

# Diffusion MRI of brain pathways

*UCLA LINT NITP*  
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*Van J Wedeen, MD*  
*Department of Radiology, Massachusetts General Hospital*  
*AA Martinos Center for Biomedical Imaging*  
*van@nmr.mgh.harvard.edu*

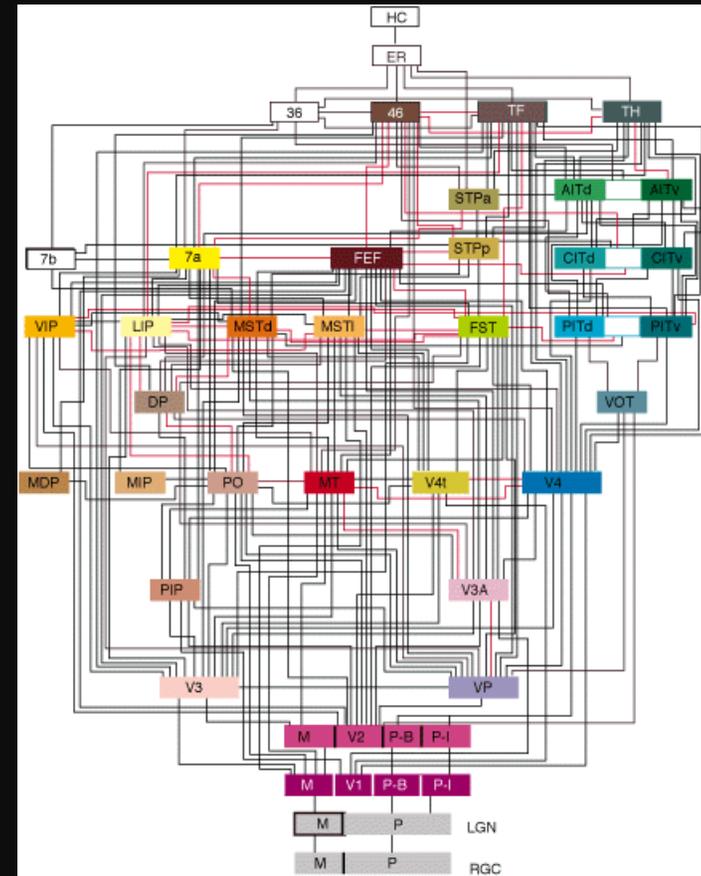


Crick & Jones, Nature, 1993 -

“It is intolerable that we do not have a knowledge of the connectivity of the human brain”

Jeff Lichtman, Science, 2011 -

“The relation between the structure of the nervous system and its function is more poorly understood ... than any other organ system.”



*Felleman & Van Essen, rhesus visual system  
Science 1989*

**WHITE MATTER CONNECTIVITY EXPLORED BY MRI**

VI Wedeen, TL Davis, RM Weisskoff, R Tootell, BR Rosen, JW Belliveau  
 Massachusetts General Hospital and Harvard Medical School, Boston, MA, USA

**Introduction**

Water diffusion assessed by MRI accurately portrays the local material anisotropy of living tissue. In the CNS, MRI of diffusion anisotropy can provide dramatic images of the orientation fields of cerebral white matter. In order to map neuroanatomic connectivity, we have investigated the feasibility of deducing from these orientation fields the large scale trajectories of cerebral white matter tracts.

**Methods**

MRI measurements of the water diffusion anisotropy tensor **D** were performed using the pulsed gradient spin echo method of Stejskal and Tanner. Diffusion data were acquired in 5 normal subjects using a GE-AMMR echo-planar 1.5T imaging system. Acquisitions used 3 mm isotropic spatial resolution for 20-30 contiguous slices. Data were produced of SNR  $\geq 30:1$ , defining the direction of principal diffusivity at each location with 3D angular accuracy of  $\pm 10^\circ$ . White matter fiber trajectories were reconstructed as described below, and compared with known anatomy.

Putative white matter tracts were defined by numerical integration of the diffusion anisotropy tensor field. Two approaches were investigated. The first approach postulates fiber tracts parallel with the principal orientation of diffusivity at each location. Then fiber position  $x^\alpha(\tau)$ ,  $\alpha \in \{1,2,3\}$ , will satisfy the first order differential equation:

$$dx^\alpha/d\tau \pm e_1^\alpha(x) v_1^\alpha(x) = 0 \quad [1]$$

where  $e_1$  denotes the maximal eigenvalue of the diffusion tensor and  $v_1^\alpha$  is its respective eigenvector. The sign ambiguity of Eq. [1] is resolved by an arbitrary, but locally consistent, choice. The second approach considers the distance in tissue defined by the mean diffusion times between points. This distance defines a (non-Euclidean) geometry in which the role of a metric tensor is played by the negative of the diffusion tensor, and it is natural to postulate that fiber tracts are the minimal paths between points. Such paths satisfy the second order geodesic equation:

$$d^2x^\alpha/d\tau^2 + \Gamma_{\beta\gamma}^\alpha(dx^\beta/d\tau)(dx^\gamma/d\tau) = 0 \quad [2a]$$

with repeated indices summed, where  $\Gamma$  represents the connection coefficients of  $\mathbf{D} = D_{\alpha\beta}$ :

$$\Gamma_{\beta\gamma}^\alpha = 1/2 (\mathbf{D}^{-1})^{\alpha\epsilon} (\partial D_{\beta\epsilon}/\partial x^\gamma + \partial D_{\epsilon\gamma}/\partial x^\beta + \partial D_{\alpha\epsilon}/\partial x^\gamma) \quad [2b]$$

Eq. [2] may be solved given an initial point  $x^\alpha$  and an initial slope  $dx^\alpha/d\tau$ .

**Results**

Fiber tracts reconstructed via Eq. [1] were in good agreement with known anatomy. Fig 1 shows fibers of the left *corona radiata* tracked from diencephalon to cortical mantle; fiber data are superposed upon parasagittal magnitude MRI; right is rostral.

Solution of the geodesic Eq. [2a-2b] is less robust. In the *corpus callosum*, fewer than 50% of computed geodesics tracked known white matter anatomy for more than 3 cm. Abrupt divergences of solutions from expected trajectories suggest numerical instability.

**Discussion**

Reconstruction of white matter tracts by vector field integration successfully indicates known large-scale white matter anatomy in prototypical cases. This technique may allow for integration in an individual of activated neural systems with their underlying connectivity.

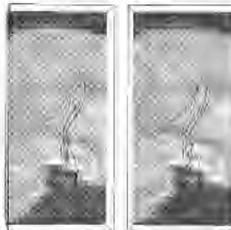
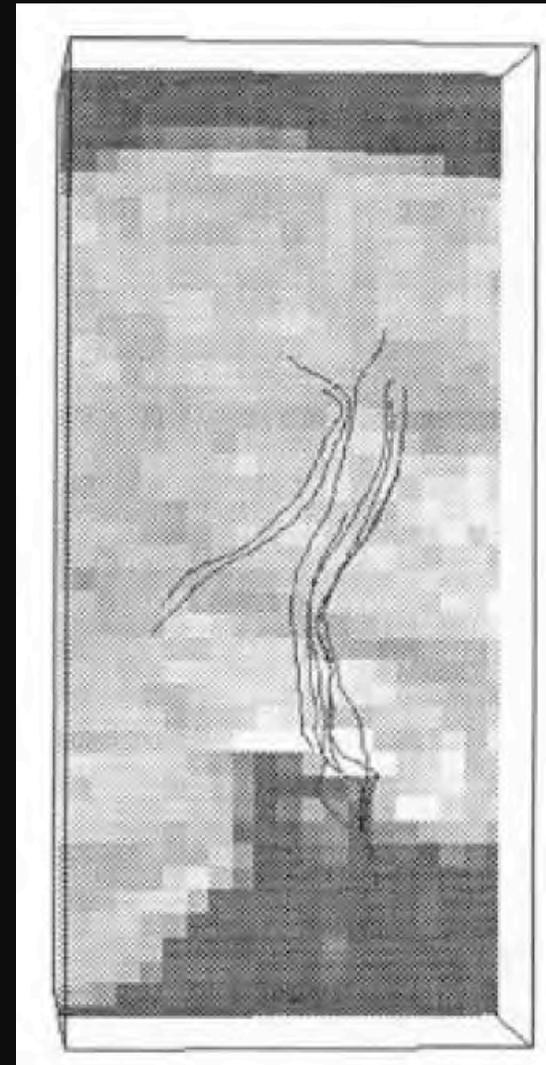
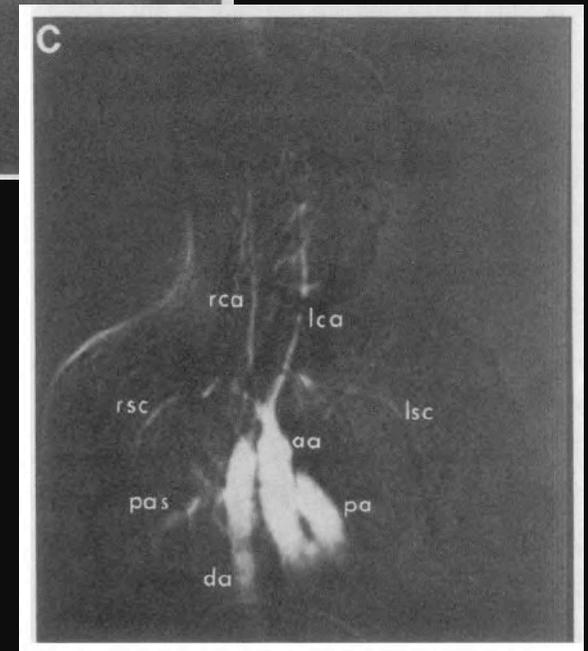
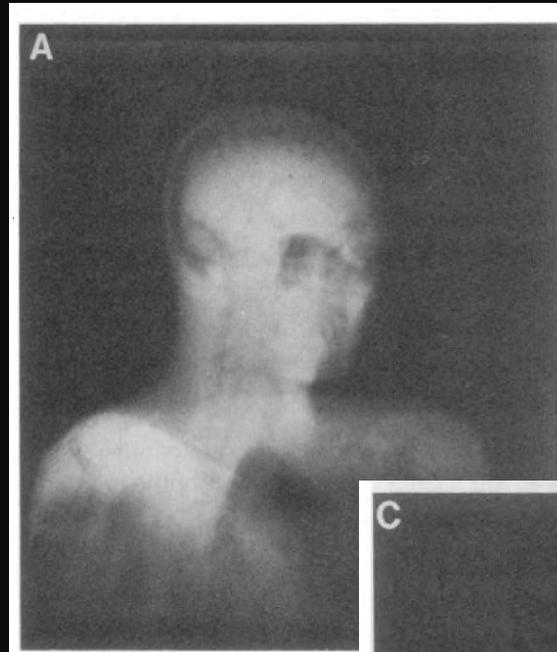
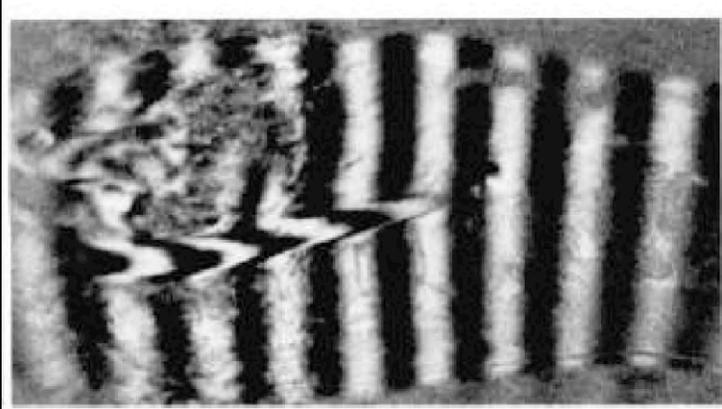
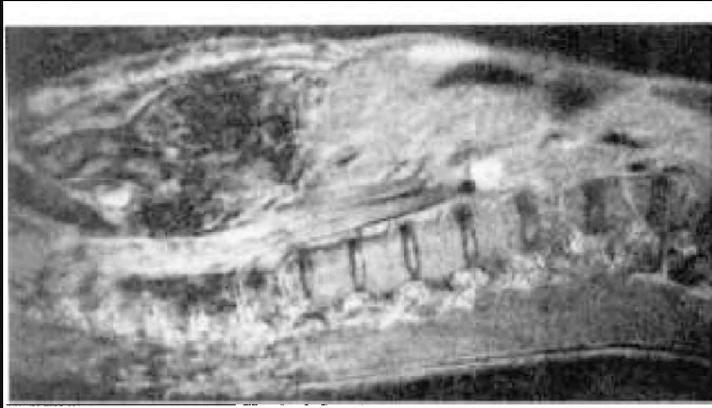


Fig 1. Stereoa pair of 3D fiber tracts.



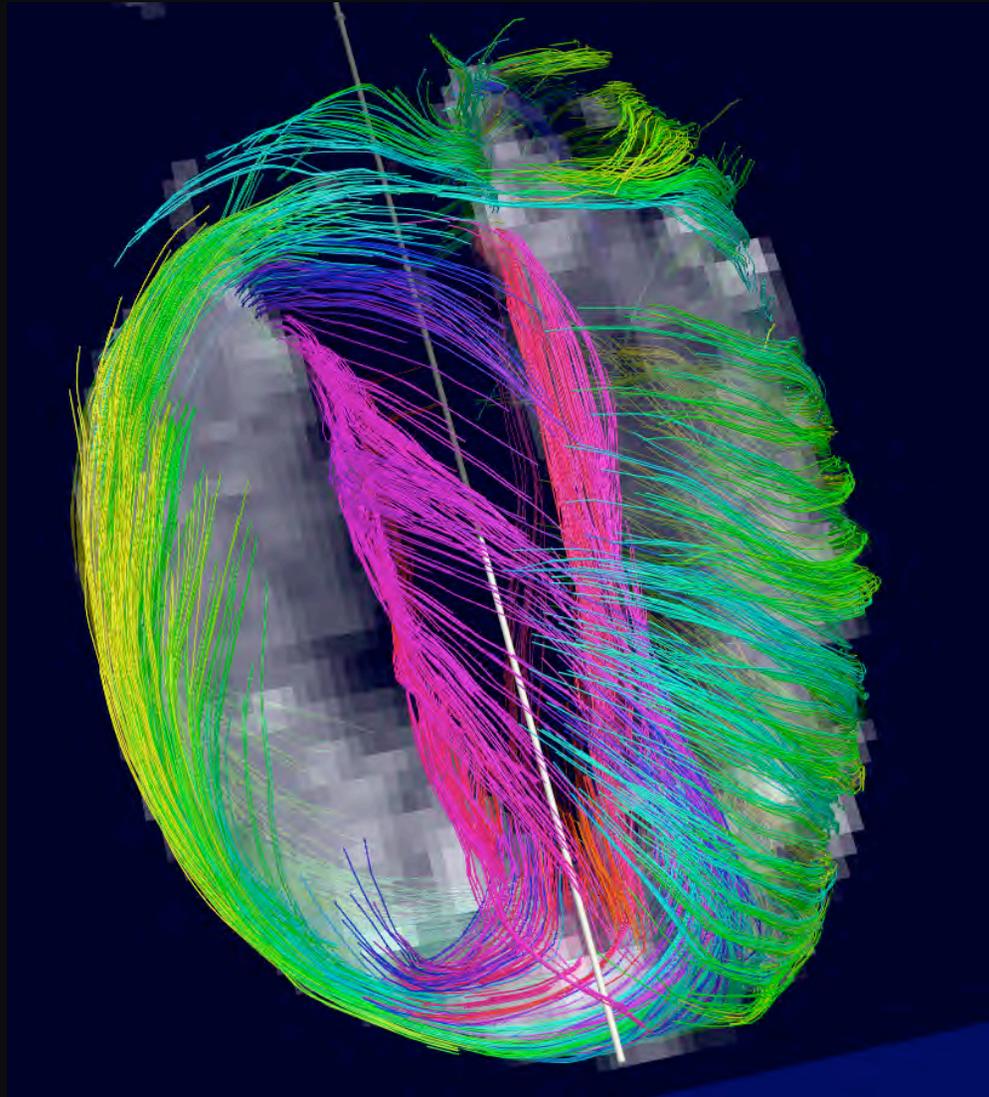
## Blood flow - 1985



MR angio Science '86

# MRI tractography reveals the functional architecture of the heart

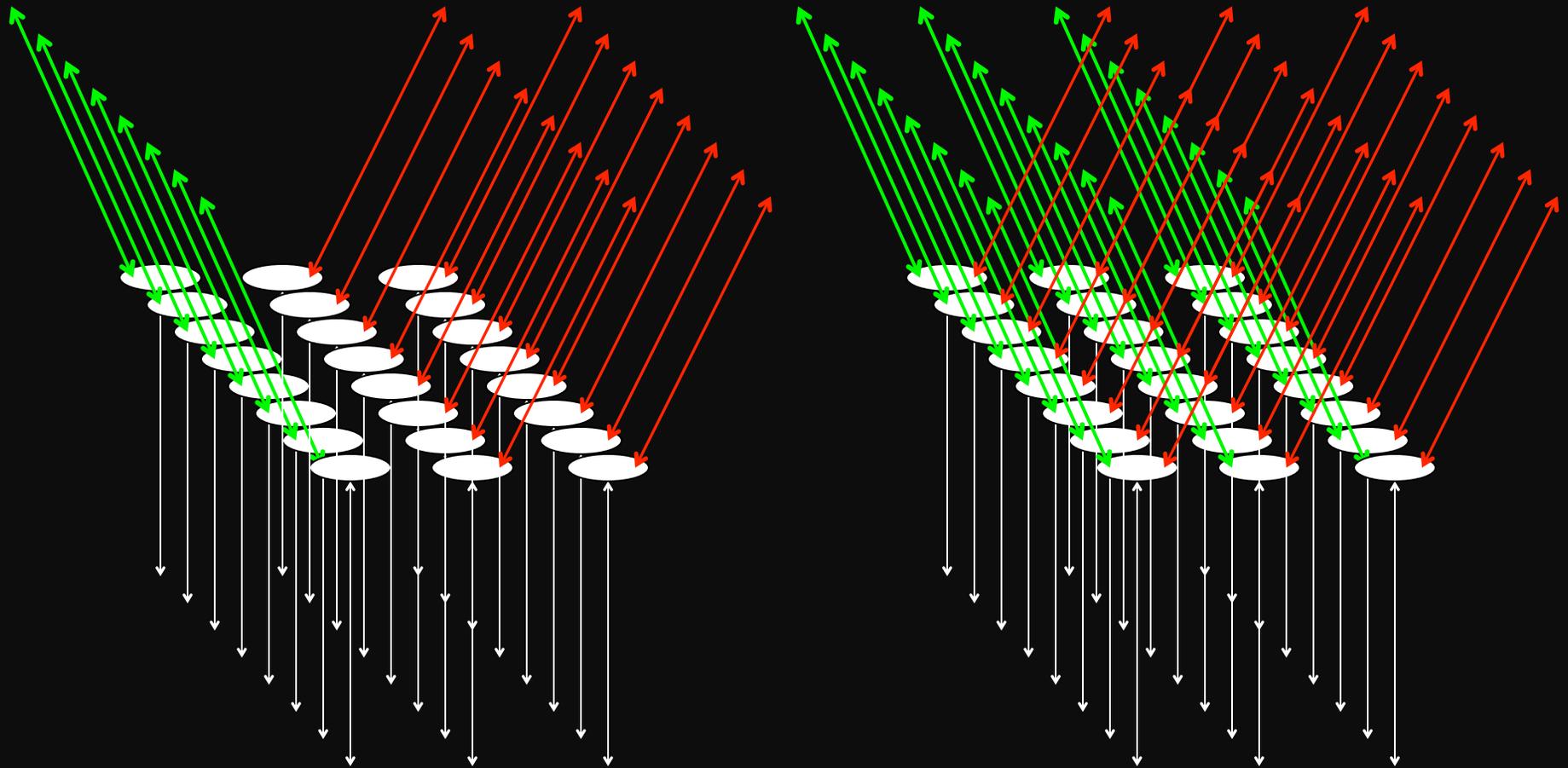
equal fiber shortening across the wall; a compliant slip system; 2x dynamic regime; design saturation



*Pathway overlap is a defining characteristic of the brain*

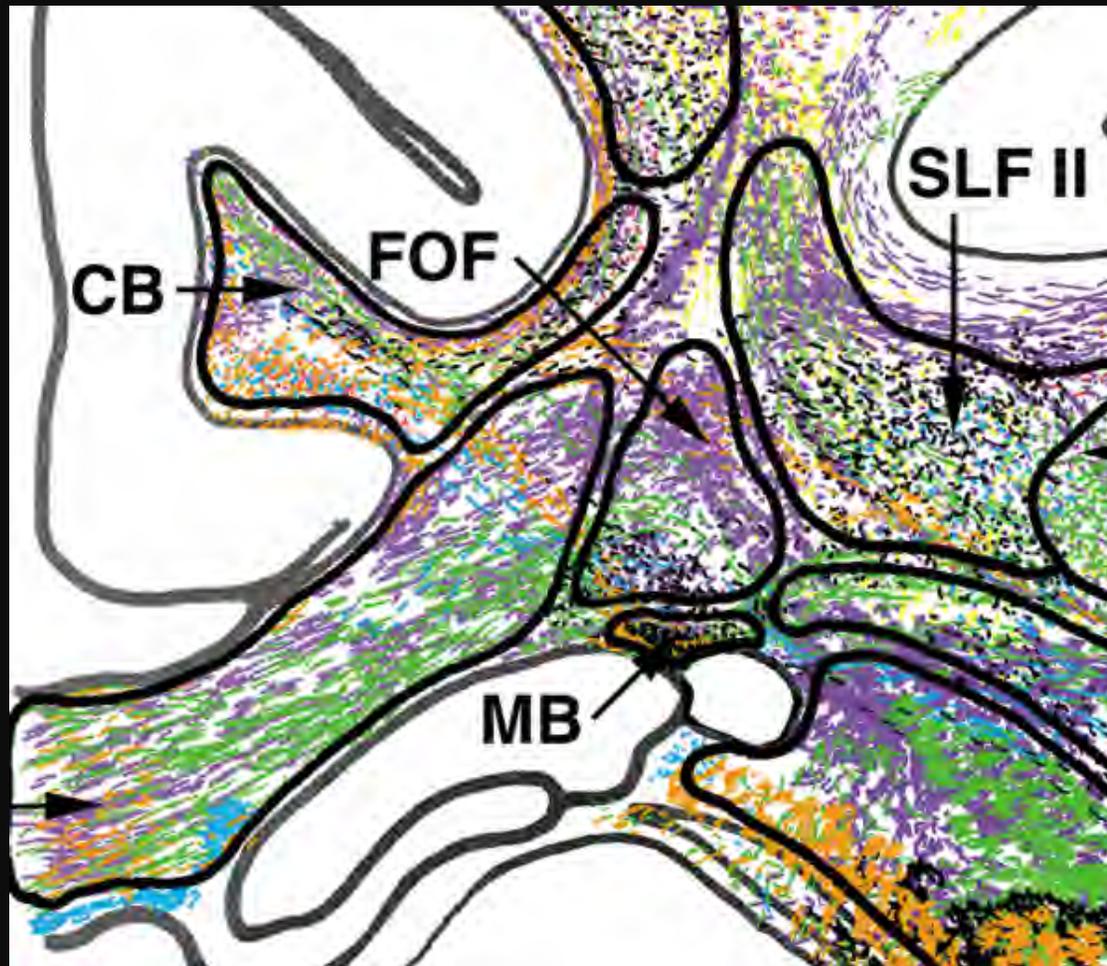
*not brainy*

*brainy*



Neuroanatomy is more difficult than other anatomy because many structures can overlap in the same place

