



NA-MIC

National Alliance for Medical Image Computing

<http://na-mic.org>

3D Computer-Assisted Brain Mapping

Sonia Pujol, PhD

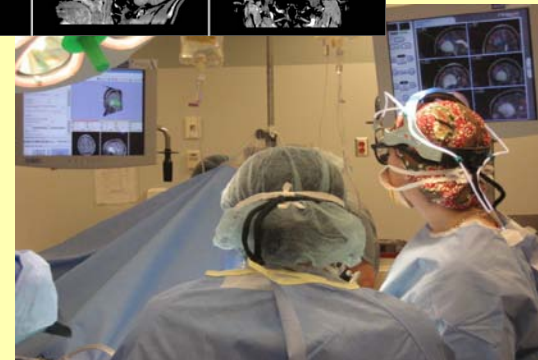
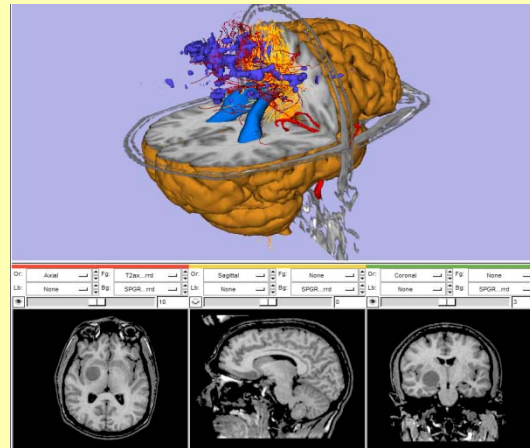
Brigham and Women's Hospital,

Harvard University





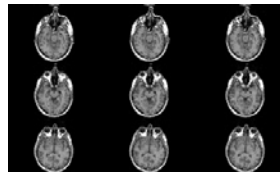
Medical Imaging



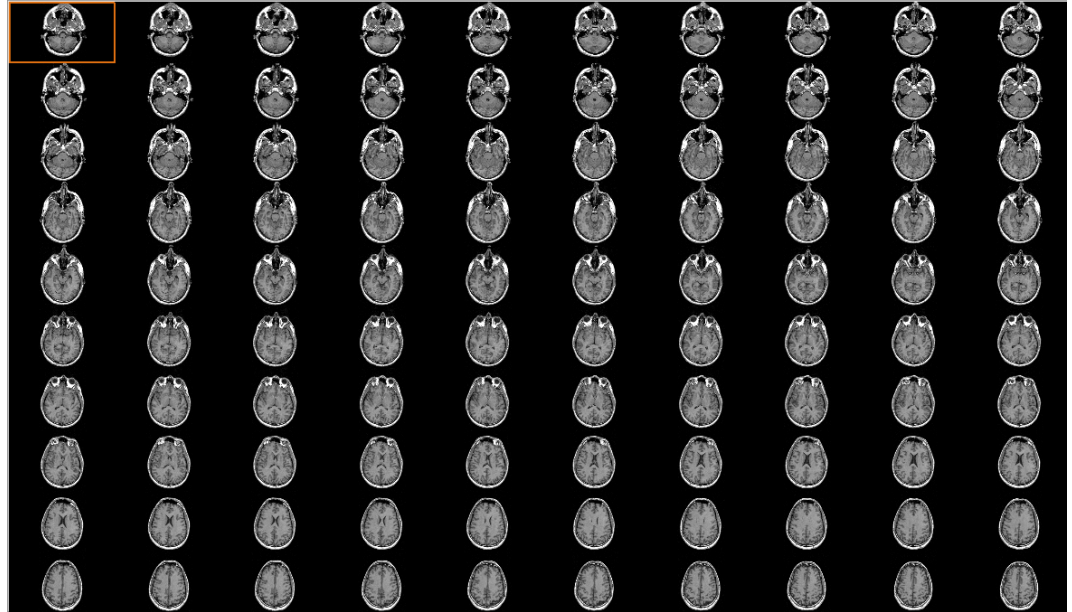
Courtesy of Alexandra Golby, MD, Noby Hata, PhD, Steve Pieper, PhD
Brigham and Women's Hospital



Data Explosion



75 slices, 37.5 MB



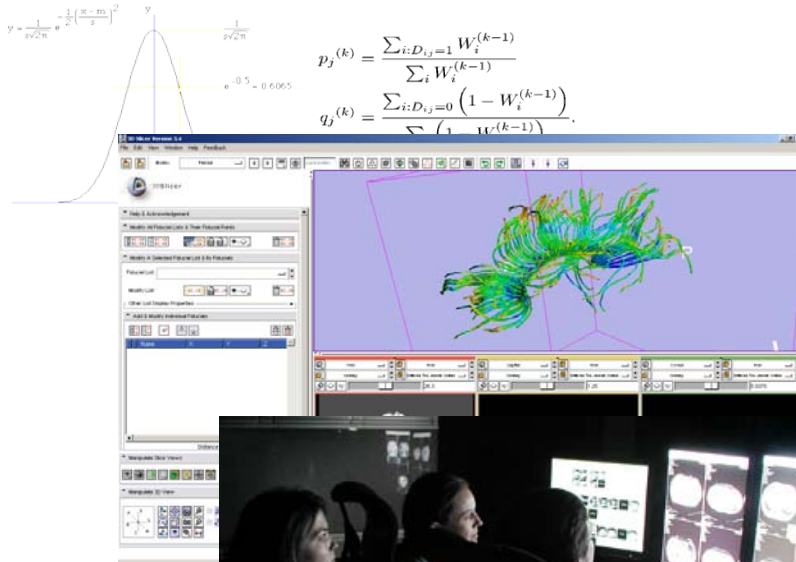
1,000 slices, 0.5 GB

Challenge: how to visualize so many data ?

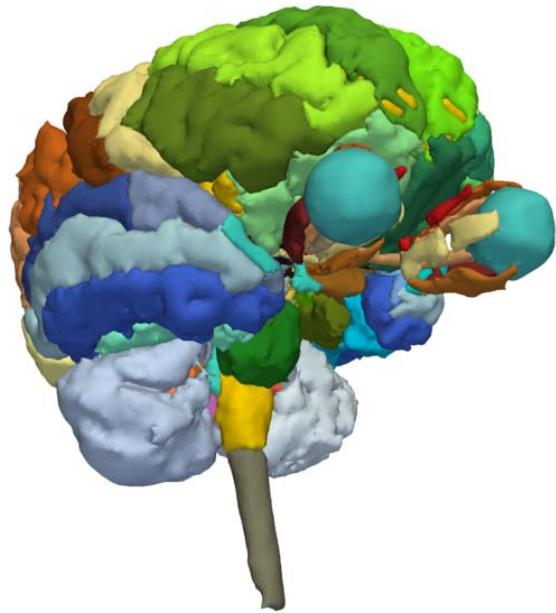


Computer-assisted brain mapping

$$\ln p(X | \pi, \mu, \Sigma) = \sum_{n=1}^N \ln \left\{ \sum_{k=1}^K \pi_k N(x_n | \mu_k, \Sigma_k) \right\}$$



- Increasing sophistication in computer hardware
- Scientific advances made by the biomedical imaging computing community
- Enhanced research capabilities for exploring the brain



Visualizing the brain in 3D

Image from the SPL-PNL Brain Atlas

Talos IF, Jakab M, Kikinis R, Shenton ME

Brigham and Women's Hospital, Boston



Volume Rendering

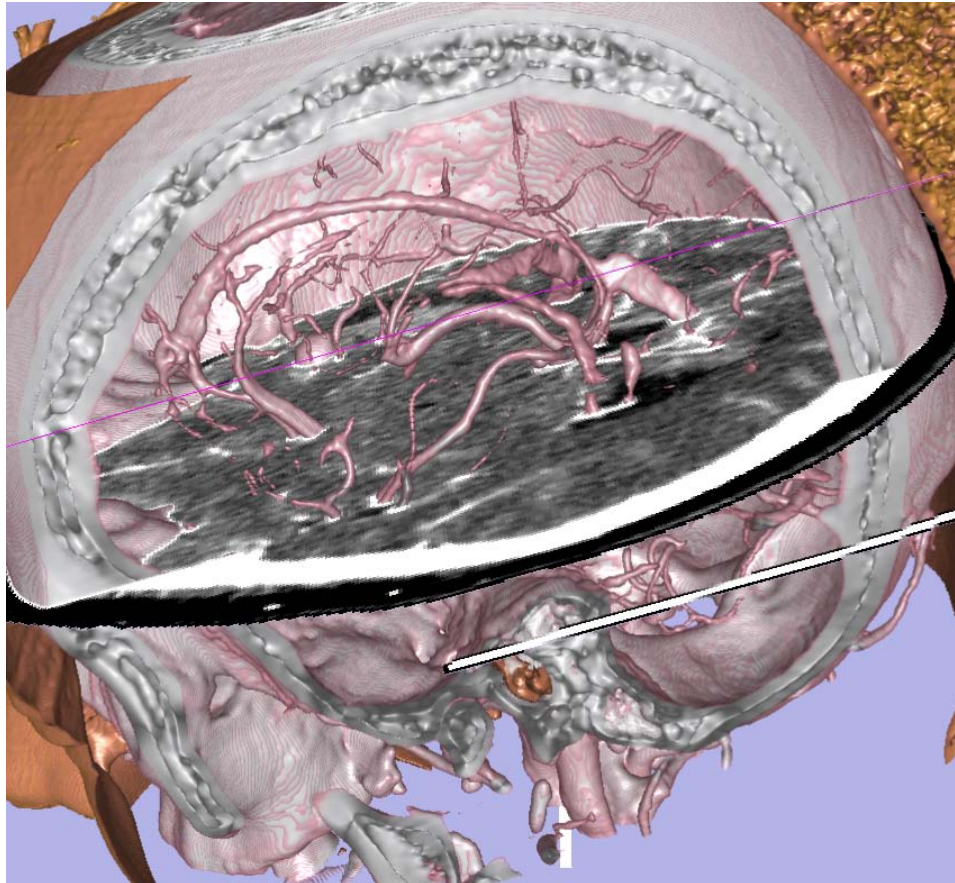
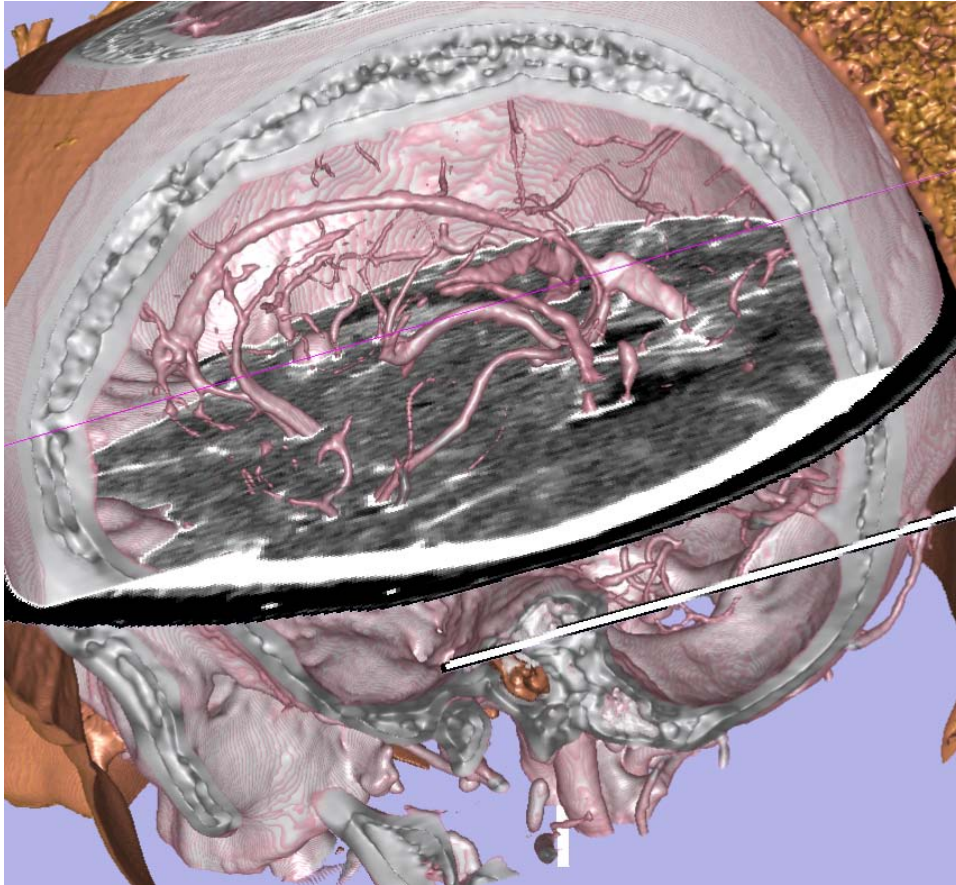


Image courtesy of Steve Pieper, Ph.D.



Volume Rendering



- Direct visualization
- Ray casting
- Hardware accelerated volume rendering

Image courtesy of Steve Pieper, Ph.D.



