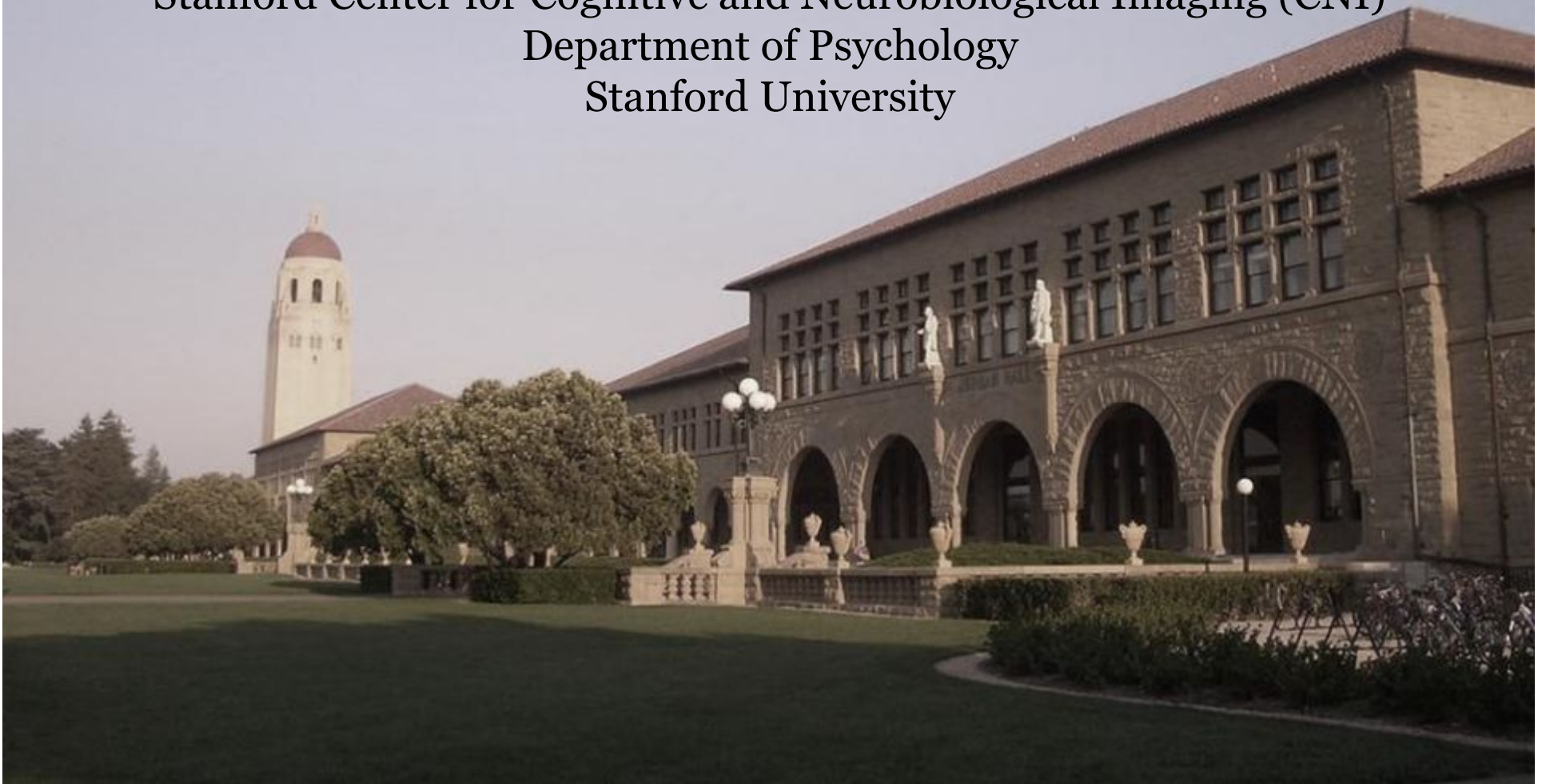


# The circuit diagram of human visual cortex

*Brian Wandell*

Stanford Center for Cognitive and Neurobiological Imaging (CNI)  
Department of Psychology  
Stanford University



# The circuit diagram of human visual cortex

- Introduction to diffusion imaging
- Diffusion: Within the voxel
- Diffusion: Across voxels (tractography)
- Visual field maps and tractography

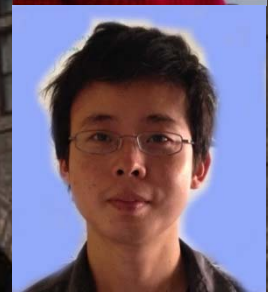
Ariel  
Rokem



Franco  
Pestilli

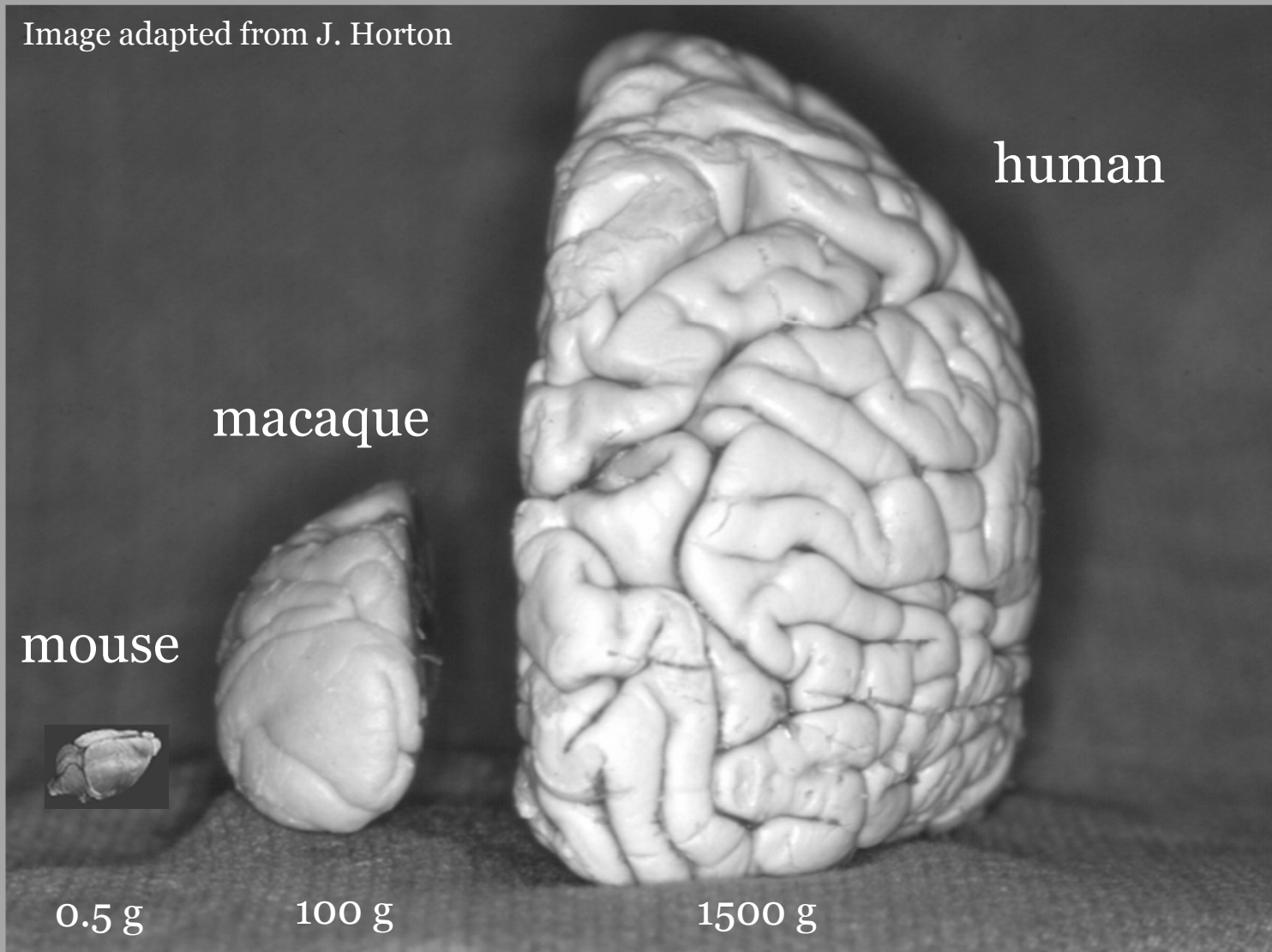


Hiromasa  
Takemura



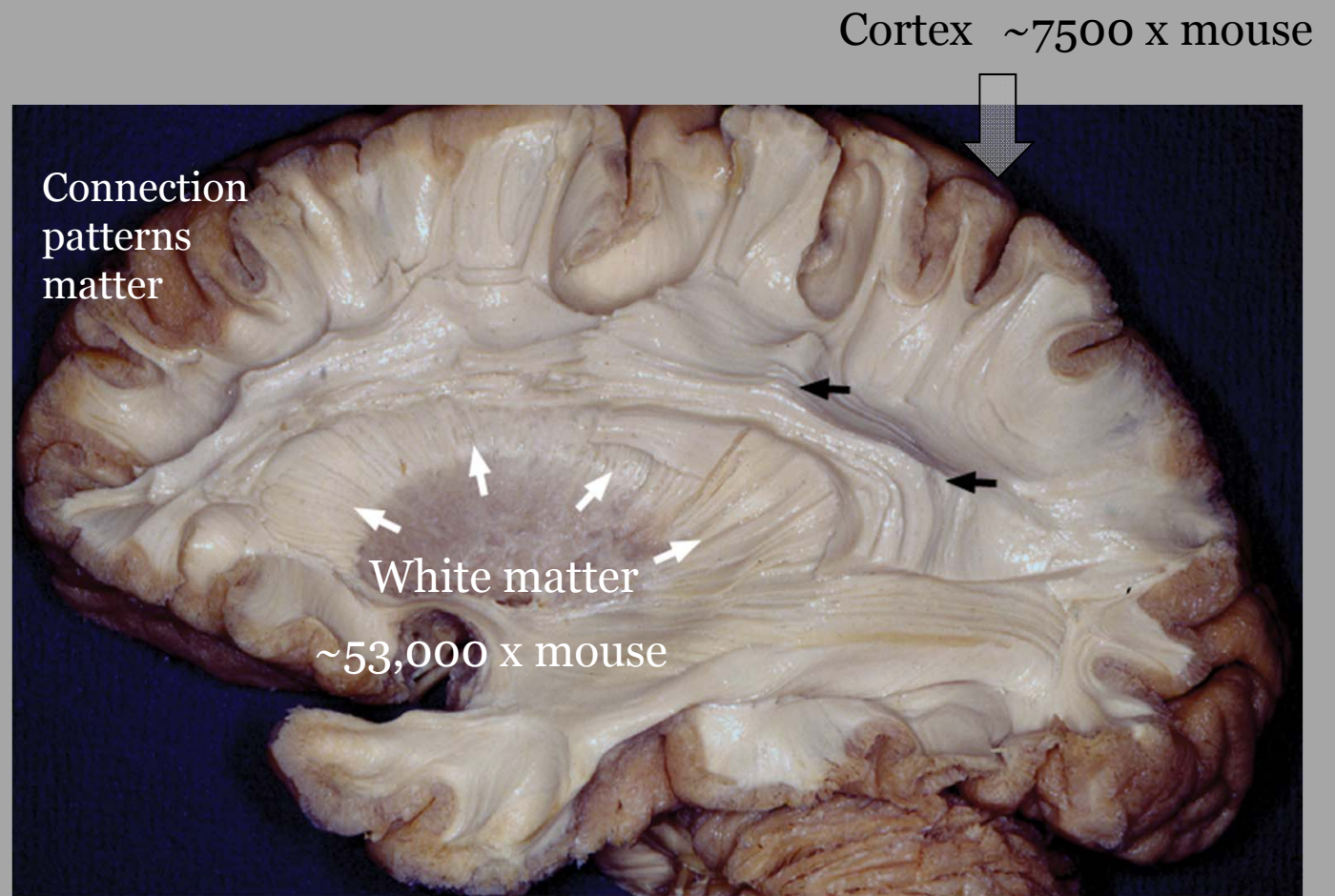
# The human brain

Image adapted from J. Horton



# Human brain characteristics

- Neuron cell bodies in cortex
- Long-range axons in white matter
- A system with active wires that develop and whose properties correlate with visual skills (e.g., sight word efficiency)



Courtesy Professor Ugur Ture

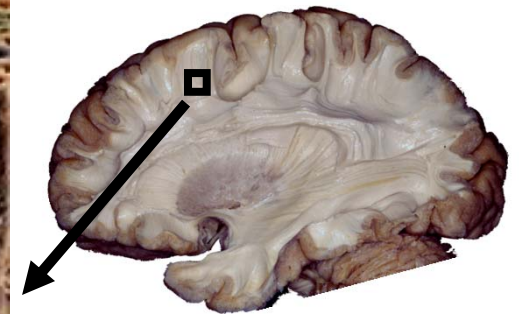
# Diffusion MRI and quantitative MRI

Measuring diffusion



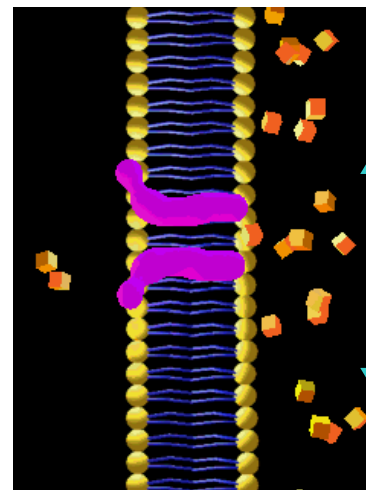
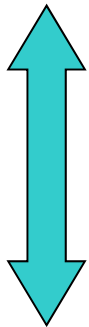
# Diffusion probes brain microscopic structure

Along the axon, within the cytoskeleton, water diffuses easily; the **Apparent Diffusion Coefficient (ADC)** is relatively large



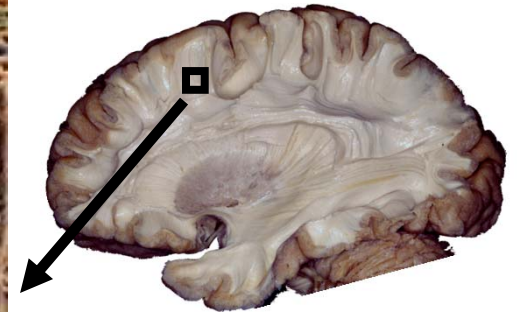
5  $\mu\text{m}$

Longitudinal diffusivity ( $\mu\text{m}^2/\text{ms}$ )



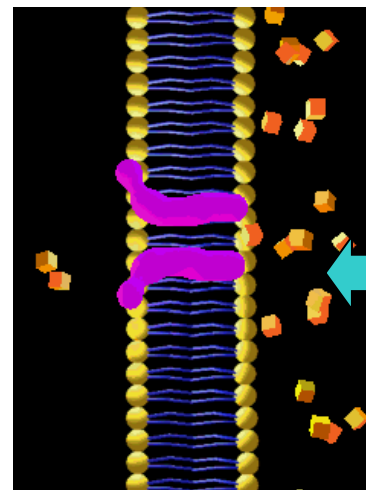
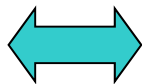
# Diffusion probes brain microscopic structure

Bi-lipid cell membranes limit diffusion. Hence, perpendicular to axons the **ADC** is relatively small