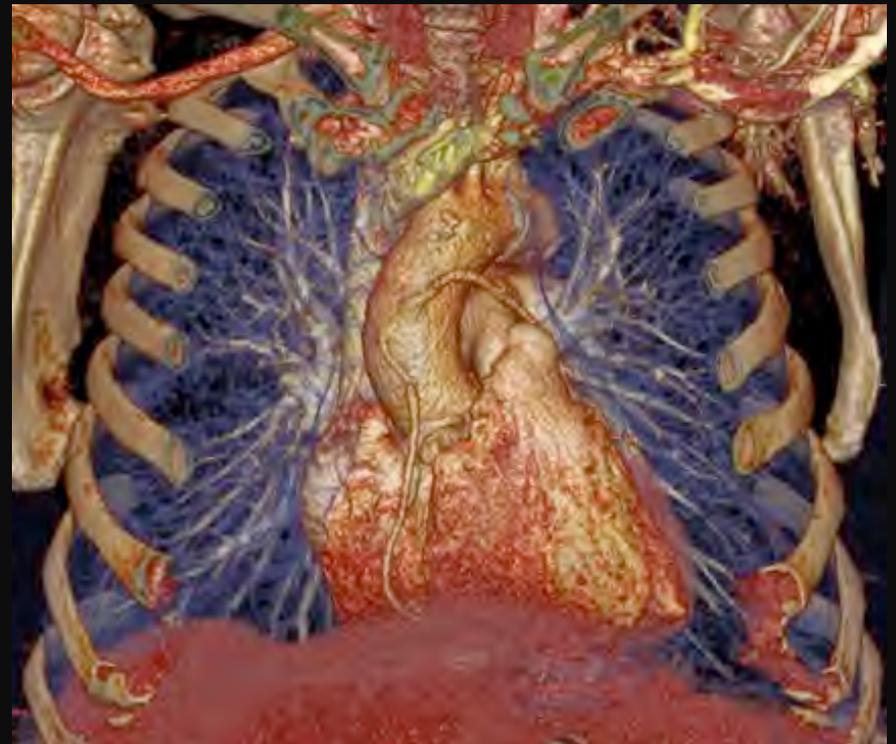
macaque tracers - Pandya & Schmahmann



2D x-ray, overlap



3D CT, no overlap

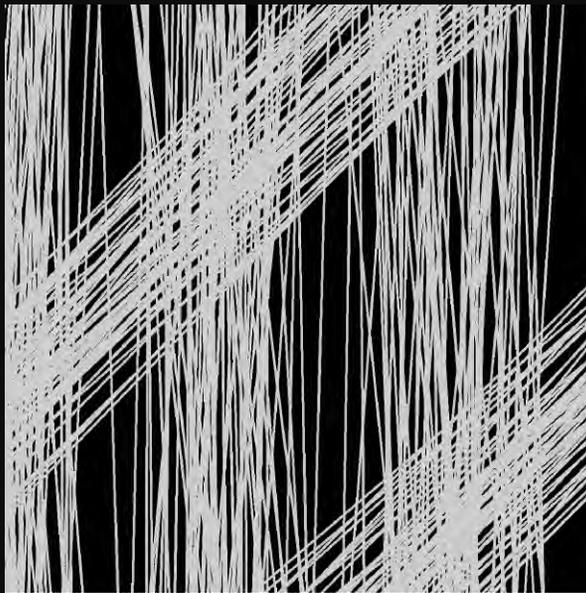


Diffusion MRI -

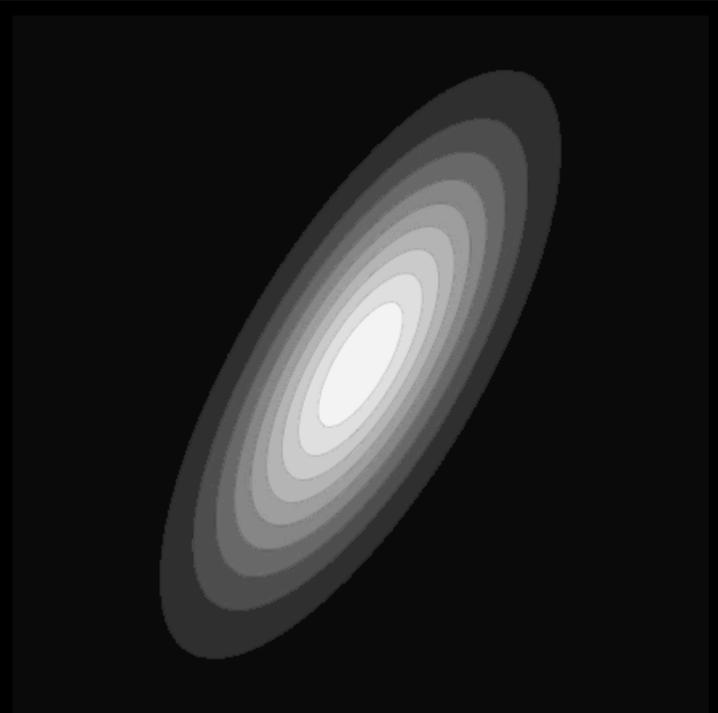
3D pattern of water diffusion indicates tissue structure

1994: diffusion tensors show average fiber directions

*tissue*



*diffusion tensor*

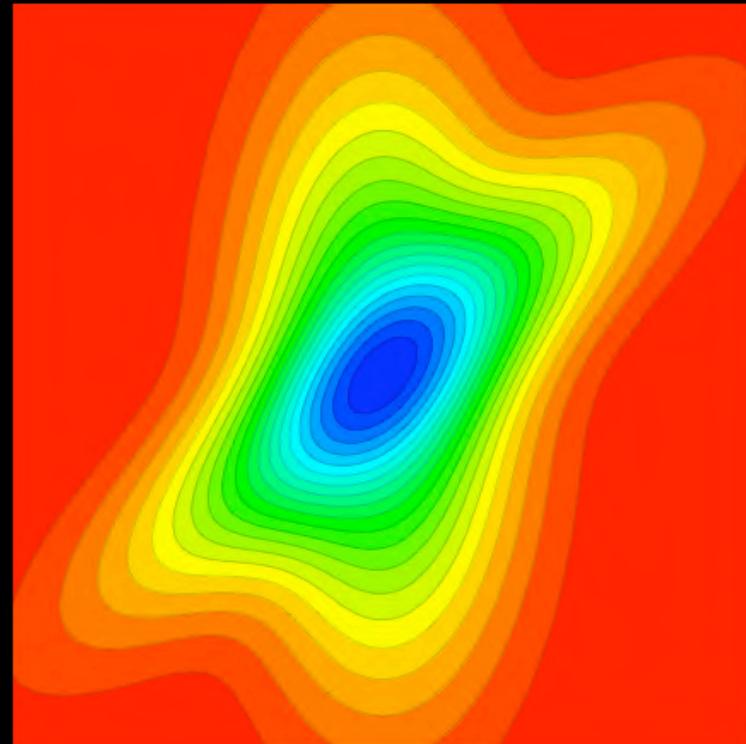
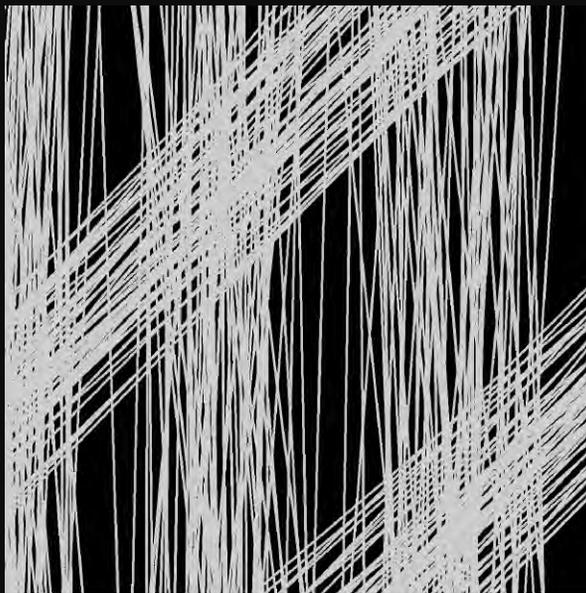


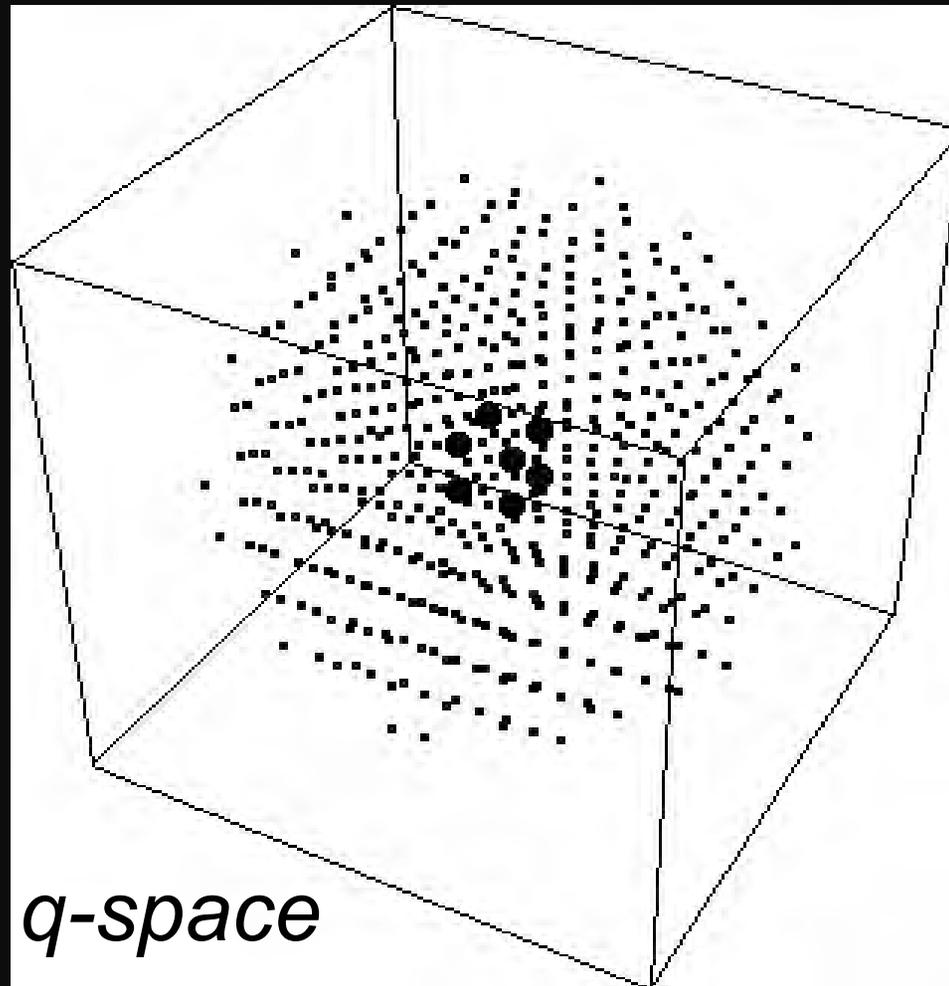
Water diffusion traces tissue fiber structure

diffusion spectrum MRI (DSI) resolves overlapping pathways

*“image” of diffusion*

*brain tissue*

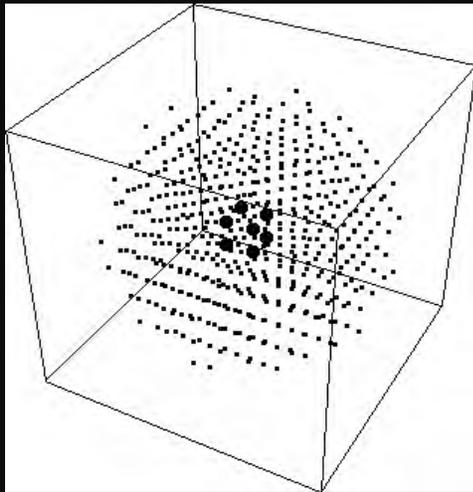




*DTI: 7 q-samples, recon with tensor fit*  
*DSI: 500 q-samples, recon with 3DFT*

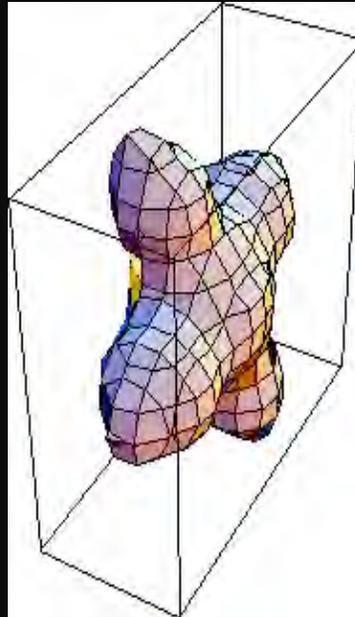
# *DSI encoding and reconstruction*

*q samples*



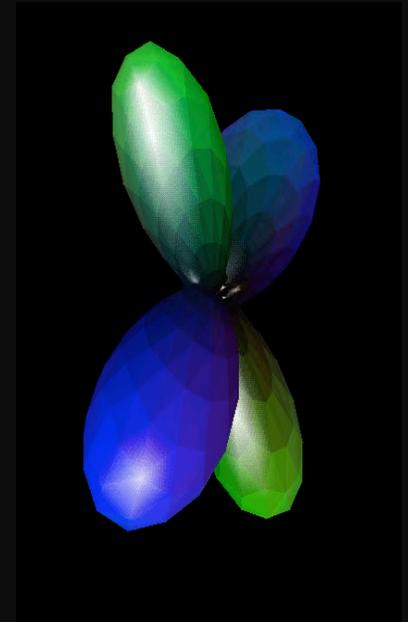
*FT* →

*pdf level set*

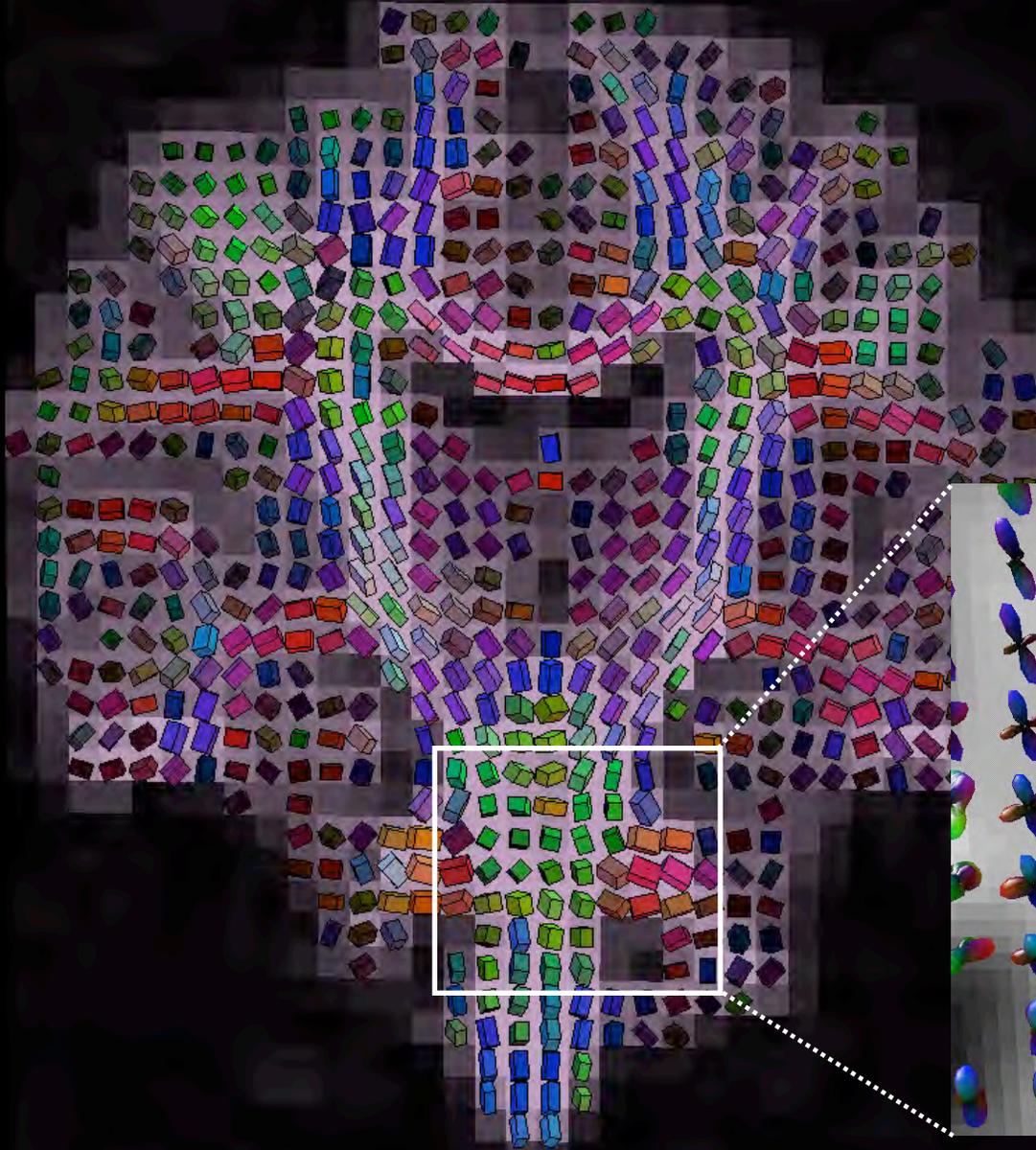


*fdr* →

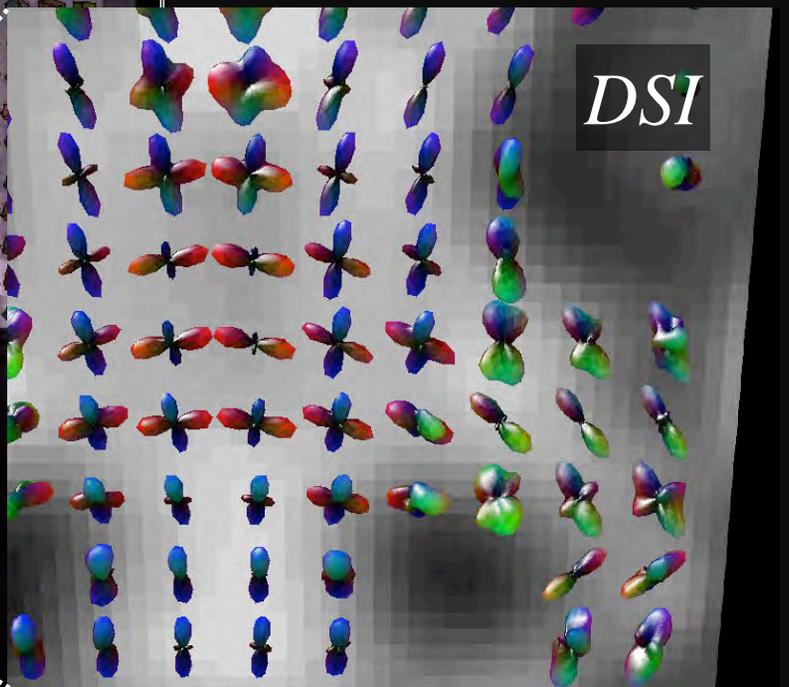
*odf spherical plot*



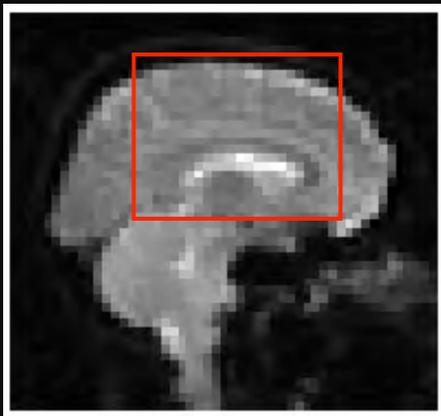
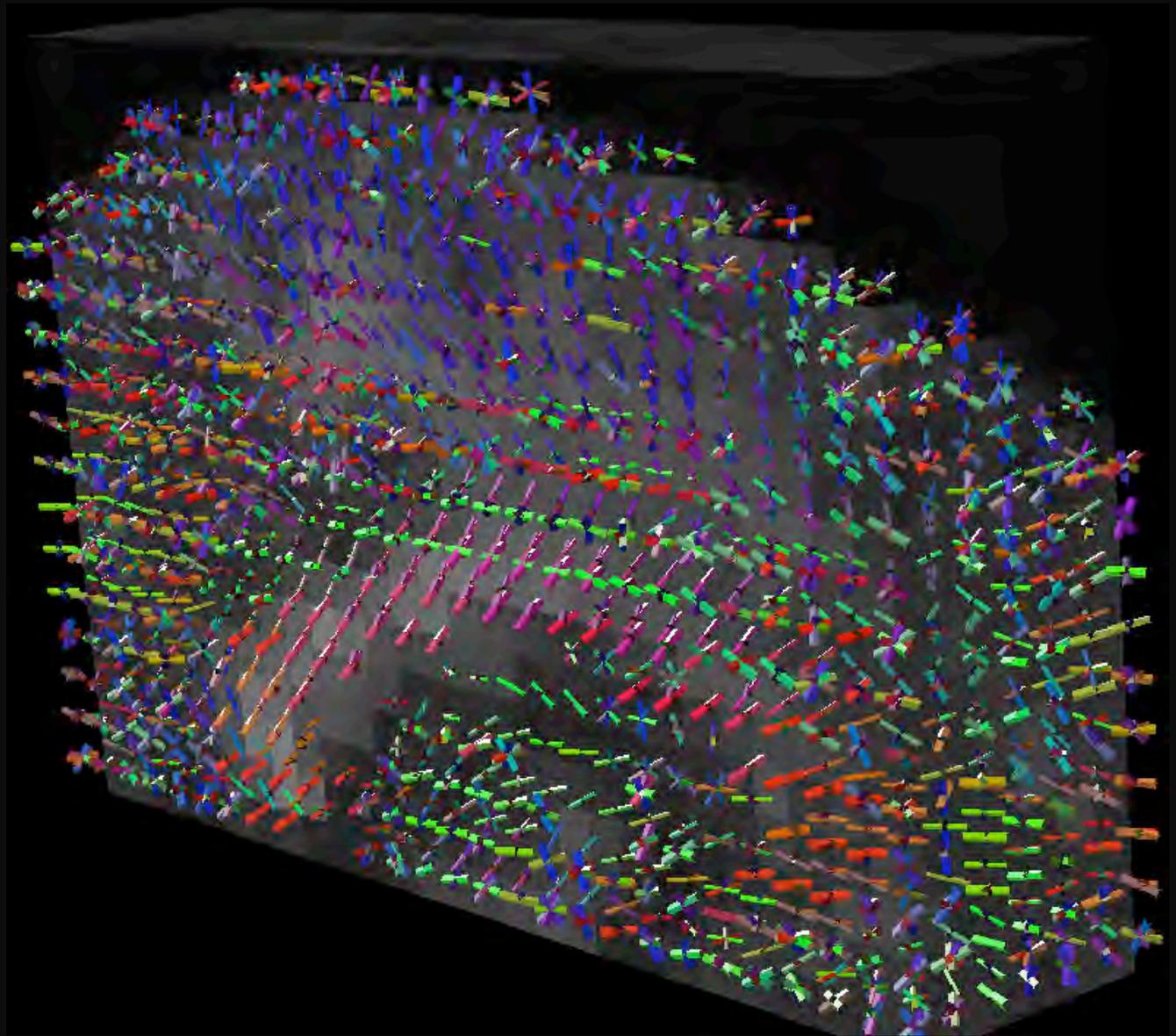
*DTI*