Image Segmentation

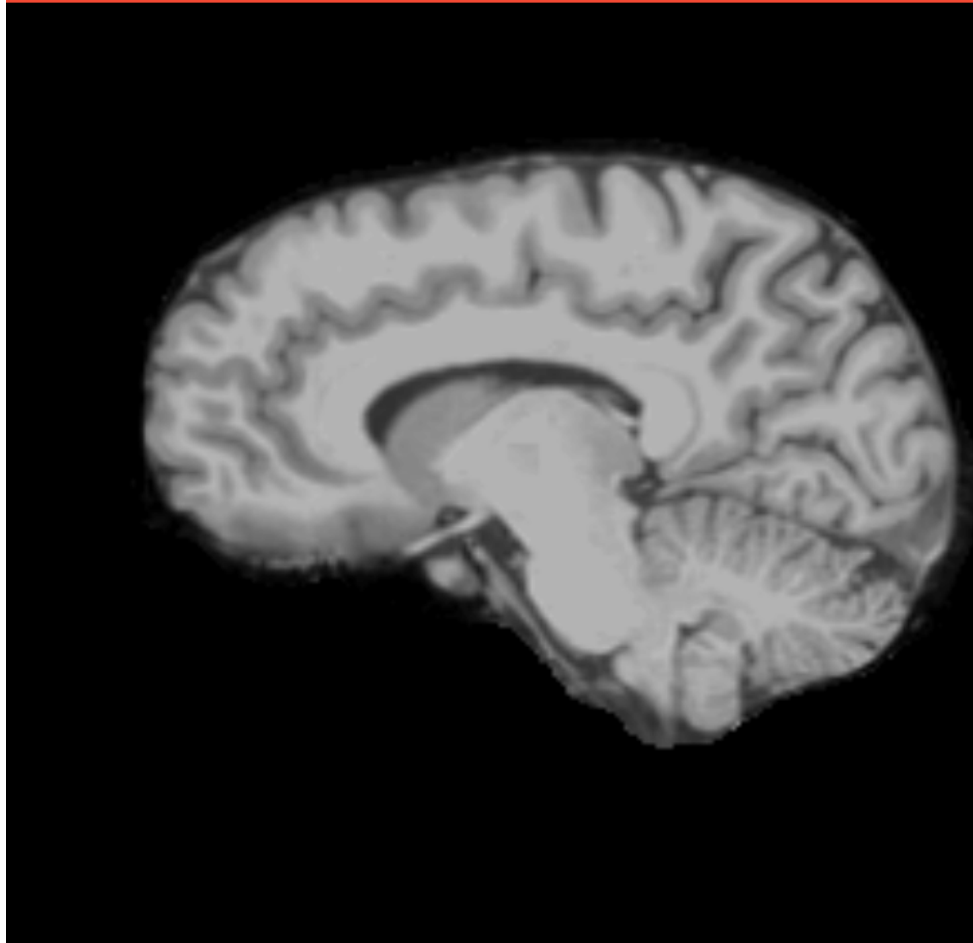




Image Segmentation

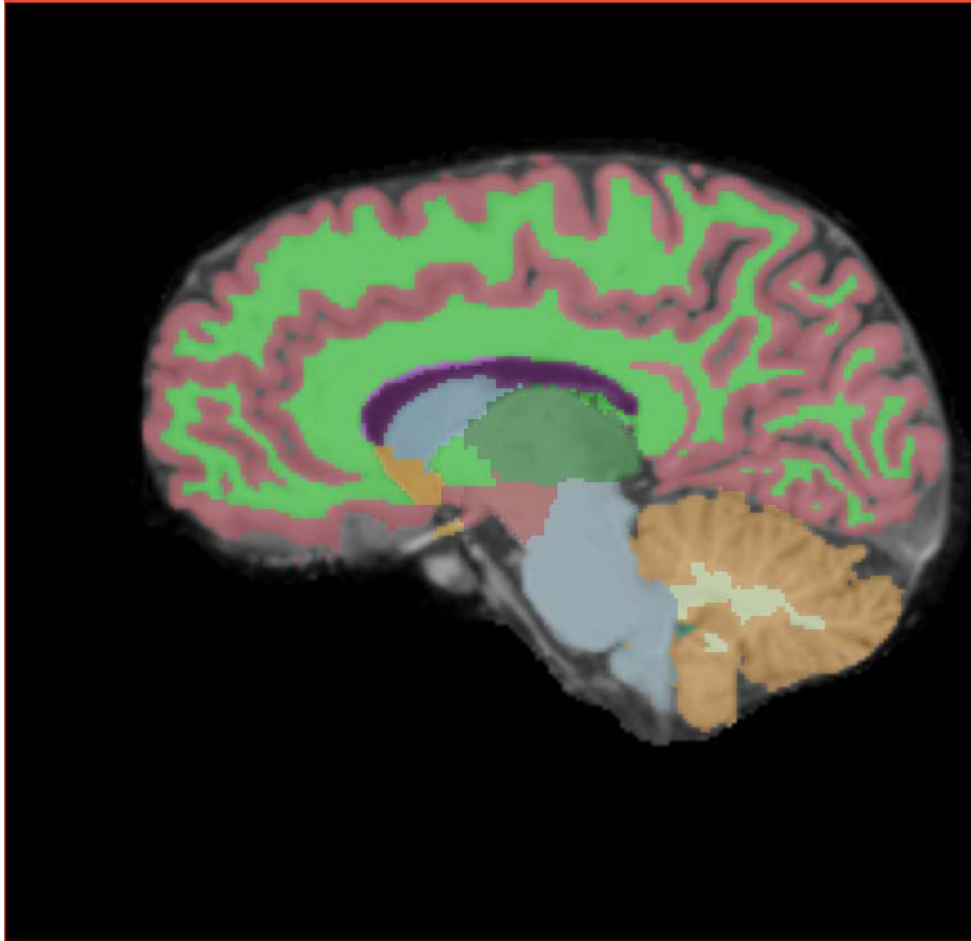




Image Segmentation

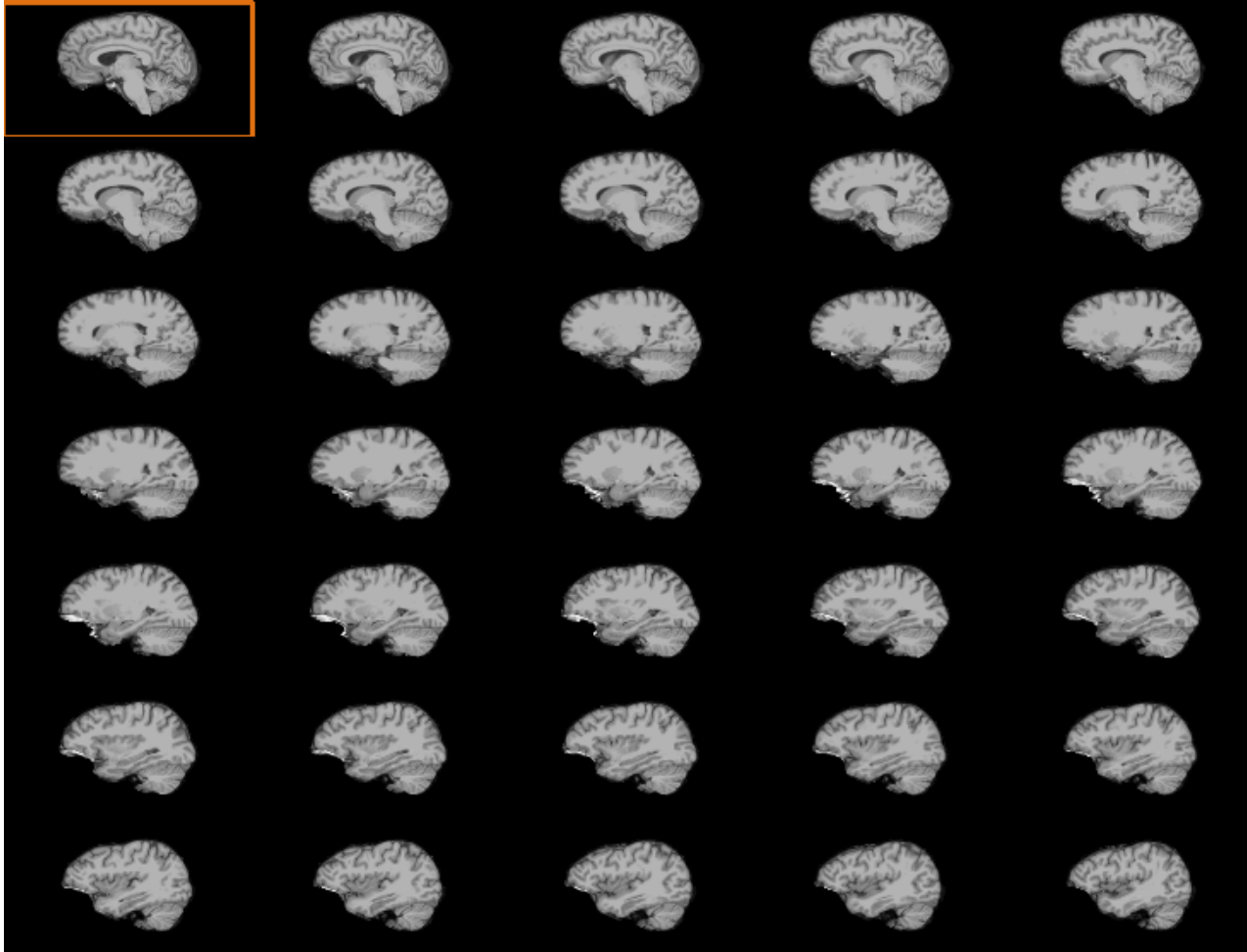




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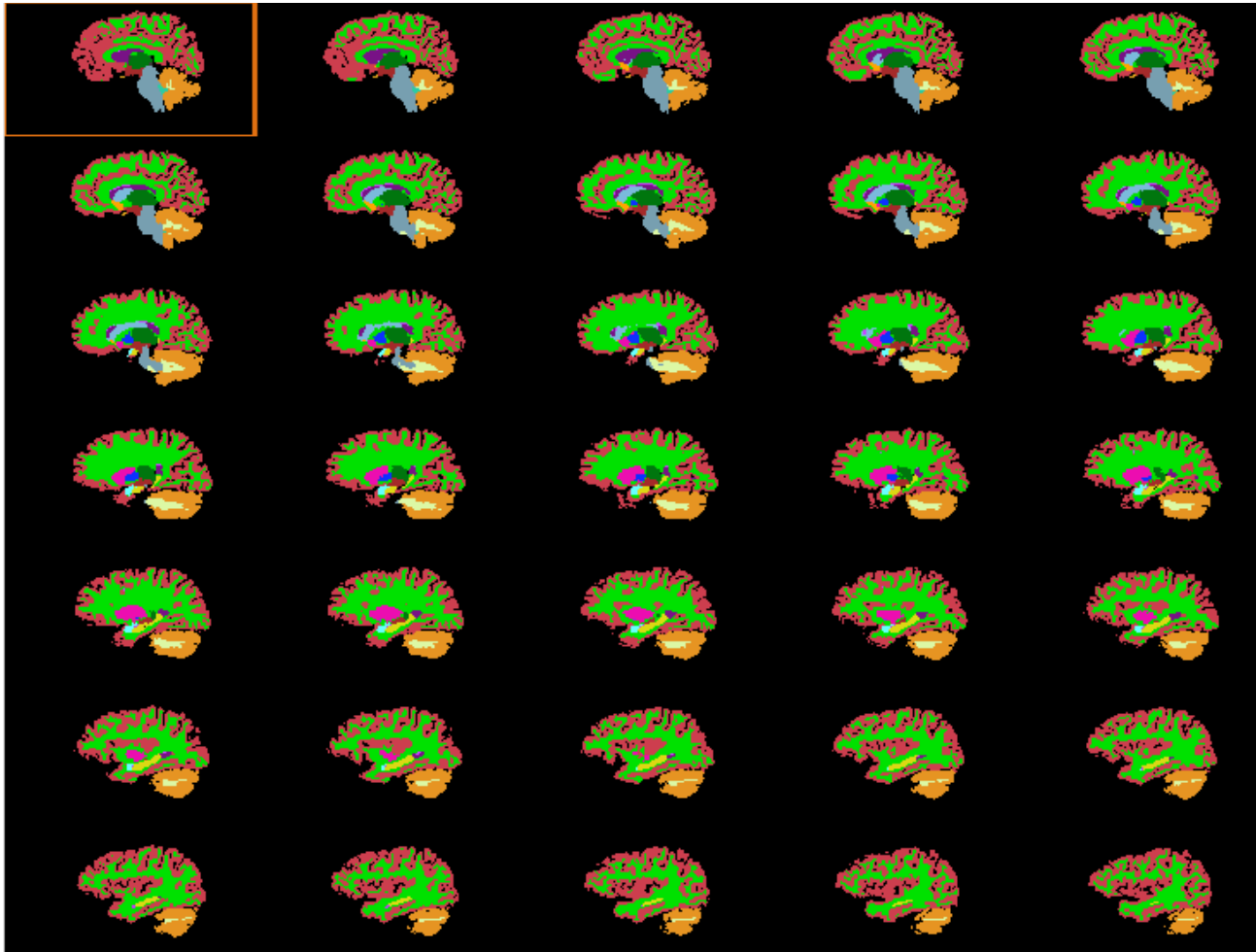
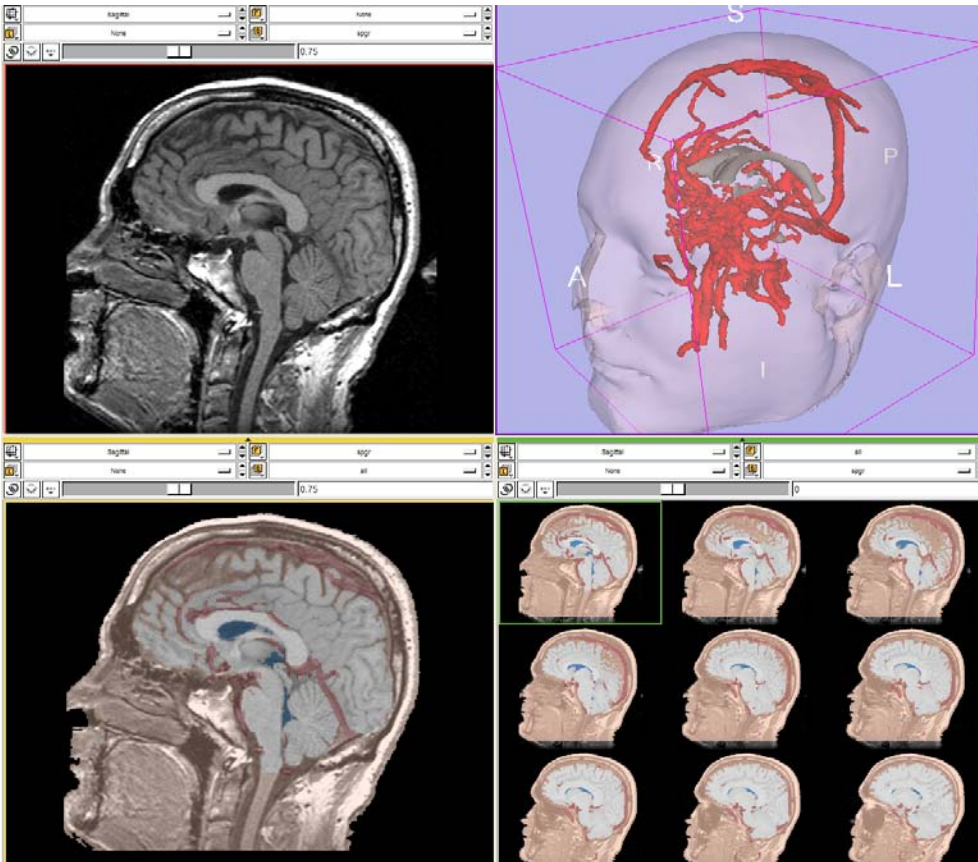