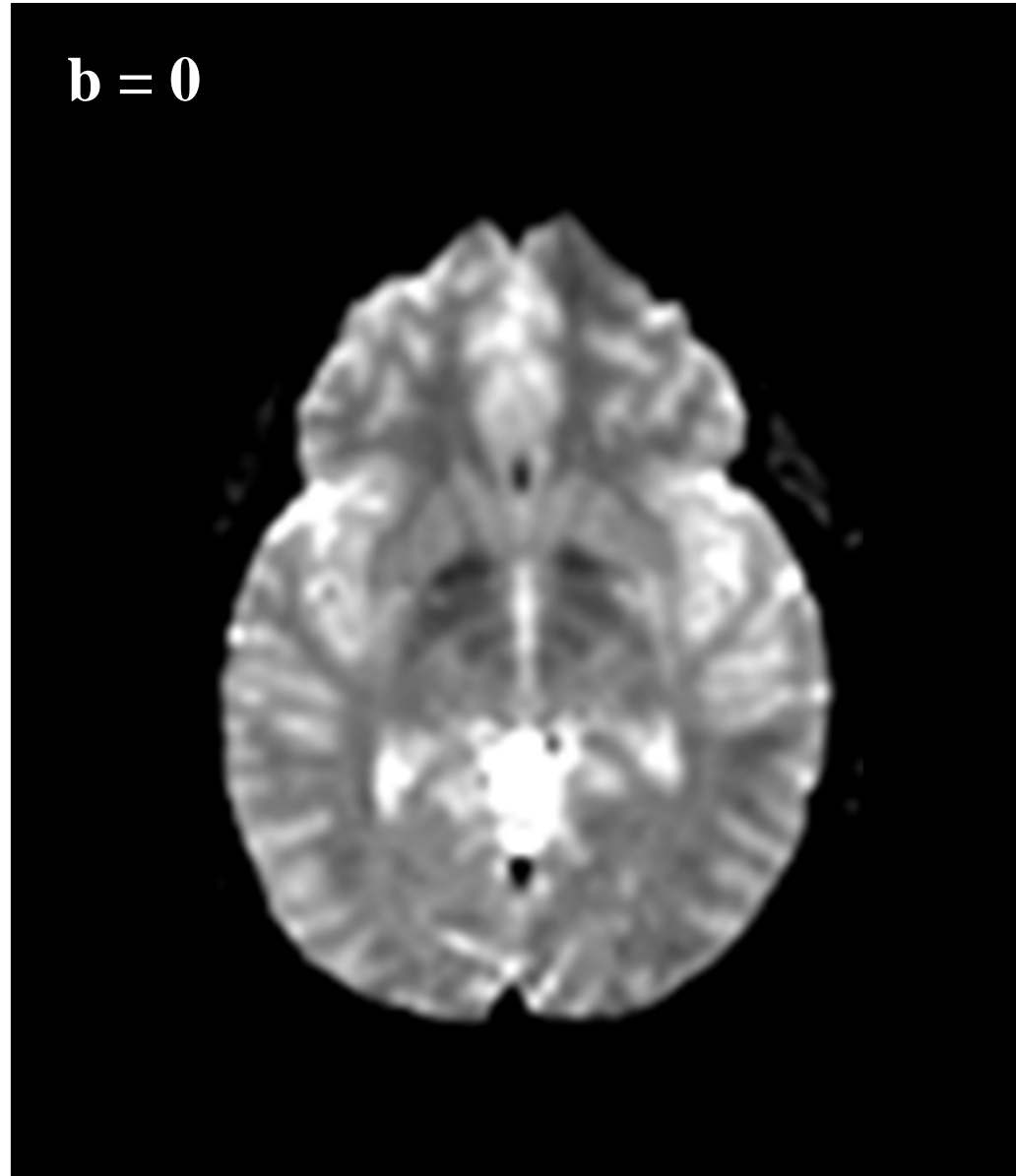
5  $\mu\text{m}$

Radial Diffusivity ( $\mu\text{m}^2/\text{ms}$ )



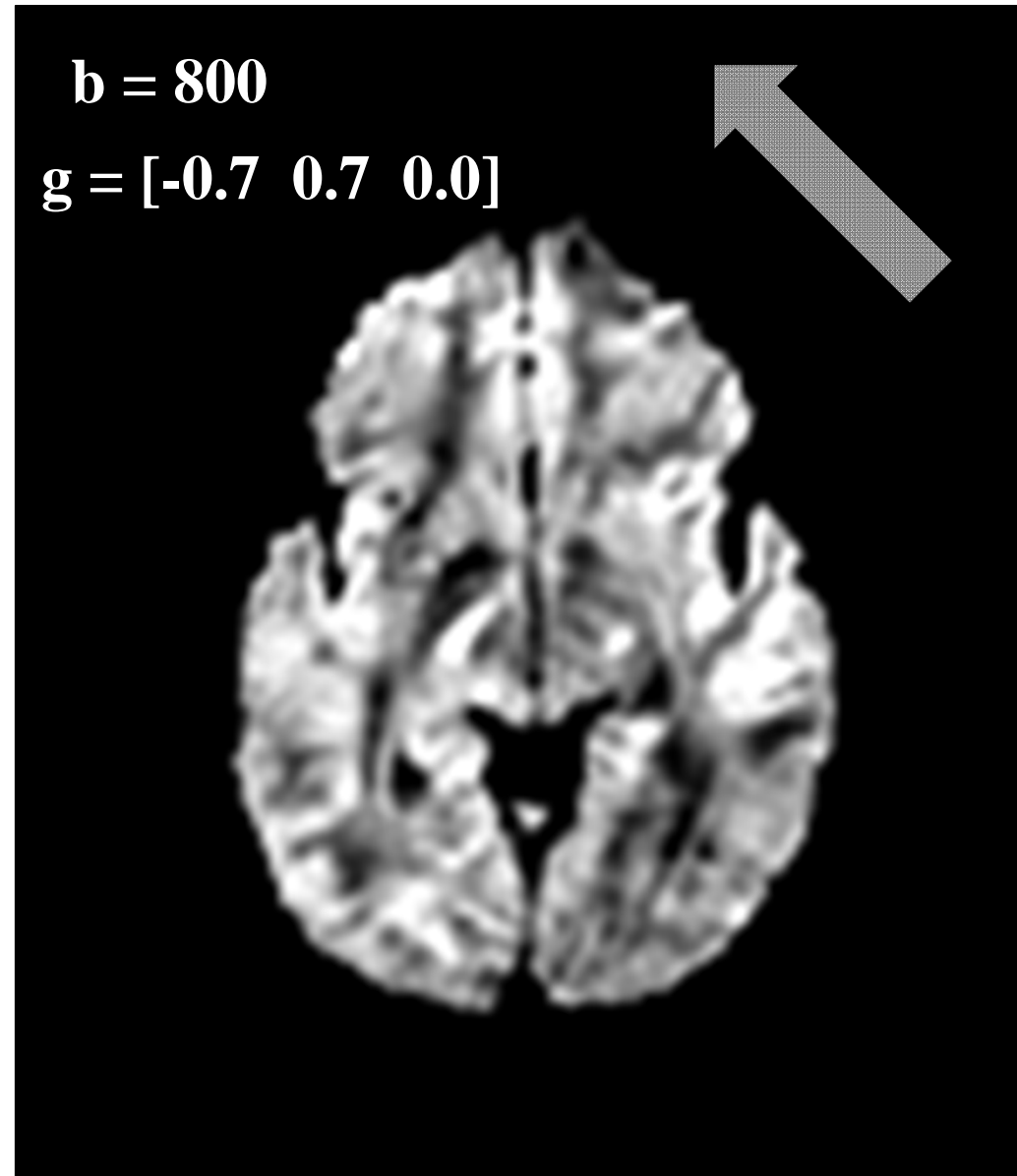
# Non-diffusion MR image

Dark means large  
signal attenuation  
High ADC



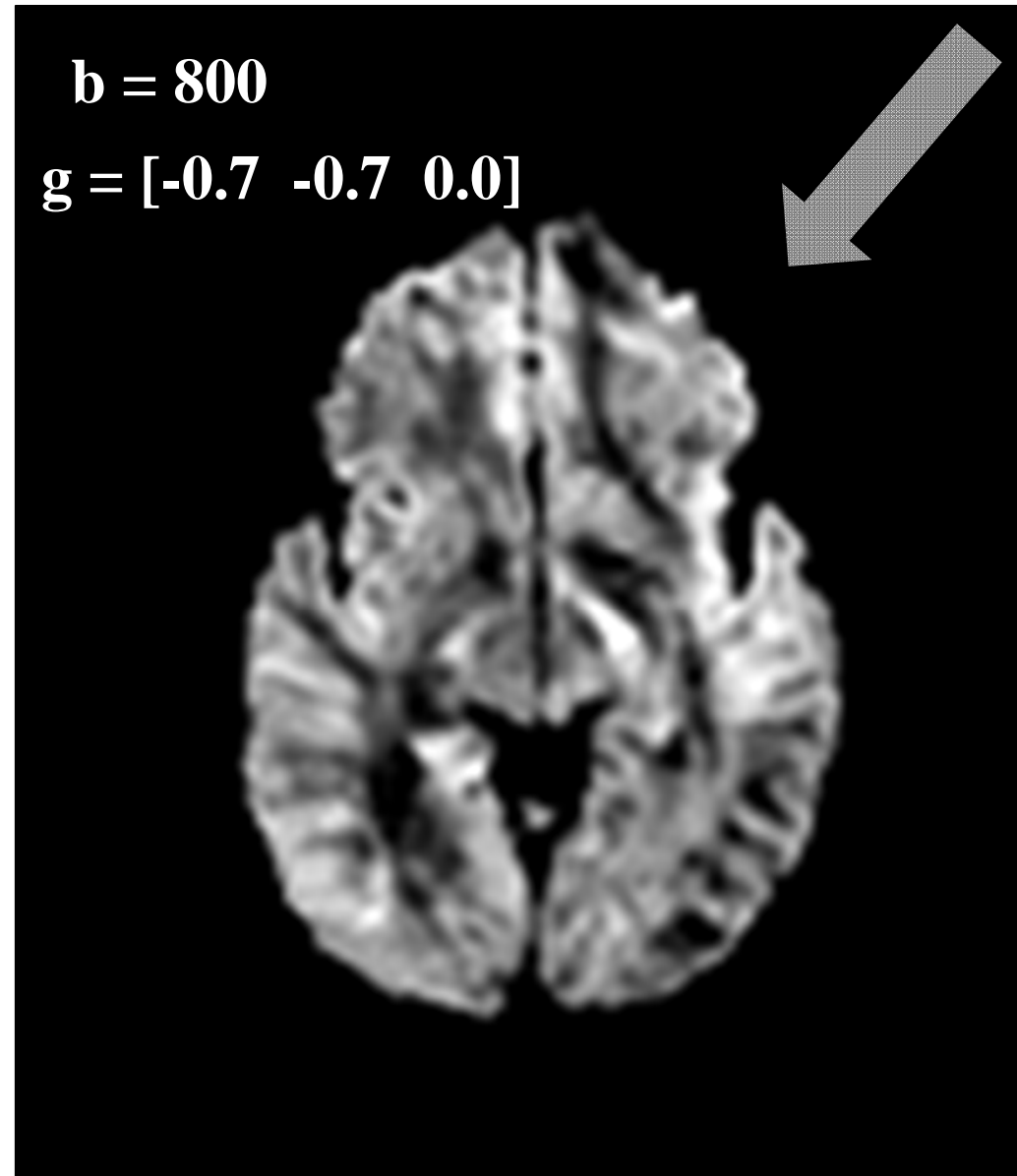
# Diffusion weighted images

Dark means large  
signal attenuation  
High ADC



# Diffusion weighted images

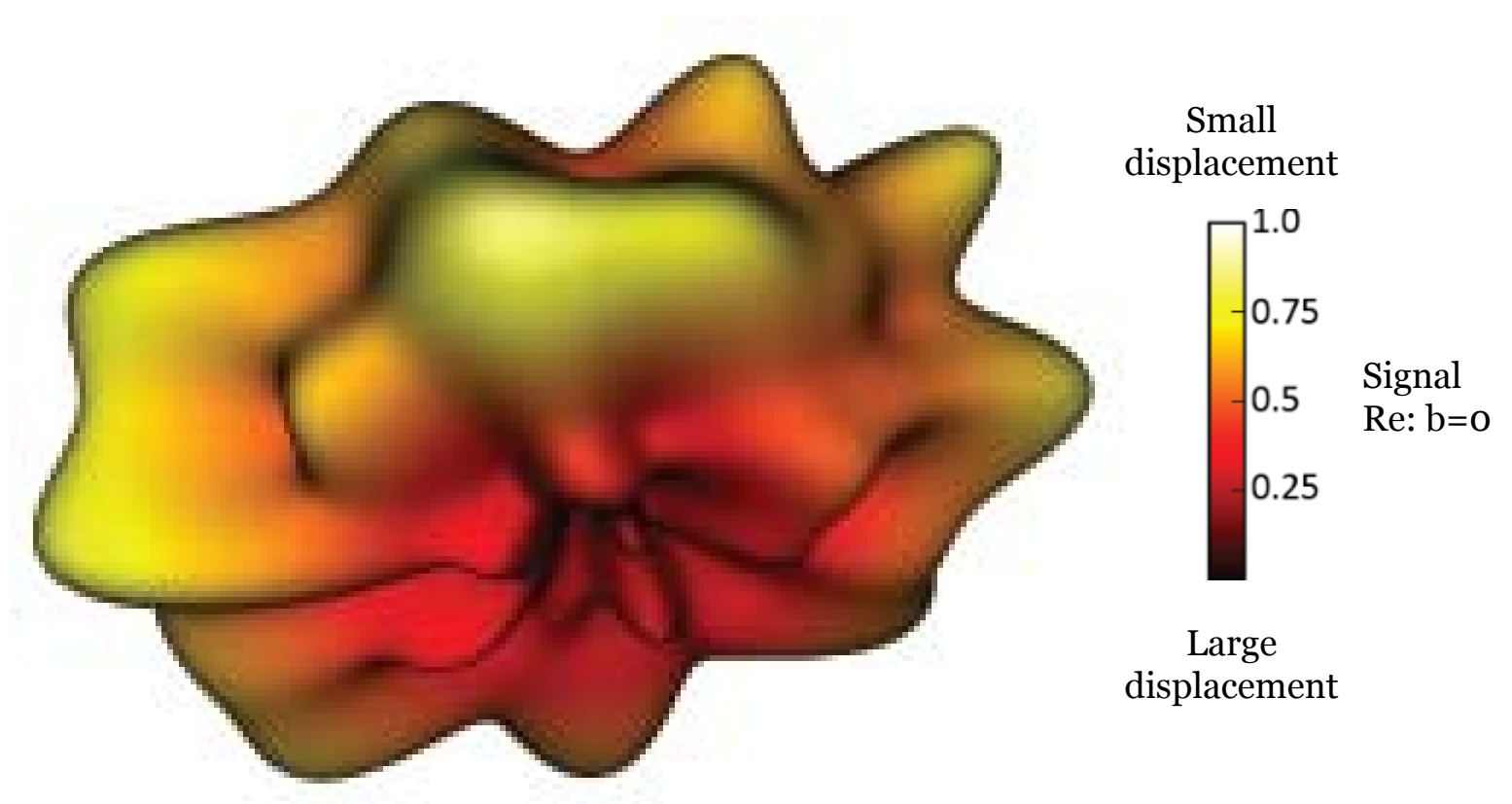
Dark means large  
signal attenuation  
High ADC



# Diffusion data analysis

High angular resolution diffusion imaging (HARDI)