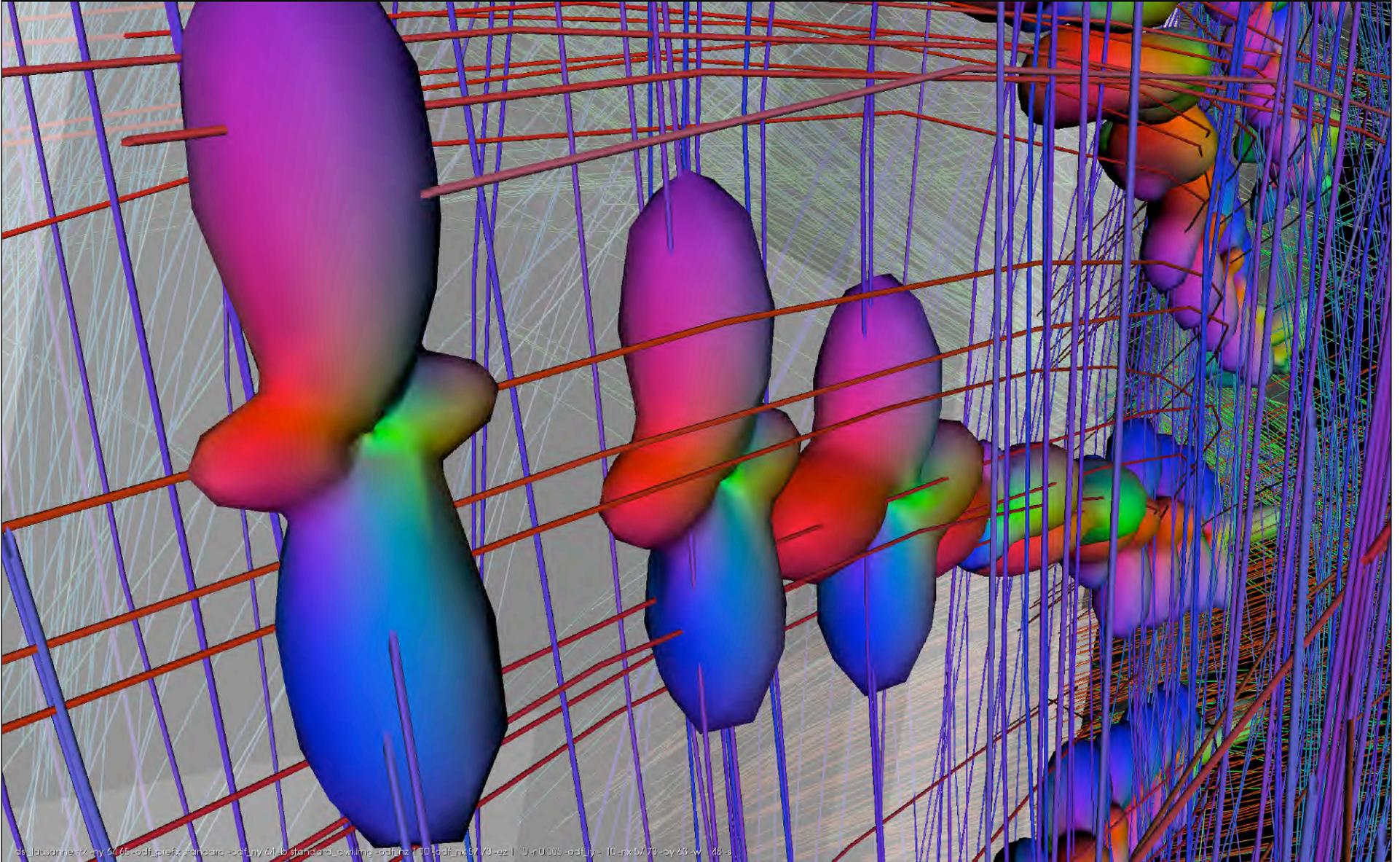
*DSI*



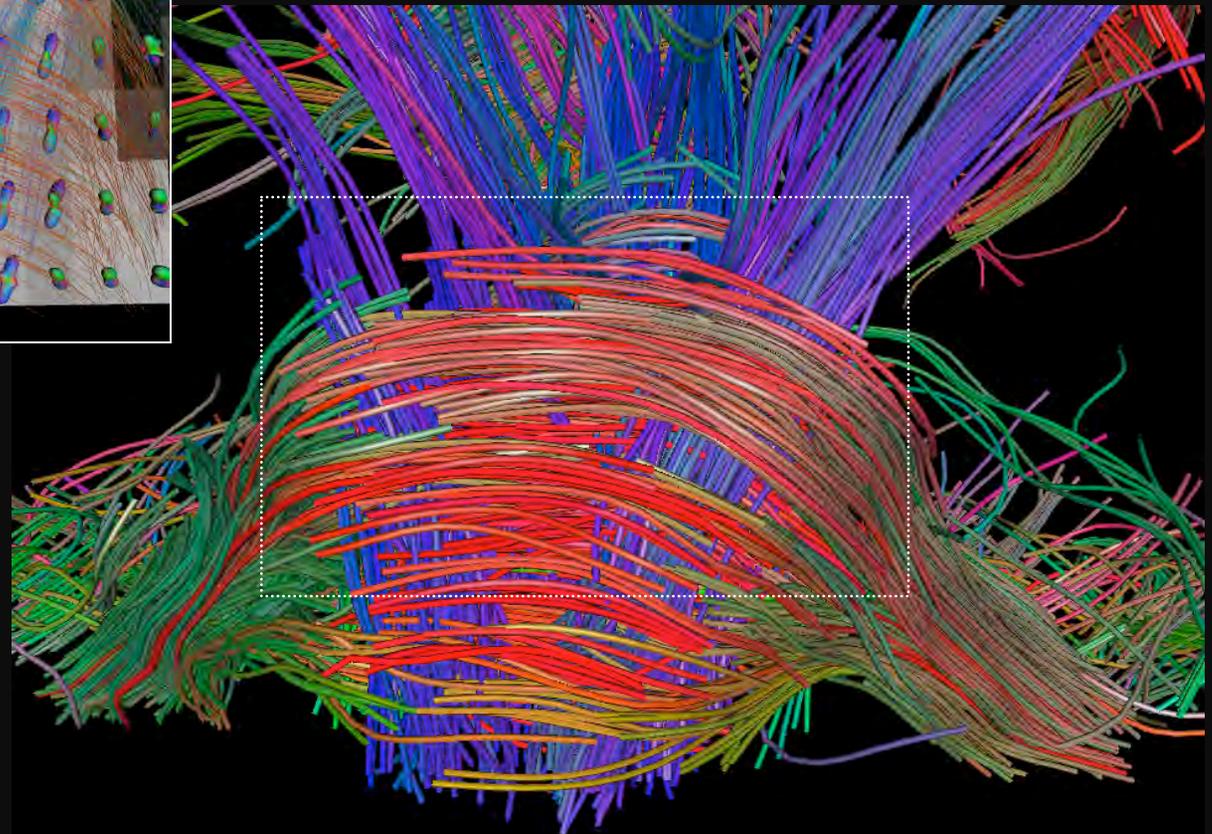
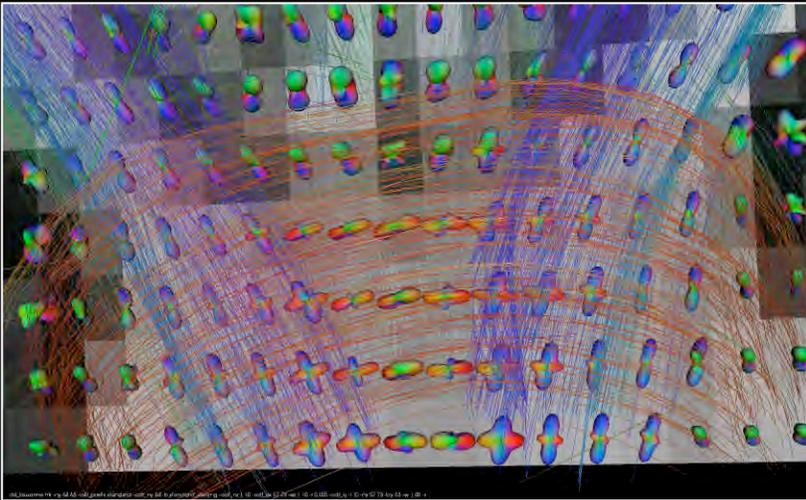
# DSI directions of maximum diffusion 3T human in vivo



To de-singularize the brain, resolve fiber orientations at each location - with DSI



*DSI tractography - Pons normal human subject in vivo  
middle cerebellar peduncle - red  
corticospinal tract - blue*



3T DSI SE 3500/96  
2.6mm  $b_{max}$  8500 53min

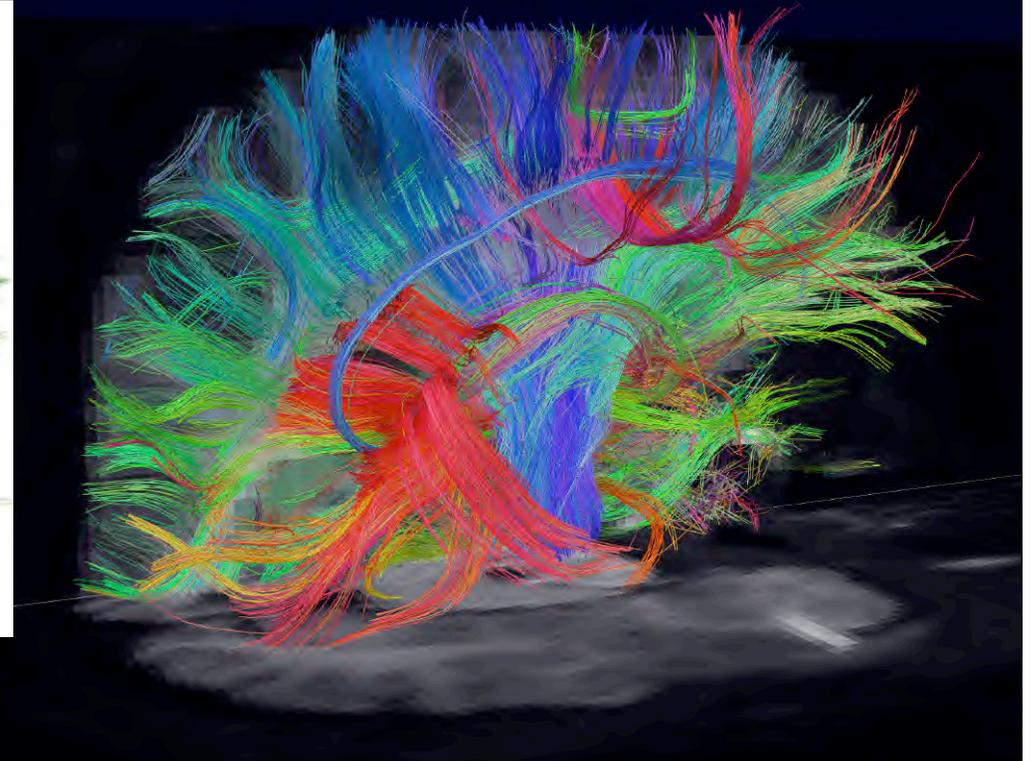


*Human DSI*

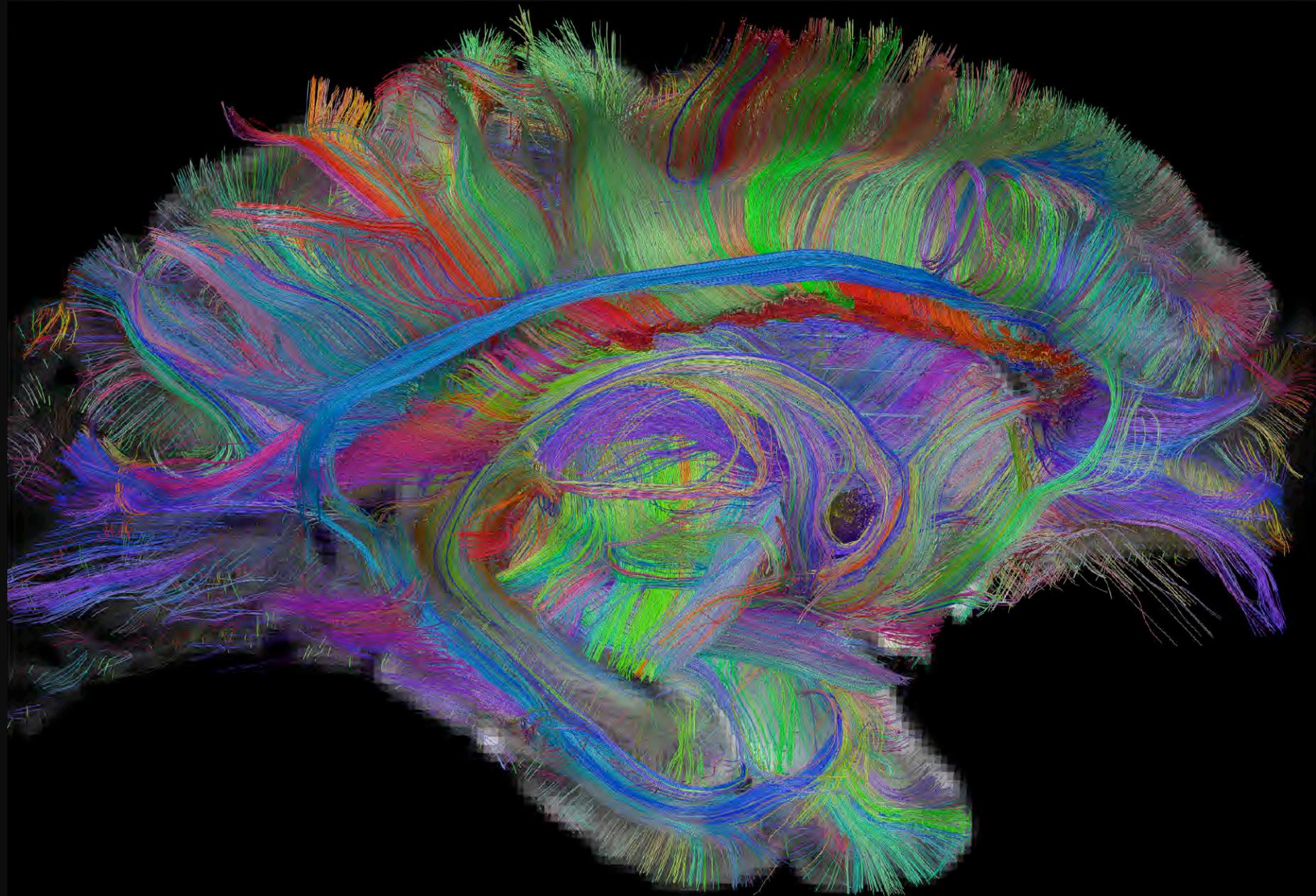
*whole brain*



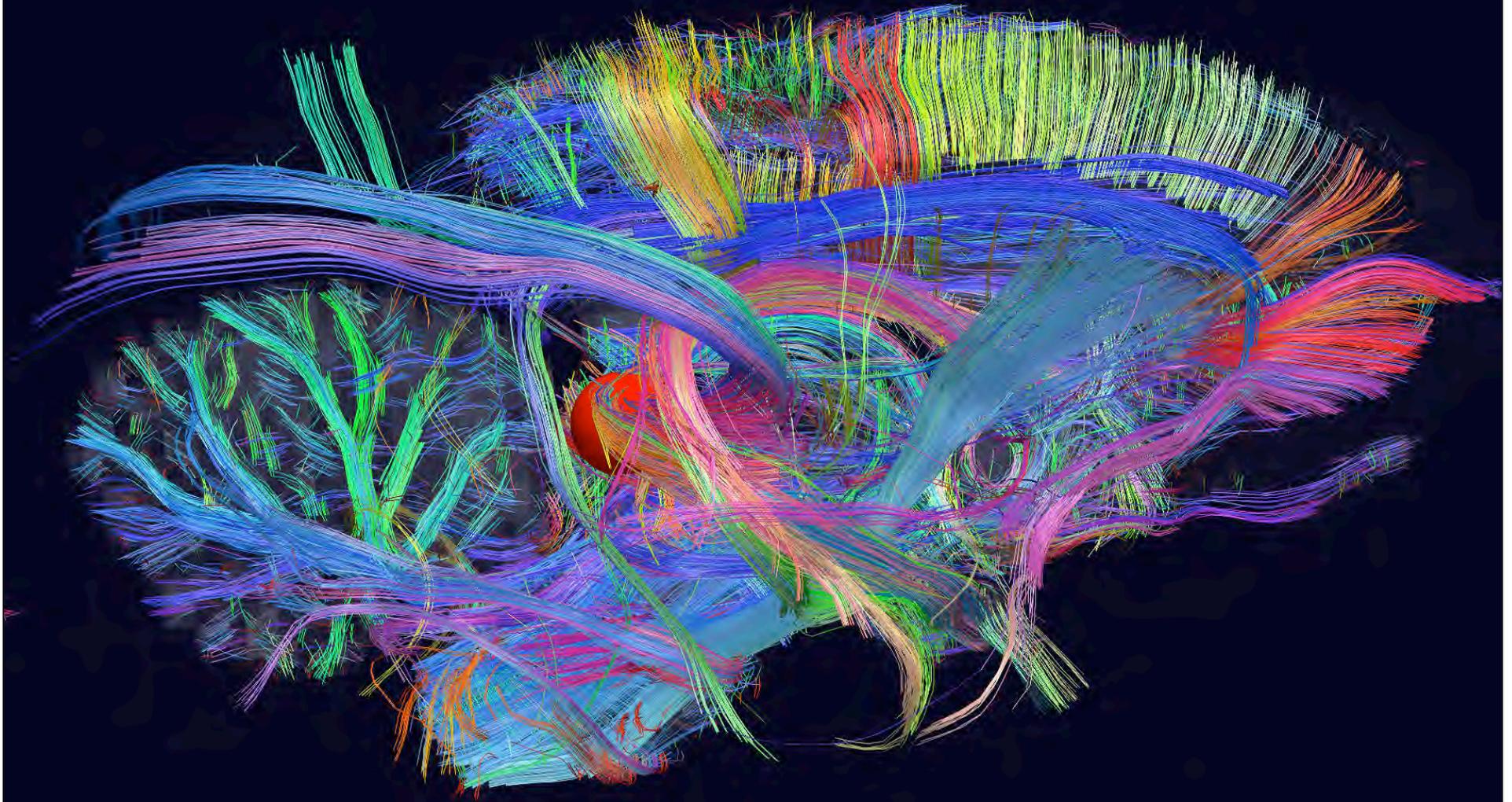
*sagittal slice*



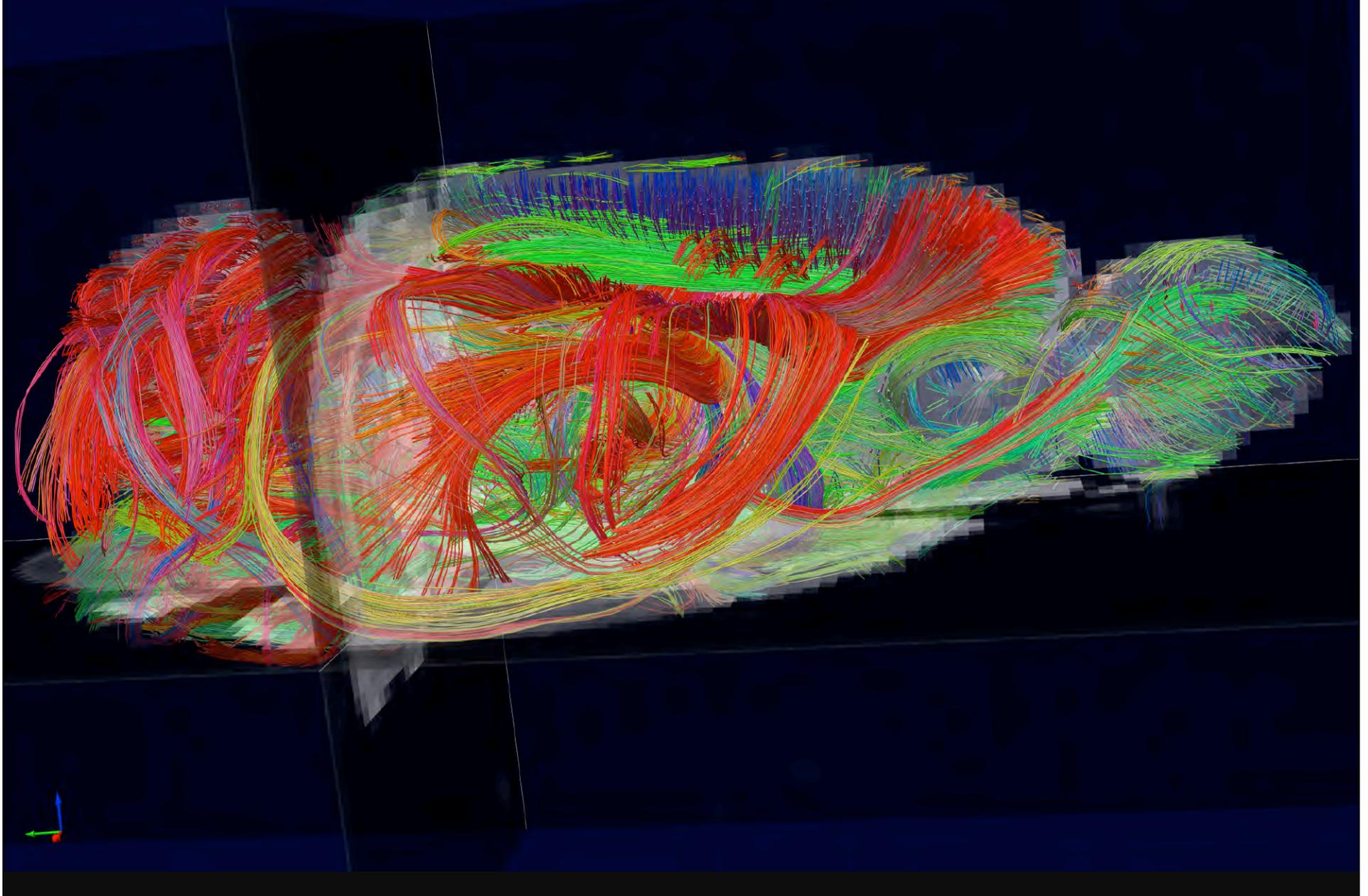
# DSI rhesus hemisphere



# Owl monkey



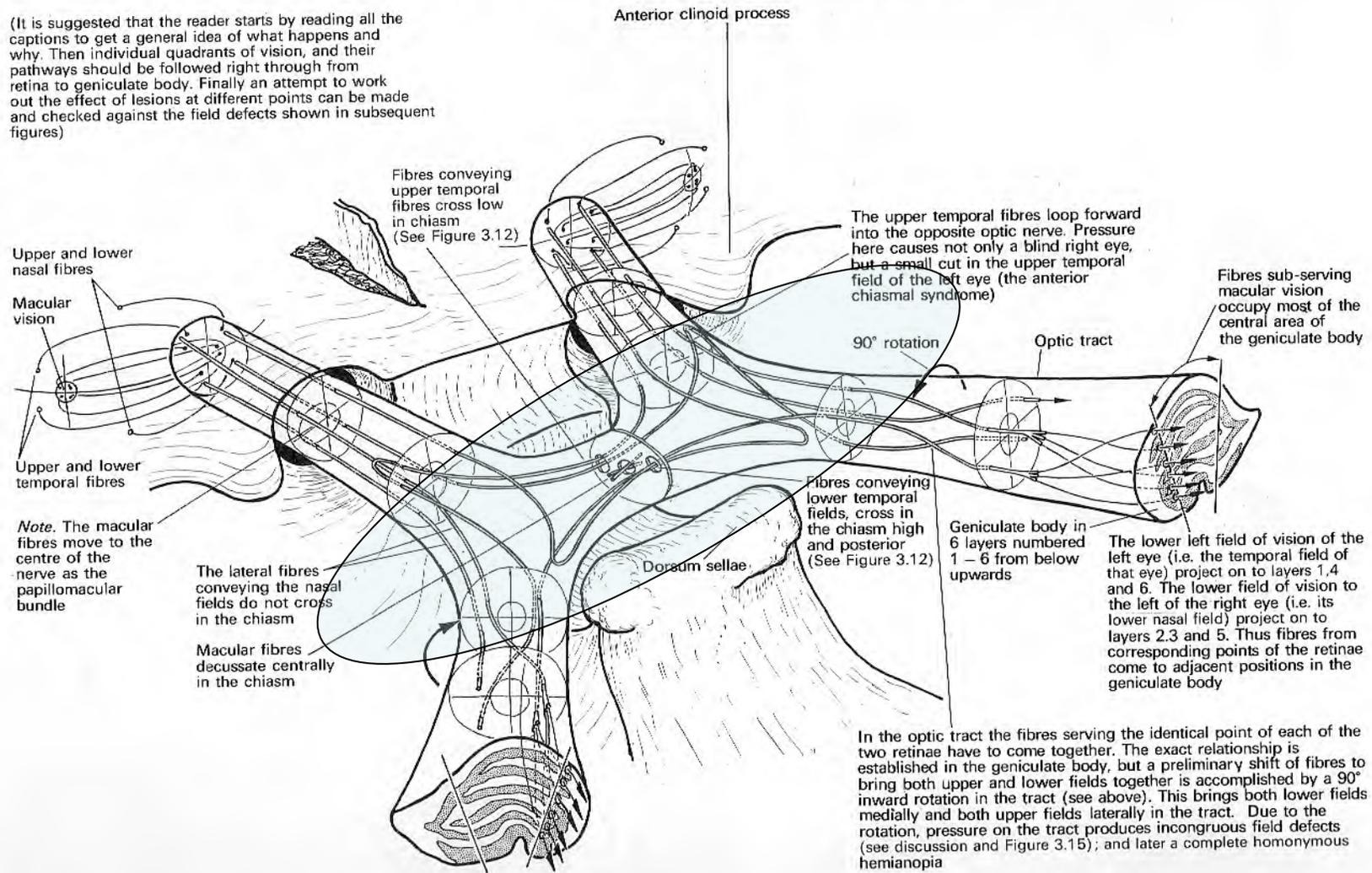
# Animal models - DSI neurorot



# Optic chiasm

Figure 3.6. The Functional Anatomy of the Optic Nerves, Chiasm and Tracts to the Geniculate Body