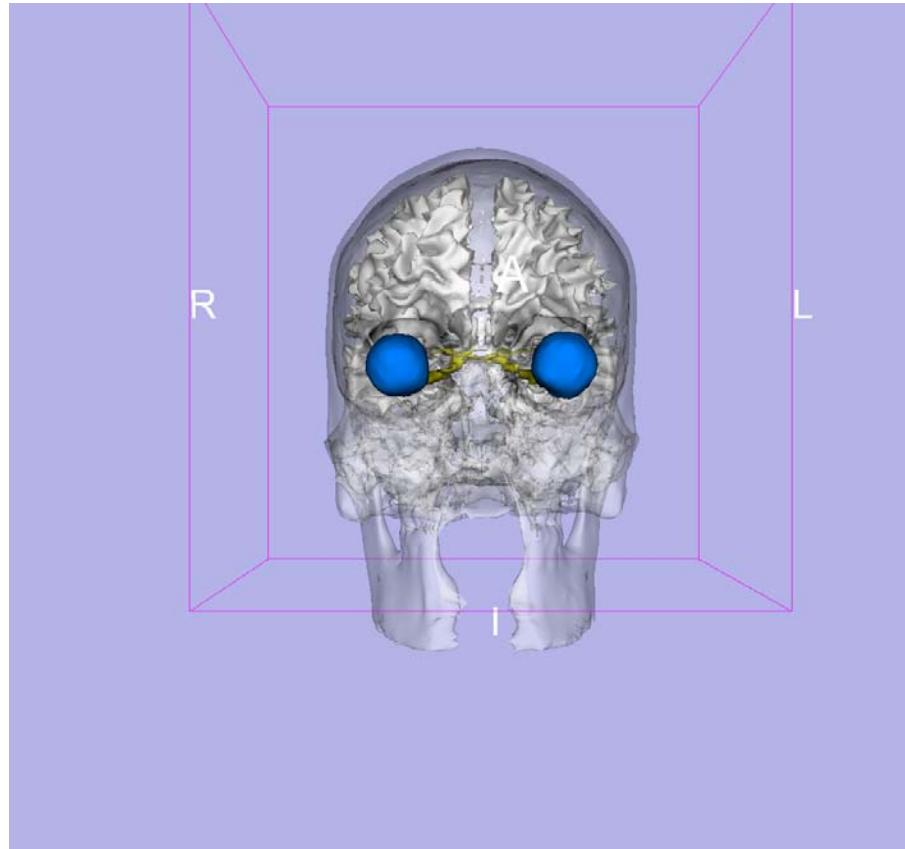
Image Segmentation



- Manual drawing & thresholding
- Semi-automated level tracing
- Automated segmentation algorithms



3D surface reconstruction

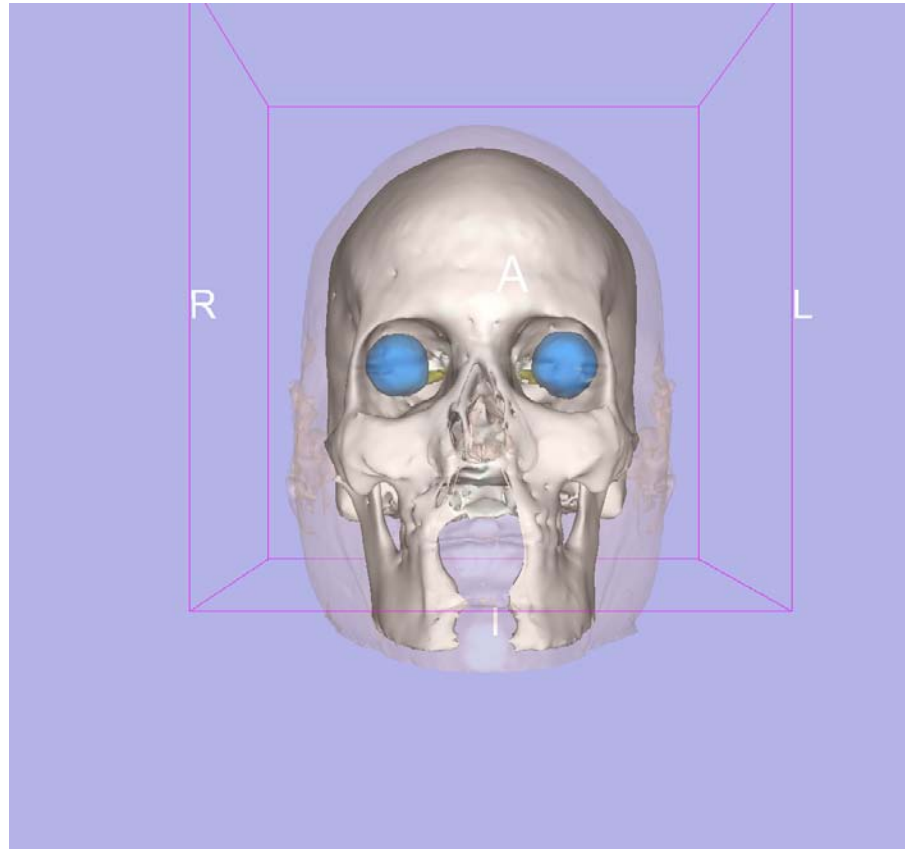


Marching Cube
Algorithm (*)

*Lorensen WE, Cline HE. Marching Cubes: a high resolution 3D surface construction algorithm. SIGGRAPH'87



3D surface reconstruction

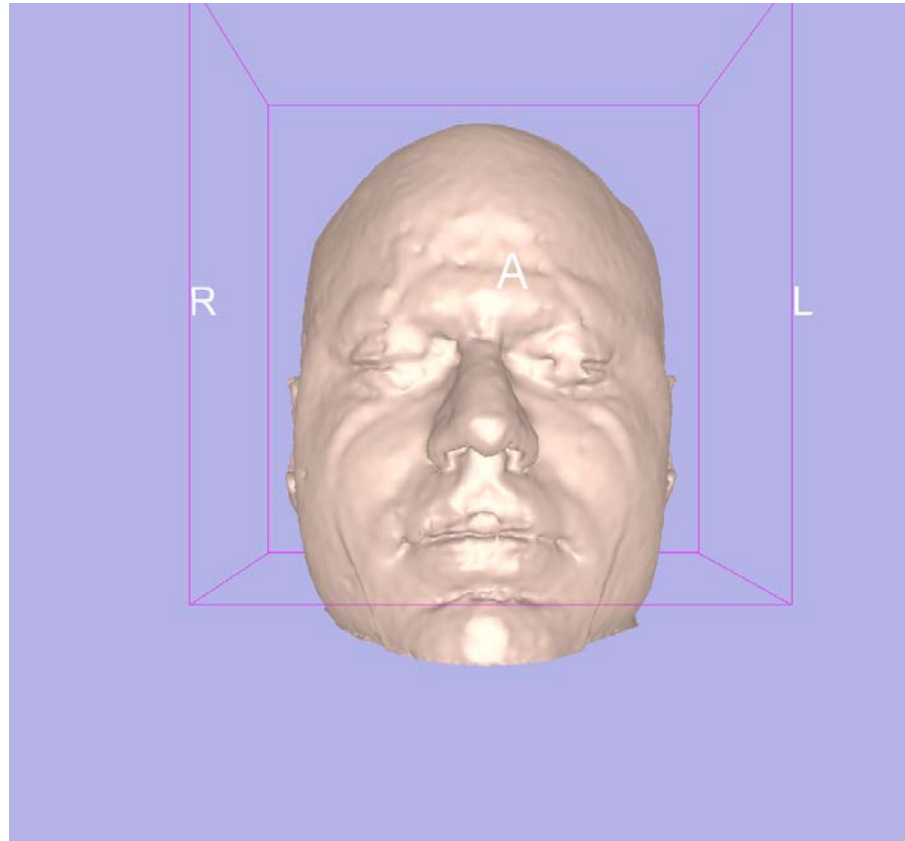


Marching Cube
Algorithm (*)

*Lorensen WE, Cline HE. Marching Cubes: a high resolution 3D surface construction algorithm. SIGGRAPH'87



3D surface reconstruction

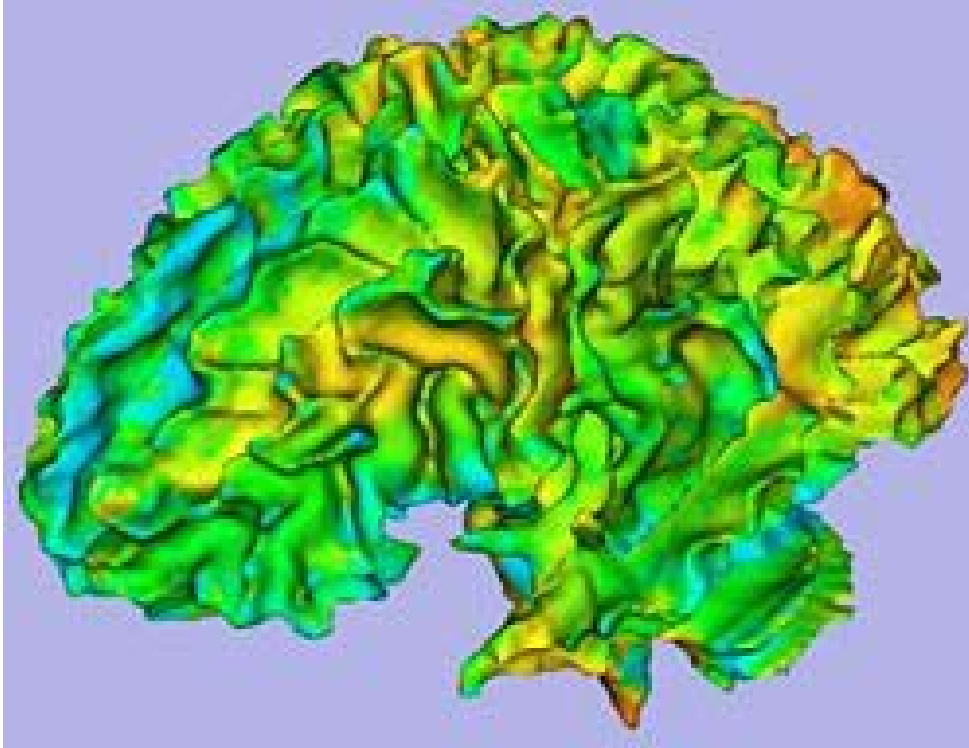


Marching Cube
Algorithm (*)

*Lorensen WE, Cline HE. Marching Cubes: a high resolution 3D surface construction algorithm. SIGGRAPH'87



3D Surface Analysis

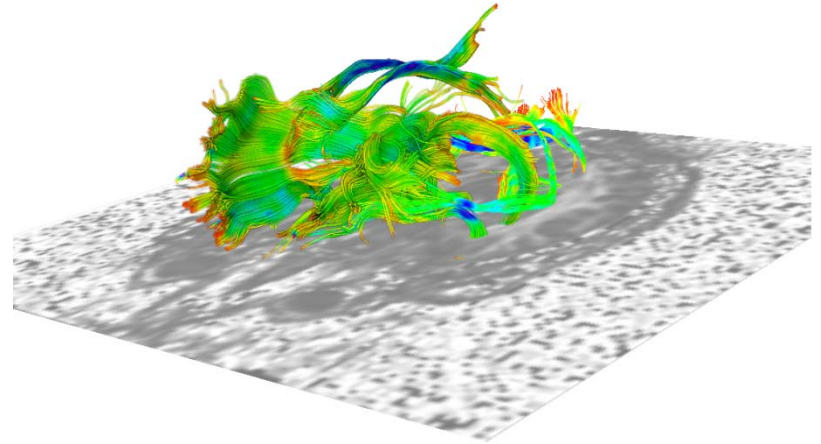


Cortical
thickness on
white matter
surface

Image courtesy of Martin Styner, PhD, Clement Vacher,
M.Sc., University of North Carolina Chapel Hill

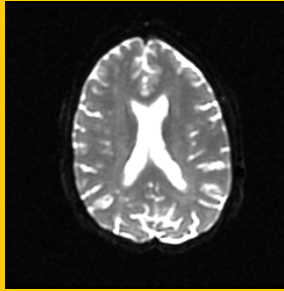


Mapping the brain with Diffusion Tensor Imaging

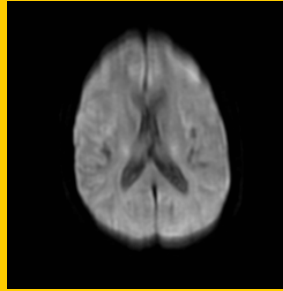




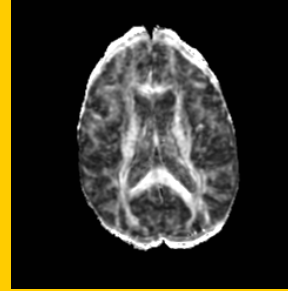
Diffusion Tensor Imaging Analysis



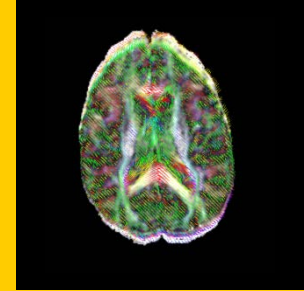
DWI
Acquisition



Tensor
Calculation



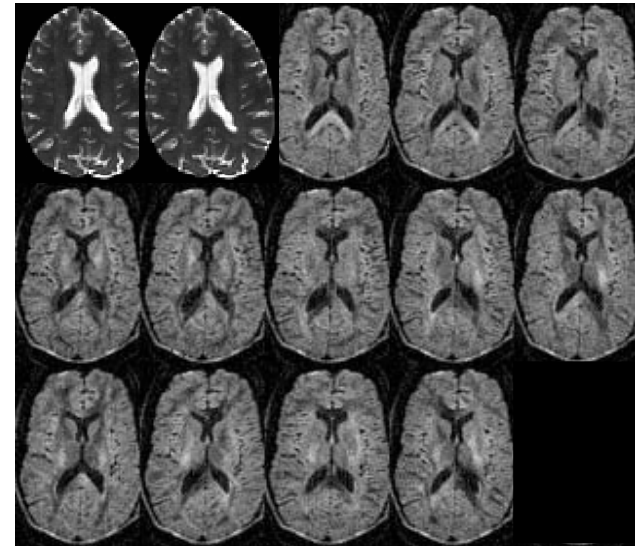
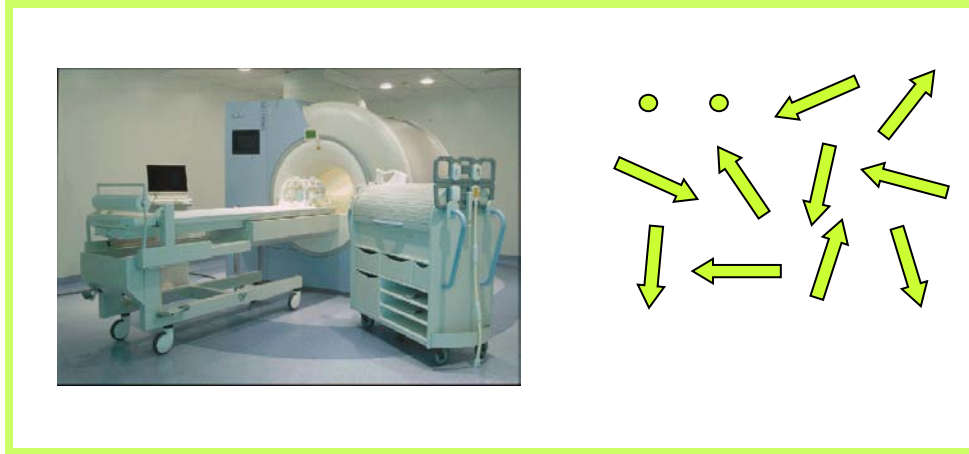
Scalar
Maps