MRI diffusion signal for each voxel



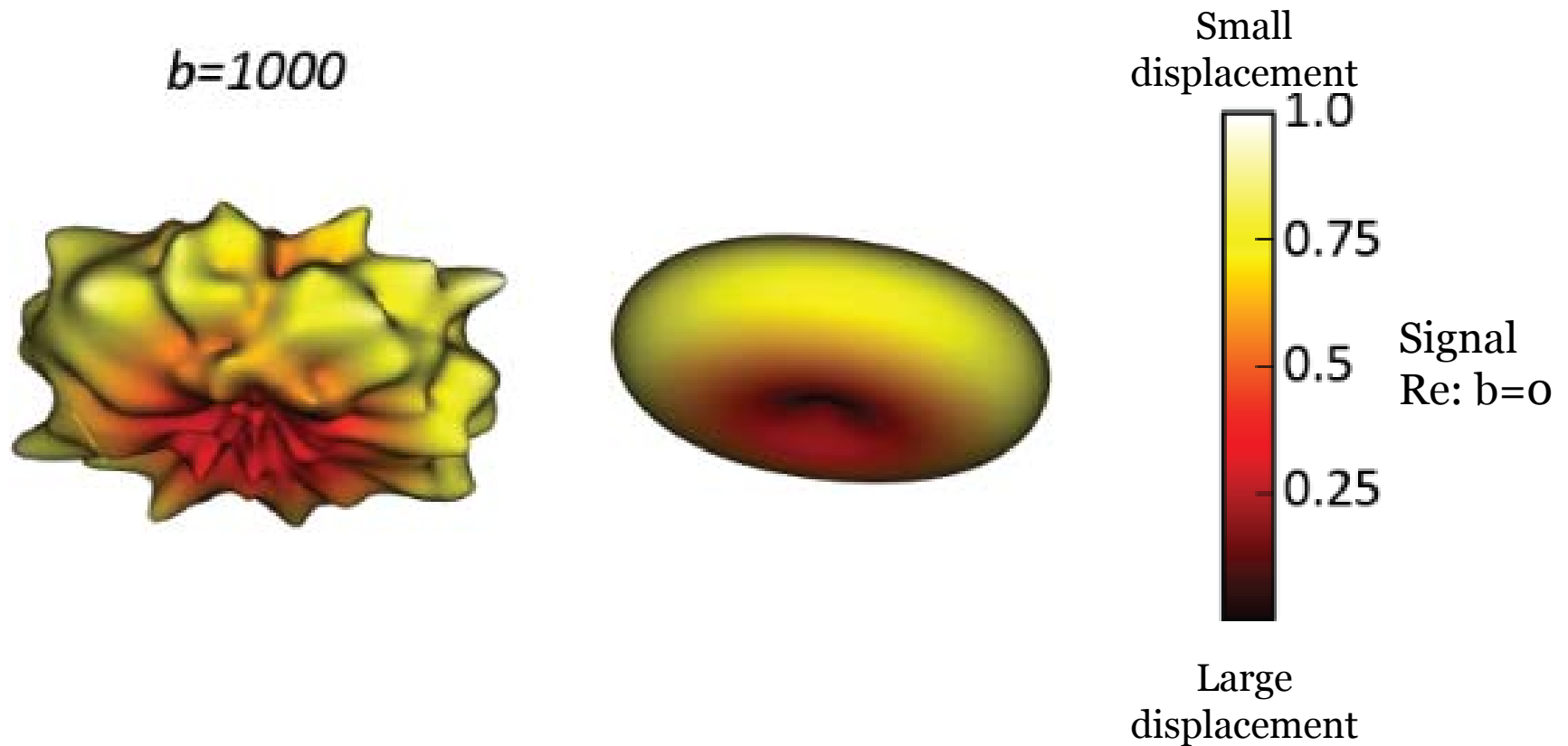
# Evaluating diffusion models within the voxel

*Ariel Rokem*



# Diffusion tensor model (DTM)

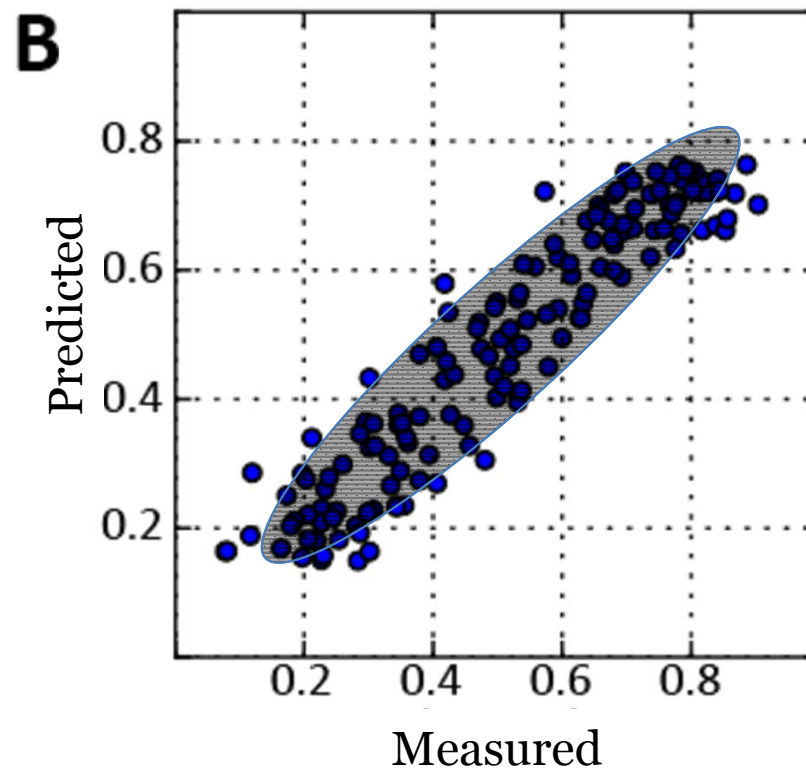
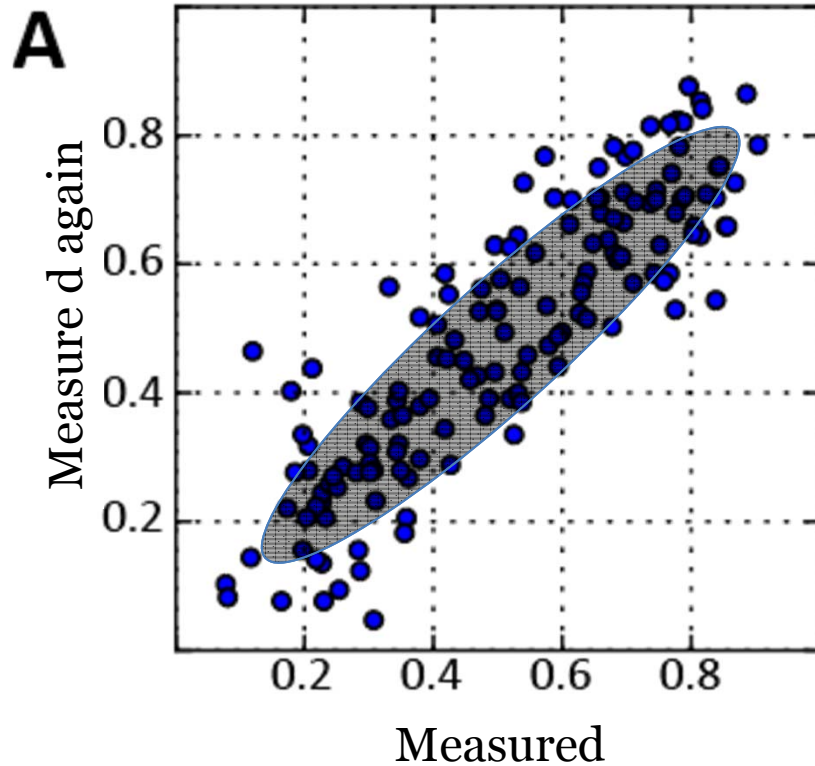
Predicts the **voxel diffusion signal** with a phenomenological equation, motivated by Gaussian diffusion.



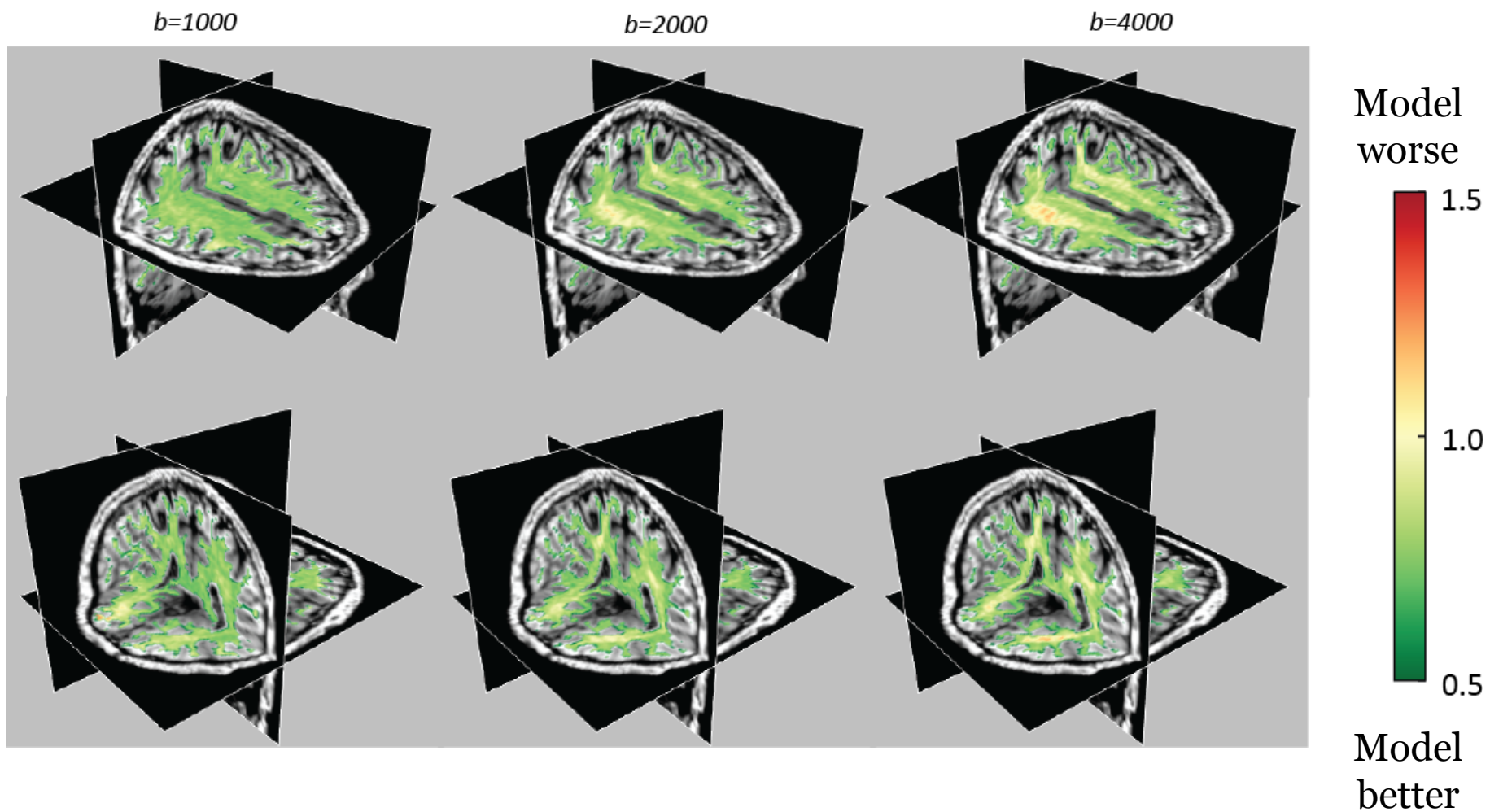
# DTM predicts independent data (cross-validates) more accurately than replication

Replication

Prediction



# DTM misses in a few regions



# Sparse fascicle model (SFM)

Predicts the **voxel diffusion signal** with a model of the sum of fascicles plus isotropic diffusion