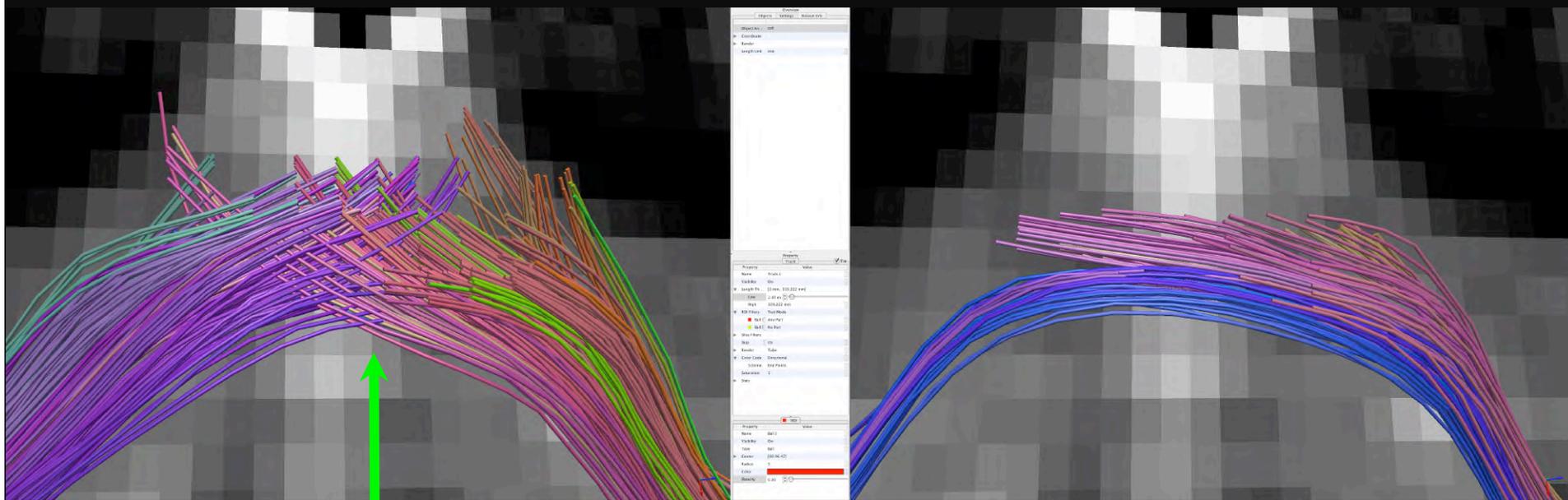
(It is suggested that the reader starts by reading all the captions to get a general idea of what happens and why. Then individual quadrants of vision, and their pathways should be followed right through from retina to geniculate body. Finally an attempt to work out the effect of lesions at different points can be made and checked against the field defects shown in subsequent figures)



# Optic chiasm

DSI

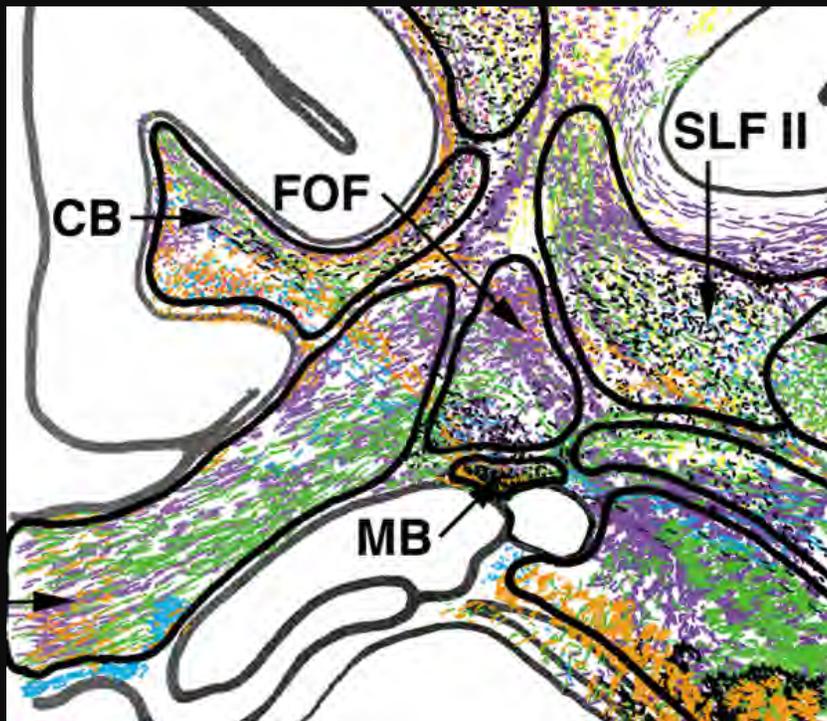
DTI



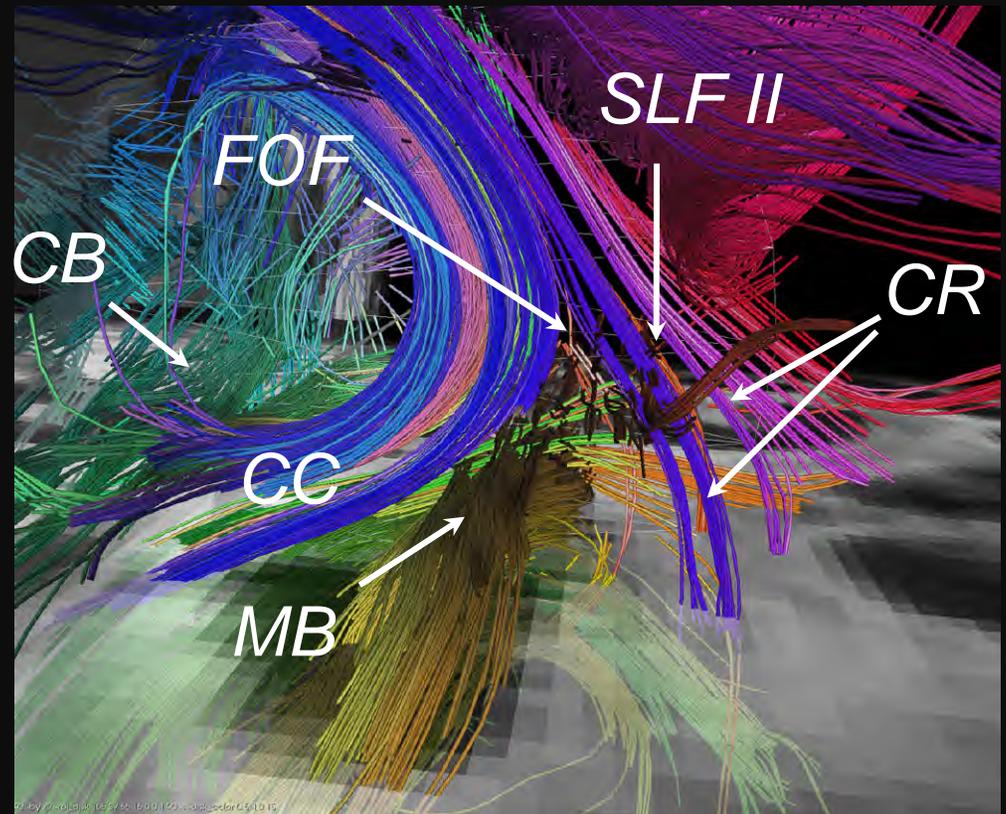
descussation

# Macaque centrum semiovale

tracer - 3D

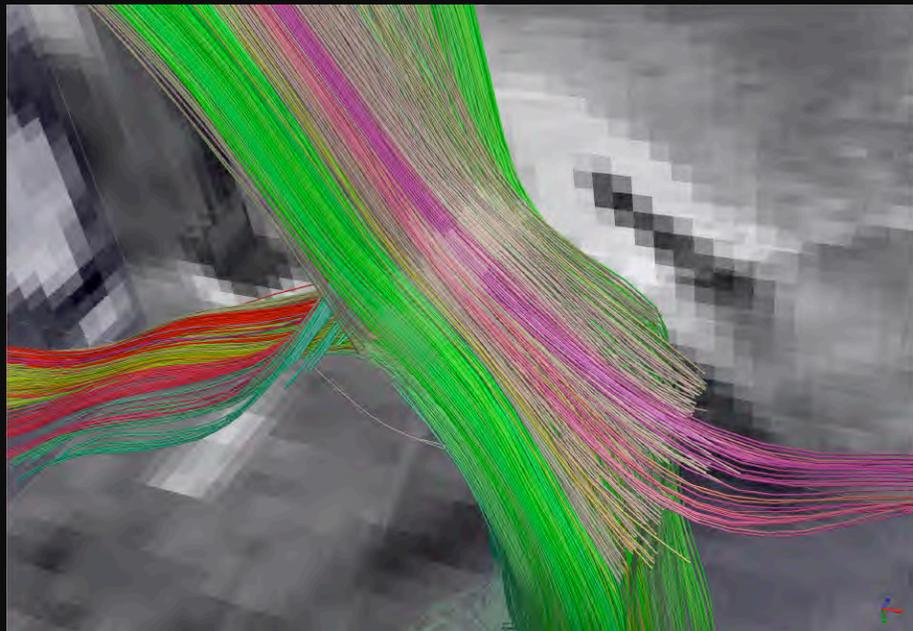


DSI - 6D

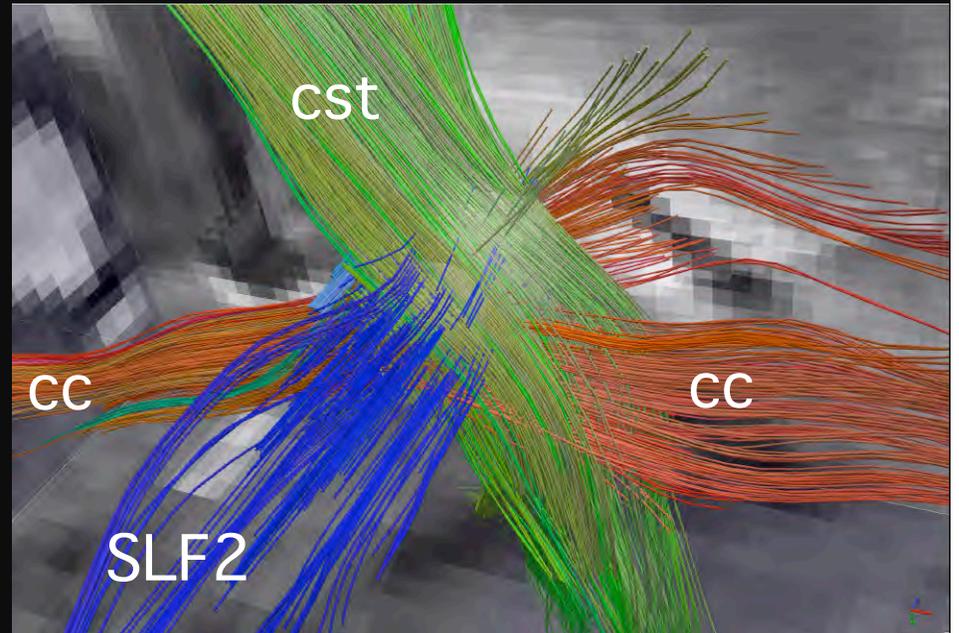


# Macaque centrum semiovale

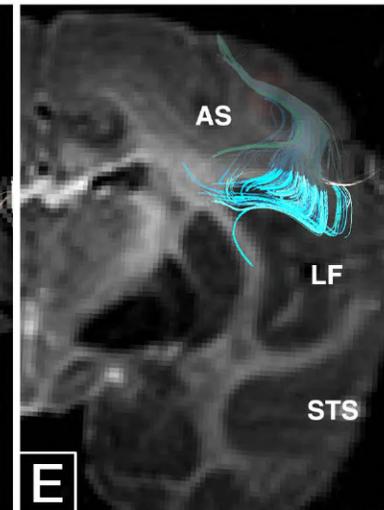
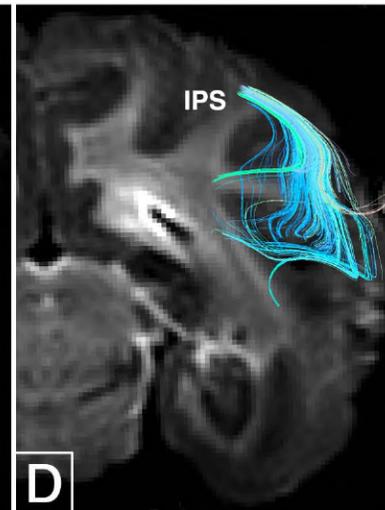
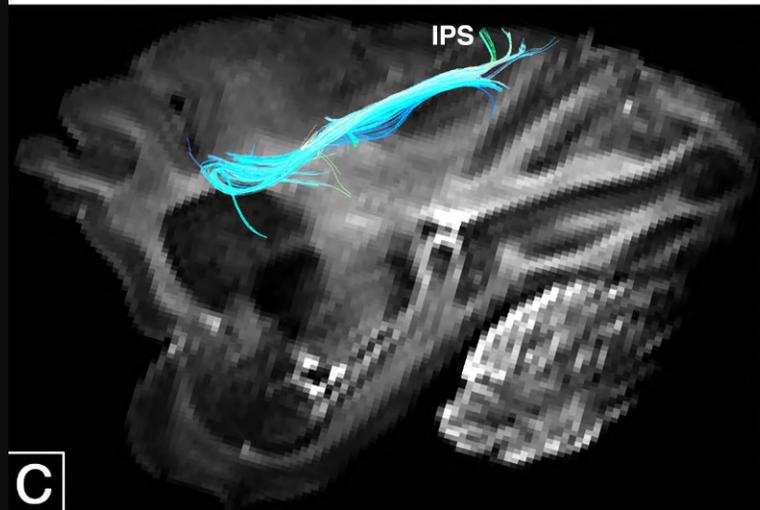
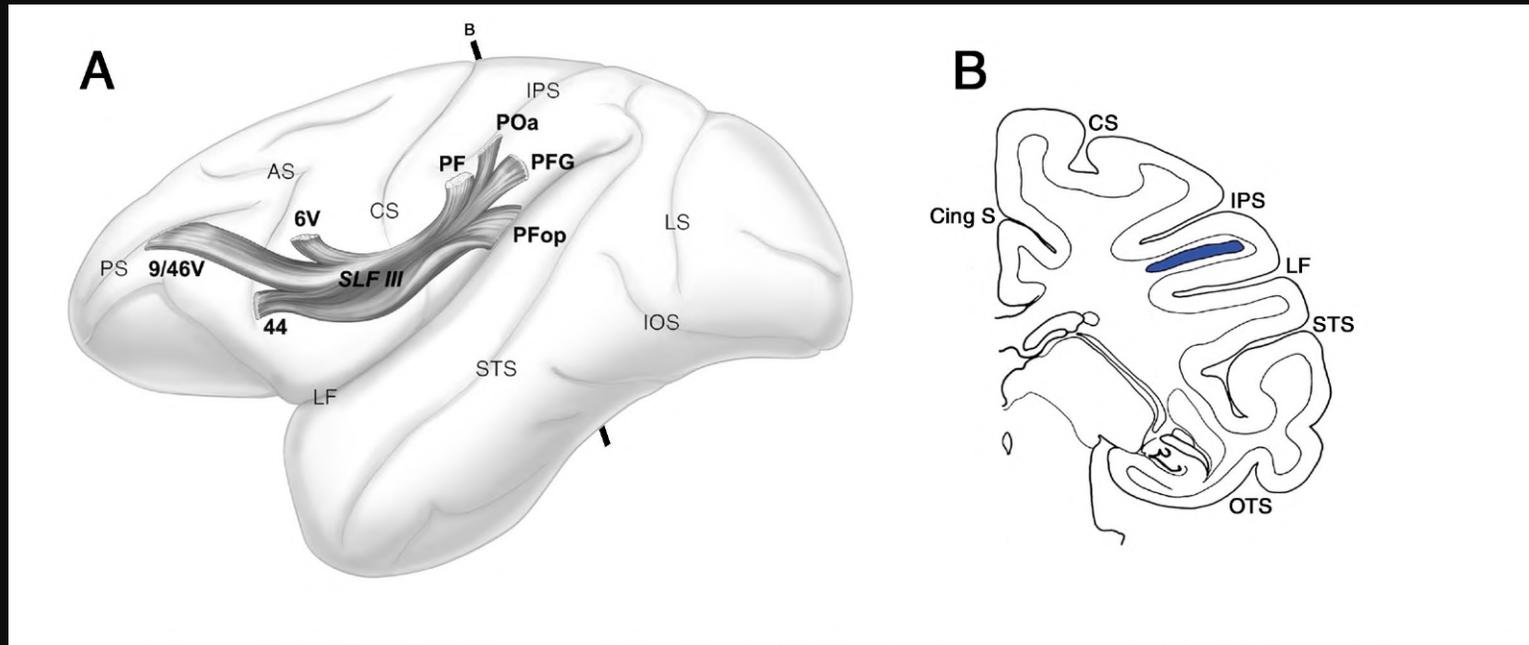
DTI



