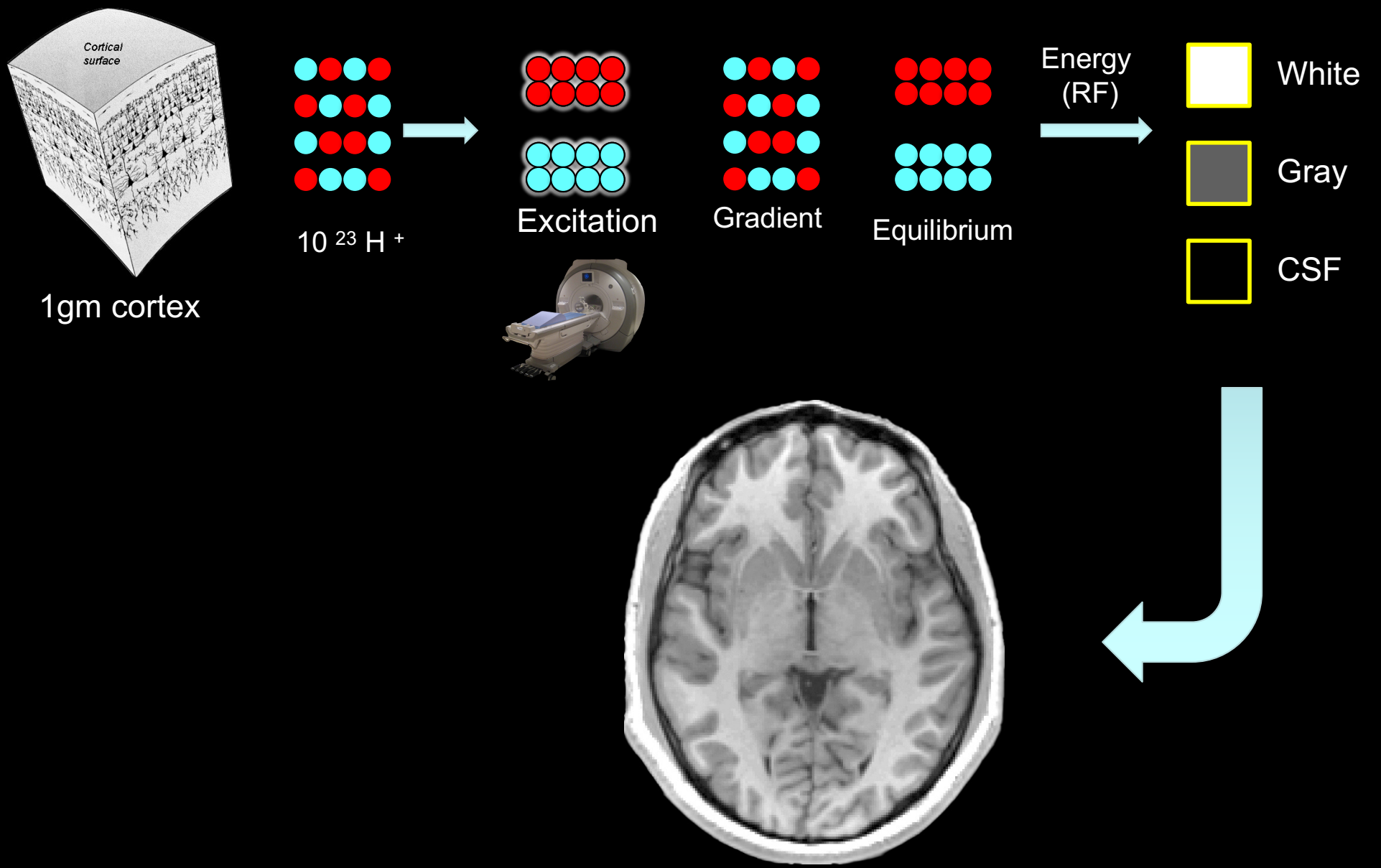


**Image brain changes boldly, but cautiously**



**Questions/ Comments?**

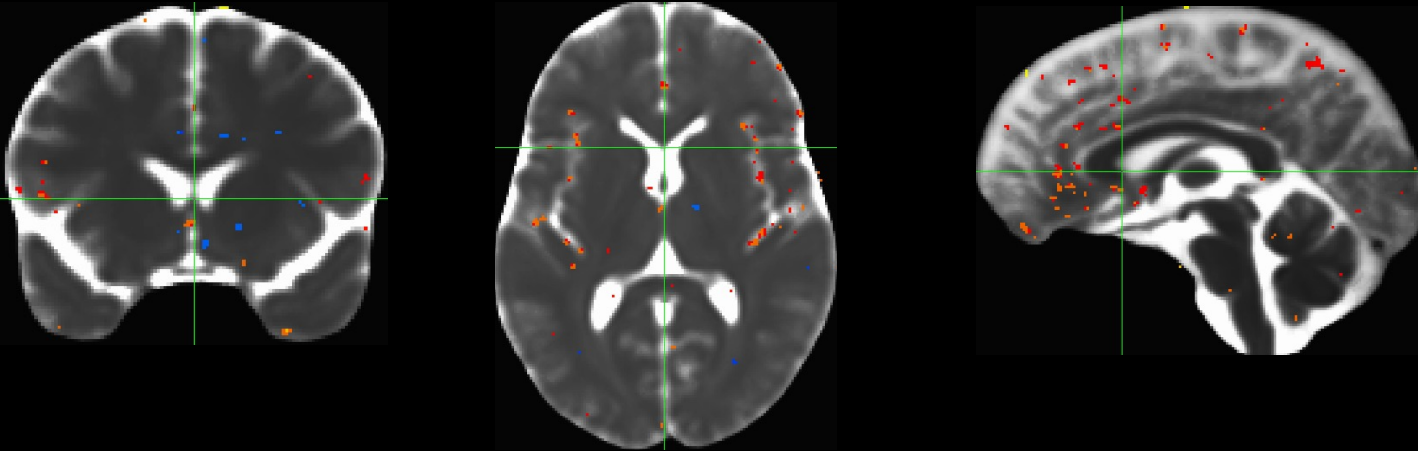
# From molecules to gray matter volume/concentration





## Increase in CSF-like Freewater accounts for diurnal fluctuations in DTI measures

Free Water Volume Fraction- Visits 4 & 1 : PM - AM



Trace Without Free Water Contamination - Visits 4 & 1 : PM - AM