$$S(\theta) = w_0 D_0 + \sum_f w_f D_f(\theta)$$



Ball

+

$f$

+

Sticks

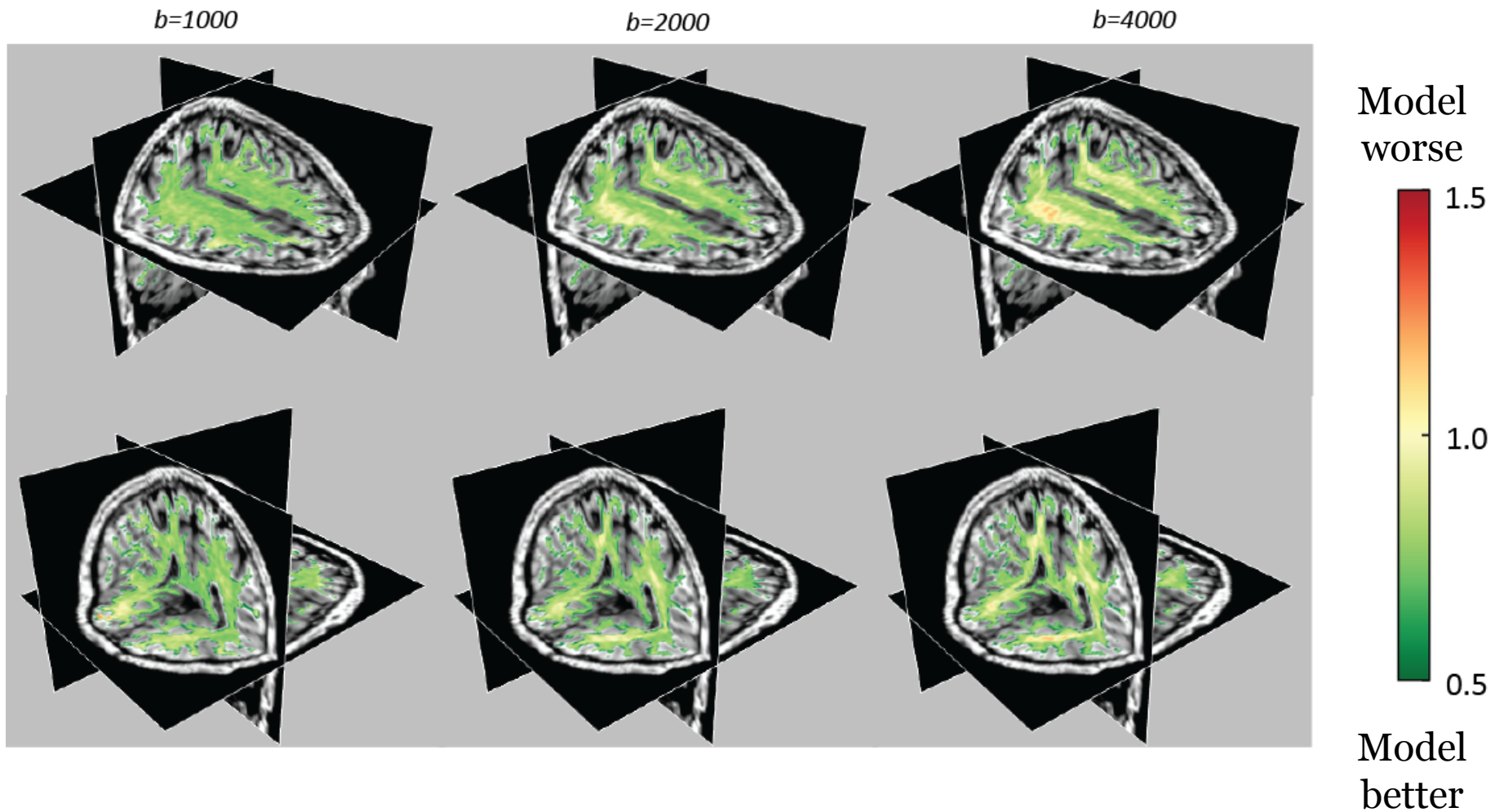


Measured



Modeled

# SFM better (slightly) than DTM

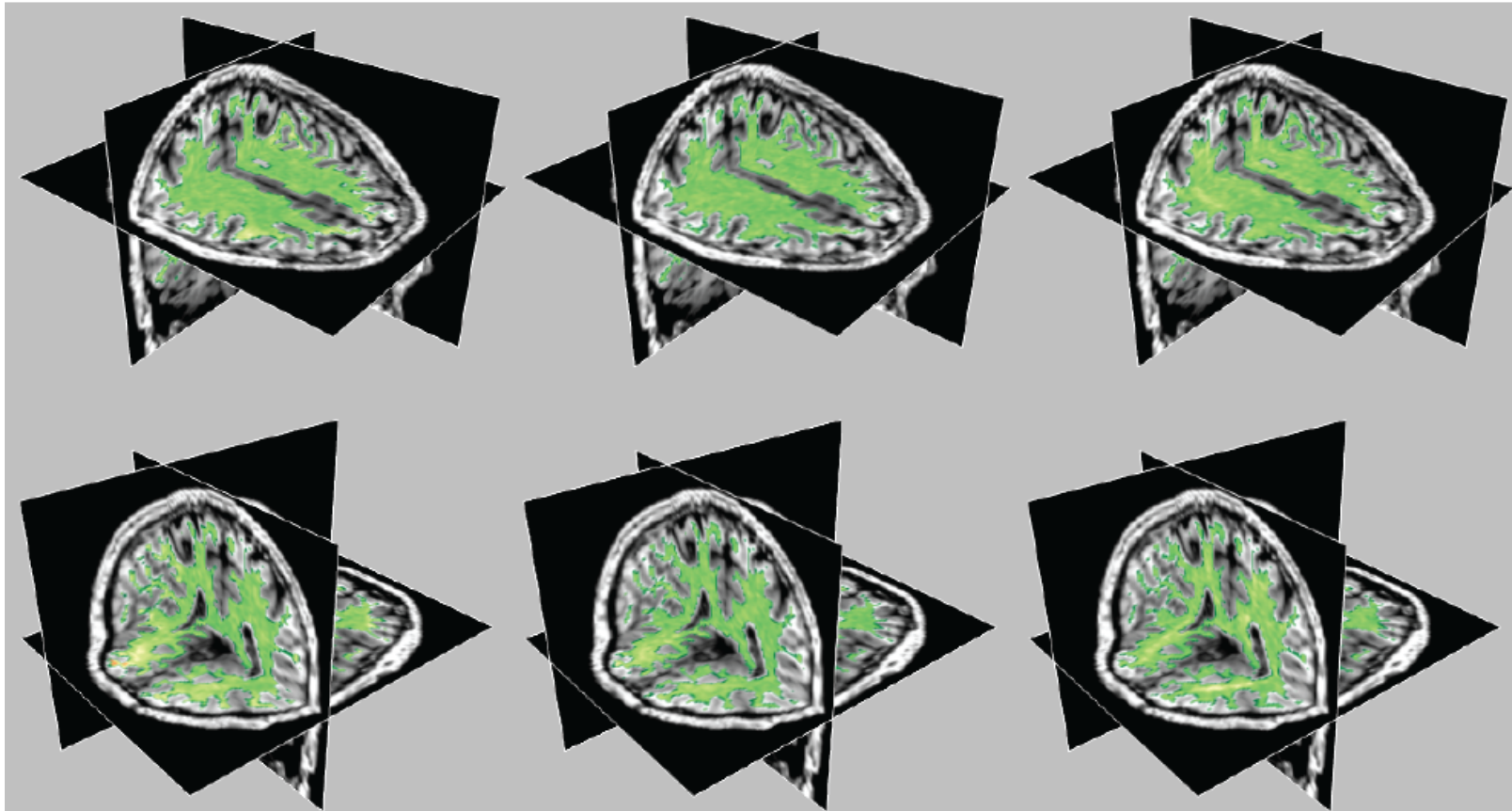


# SFM better (slightly) than DTM

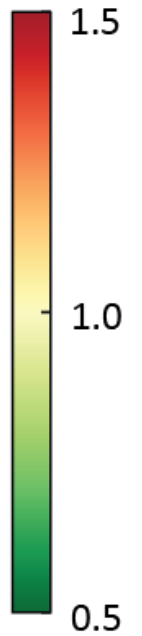
*b=1000*

*b=2000*

*b=4000*



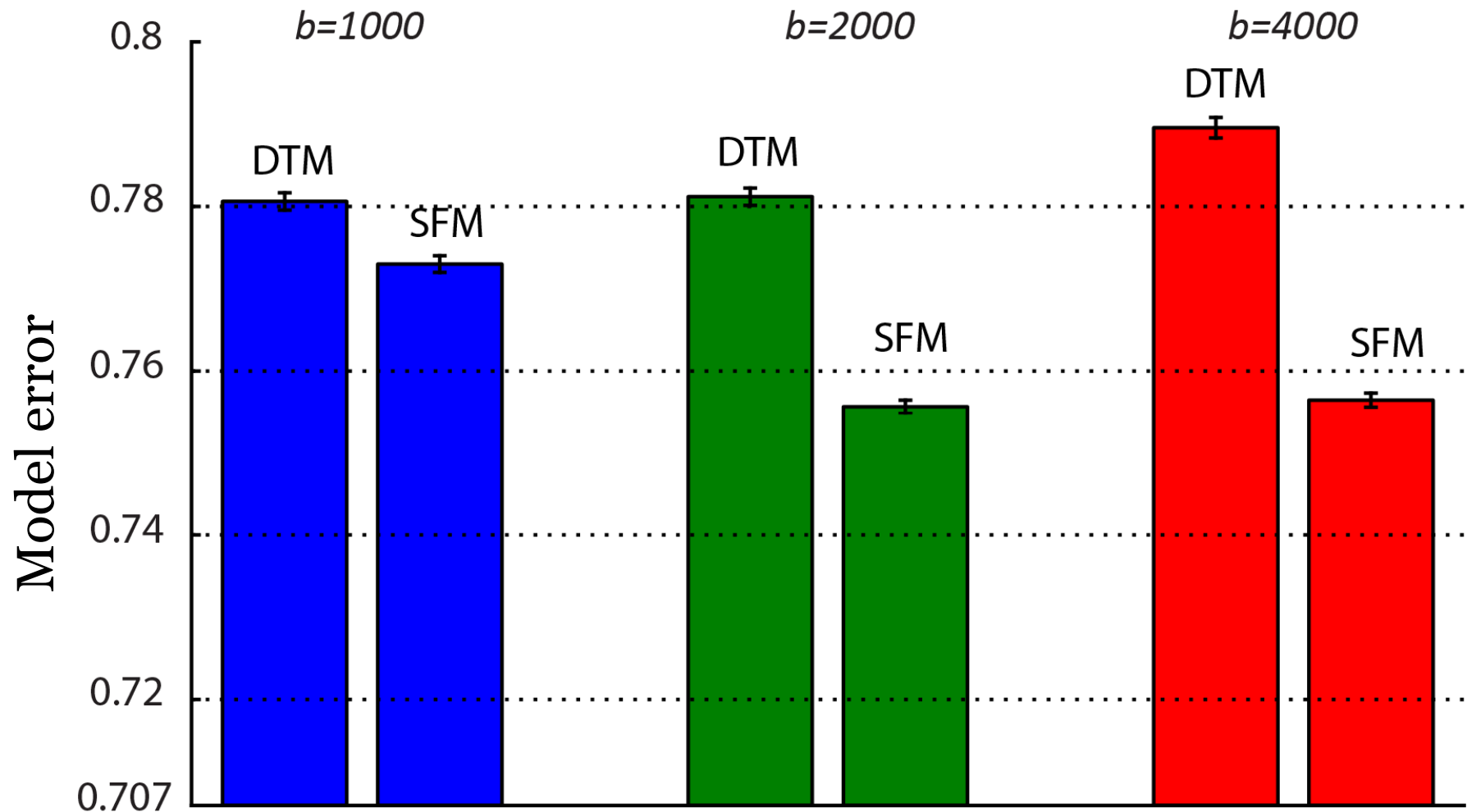
Model  
worse



Model  
better

# SFM slightly outperforms DTM

Both are very good, and just short of best possible performance



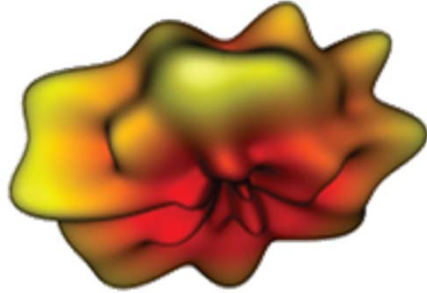
**Best possible** =  $\frac{1}{\sqrt{2}}$