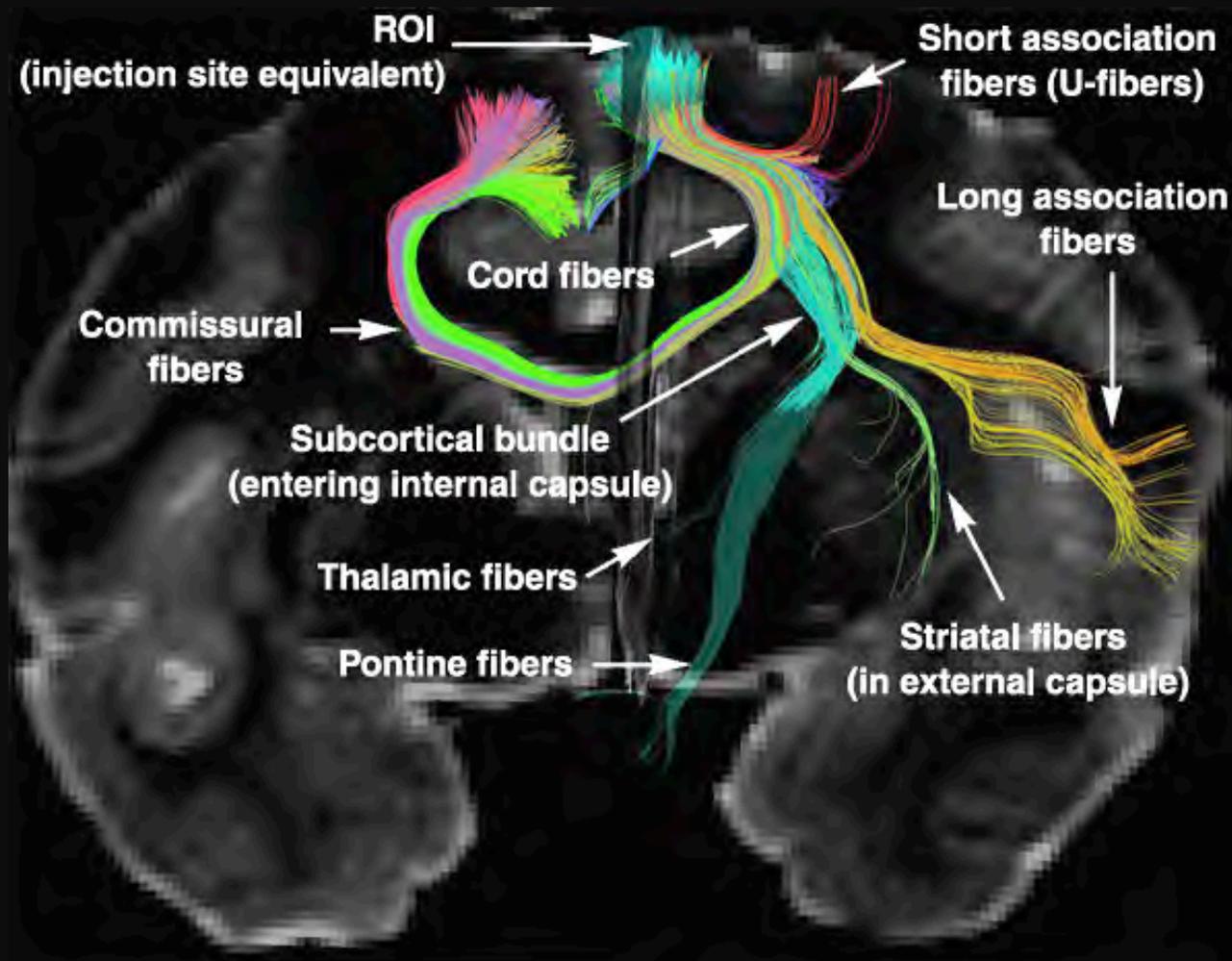
DSI



# Validation DSI and tracer rhesus SLF3



## *DSI connectivity of macaque superior frontal gyrus*

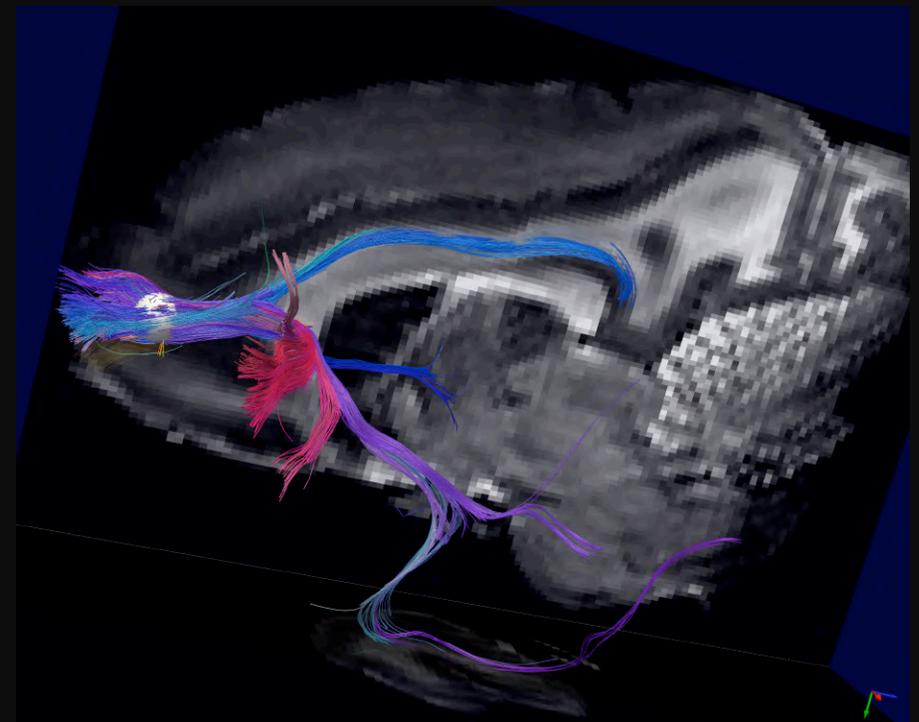
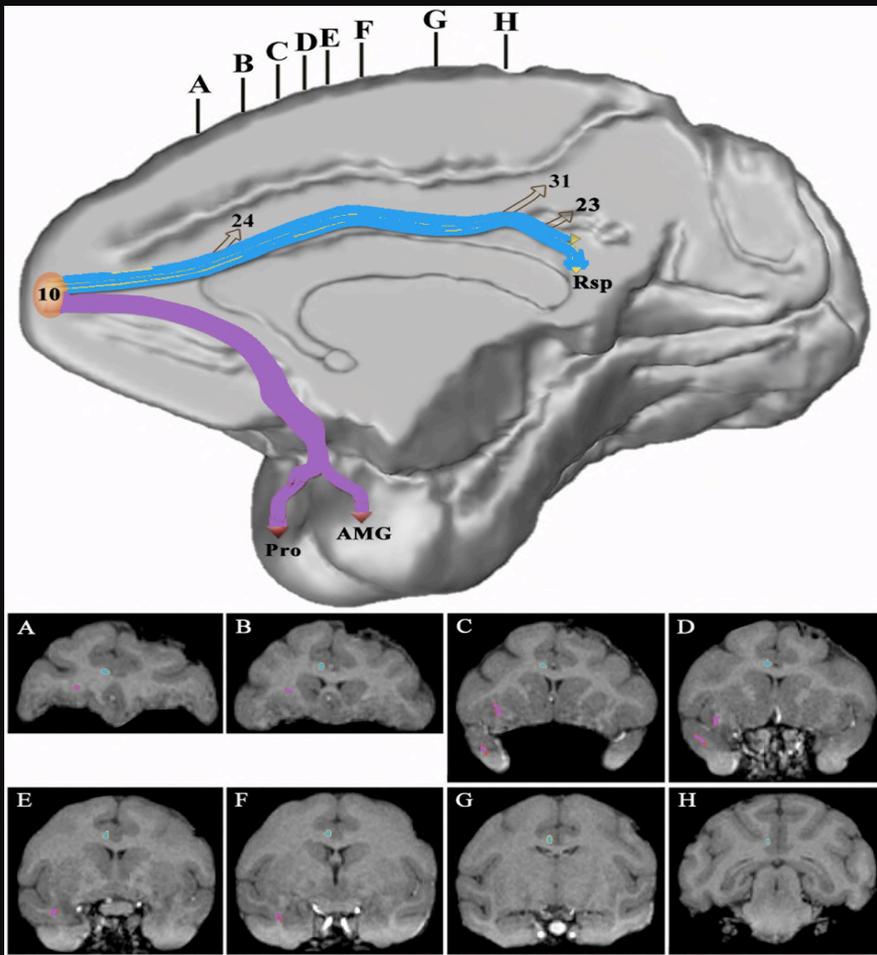


*Schmahmann JD, Pandya DN, Wang R, Dai G, D'Arceuil HE, de Crespigny AJ, Wedeen VJ*

# DSI rhesus BA10 connectivity

tracer Petrides & Pandya

DSI

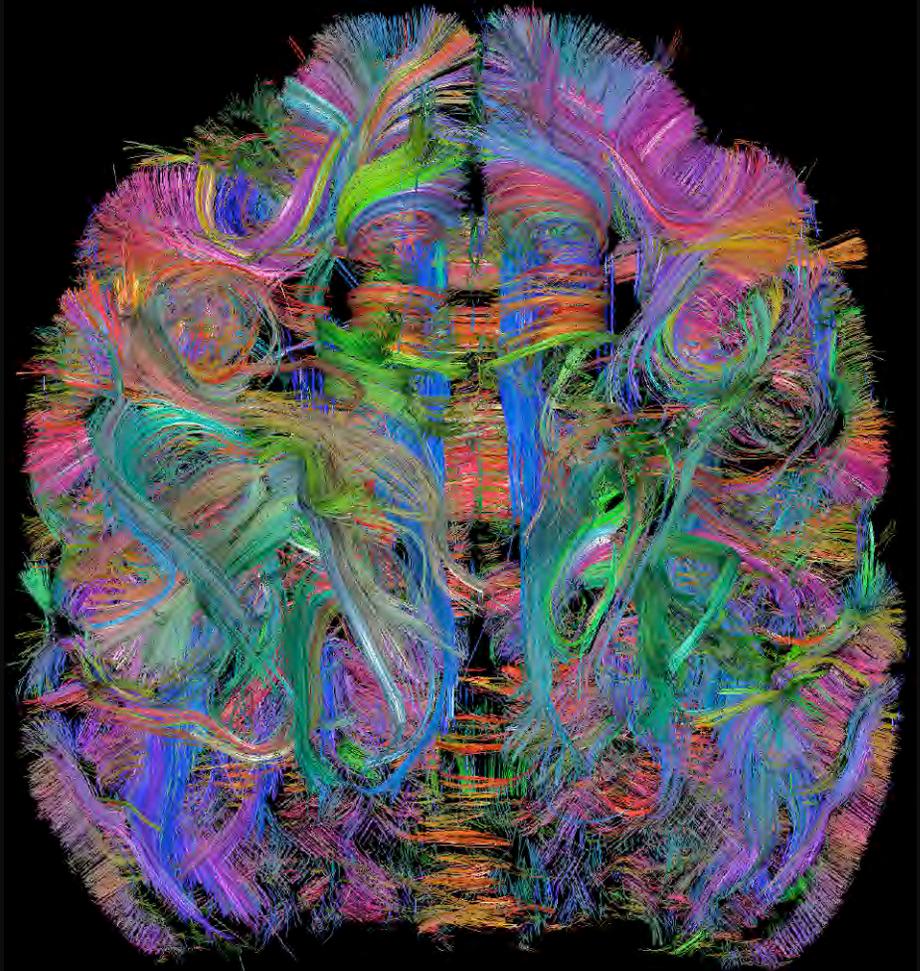


# Macaque

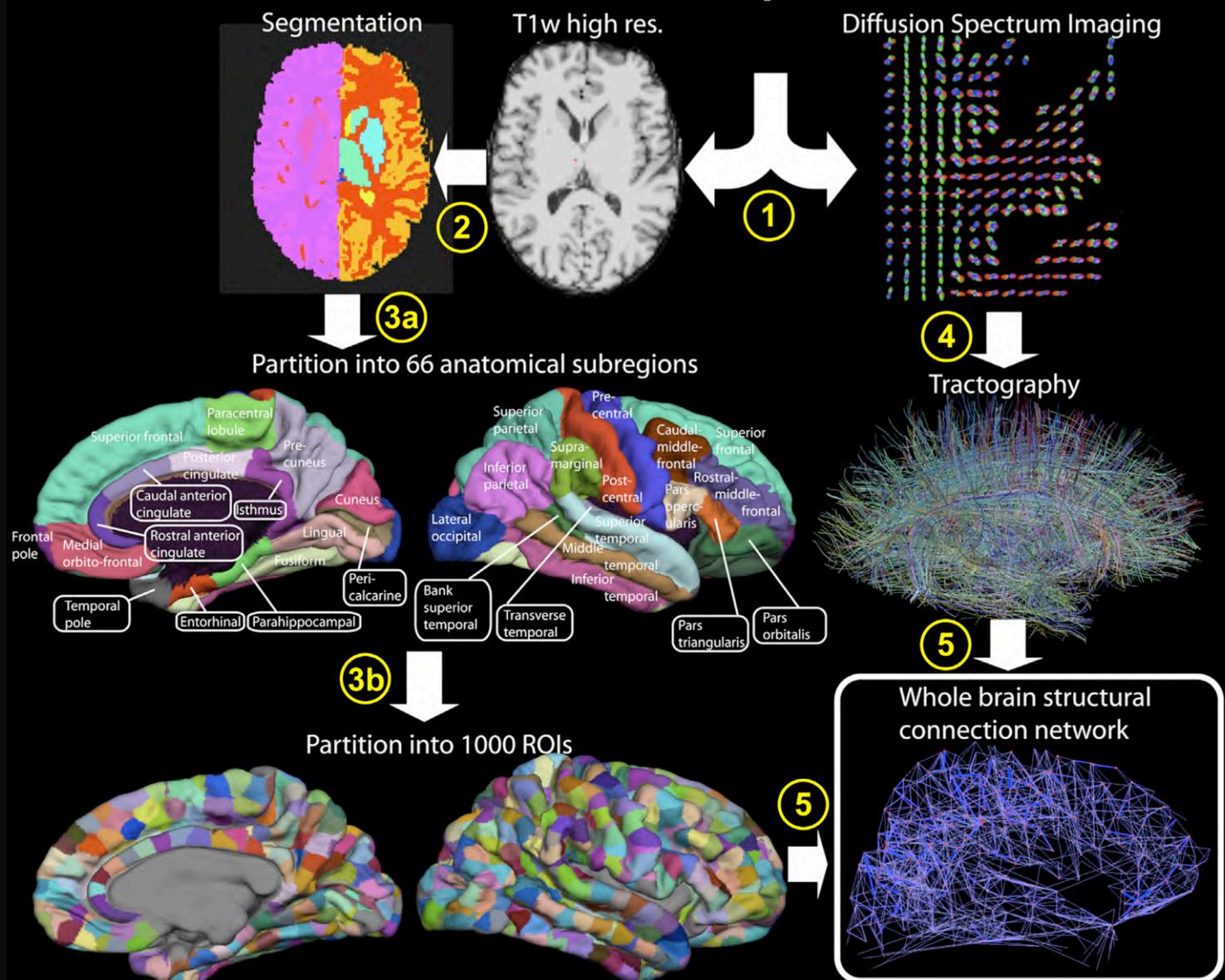
MRI 3D and overlap



DSI 6D and no overlap



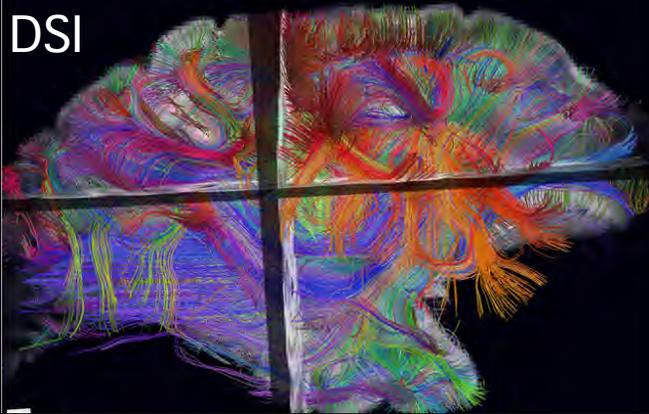
# DSI human connectome - Hagmann et al PLoS Biol 7.08



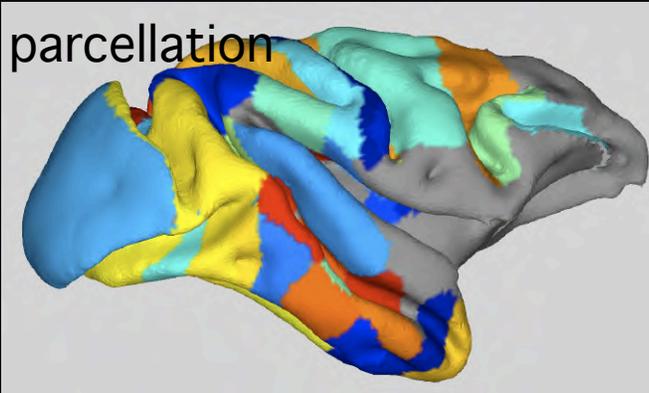
# Macaque connectome

## DSI and CoCoMac

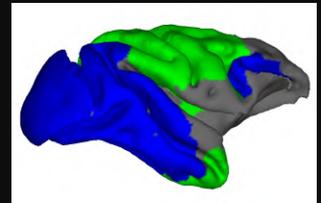
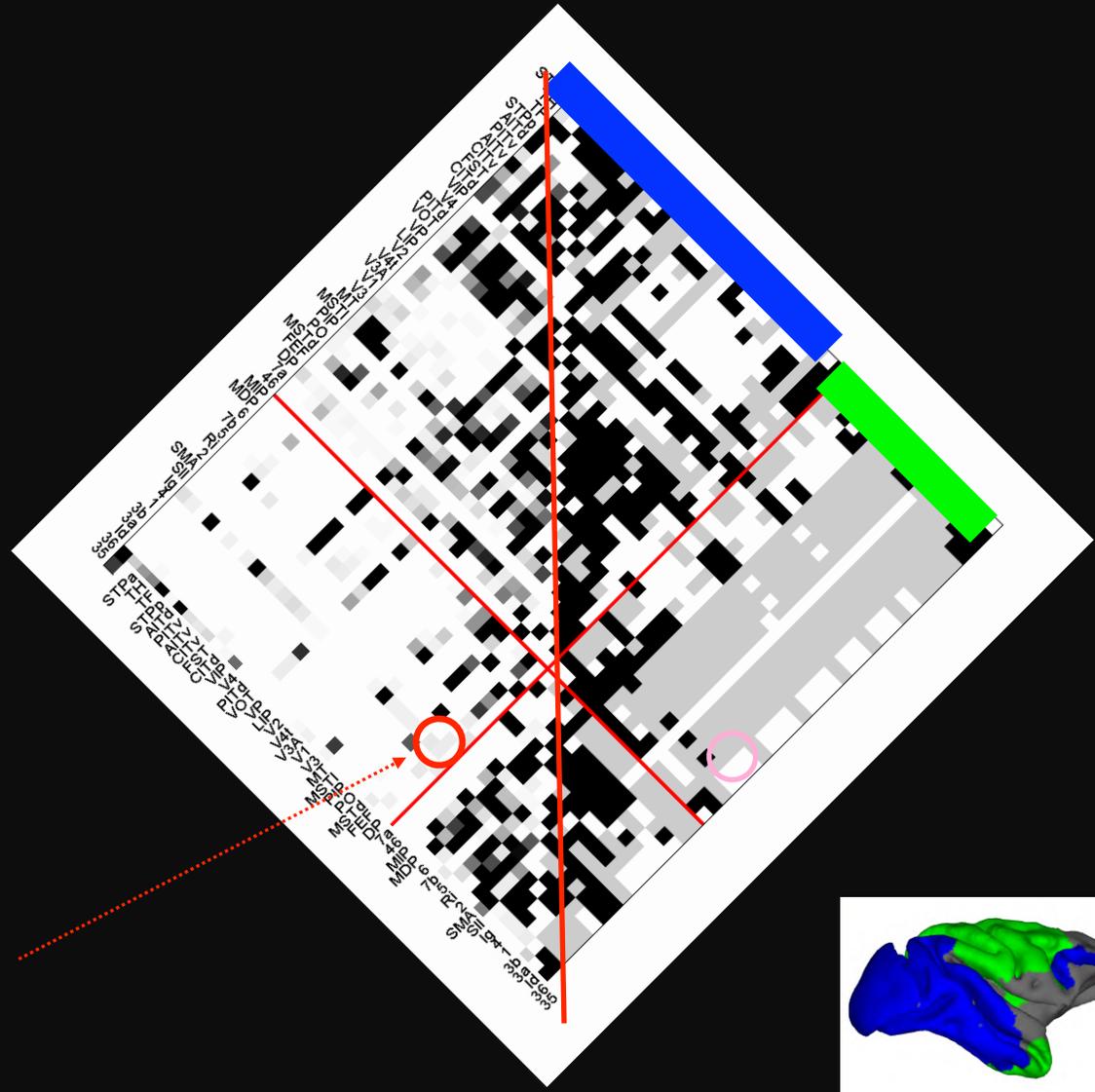
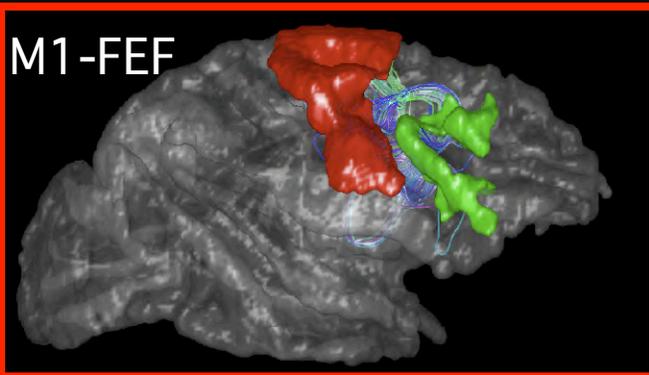
DSI