3D
Visualization



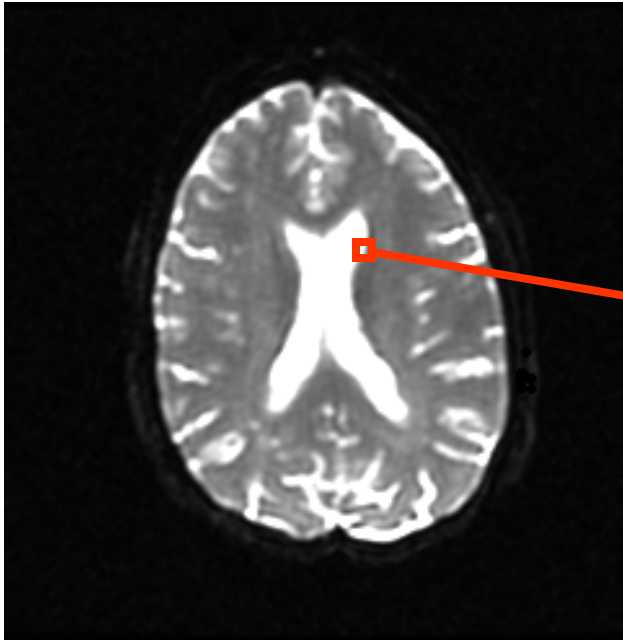
Diffusion Weighted MR Imaging





Diffusion Tensor

Stejskal-Tanner $S_i = S_0 e^{-b \hat{g}_i^T \underline{D} \hat{g}_i}$

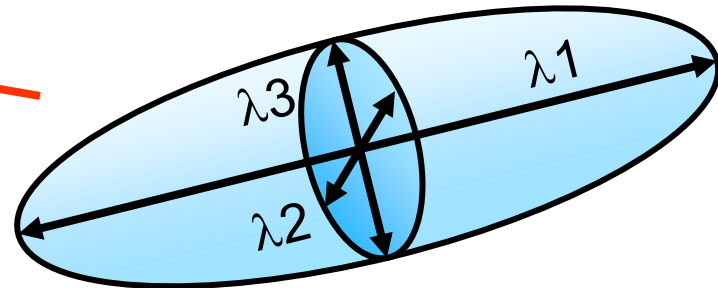
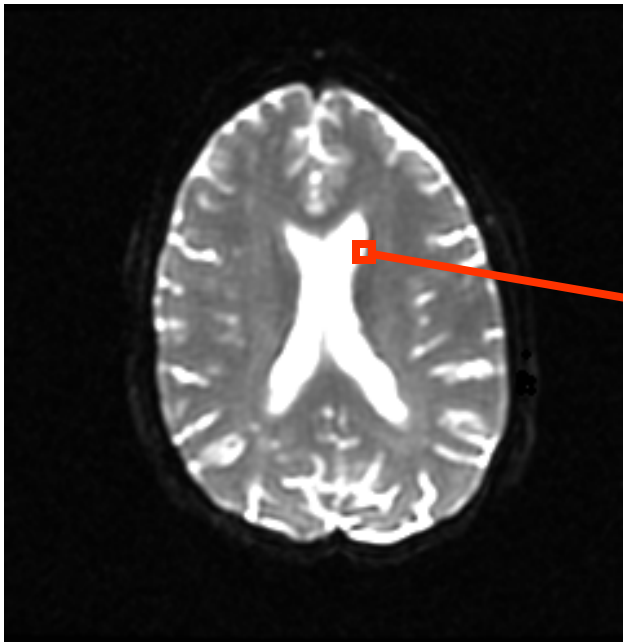


$$\underline{D} = \begin{bmatrix} D_{xx} & D_{xy} & D_{xz} \\ D_{yx} & D_{yy} & D_{yz} \\ D_{zx} & D_{zy} & D_{zz} \end{bmatrix}$$



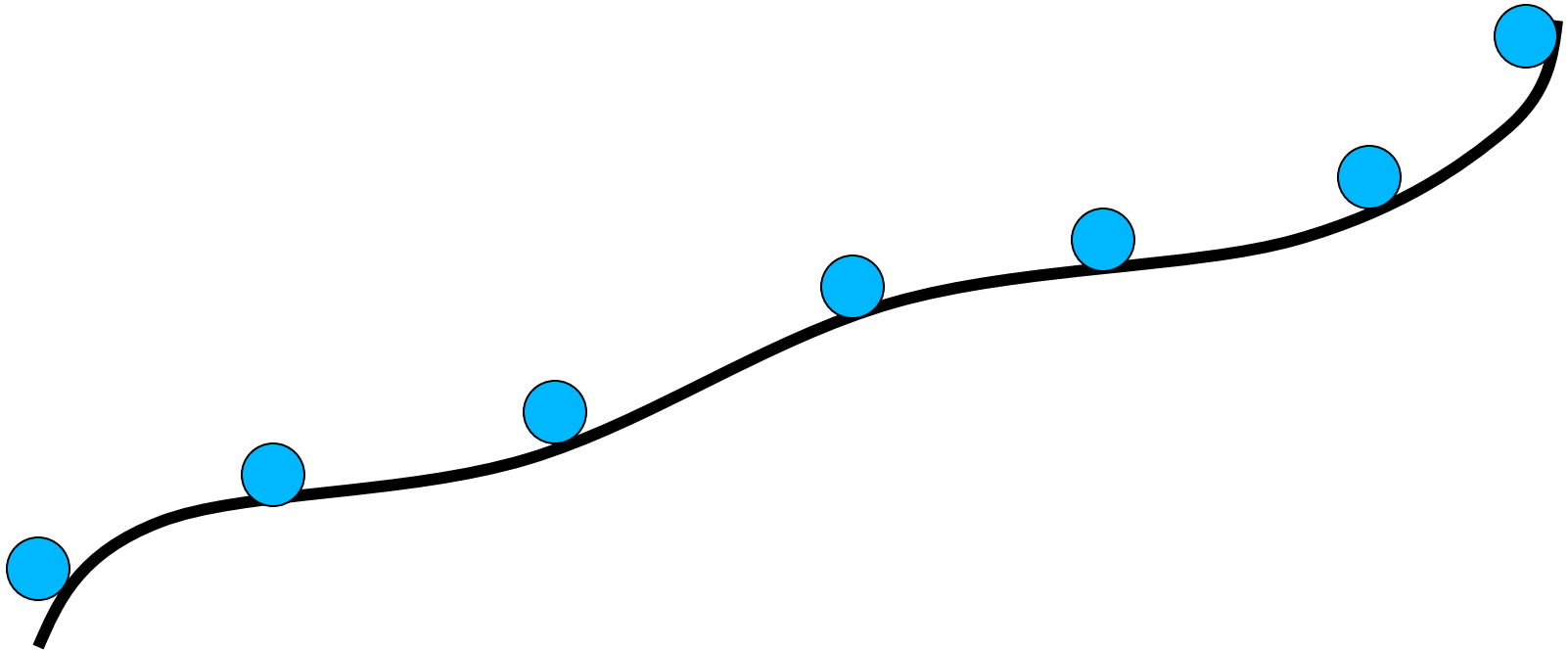
Diffusion Tensor

Stejskal-Tanner $S_i = S_0 e^{-b \hat{g}_i^T \underline{D} \hat{g}_i}$



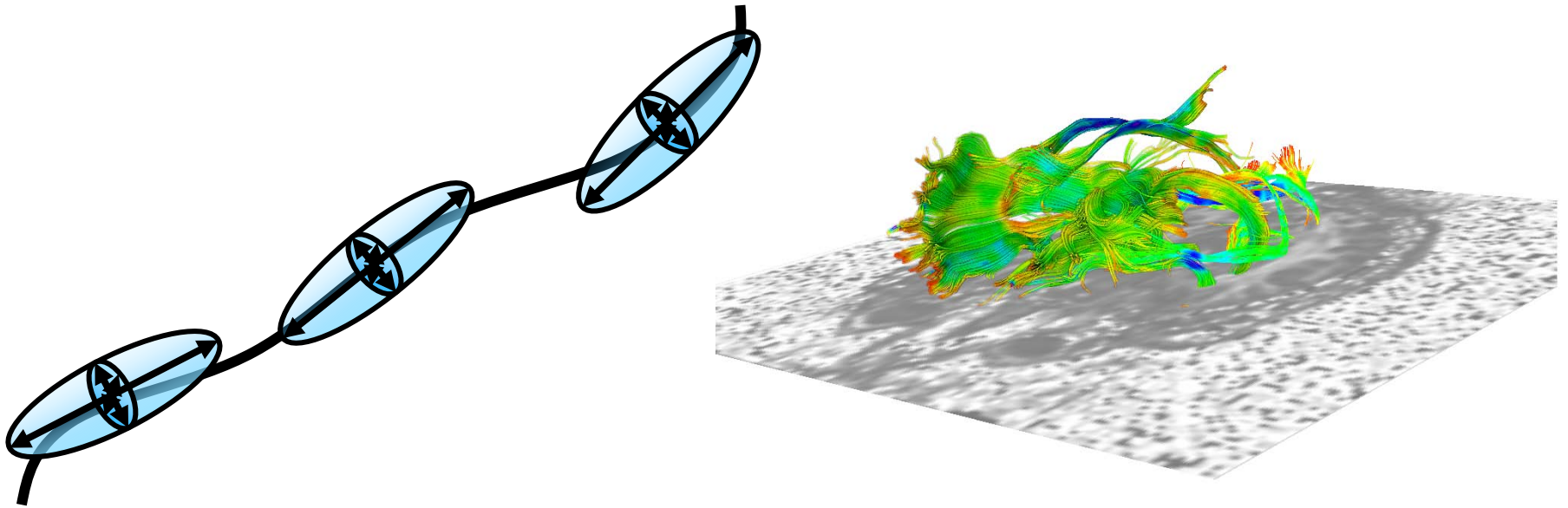


Tractography





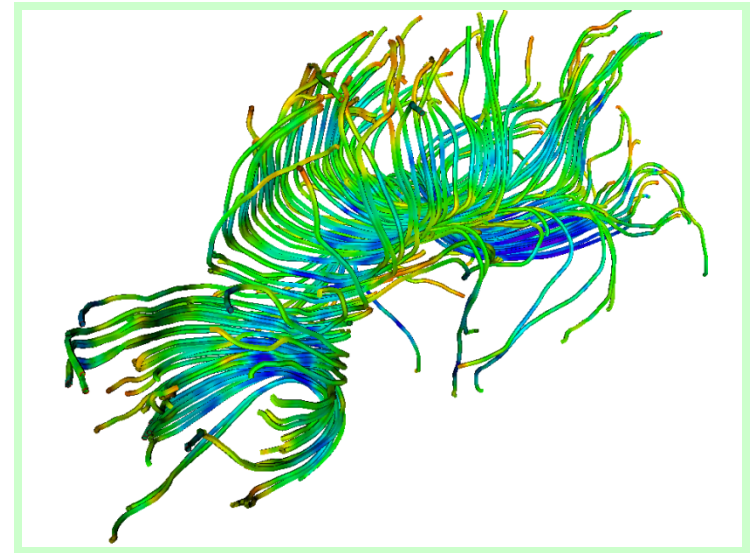
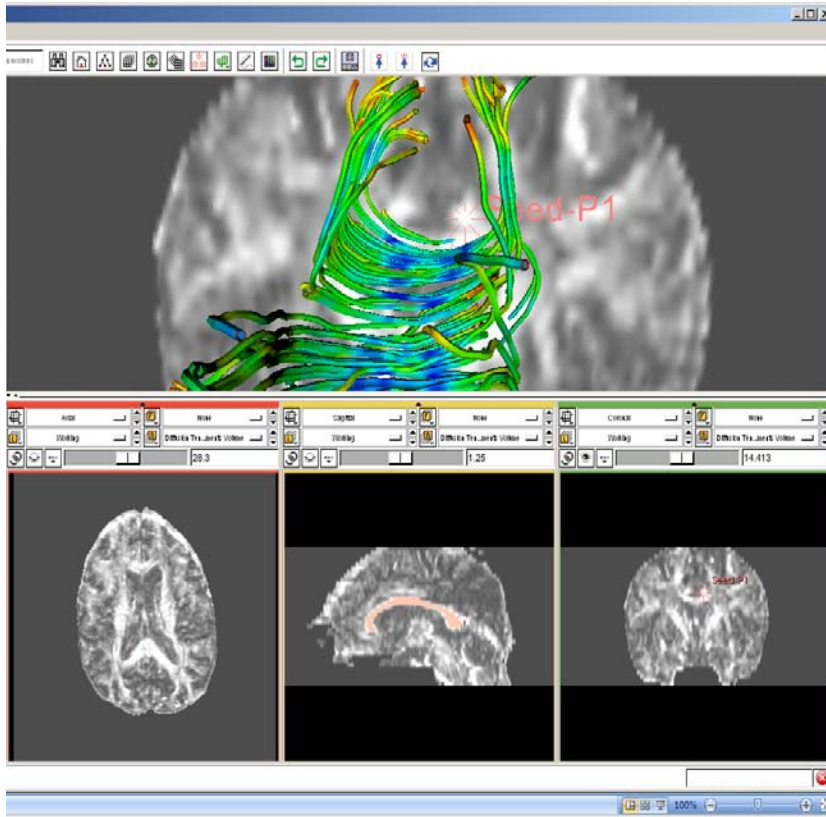
Streamline Tractography



The goal of tractography is to determine white matter fibers' trajectory from a set of DTI voxels.