# Model-based neuroanatomy: Validation and statistical inference in living connectomes

*Franco Pestilli*

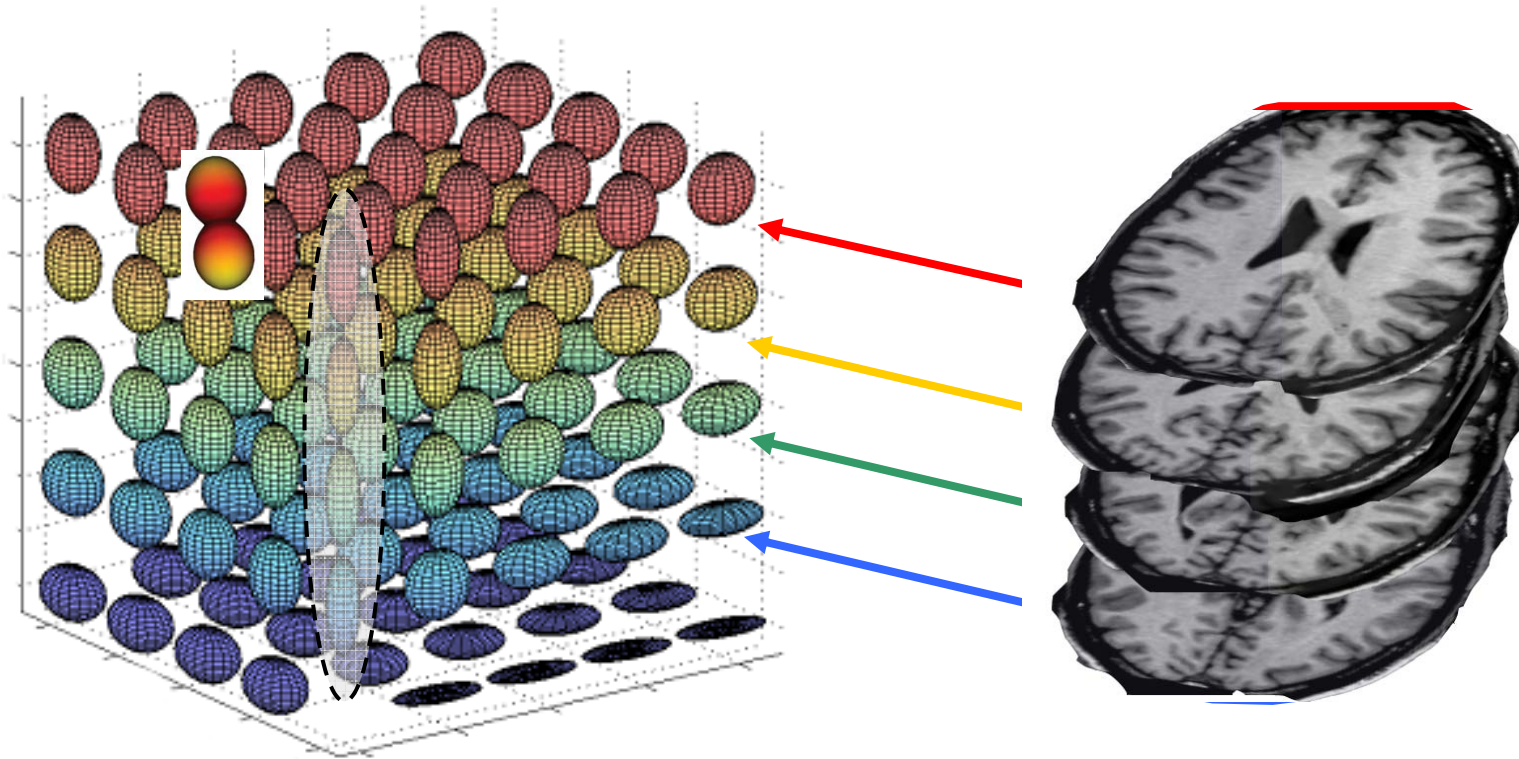


# Tractography

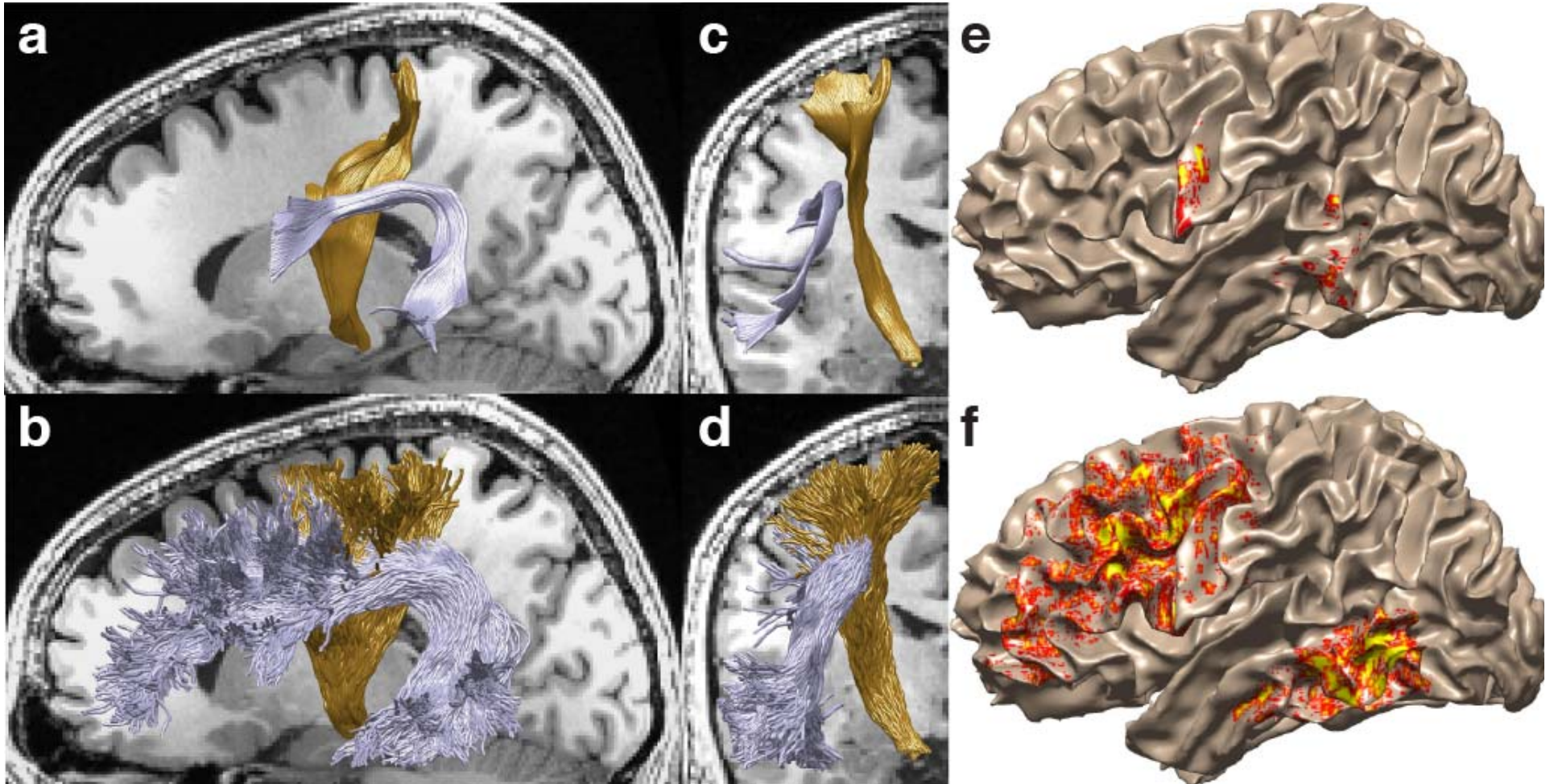


*Diffusion data are surfaces*

Use the local (voxel) diffusion measurements to estimate white matter tracts

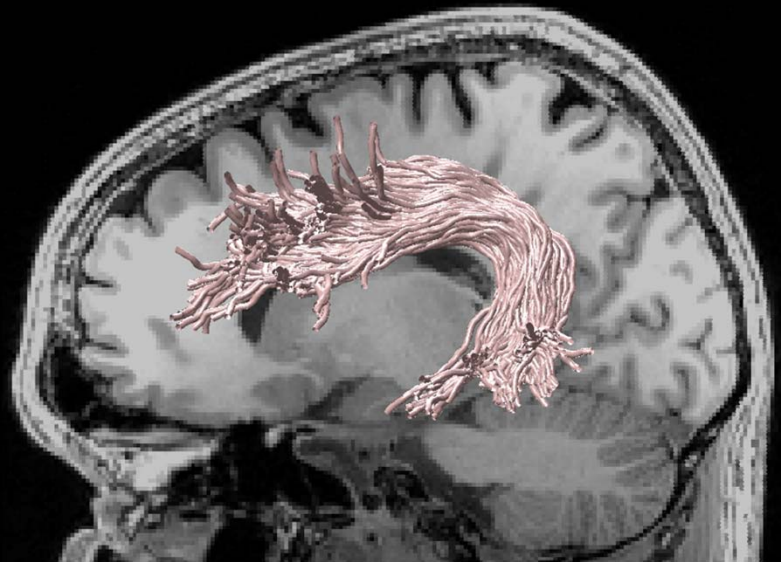
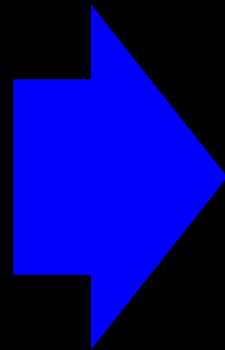
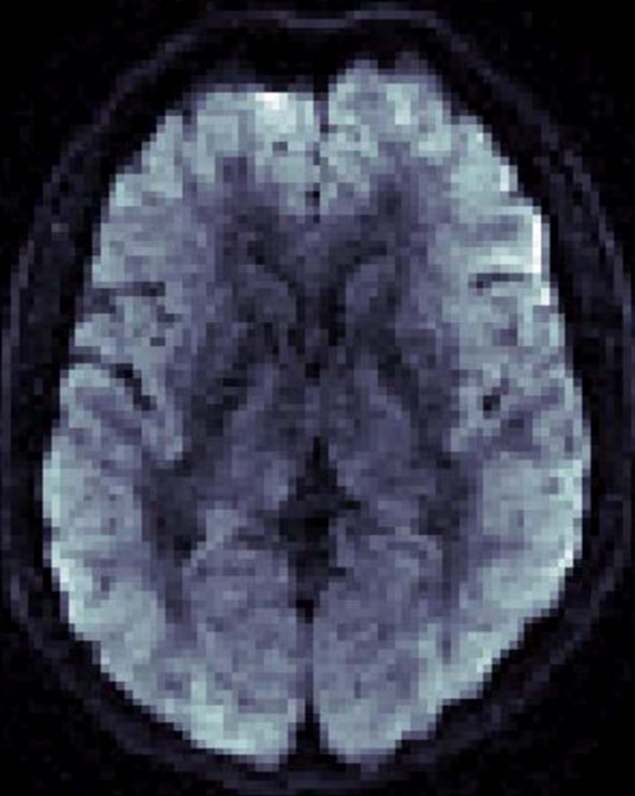


Tractography algorithms differ. A lot.



# Standard tractography

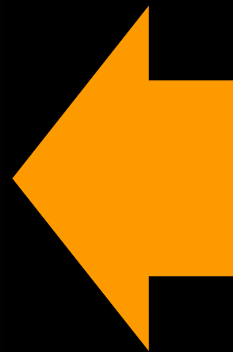
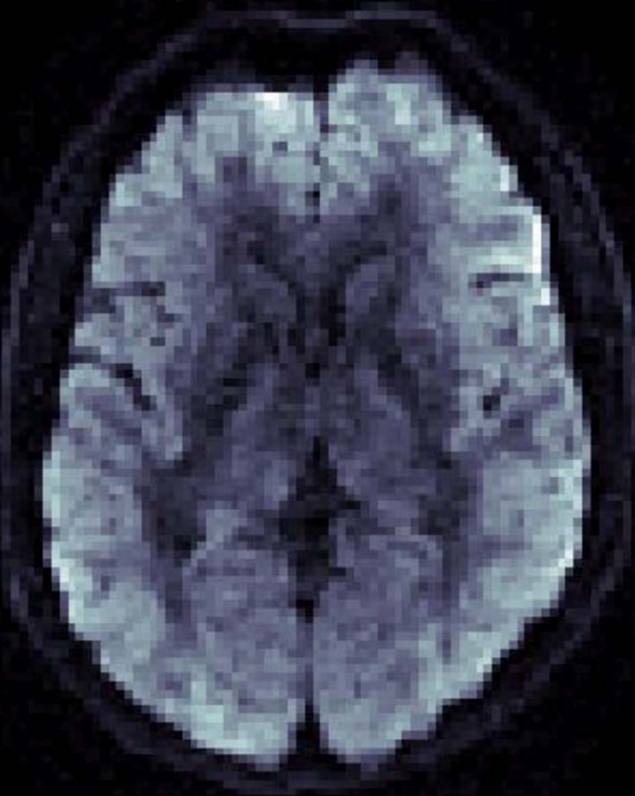
Estimate fascicles from diffusion data



# Linear iterative fascicle evaluation (LIFE)

Predict diffusion data from fascicles

Compare how well different models and algorithms do

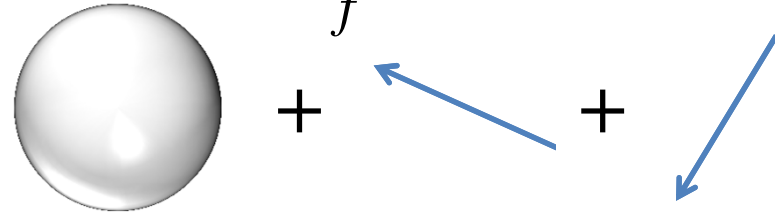


# Fascicle contributions

- Each fascicle makes a contribution to the diffusion signal for each voxel it passes through
- The contribution depends on the fascicle orientation

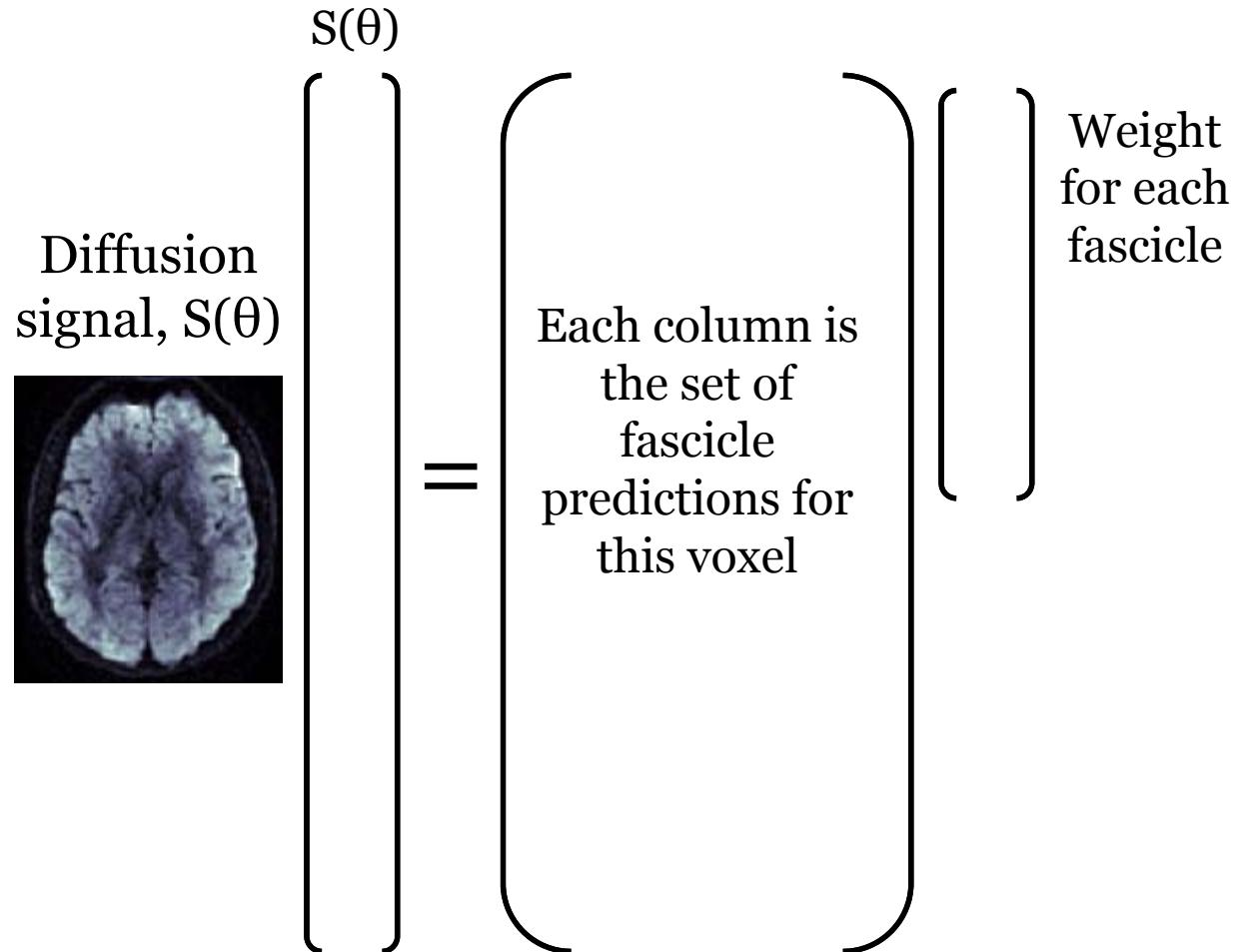
In each voxel, use the tractography fascicles as the sticks

$$S(\theta) = w_0 D_0 + \sum_f w_f D_f(\theta)$$



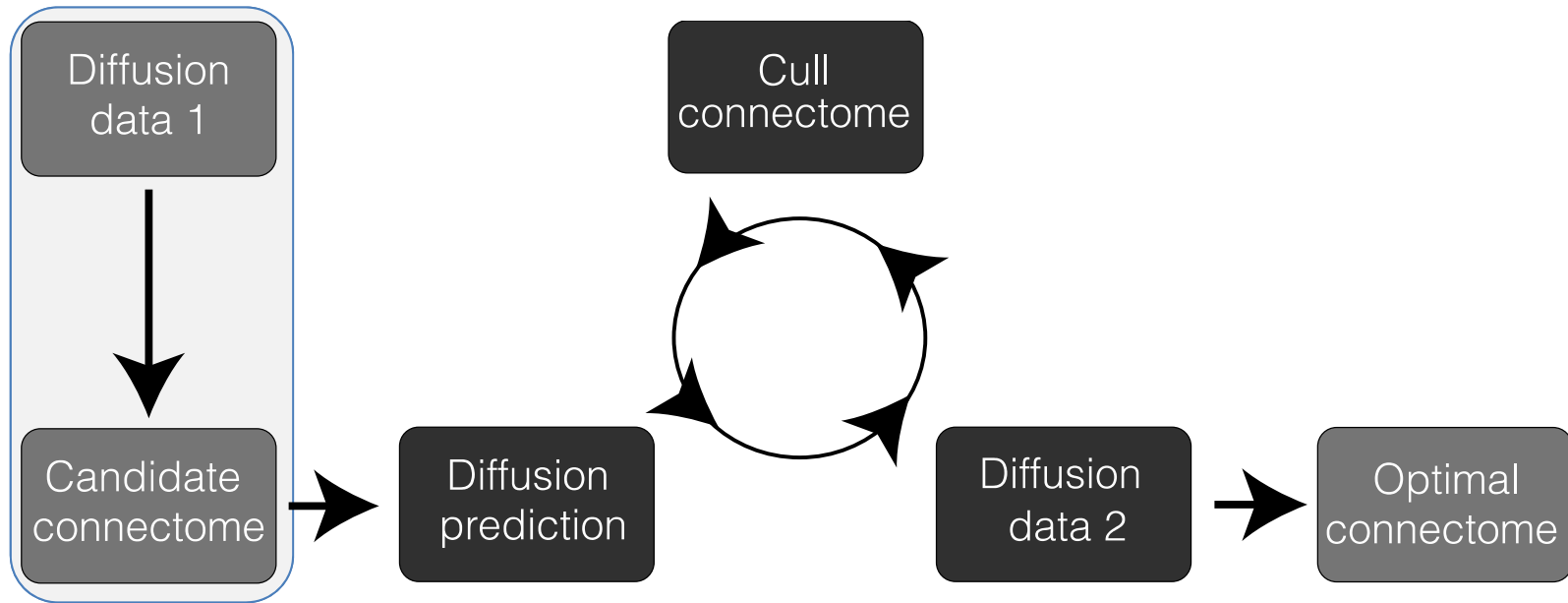
# Set up the non-negative LS equations

- Each fascicle makes a contribution to the diffusion signal for each voxel it passes through
- The contribution depends on the fascicle orientation
- The fascicles can contribute somewhat different amounts (weighted)