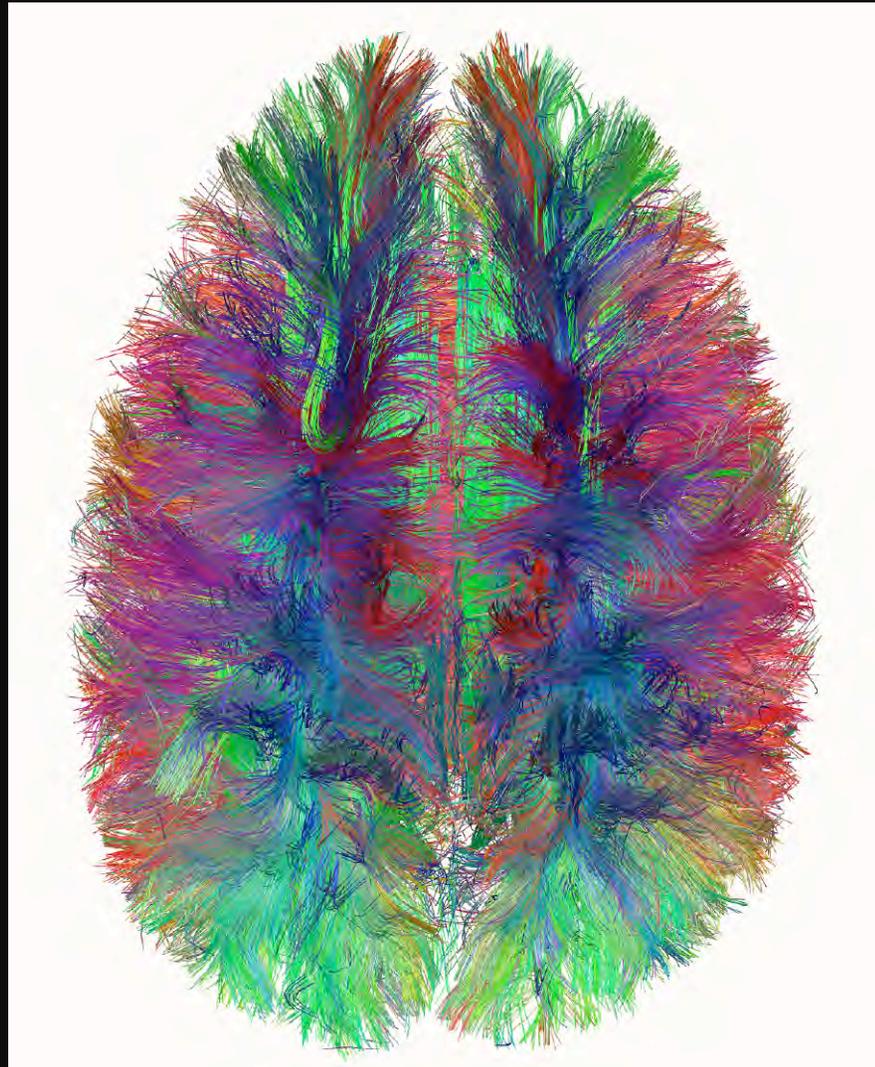
parcellation



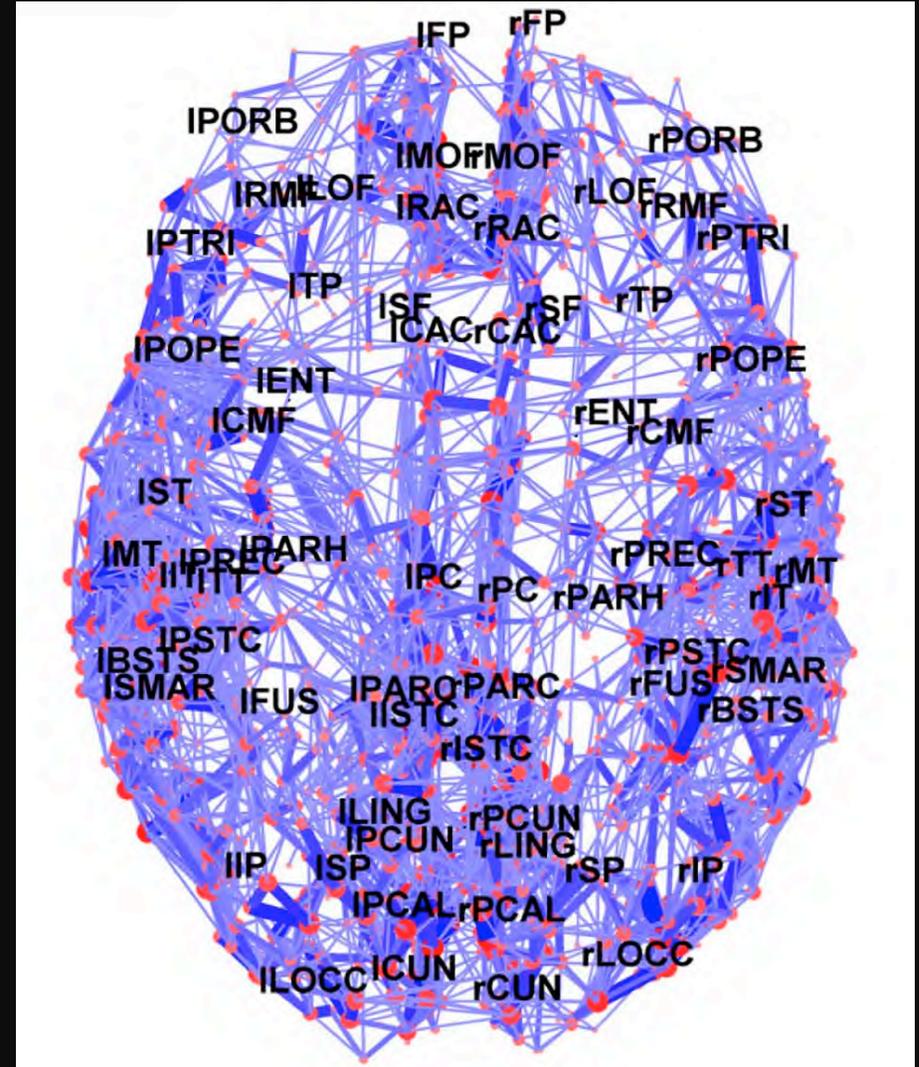
M1-FEF



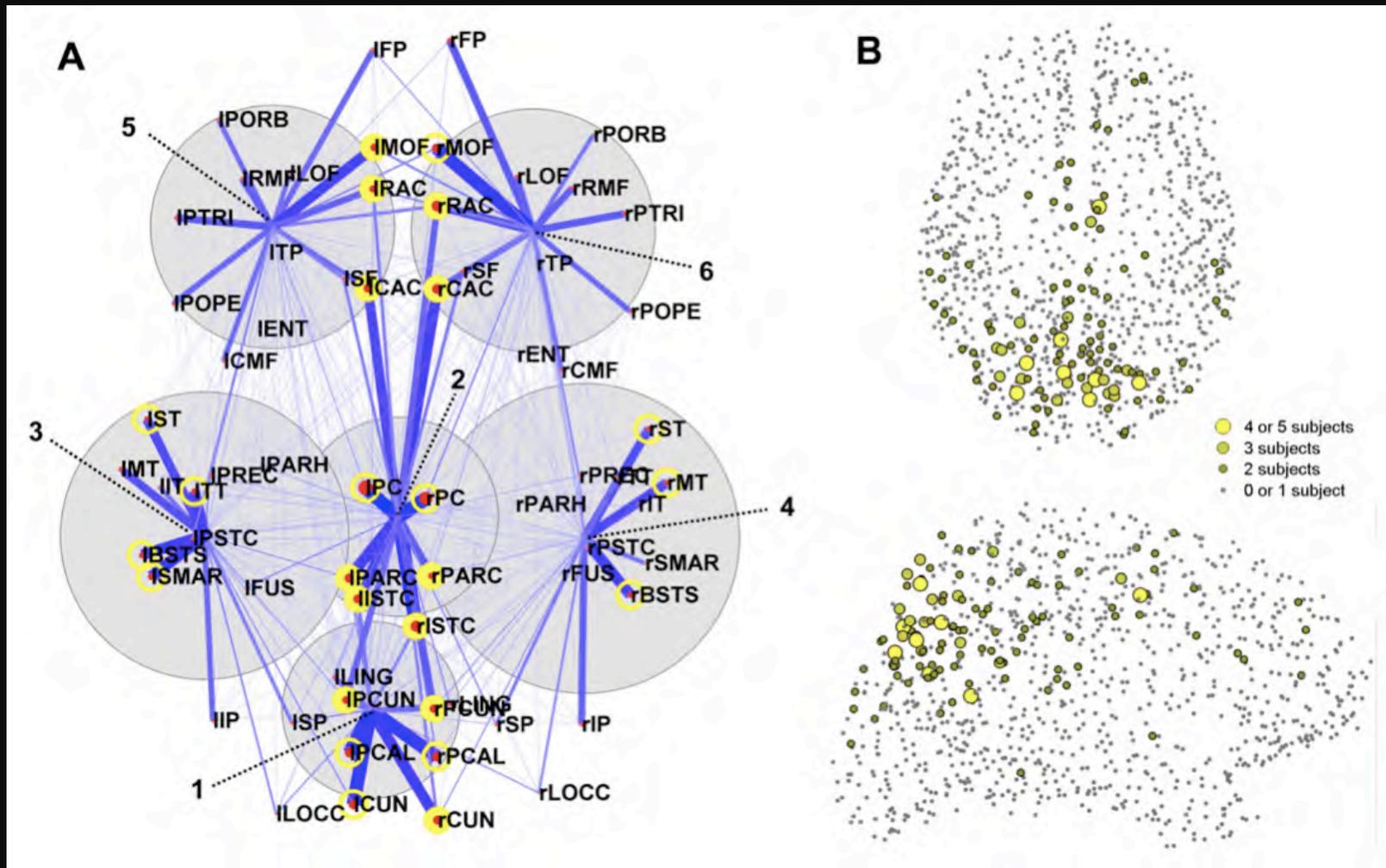
# DSI in vivo human



# human connectome



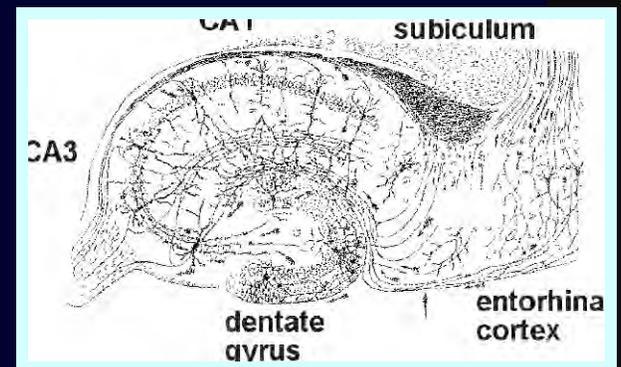
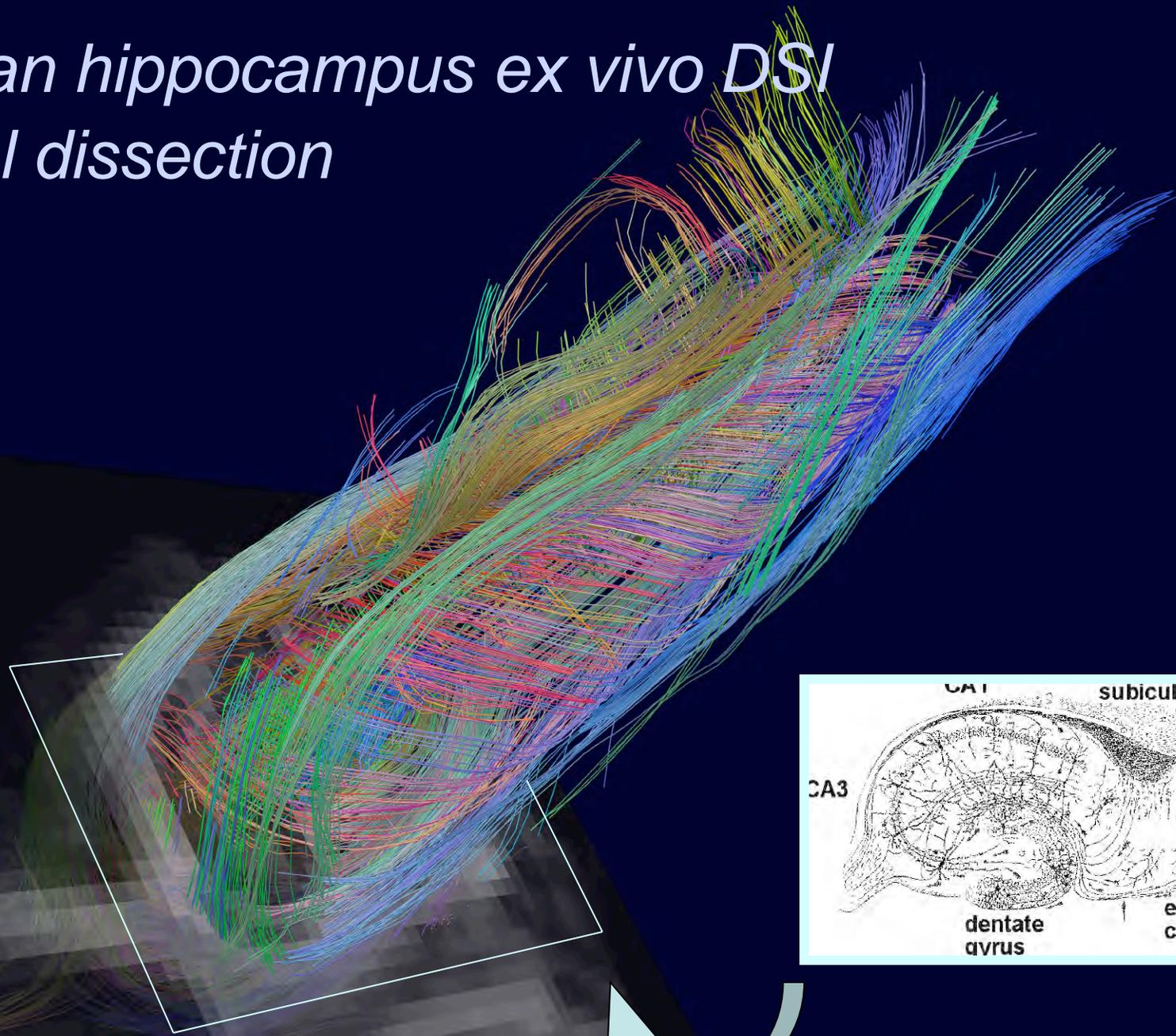
# Human connectome hubs and core



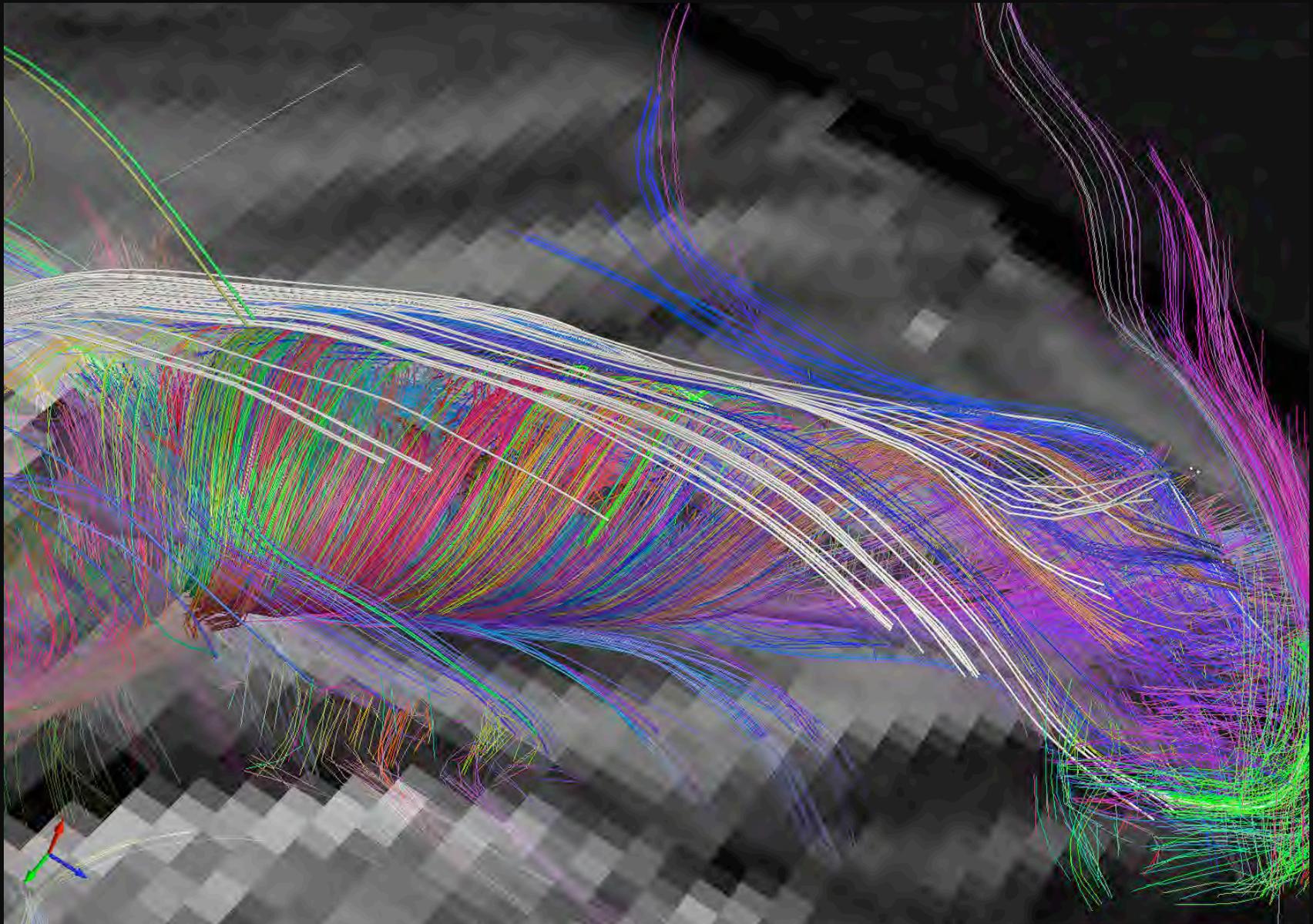
# Macaque cingulum bundle



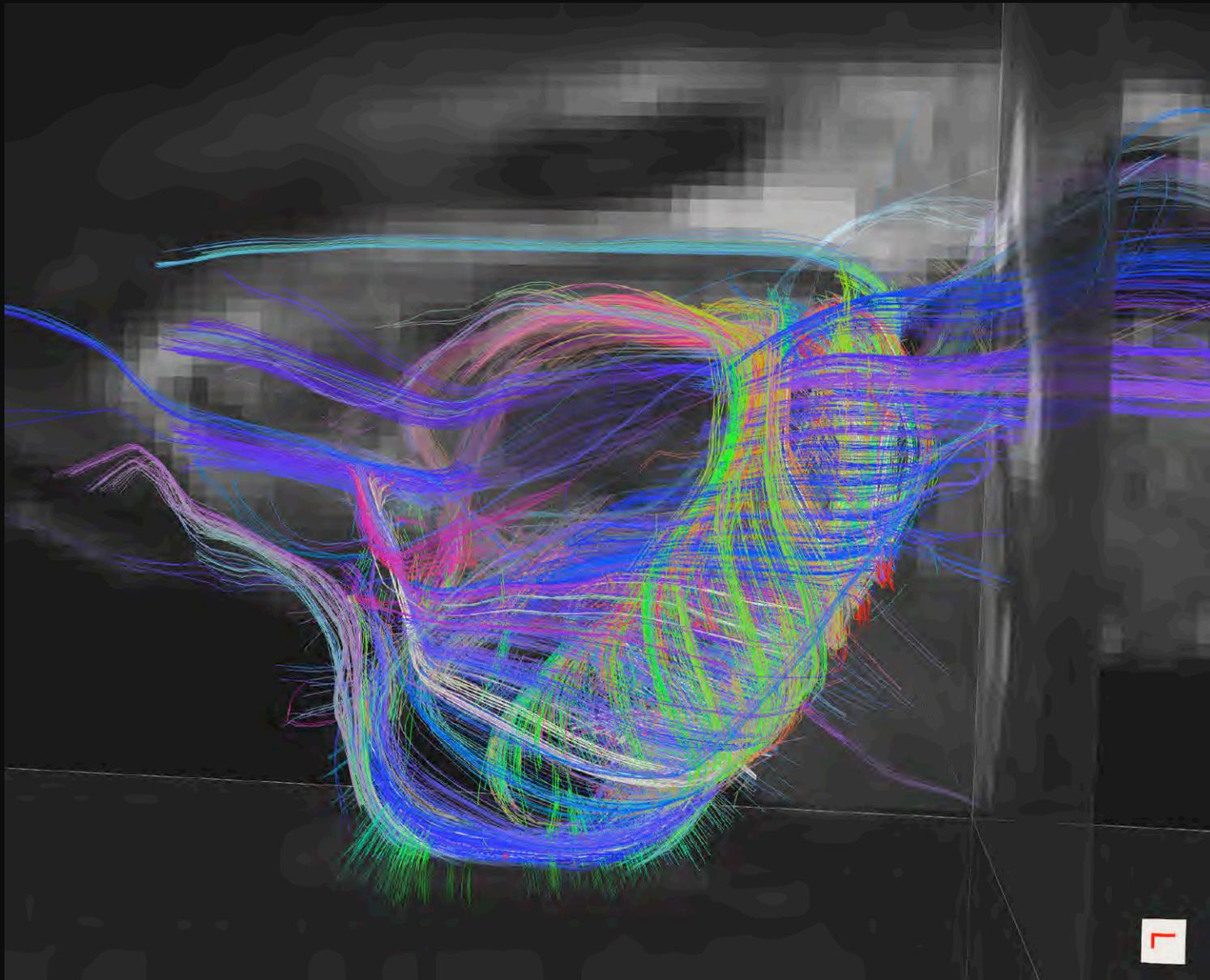
# *Human hippocampus ex vivo DSI digital dissection*