ROI Seeding





Fiducial Seeding

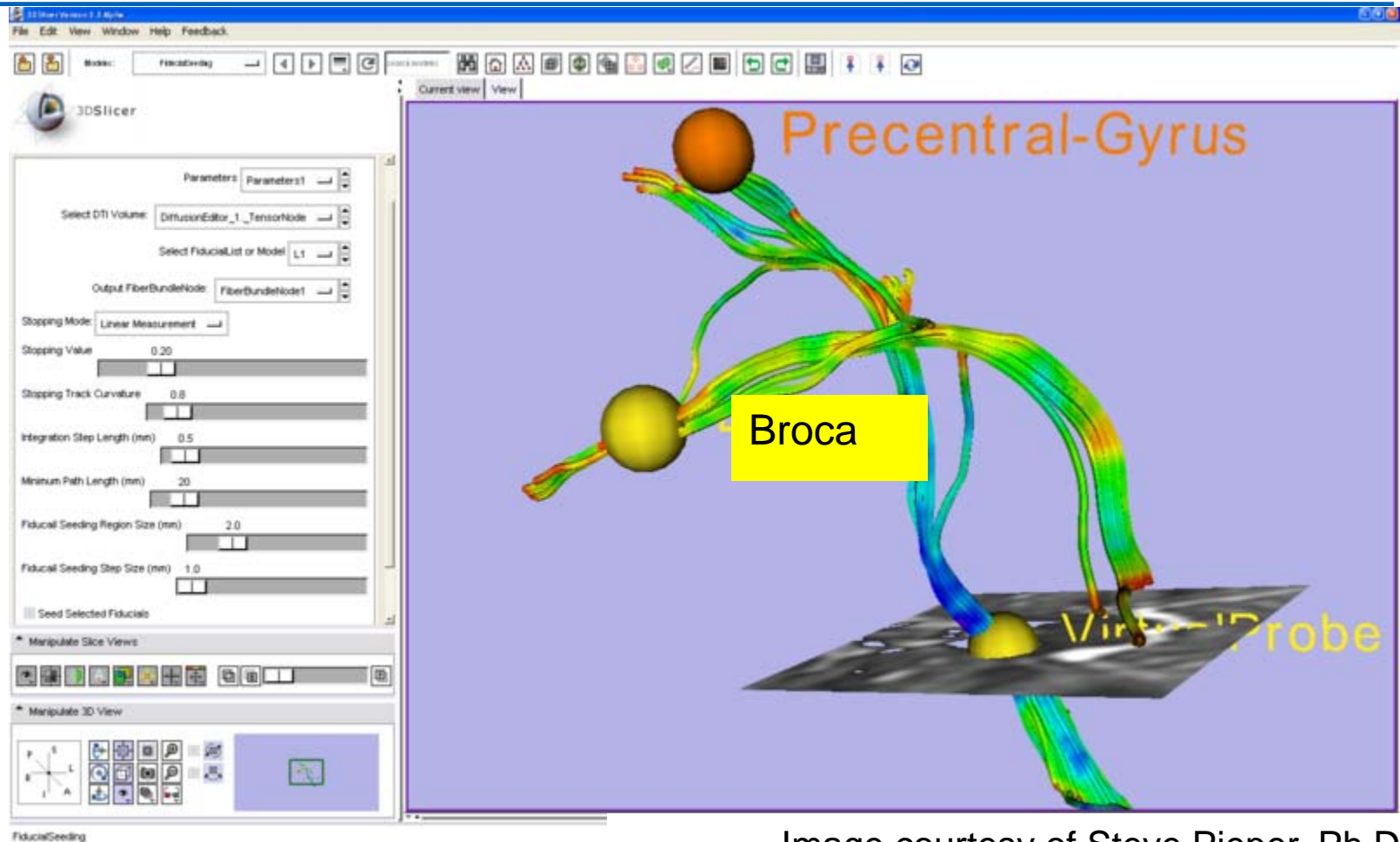


Image courtesy of Steve Pieper, Ph.D.



Data Fusion

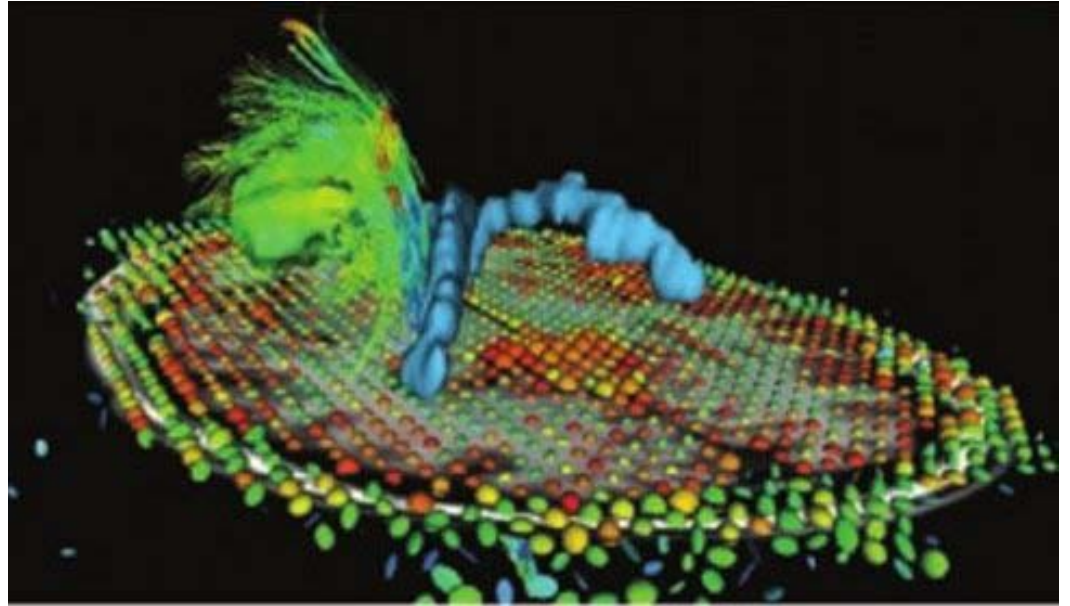
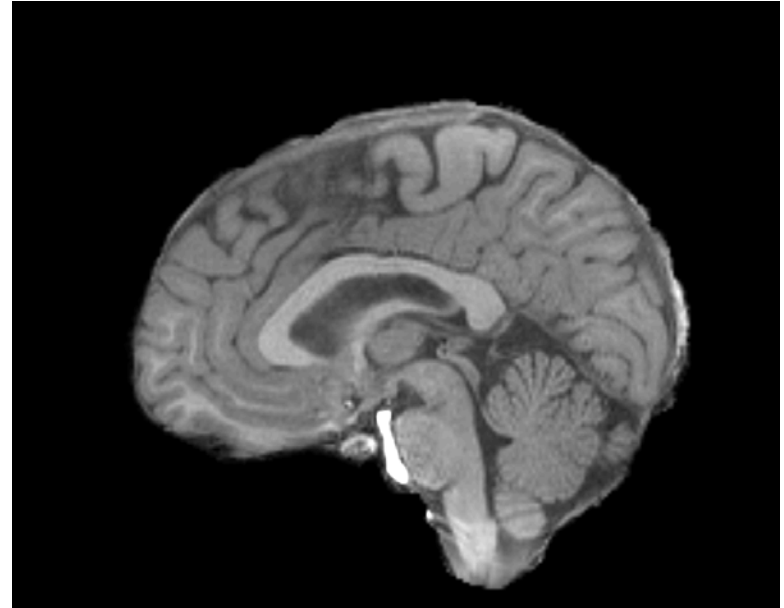


Image courtesy of Alexandra Golby, M.D., Jean-Jacques Lemaire, M.D., Ph.D., Steve Pieper, Ph.D.