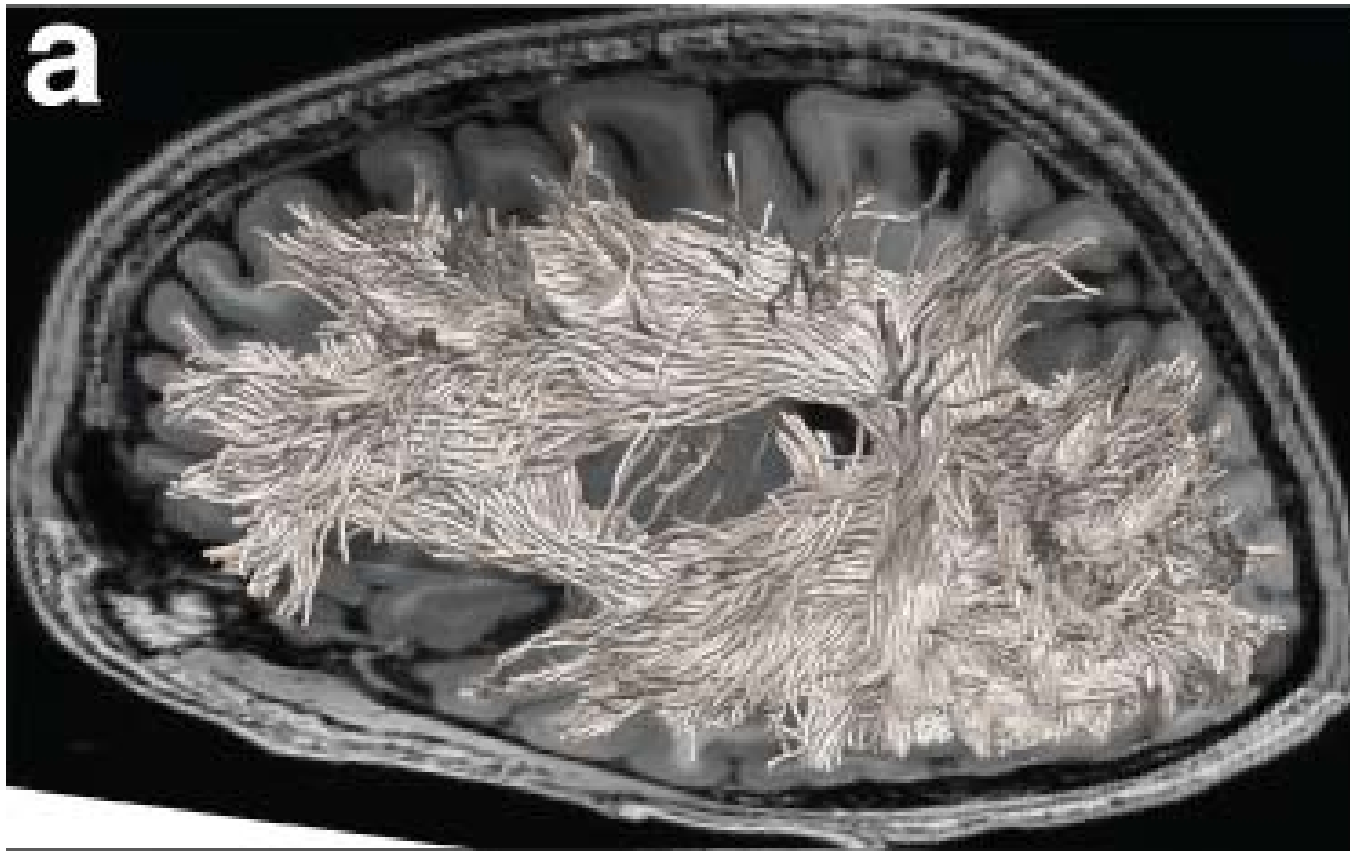


# Linear Iterative Fascicle Evaluation (LIFE)

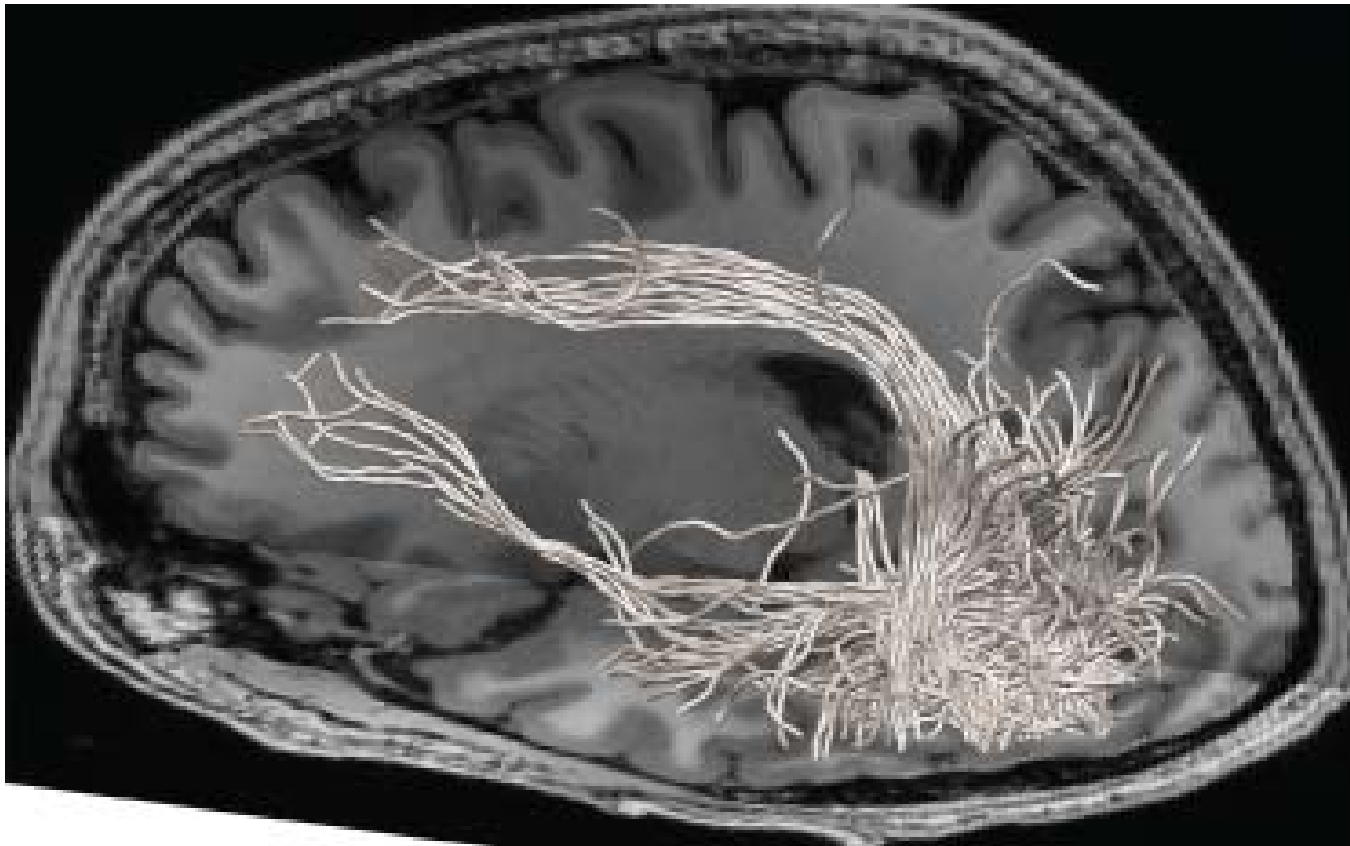
Cull fascicles with zero weights



# Tractography solution for fascicles with hMT+ endpoints

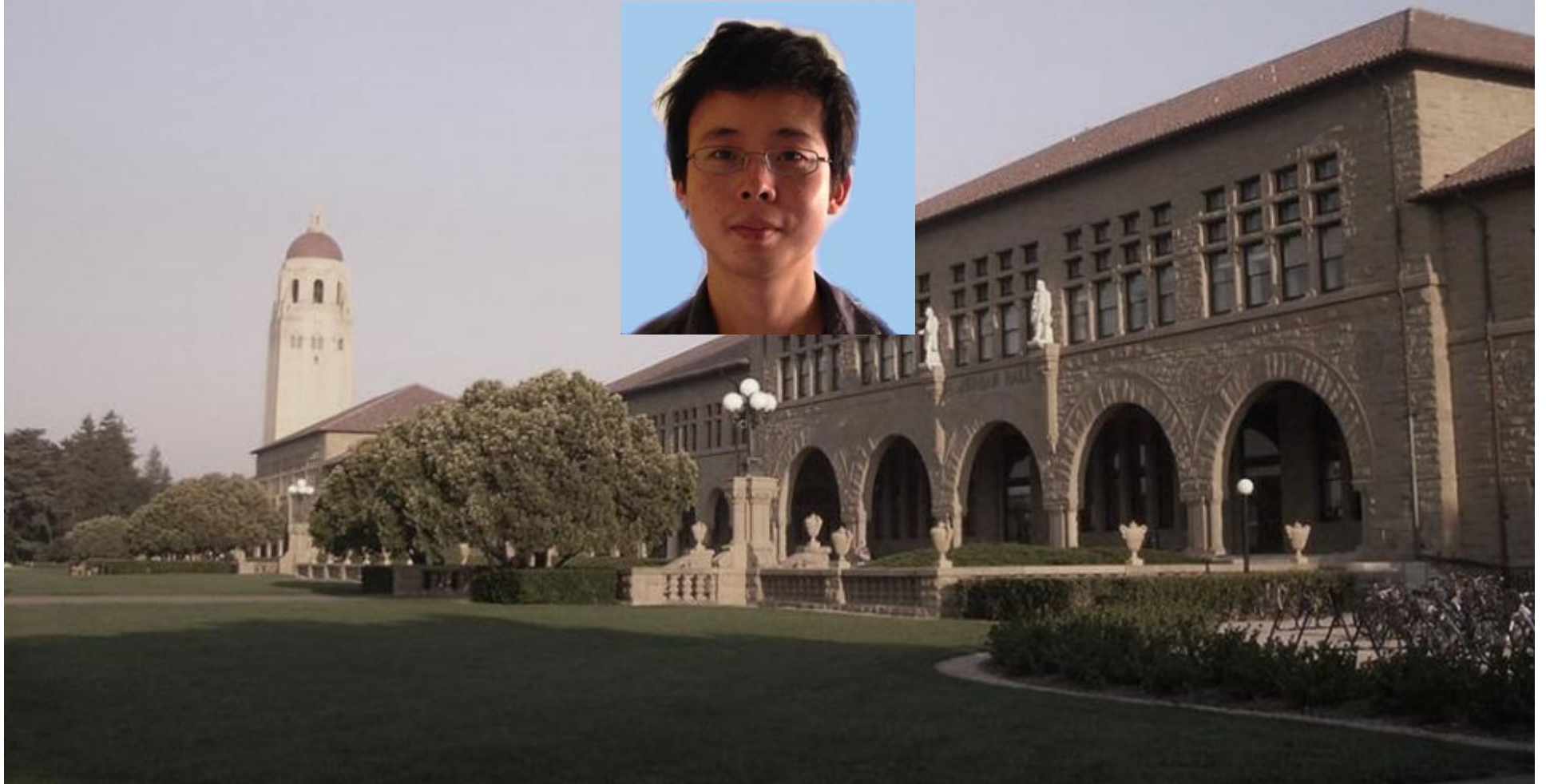
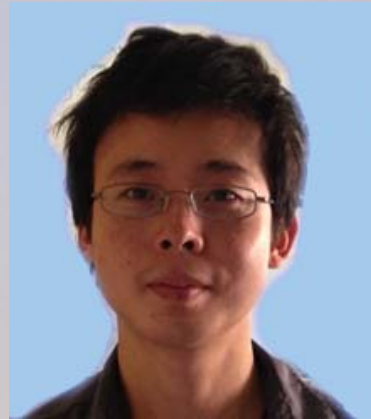