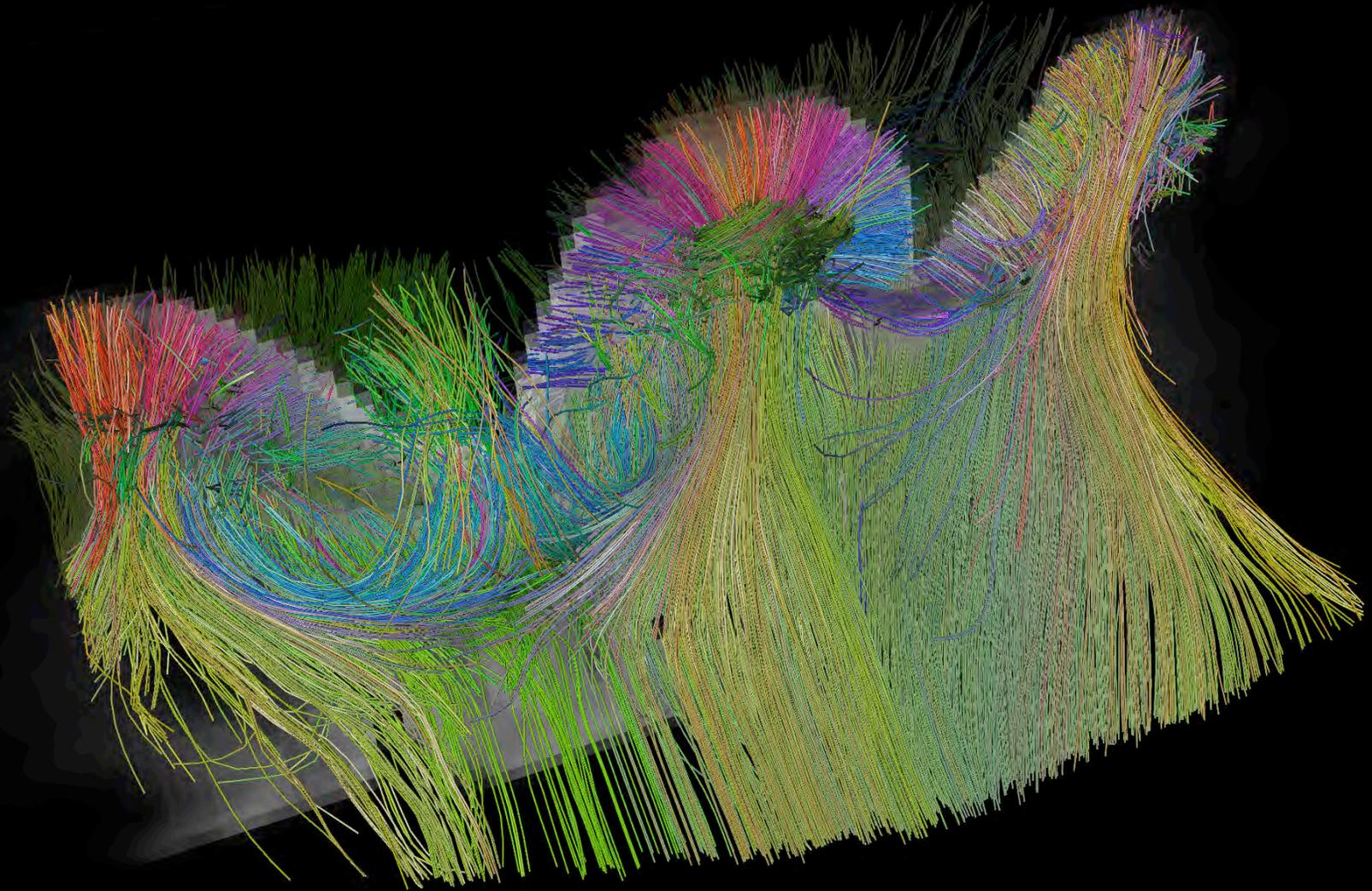
# Macaque calcarine connections



Early evidence of geometric structure, owl monkey hippocampus 2005



# Human cortex 300u



*Approach to “diffusion resolution”*

*The aim of diffusion MRI is to image an underlying shape.*

*This is limited by blurring from 2 sources:*

*- blurring due to finite resolution of the diffusion camera*

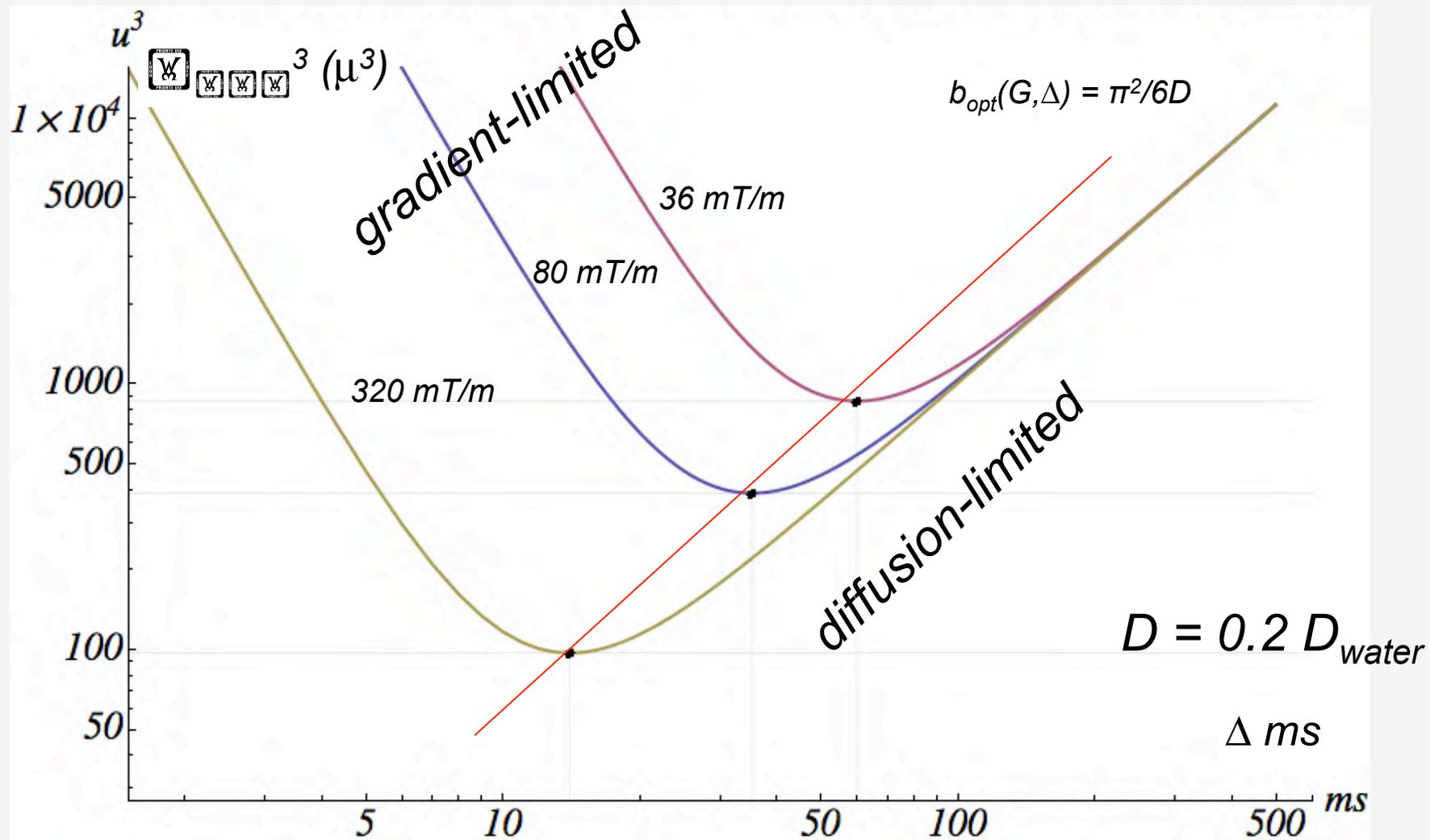
$$1/q_{\max} = 1/GT$$

*- blurring due to diffusion itself*

$$\sqrt{2DT}$$

*Combining these, overall diffusion resolution  $R$  is*

$$R^2 = (1/GT)^2 + 2DT$$



*Consequences:*

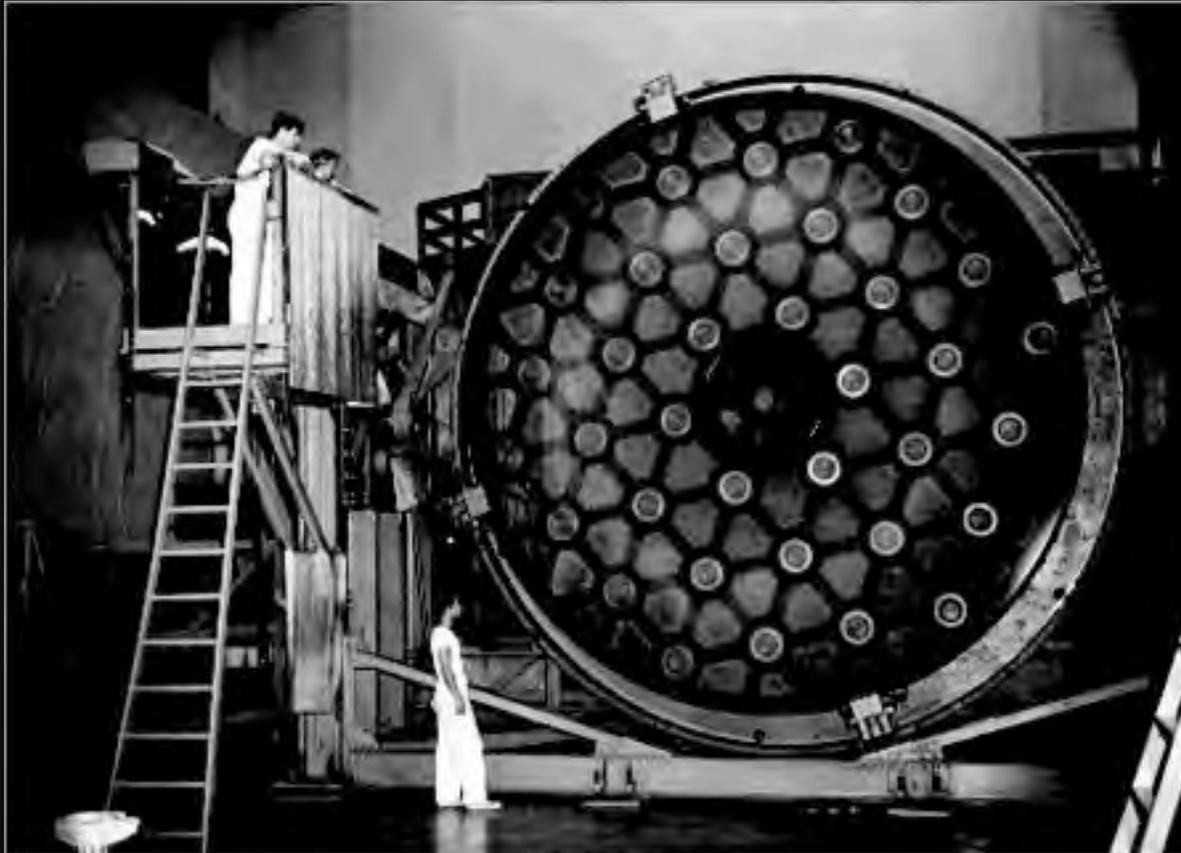
*For any gradient  $G$ , there is a best-possible micro-resolution*

$$R_{\text{eff}} = (D/G_{\text{max}})^{1/3}$$

*For any diffusion  $D_{\text{min}}$ , there is a universal optimum b-value*

$$b_{\text{opt}} = \pi^2/6D_{\text{min}}$$

*In astronomy, the way to sensitivity and resolution is mirror diameter*



*Corning 200" mirror for the Hale Telescope at Mt Palomar*

*In diffusion MRI, the way to boost signal-to-noise and resolution of micro-structure is gradient strength*

# *MGH-UCLA HCP*

*Immediate goal: map human connectivity*

*Long-term goal: objective mental health care*

The logo for the Human Connectome Project features a central bright yellow and white light source. From this source, numerous colorful, glowing lines radiate outwards, creating a sense of dynamic energy and connectivity. The background is dark, with a grid of small, colorful dots (red, orange, yellow, green, blue) that appear to be part of a larger, curved structure, possibly representing a brain or a network. The text "Human Connectome Project" is overlaid on this graphic in a white, sans-serif font.

Human  
Connectome  
Project

**NIH Blueprint**

for Neuroscience Research



# The ultimate diffusion machine...

7x the gradient strength.

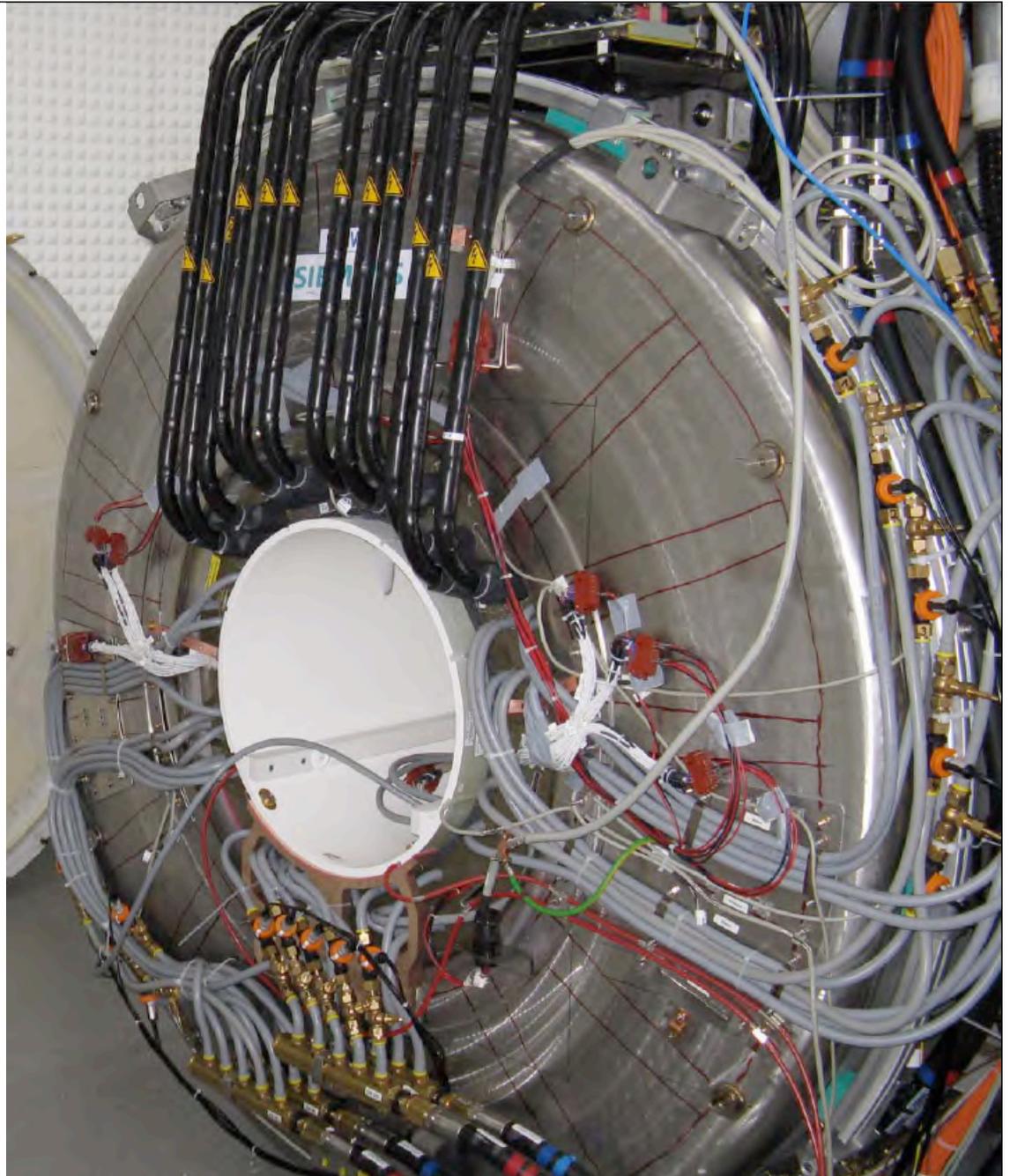
$$G_{\max} = 300\text{mT/m}$$

$$\text{Slew} = 200\text{ T/m/s}$$

4x the encoding speed.

(thru simultaneous multi-slice imaging)

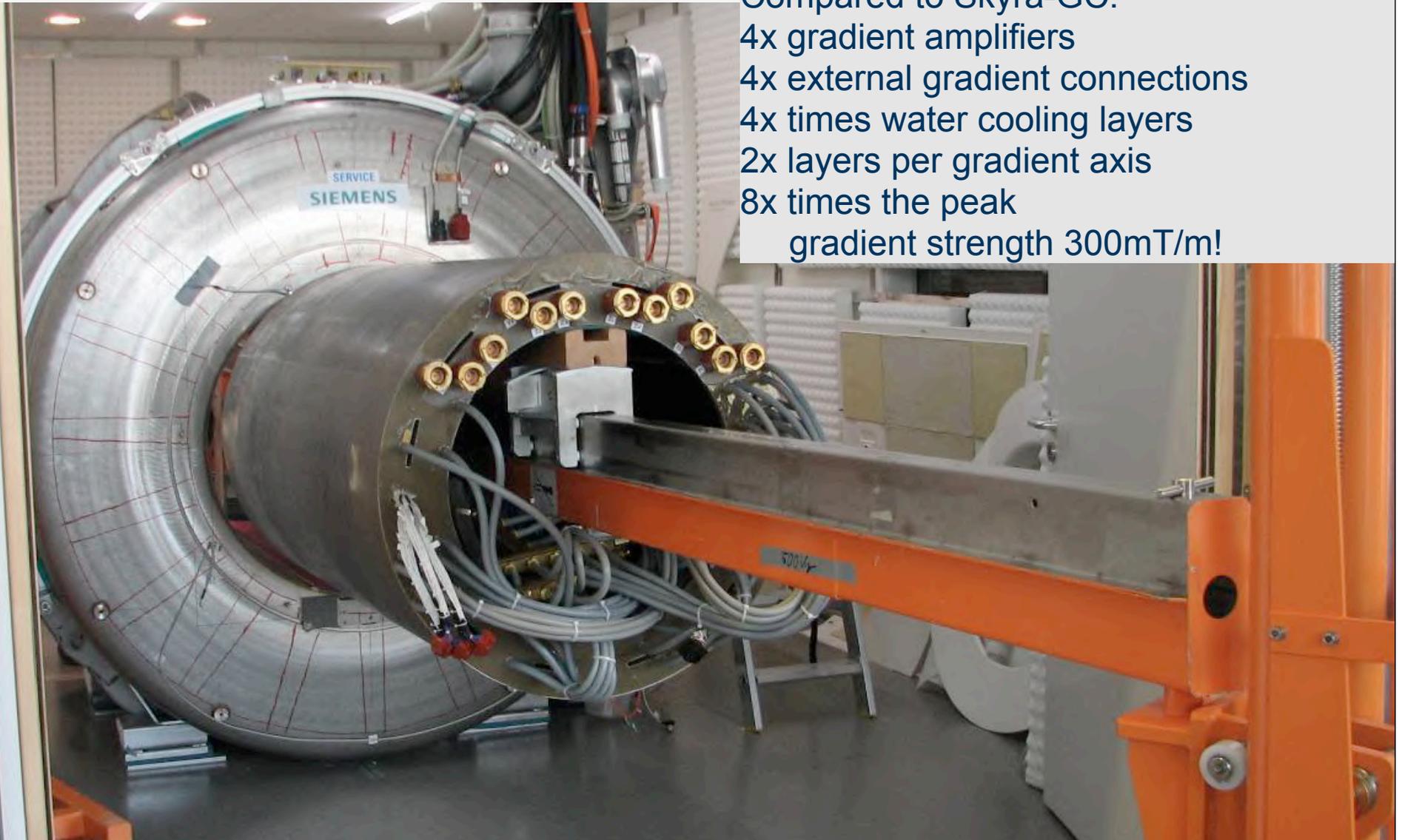
64 channel brain array



Expect nearly 10x increase in sensitivity for high b value diffusion

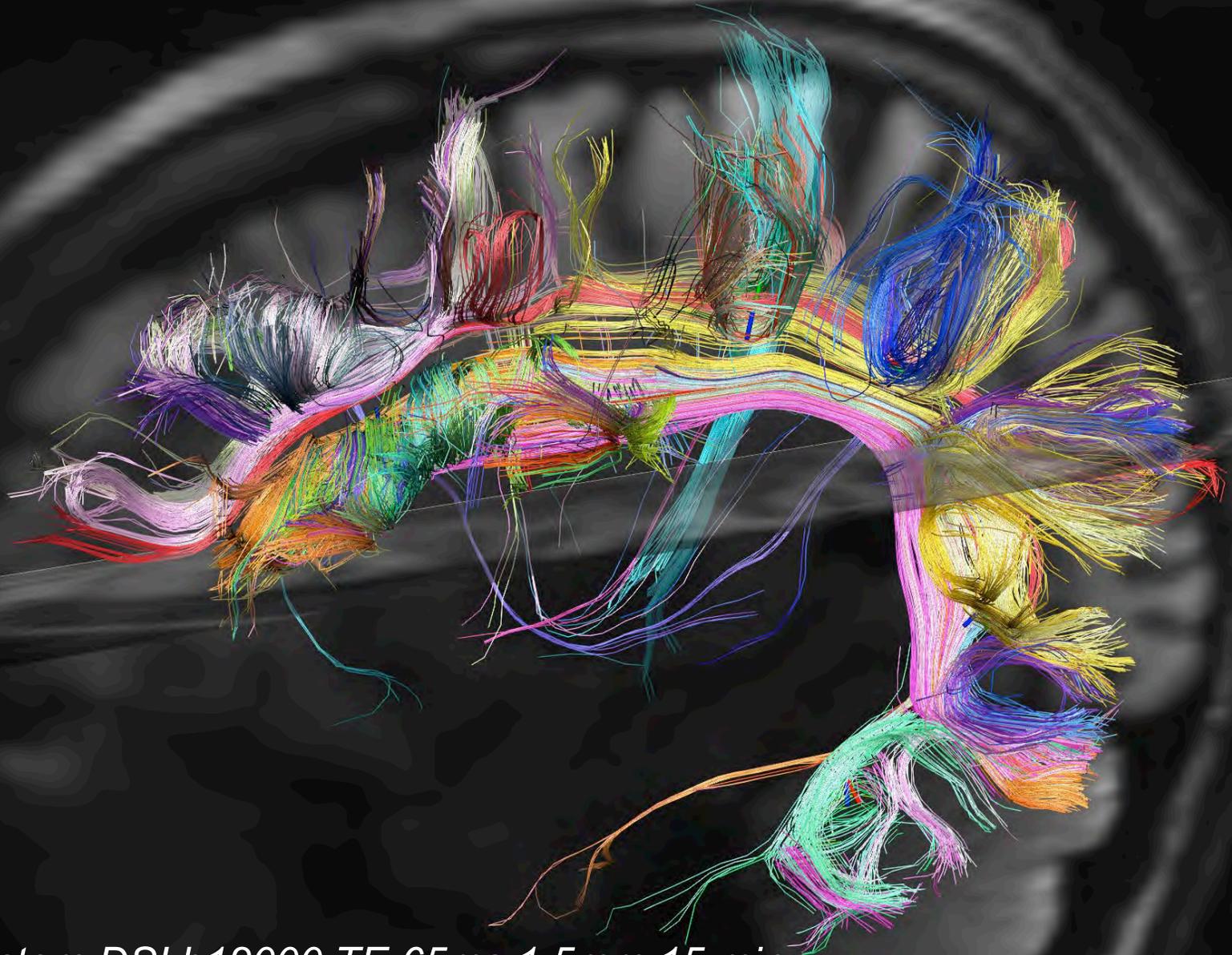
# The MGH Connectom Scanner

Compared to Skyra-GC:  
4x gradient amplifiers  
4x external gradient connections  
4x times water cooling layers  
2x layers per gradient axis  
8x times the peak  
gradient strength 300mT/m!



*3T Connectom scanner, 24 megawatts*  
*Los Angeles class nuclear submarine, 26 megawatts*





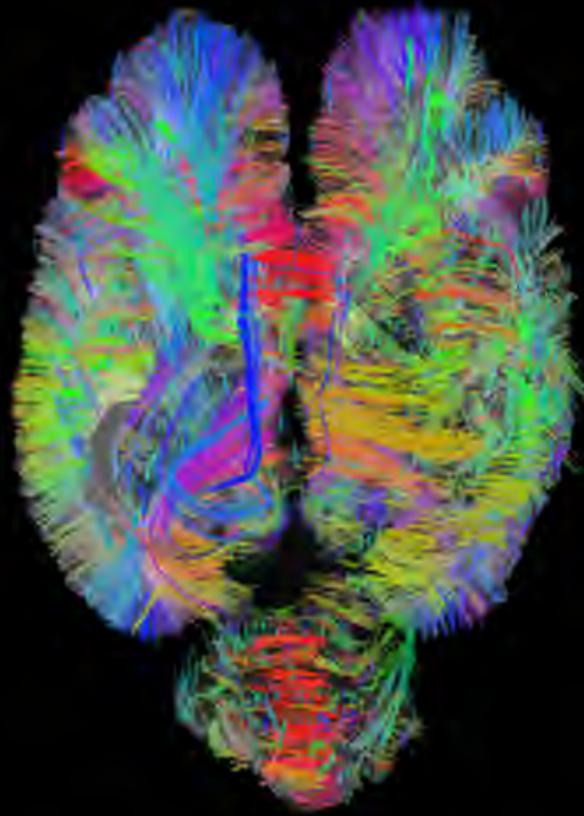
*Connectom DSI b12000 TE 65ms 1.5mm 15 min*

*Van Wedeen  
Ellen Grant  
Doug Rosene  
Patric Hagmann  
Jon Kaas  
W-Y Isaac Tseng  
Larry Wald  
Ruopeng Wang  
Bruce Rosen  
Guangping Dai  
and  
Farzad Mortazawi  
Thomas Witzel*



# Cat DSI

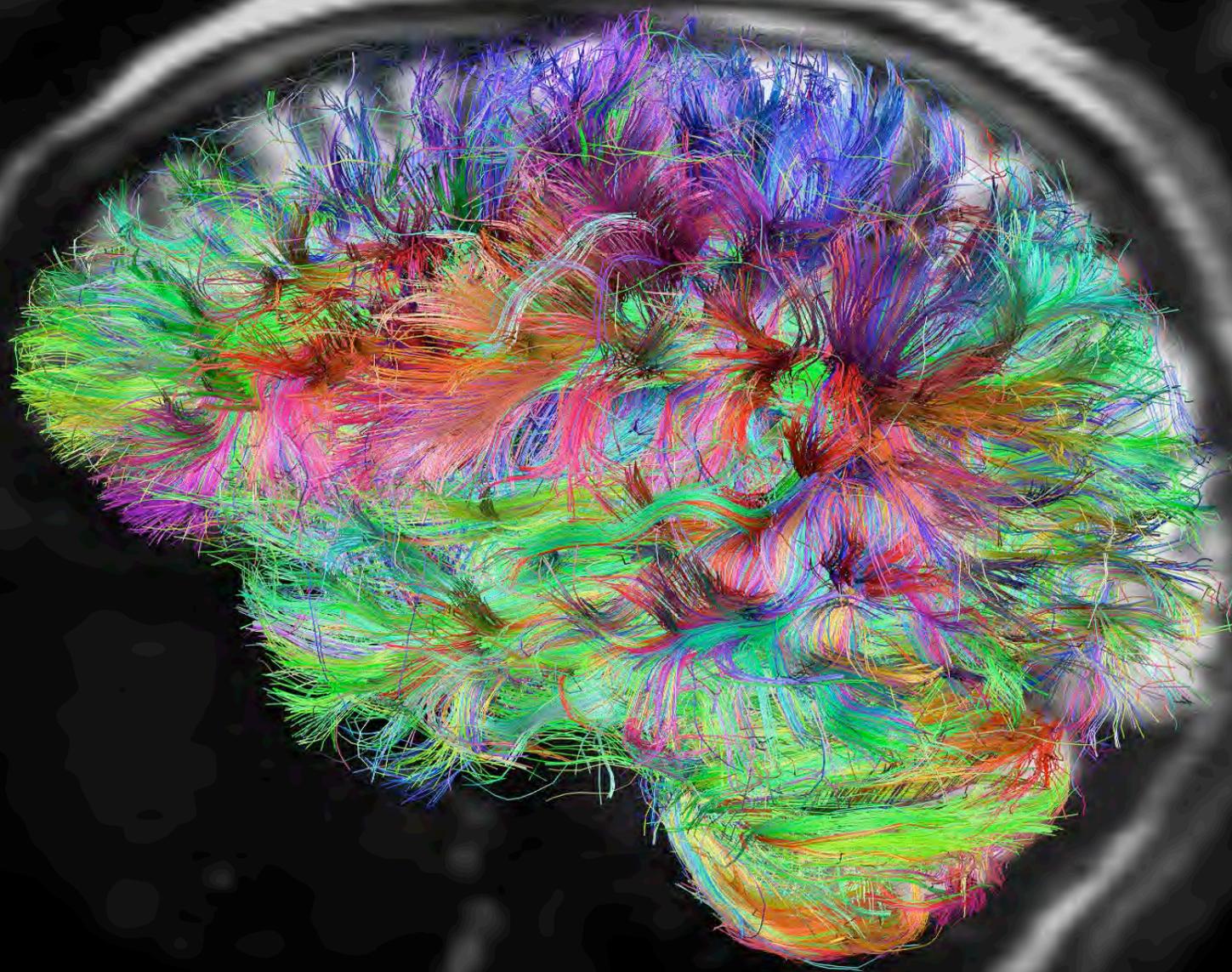
birth



day 100



*DSI Connectom 1.5mm b15k TE 68ms 15 min*

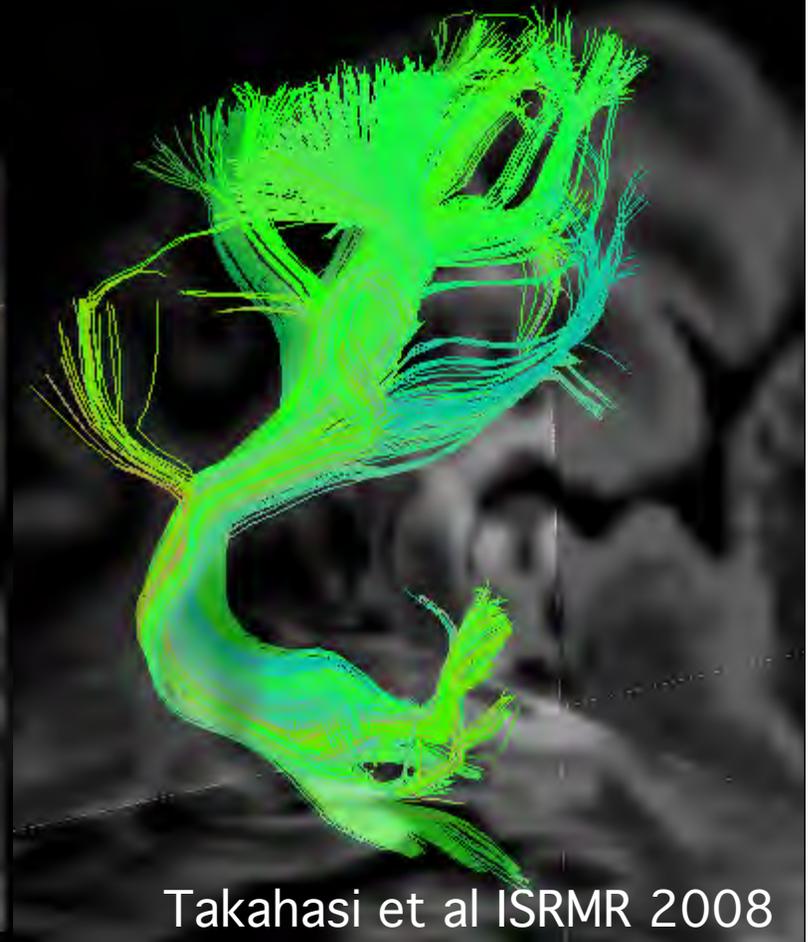
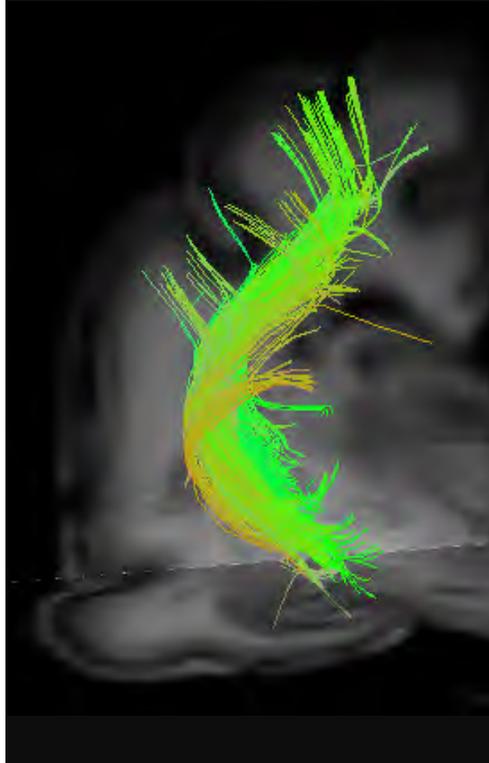