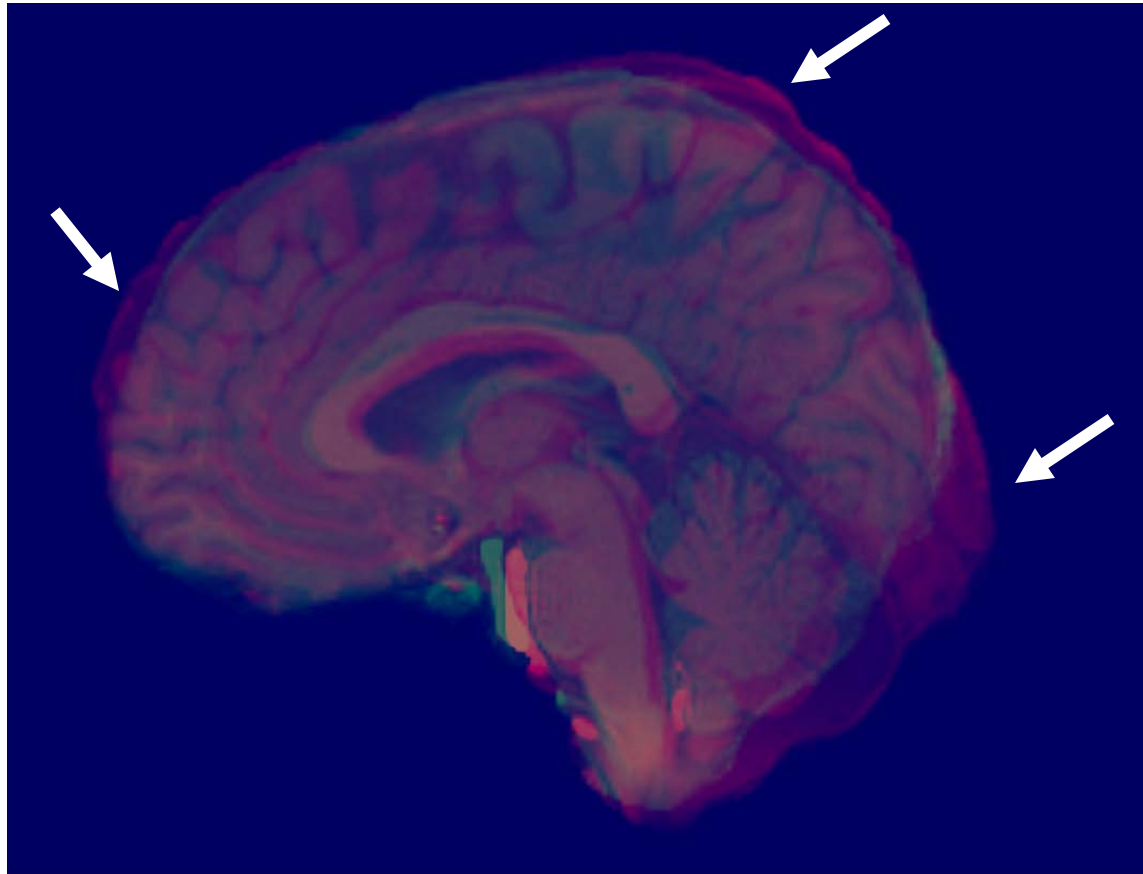


Data Fusion



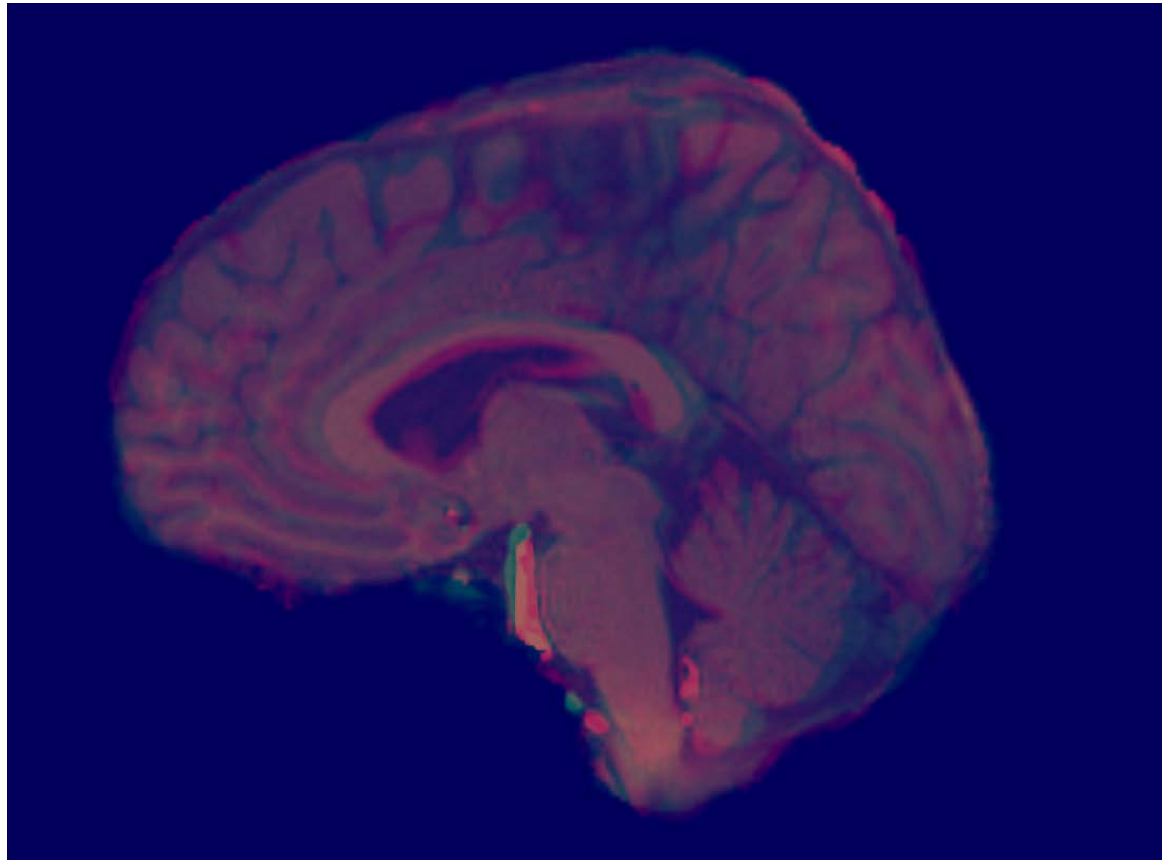


Initial mis-registration



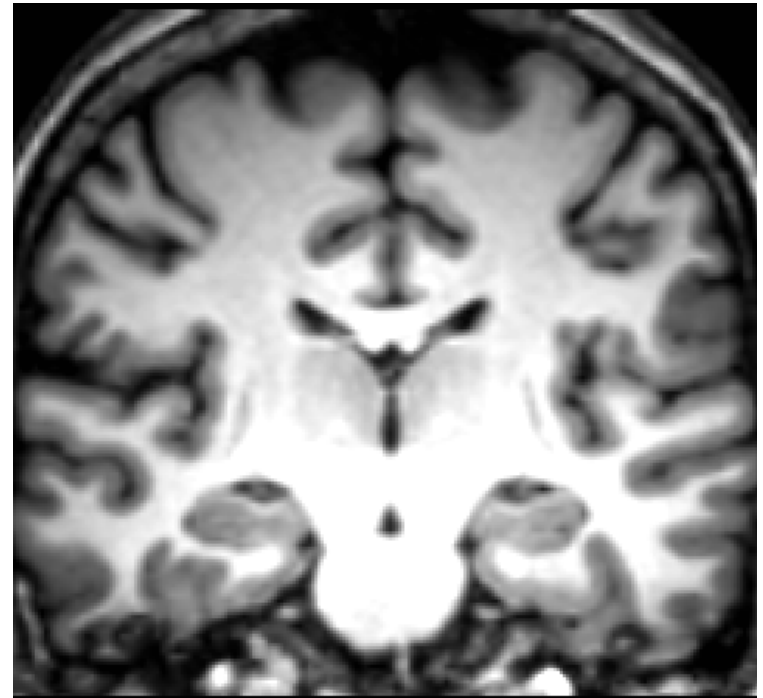
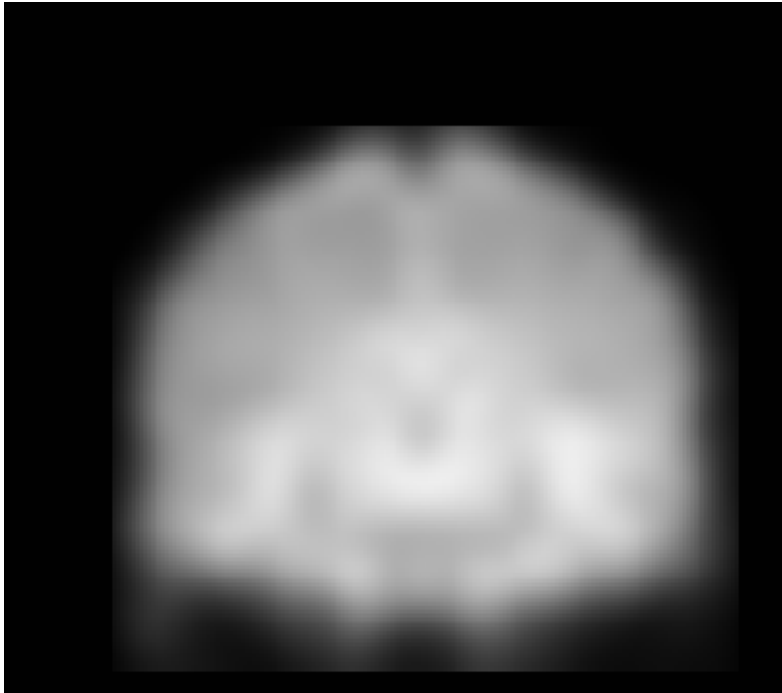


After registration





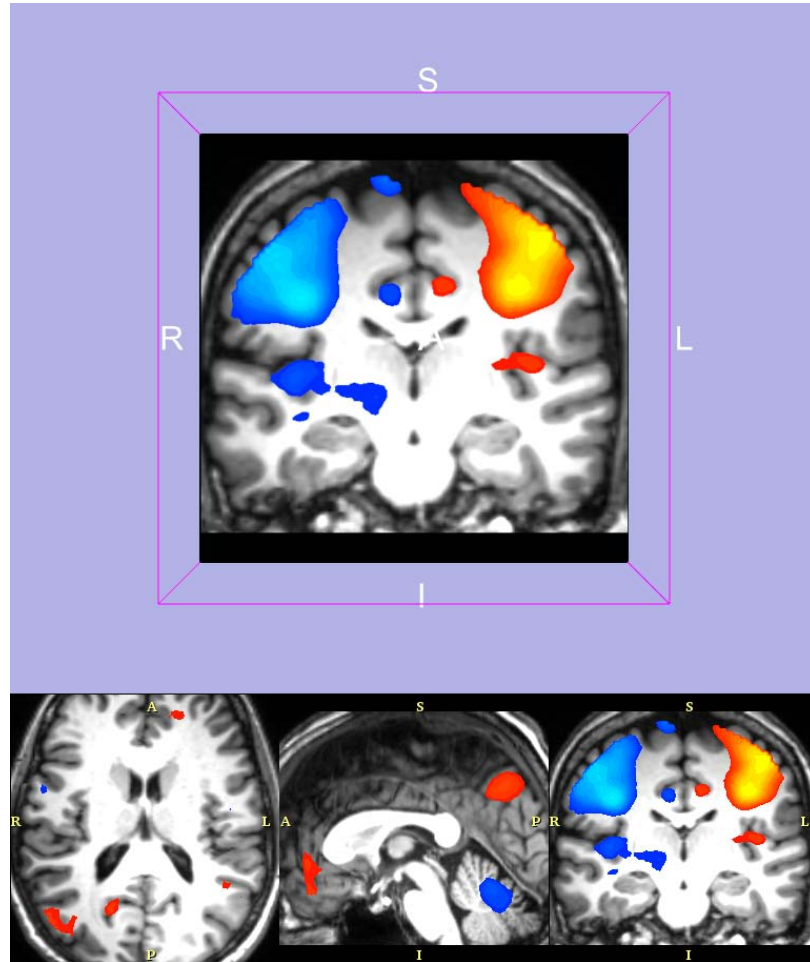
Data Fusion



Example: Registration of high-resolution anatomical and functional datasets to improve localization of findings for fMRI analysis



Mapping the brain and its function



fMRI activation map
superimposed on the
anatomical images



Multimodal MRI Data Fusion

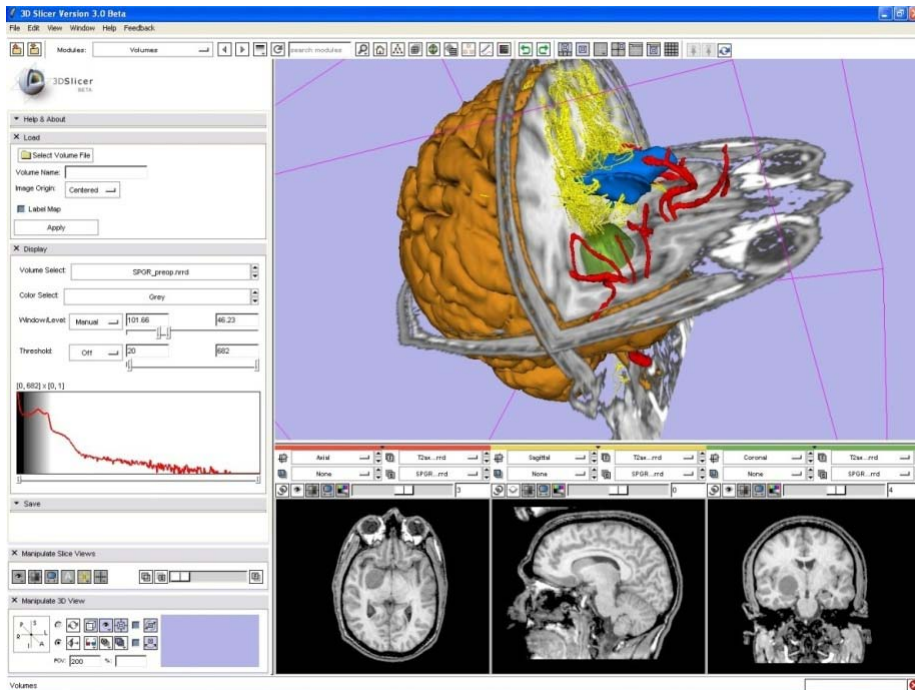


Image courtesy of Steve Pieper, Ph.D.

Clinical perspectives

- Integrated visualization from various imaging modalities
- Enhanced assessment of the clinical situation
- Better evaluation of treatment options



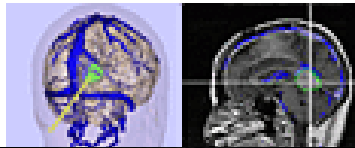
3D Navigation in the brain



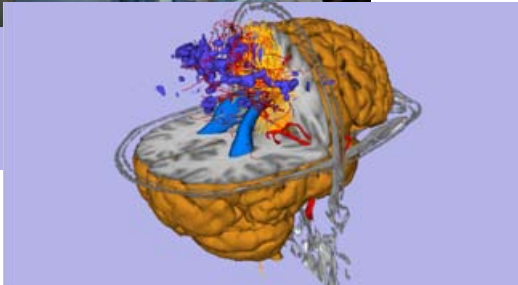
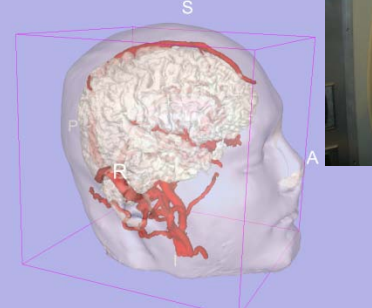
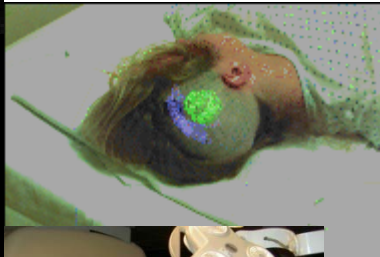
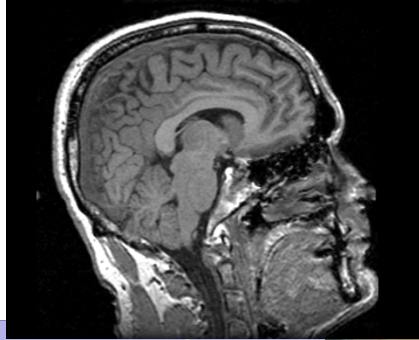
Courtesy of Ferenc Jolesz, MD, Brigham and Women's Hospital, Boston



Computer-assisted navigation



Images Courtesy of CSAIL, MIT

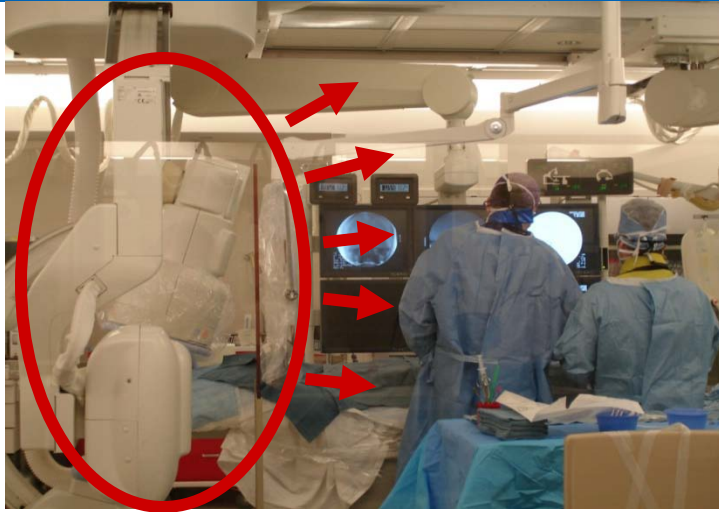


Images courtesy of Ferenc Jolesz, MD, Steve Pieper, PhD, Brigham and Women's Hospital, Boston

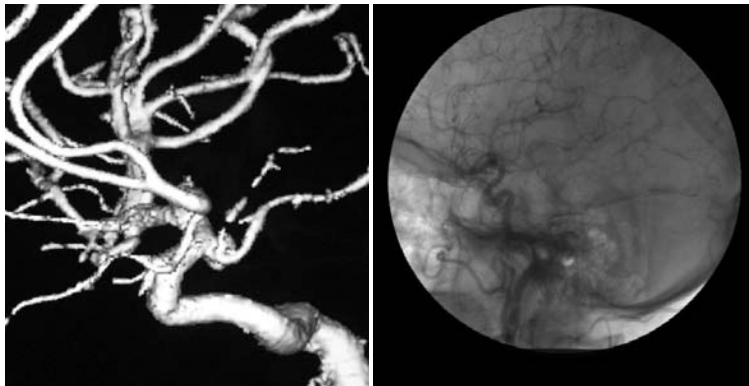
- Computer-assisted stereotactic neurosurgery
- Improvement of surgical accuracy
- Faster & safer procedures



Neurointerventions



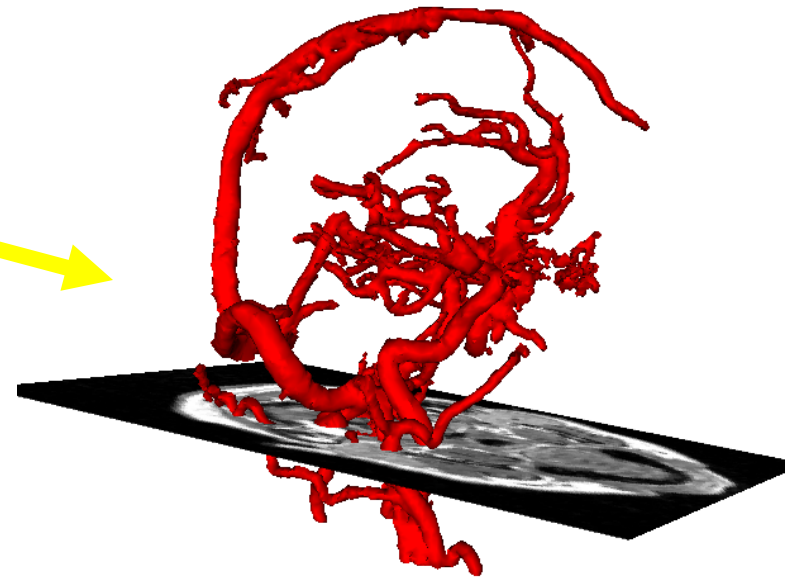
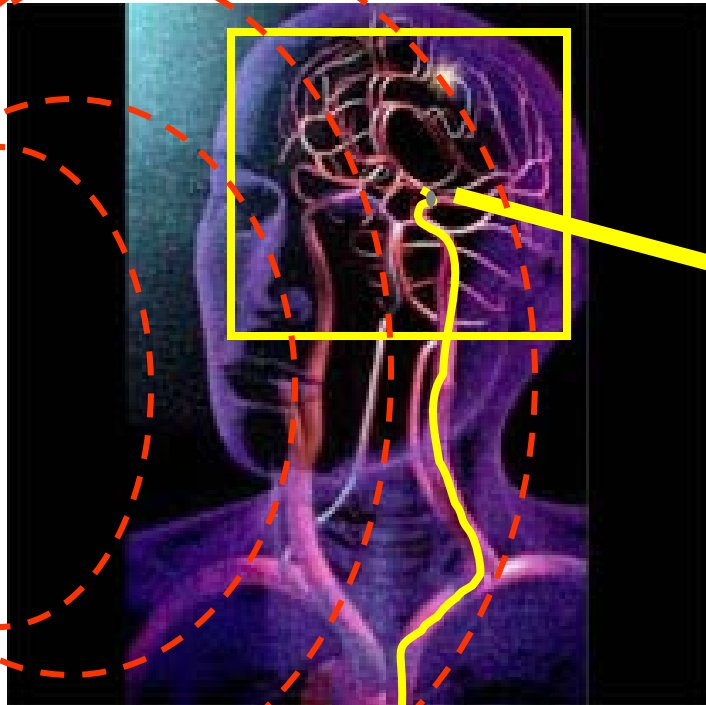
- Patient radiation exposure
- Clinician radiation exposure
- Projective imaging of complex cerebral vasculature