Culled solution explains the data just as well

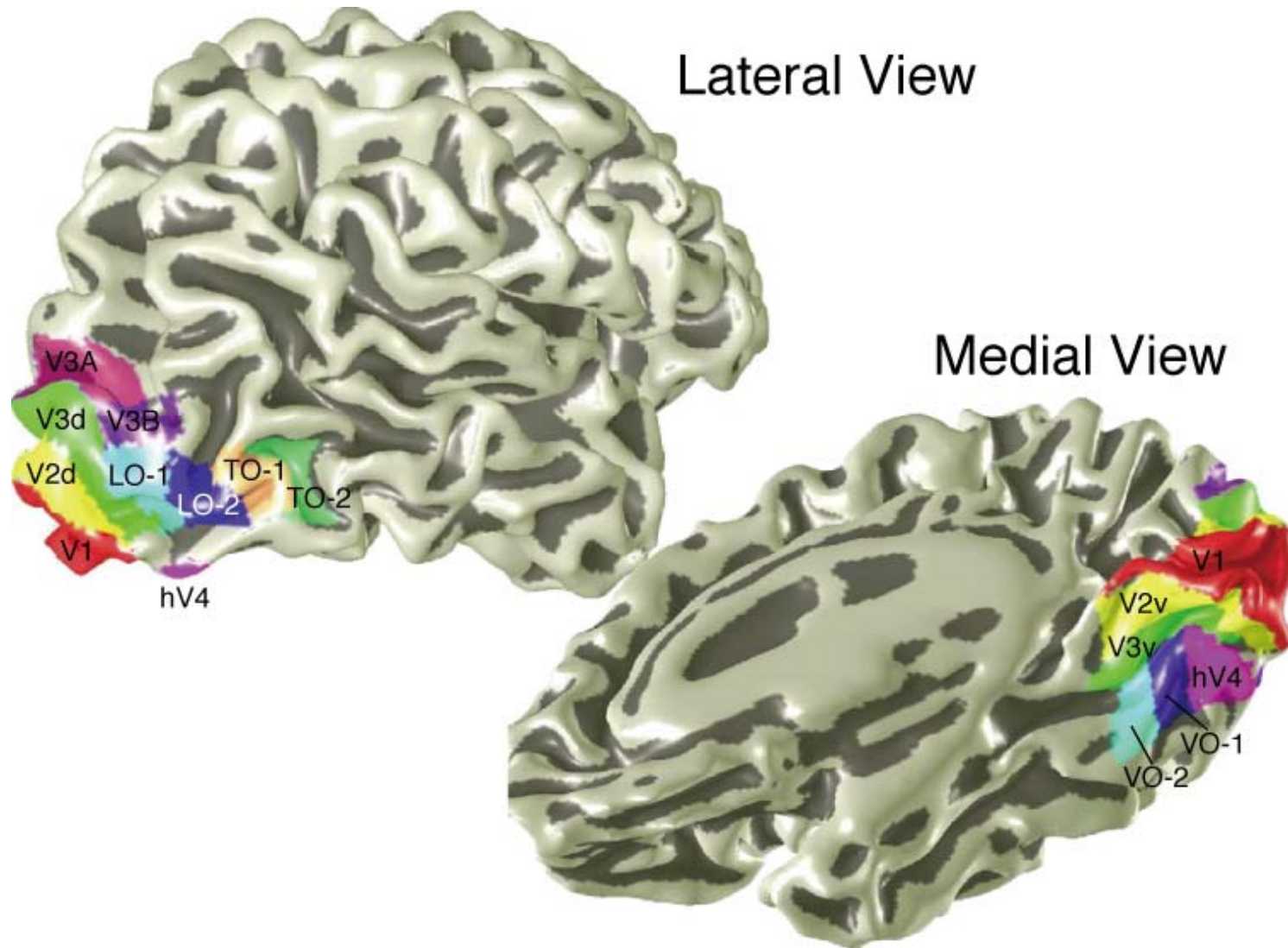


# Map organization and white matter: Dorsal-ventral streams

*Hiromasa Takemura*



# Visual field maps in humans



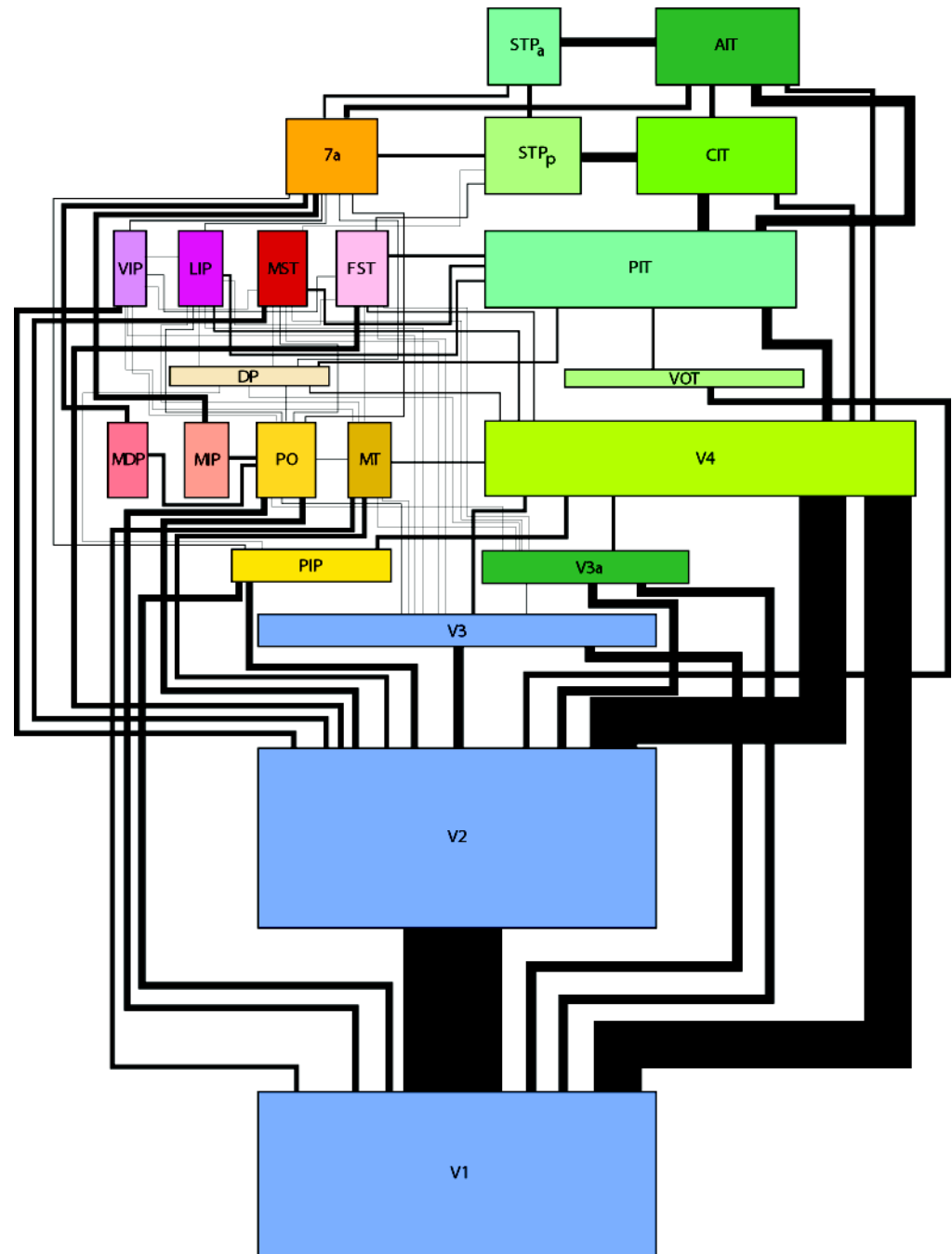
# Macaque field map organization

Felleman and Van Essen (1991),  
Annotated by  
Wallish and Movshon (2008)

## Human diagram

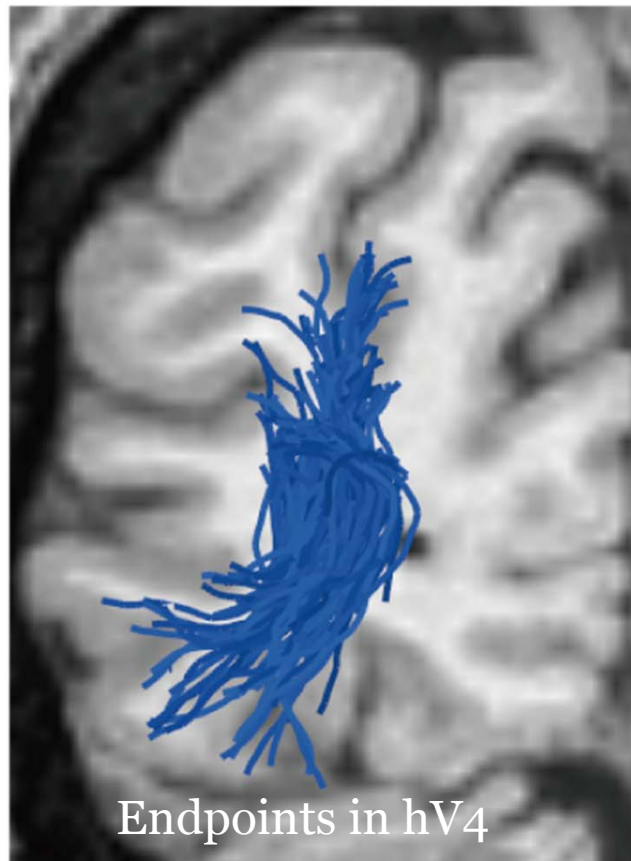
V3 is much bigger (75% of V2)  
V3A is accompanied by V3B  
hV4 position

What about dorsal-ventral  
segregation

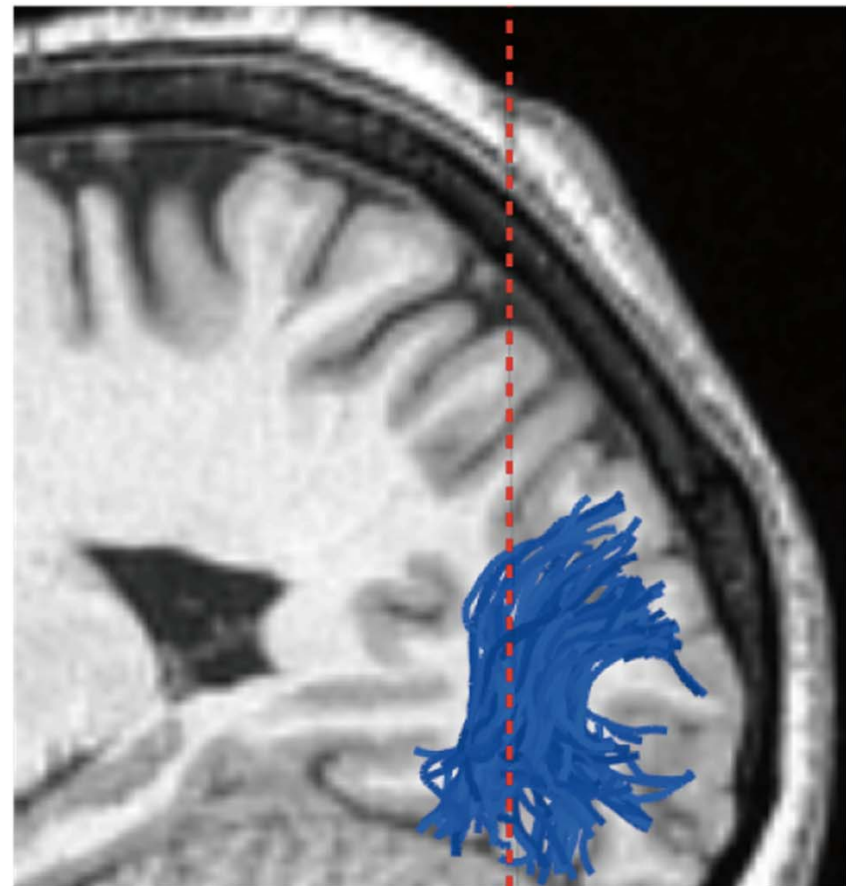


# Posterior Vertical Occipital Fasciculus (VOF)

Coronal



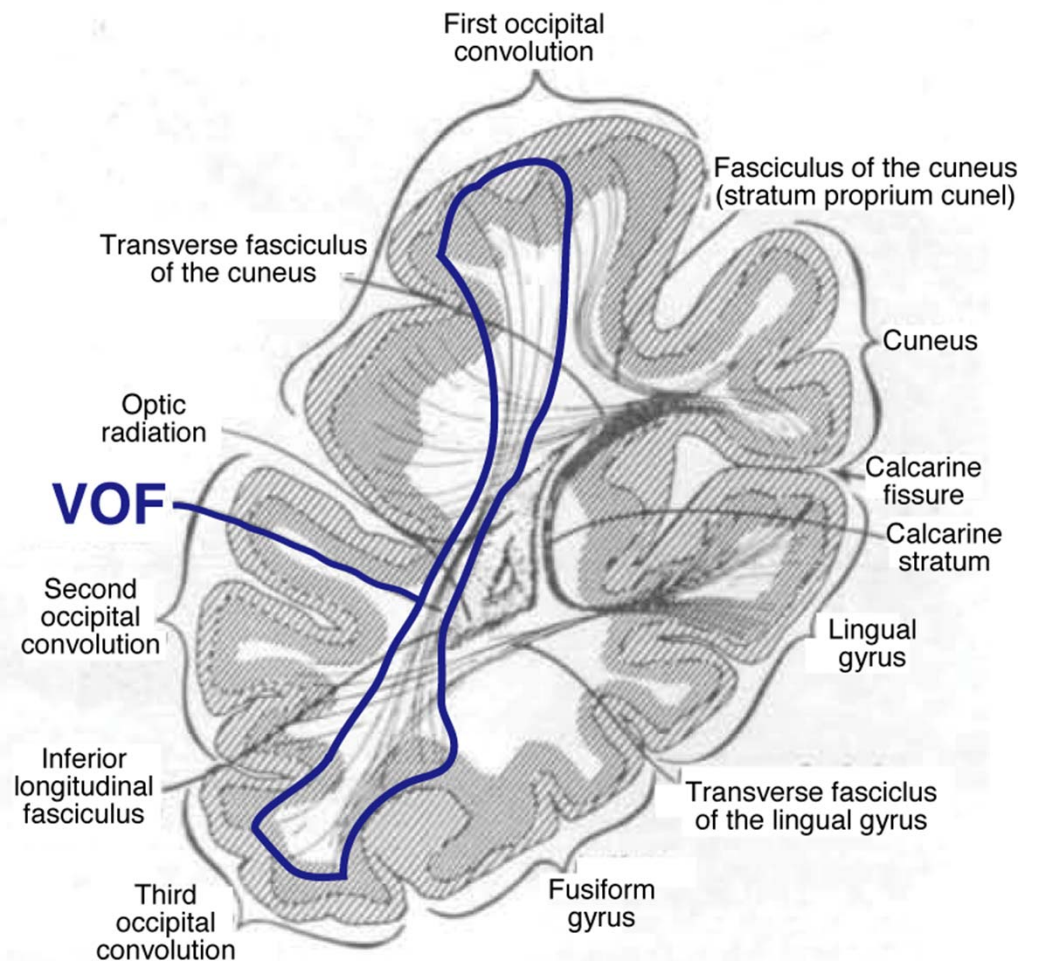
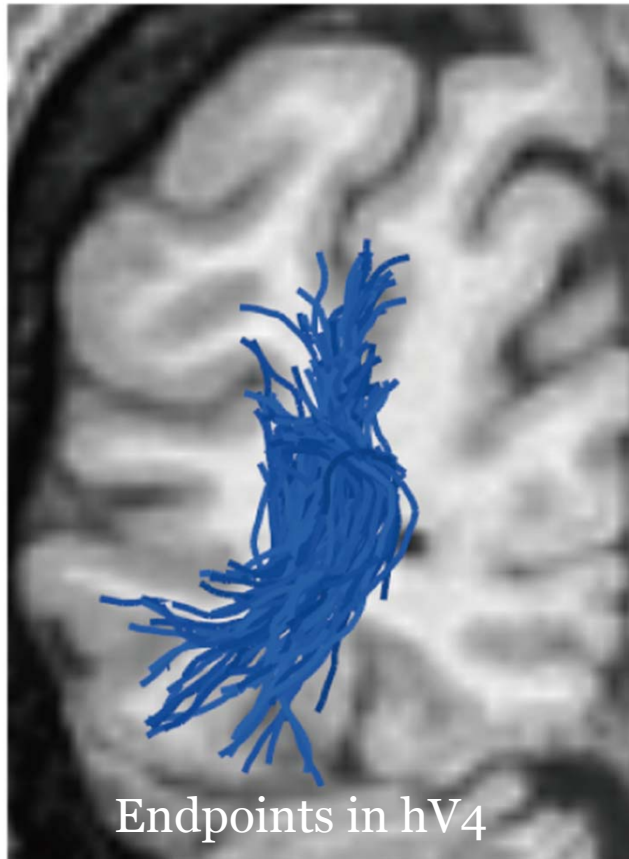
Sagittal



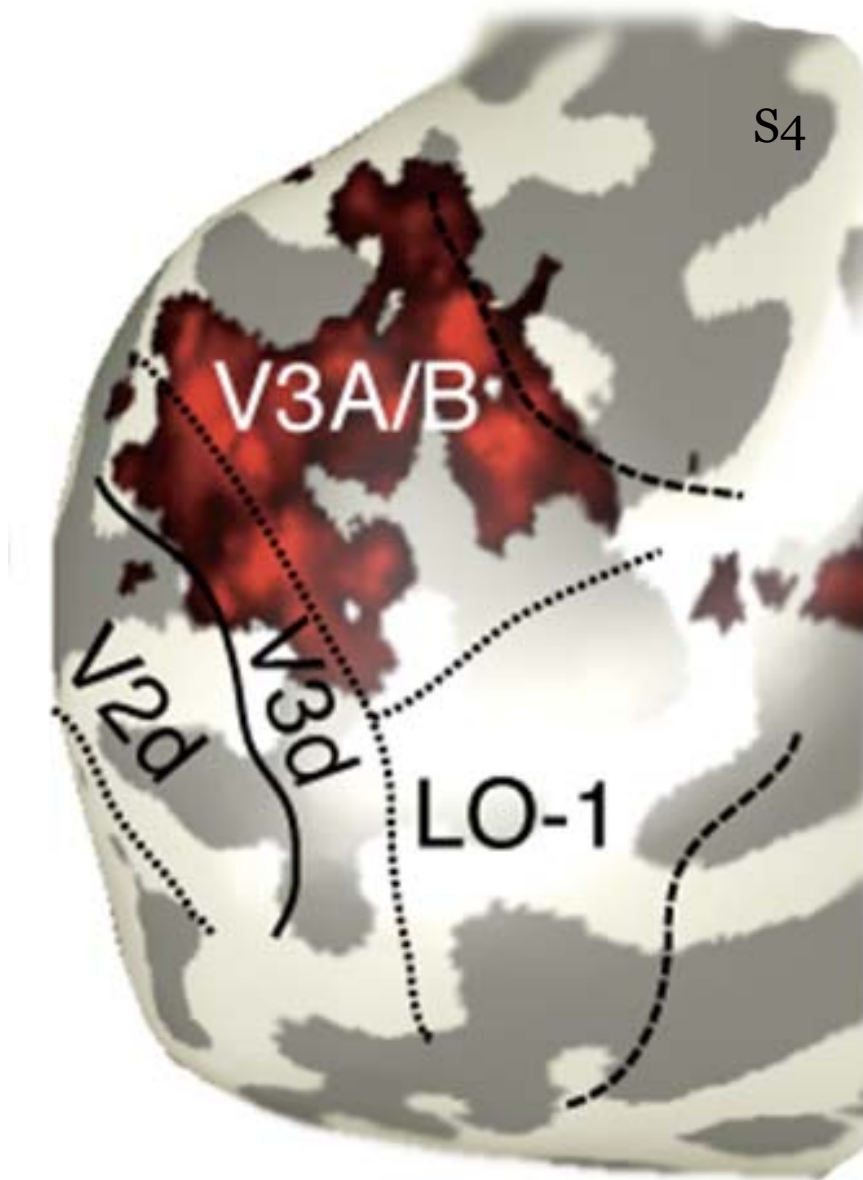
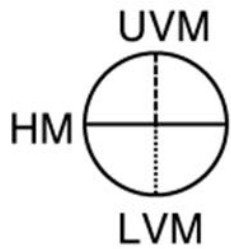
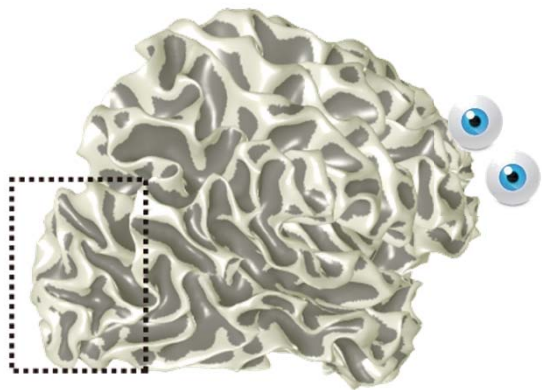
# Posterior Vertical Occipital Fasciculus (VOF)