# Cat cortico-thalamic tracts development

Day 0

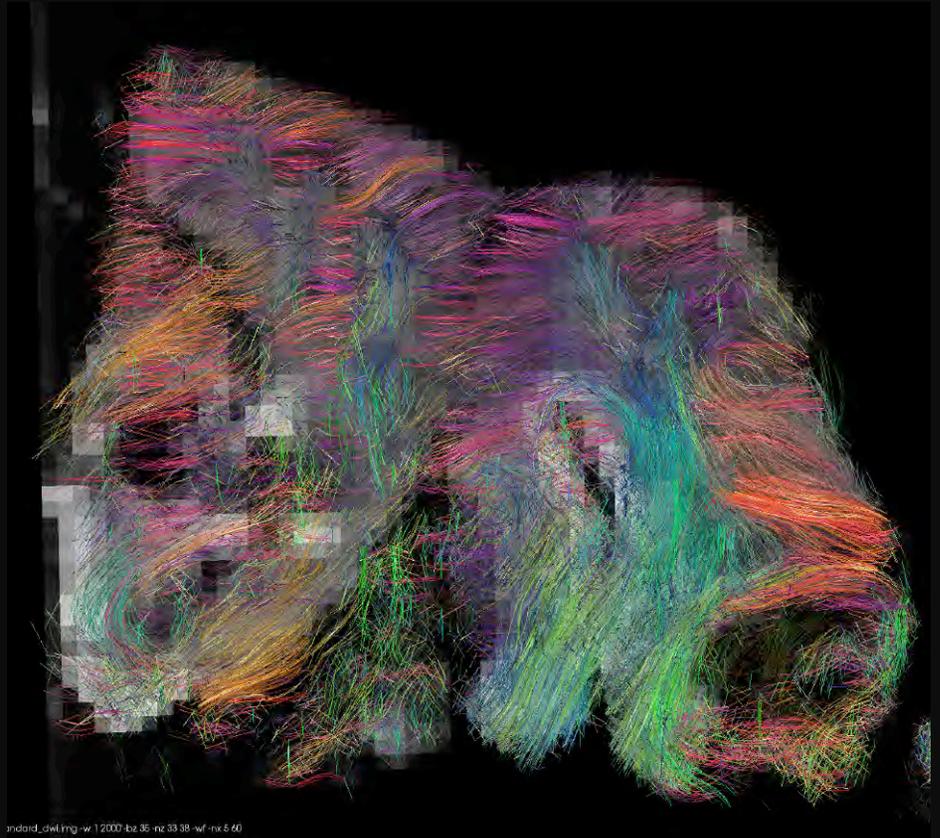
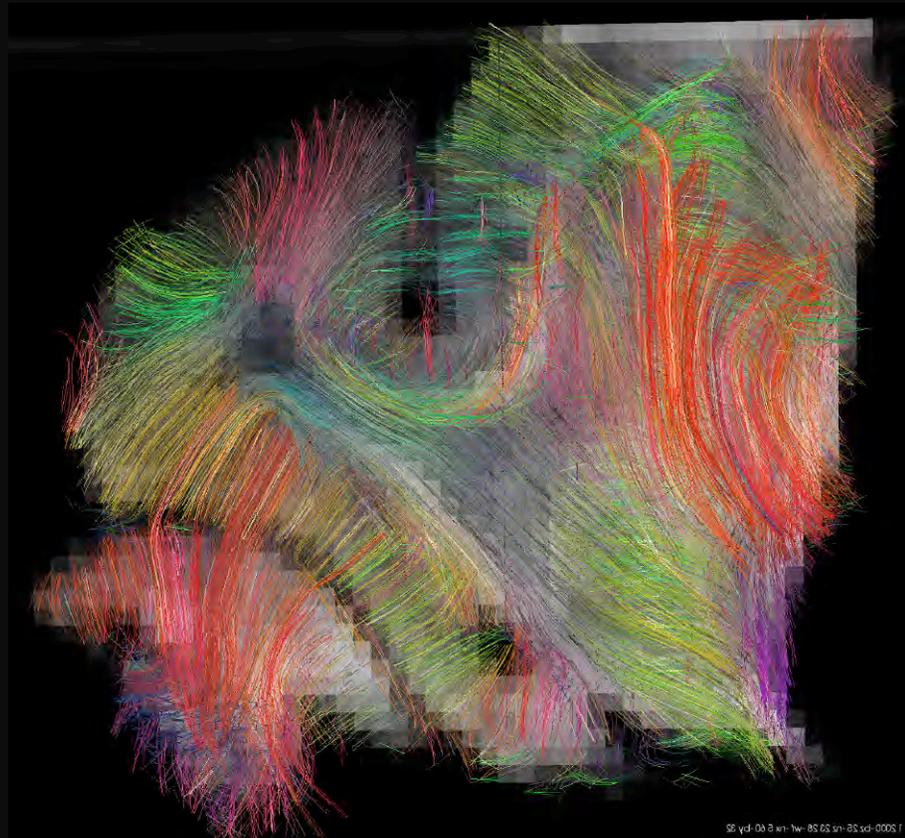
Day 35

Day 100



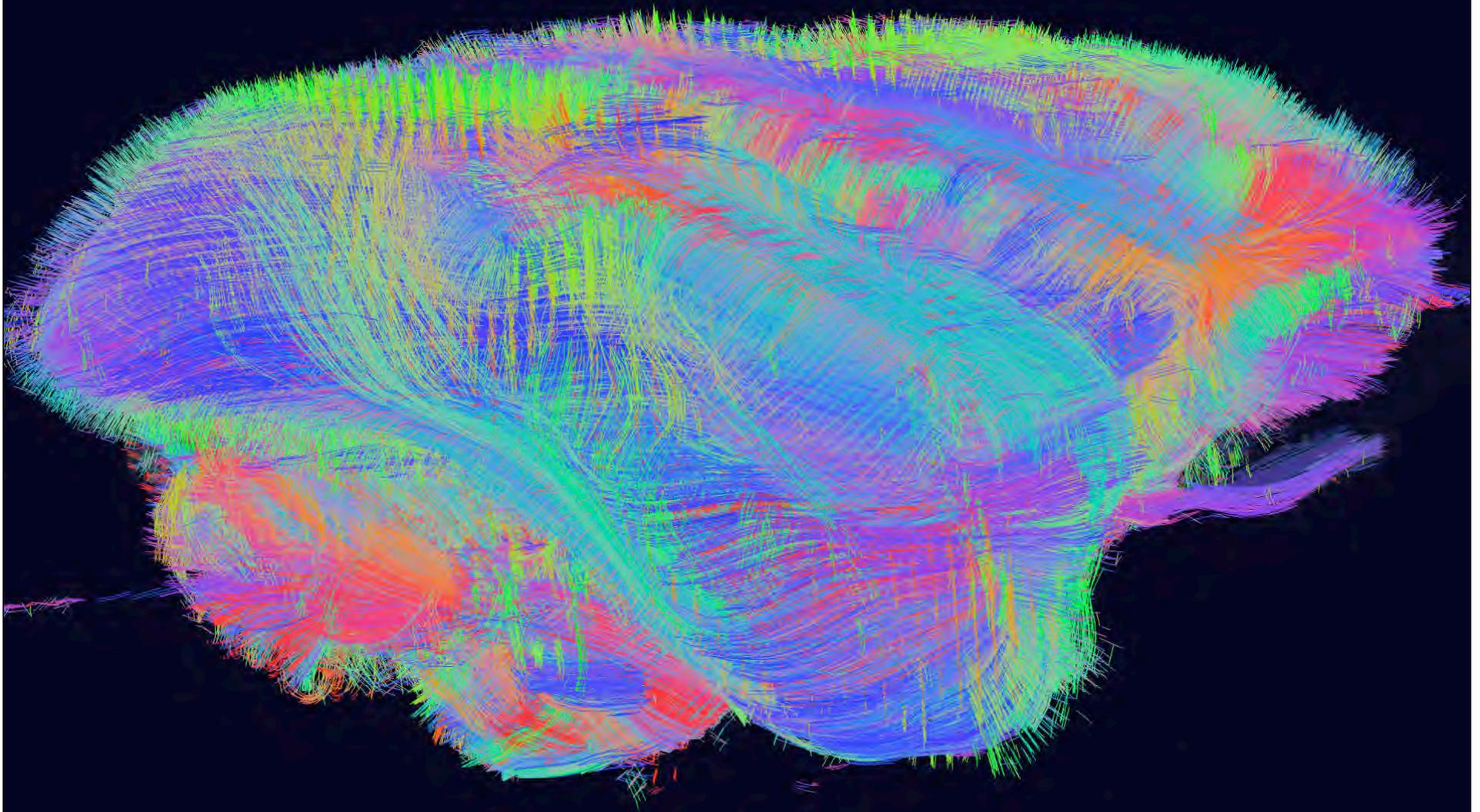
Takahasi et al ISMRM 2008

# Human cortex specimens normal control vs. polymicrogyria



Ellen Grant, RP Wang, A deCrespigny, VJ Wedeen - MGH Radiology

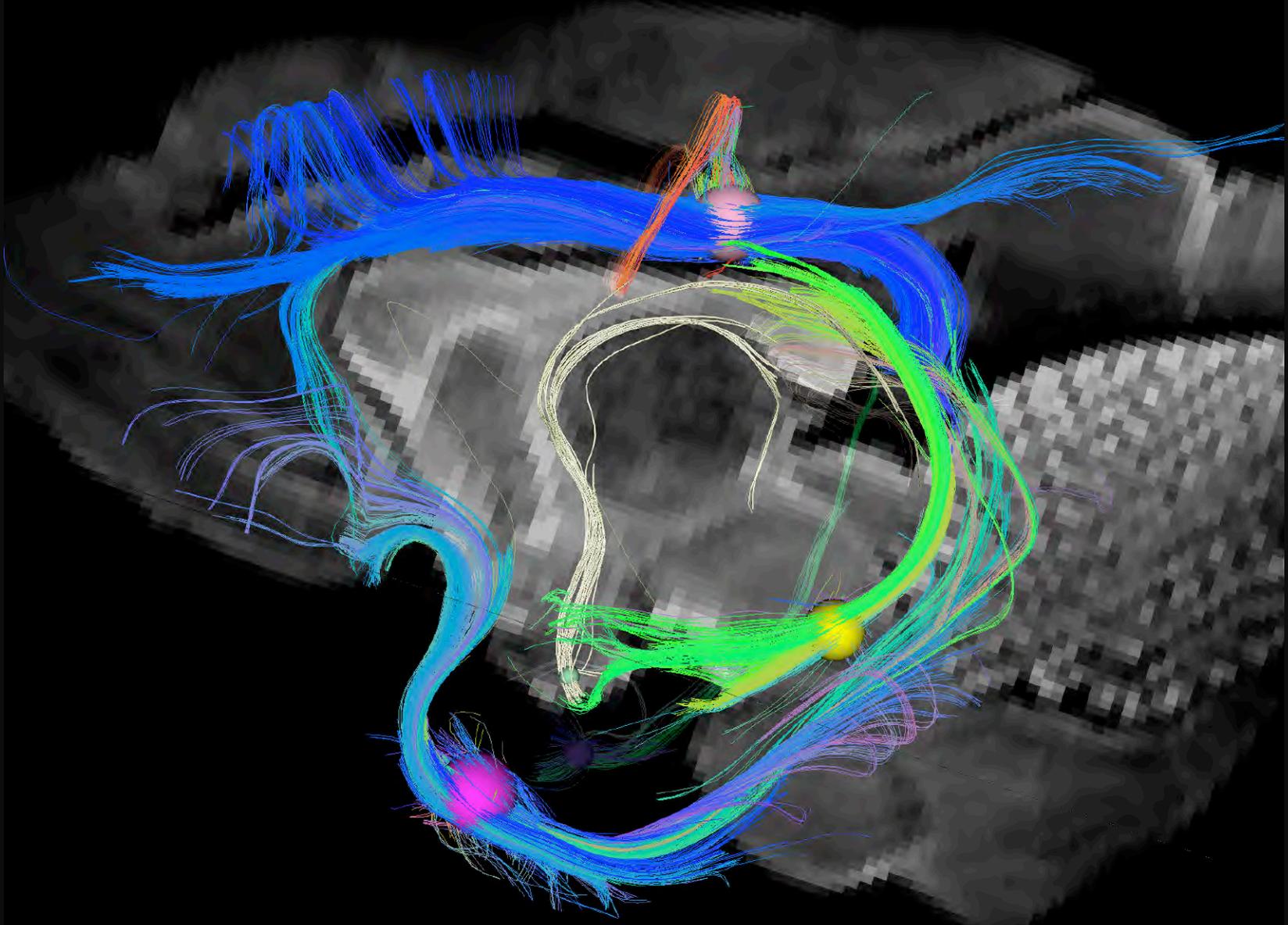
# Intracortical connectivity



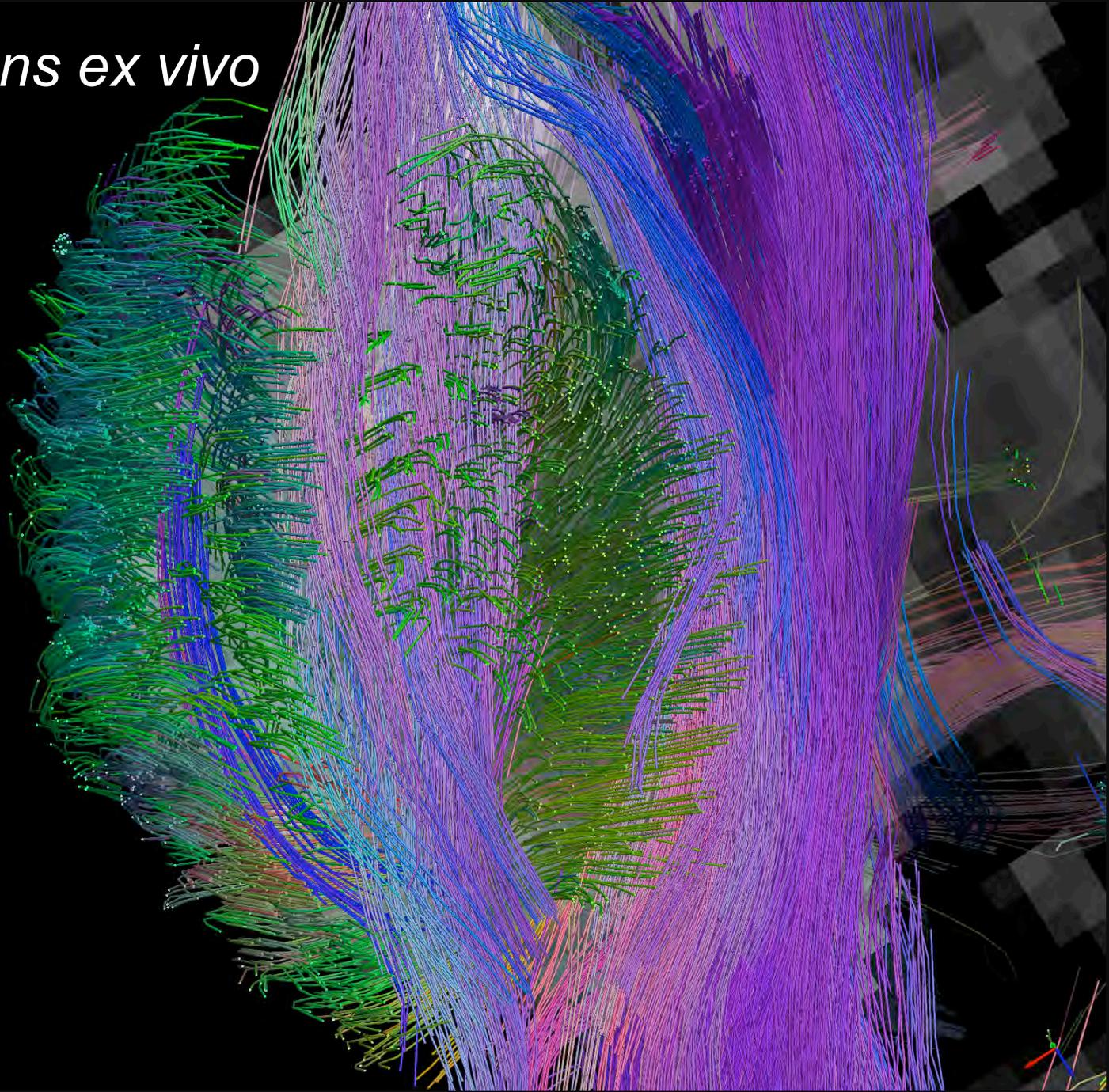
# Cat and mouse



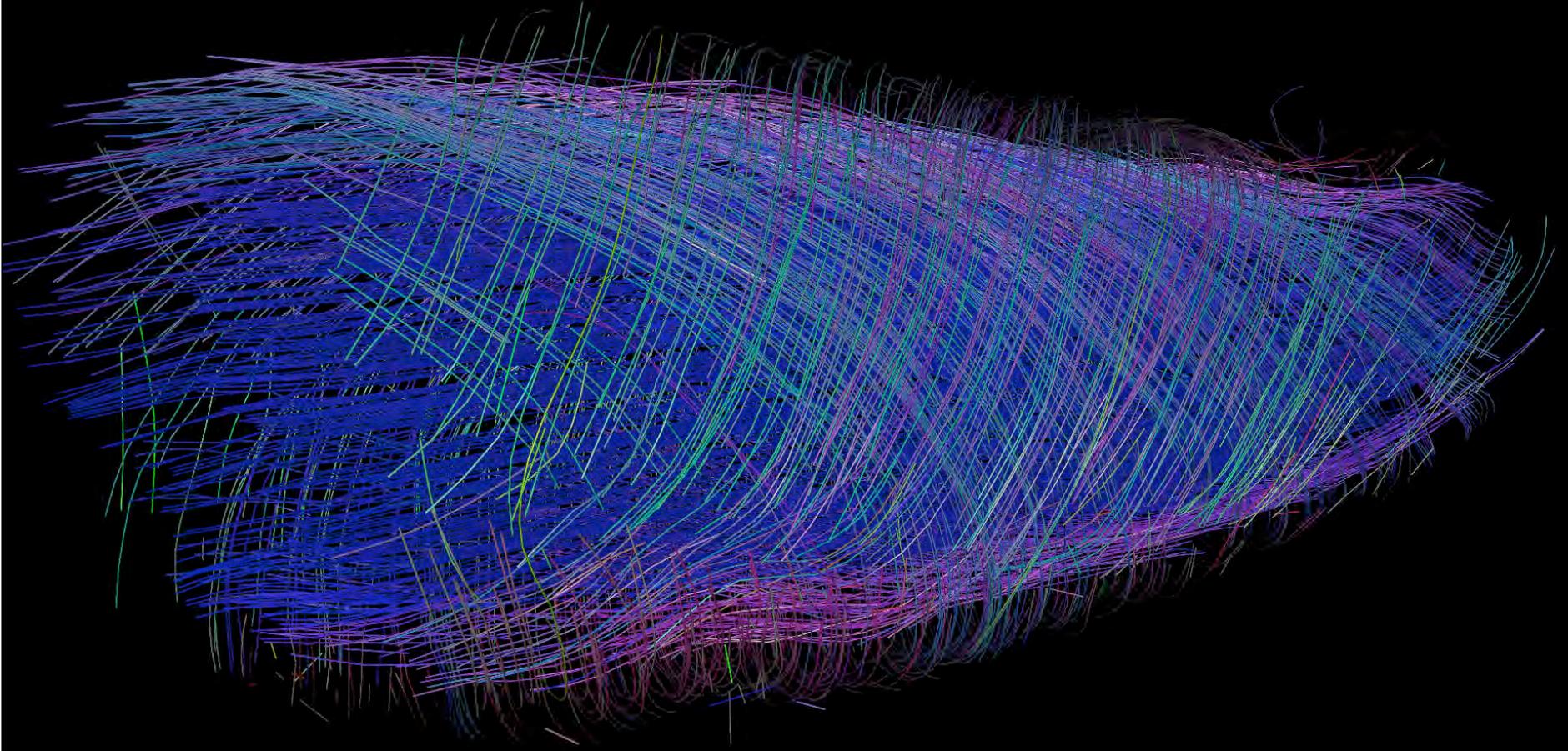
# Macaque circuit of Papez ex vivo



# *Human pons ex vivo*



# Esophagus fiber structure - like Chinese finger cuffs



esophagus\_sharp\_25.trk -skip 20 -nx 6 58 -ny 16 38 -nz 30 100 -s -r 0.04