Kai Frerichs M.D., Sonia Pujol, Ph.D.
Brigham and Women's Hospital

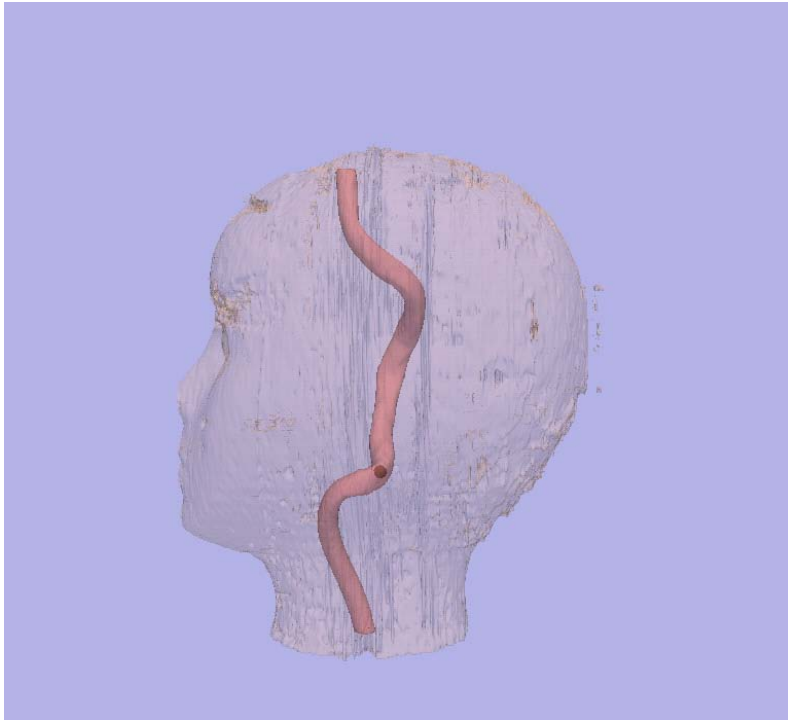


Neurovascular Navigation





Neurovascular Navigation

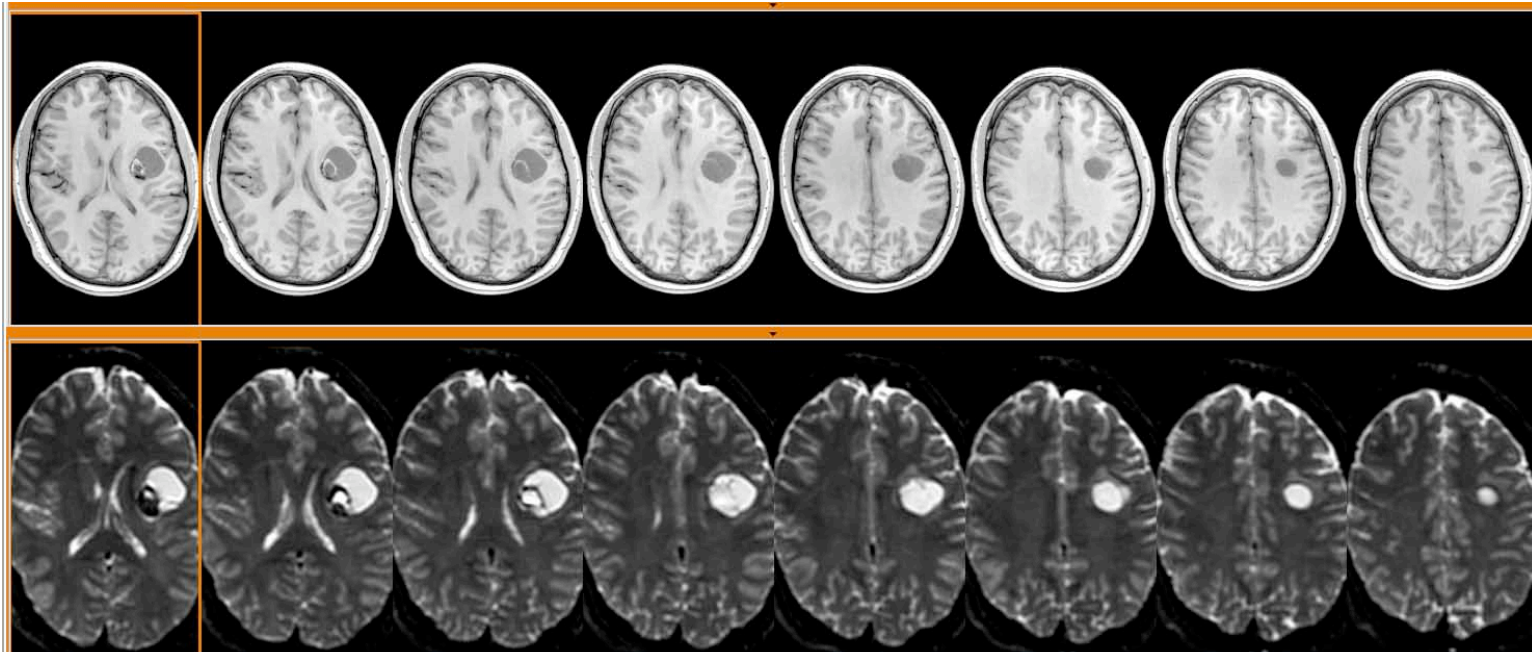


- 3D roadmapping
- Reduced radiation exposure for patient and clinician
- Real-time 3D data fusion



Example: A Clinical Case

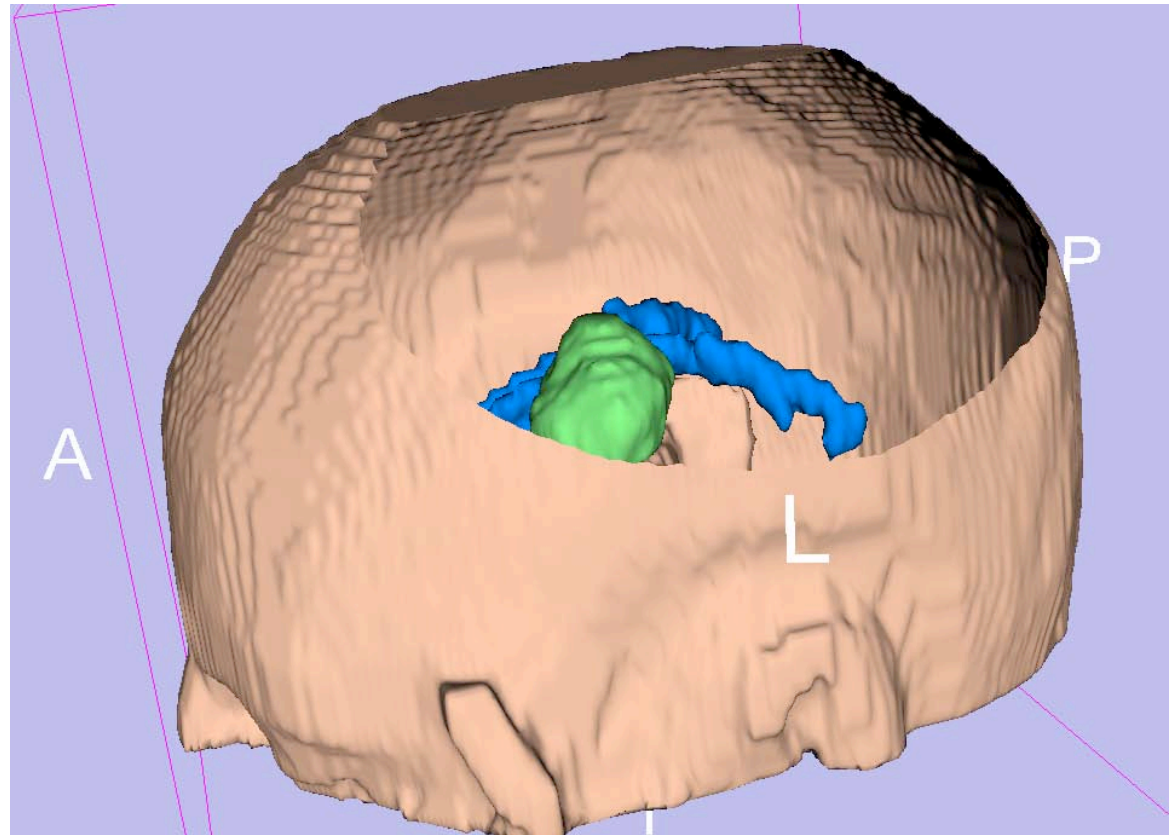
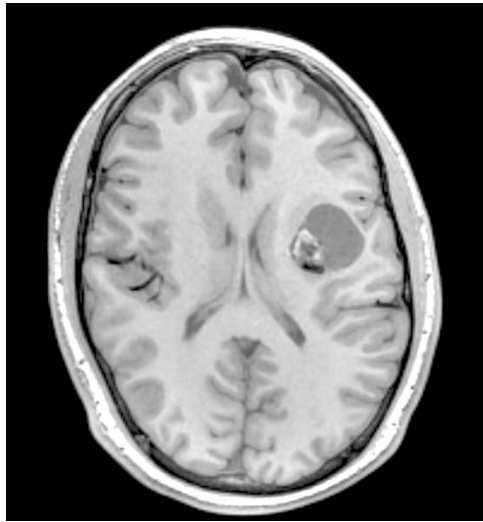
- Right handed male patient, 20 years old.
- Scan of the head after sport trauma



Courtesy of Alexandra Golby, MD, Peter Black, MD, Ron Kikinis, MD
Brigham and Women's Hospital, Boston, MA



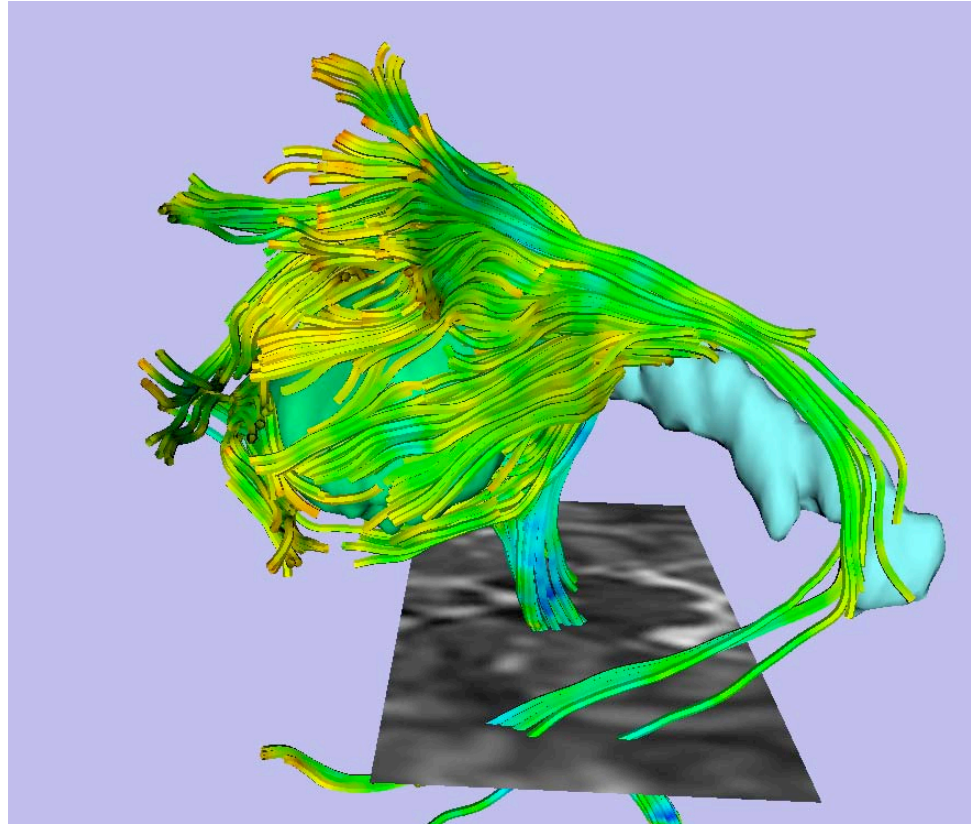
A Clinical Case: Overview



Courtesy of Alexandra Golby, MD, Peter Black, MD, Ron Kikinis, MD
Brigham and Women's Hospital, Boston, MA