(Dejerine, 1895; Modified by Greenblatt, 1973)

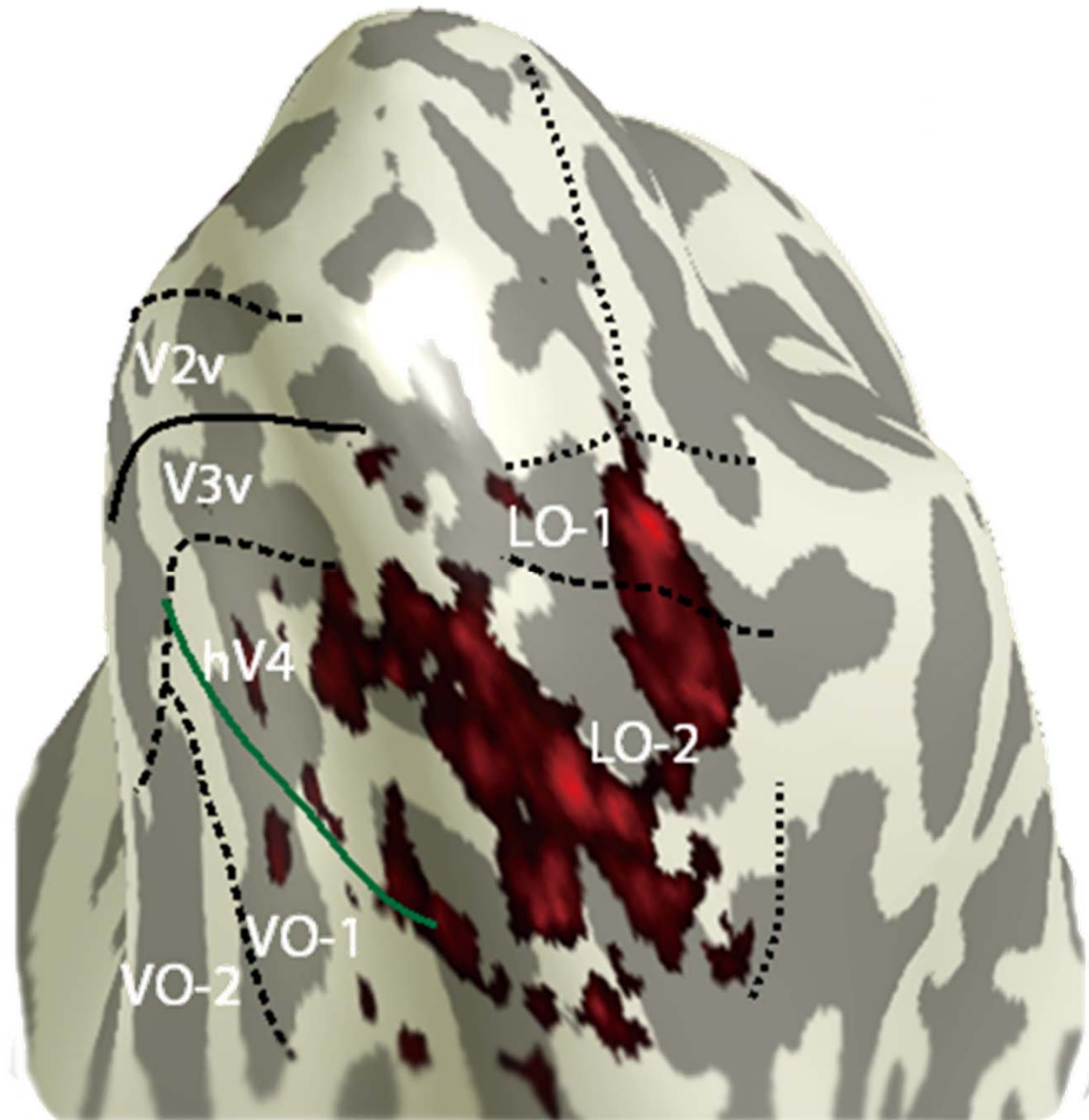
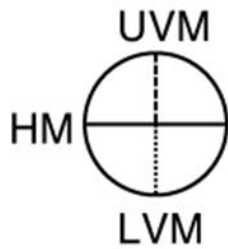
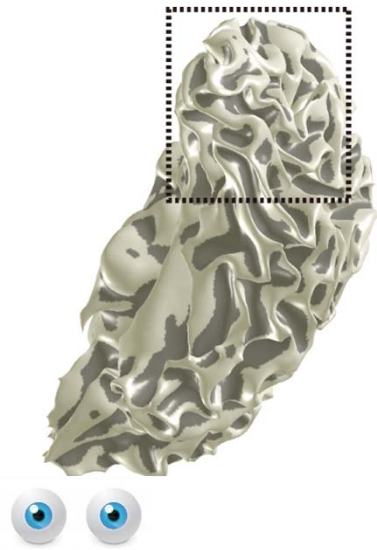
## Coronal



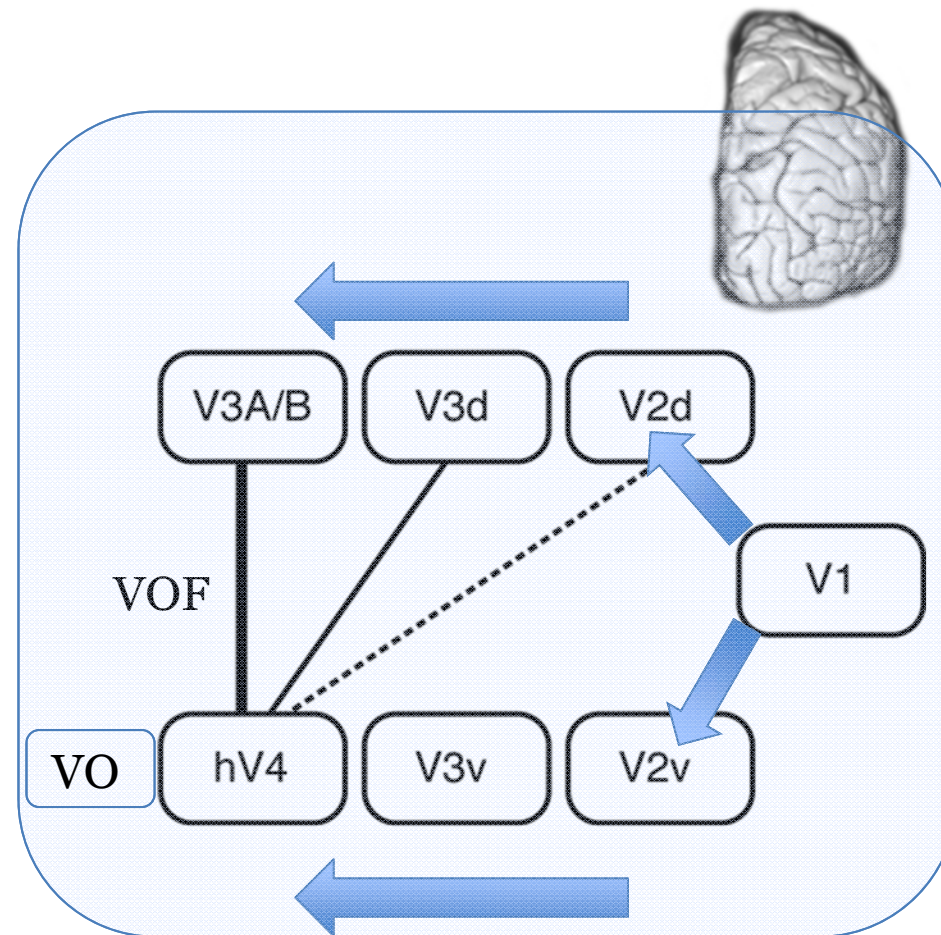
# Dorsal VOF endpoints



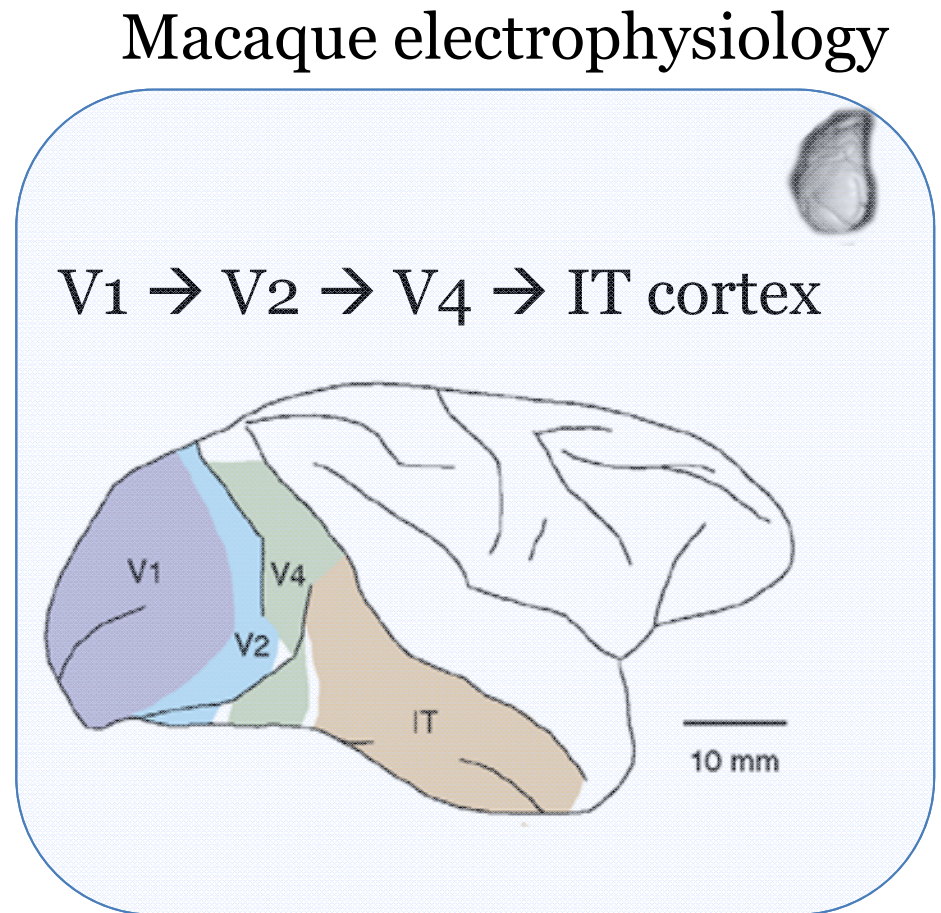
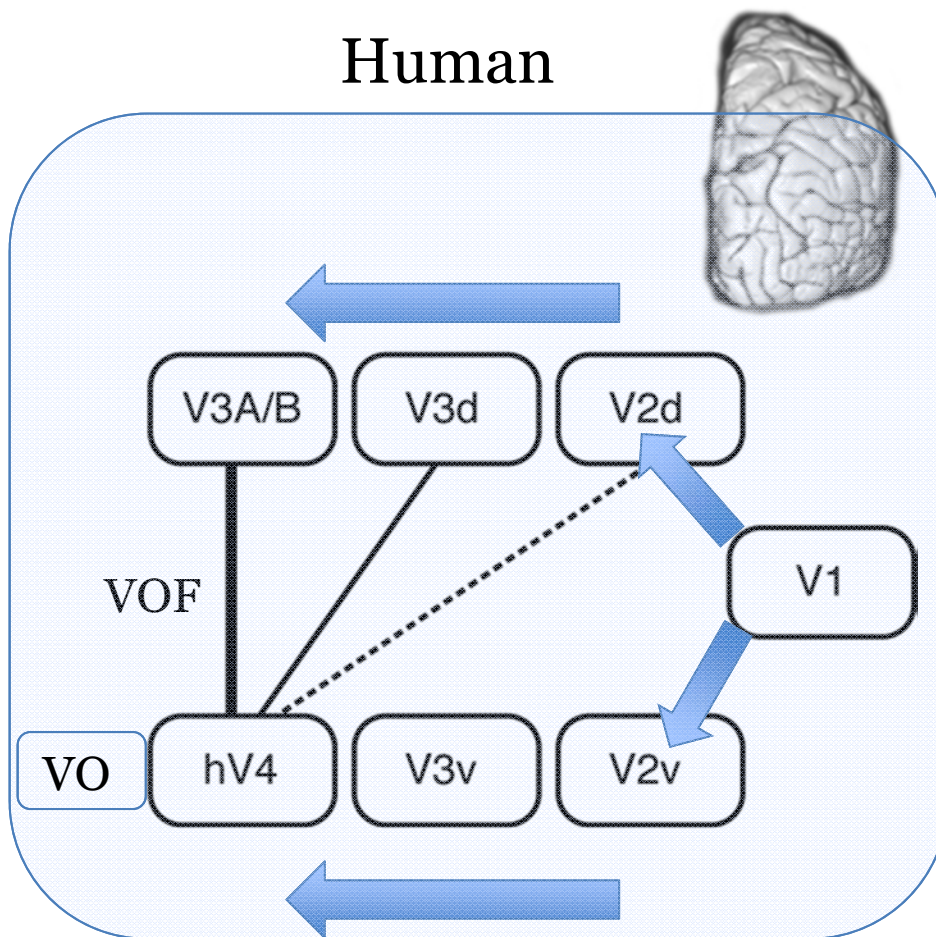
# Ventral VOF endpoints



# The human wiring diagram



# Rethinking the human wiring diagram



DiCarlo and Cox, 2007

# *Thank you!*

## **Stanford**

J. Winawer

A. Mezer

M. Perry

K. Kay

J. Yeatman

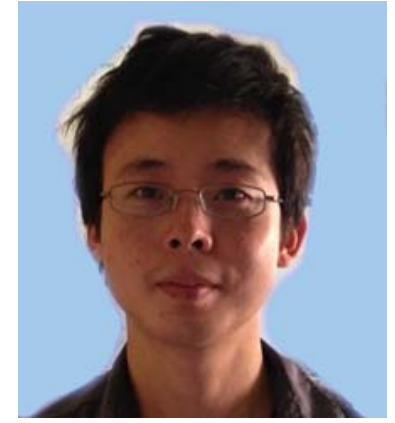
B. Dougherty



Ariel  
Rokem



Franco  
Pestilli



Hiromasa  
Takemura