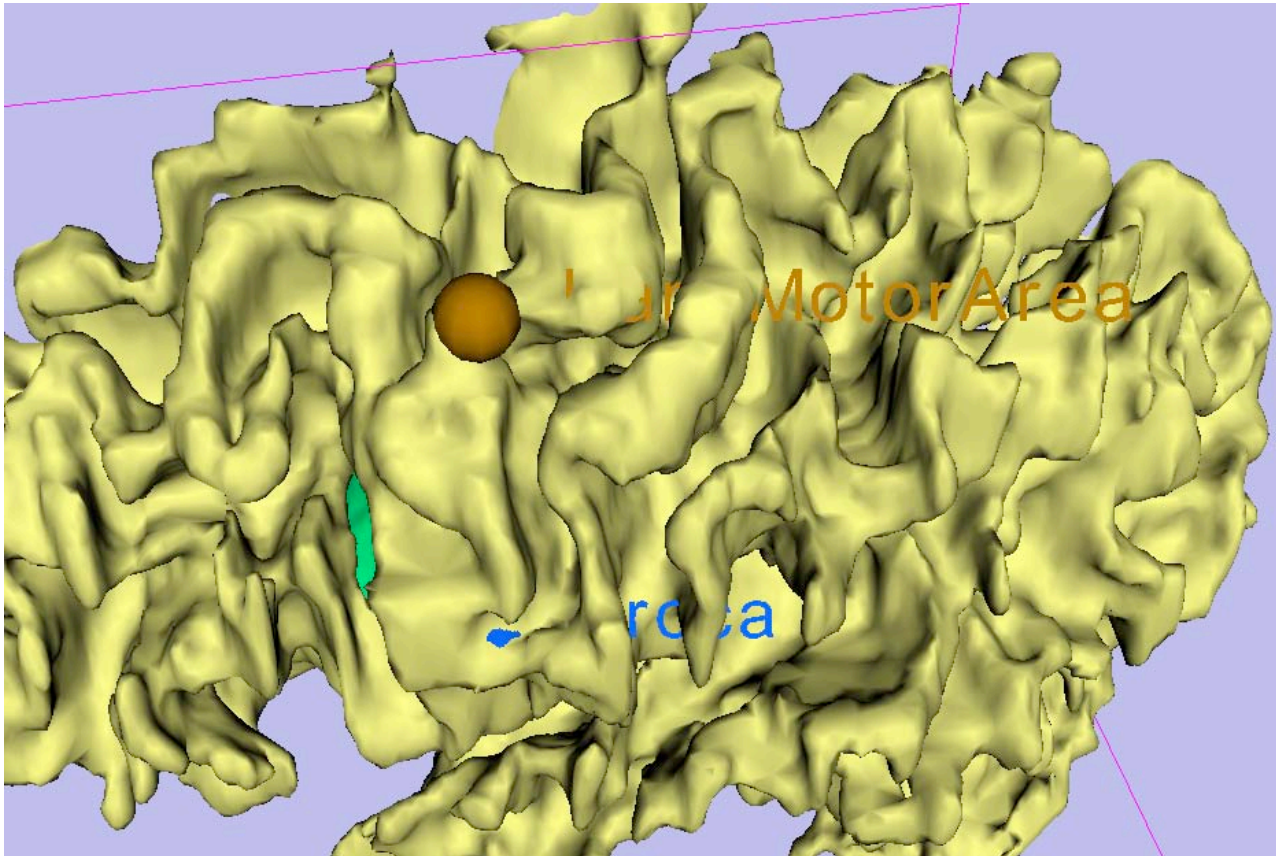
Peritumoral Tracts



Courtesy of Alexandra Golby, MD, Peter Black, MD, Ron Kikinis, MD
Brigham and Women's Hospital, Boston, MA



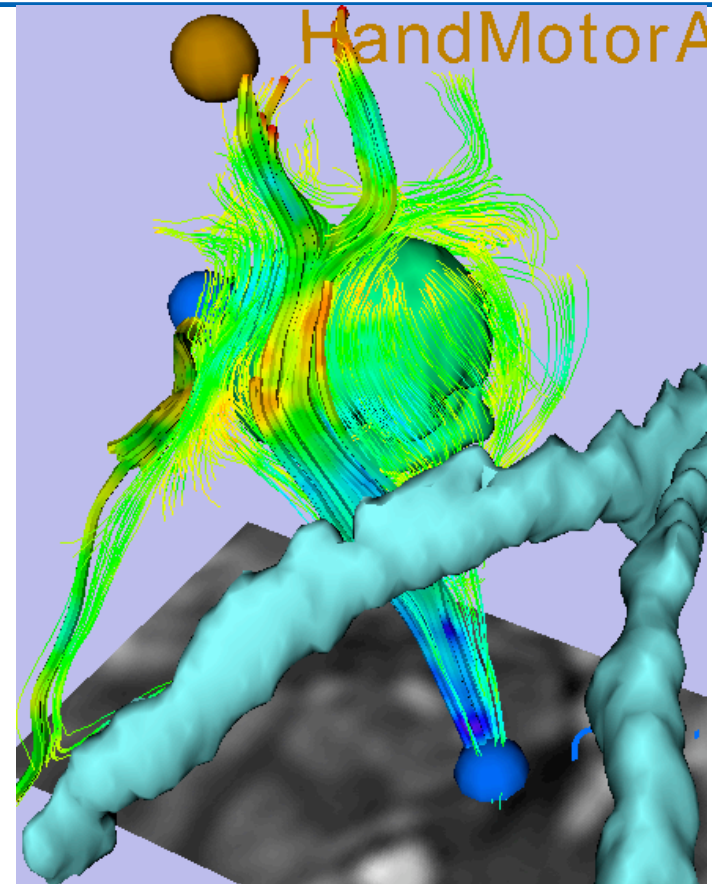
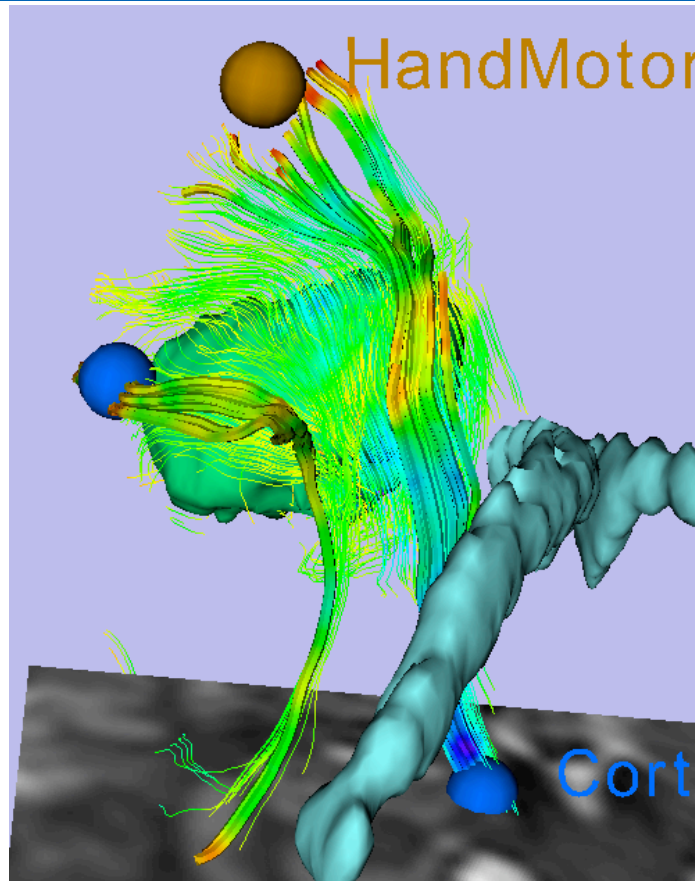
White Matter Surface



Courtesy of Alexandra Golby, MD, Peter Black, MD, Ron Kikinis, MD
Brigham and Women's Hospital, Boston



Virtual Probing



Courtesy of Alexandra Golby, MD, Peter Black, MD, Ron Kikinis, MD
Brigham and Women's Hospital, Boston, MA



Neurosurgical Navigation

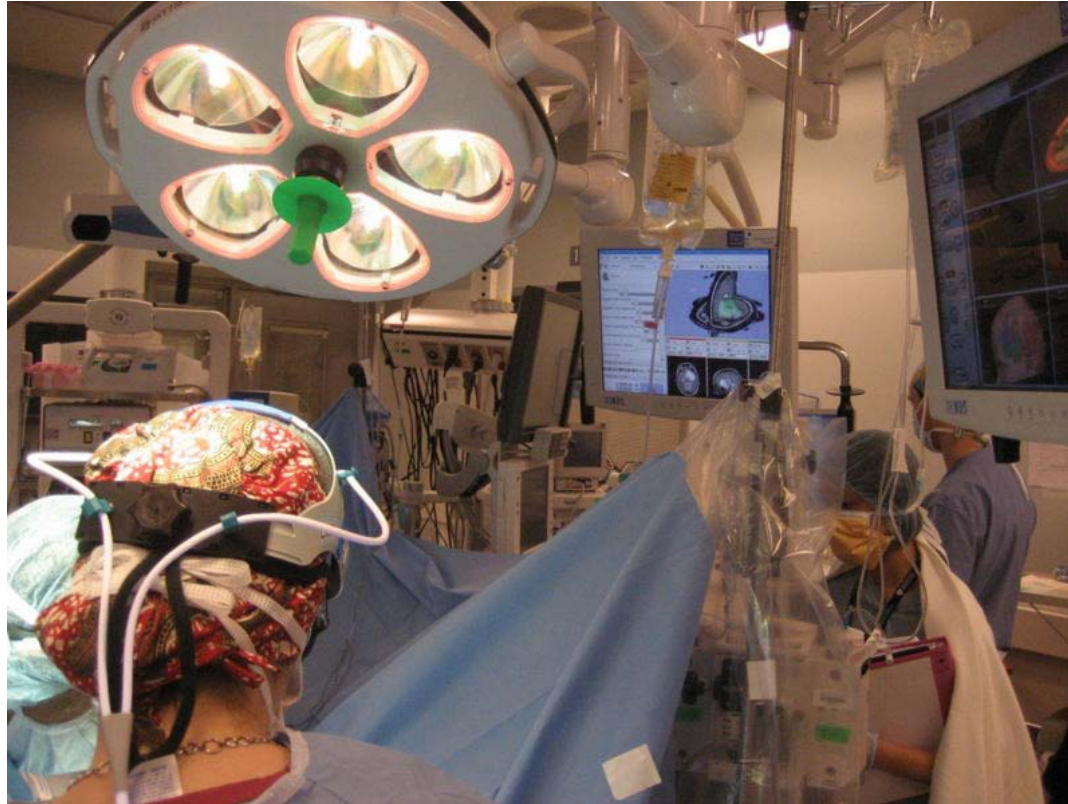


Anatomic and functional brain mapping in areas surrounding brain tumors

Courtesy of Alexandra Golby, MD, Noby Hata, PhD, and Haying Lui, MSE. Brigham and Women's Hospital, Boston



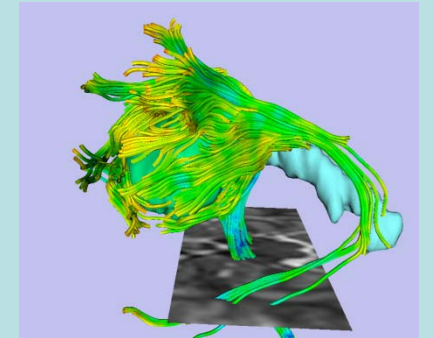
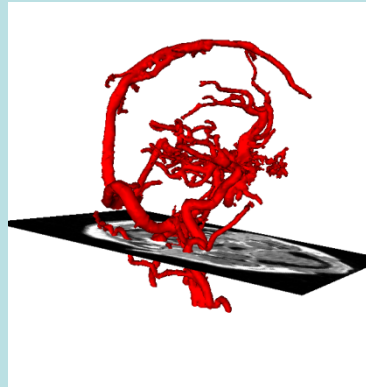
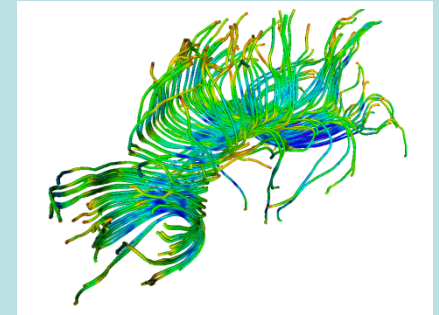
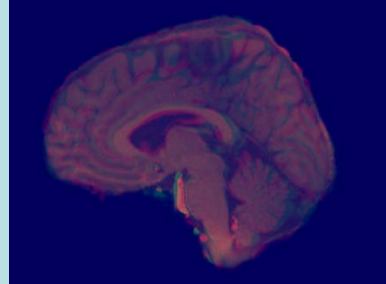
Neurosurgical Navigation



Courtesy of Alexandra Golby, MD, Nobuyuki Hata, PhD, Haying Lui, MSE. Brigham and Women's Hospital, Boston, MA

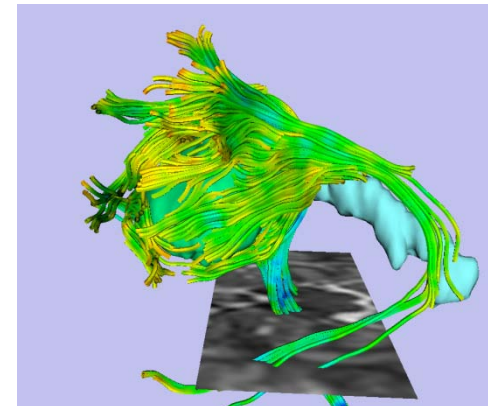
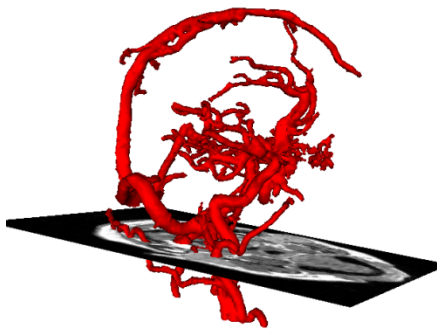
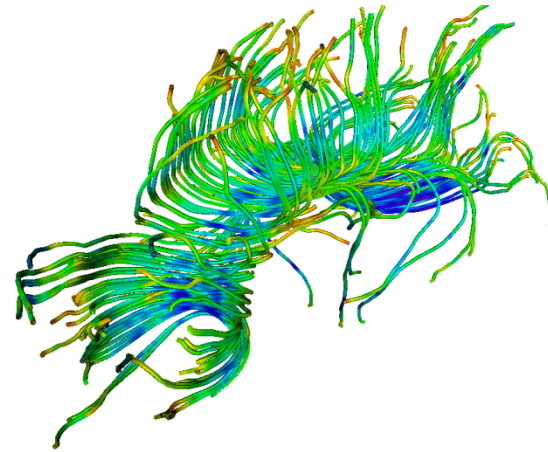
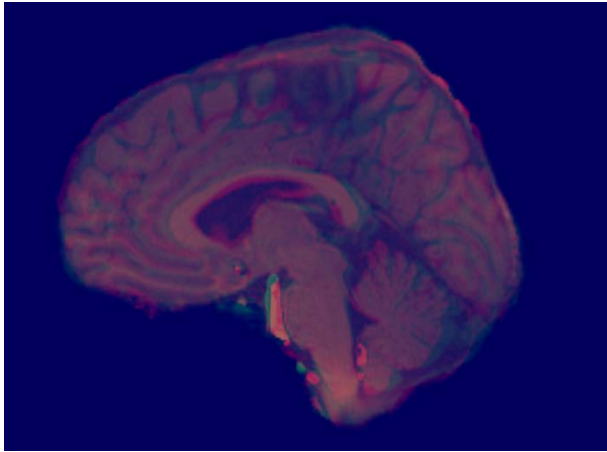


Validation





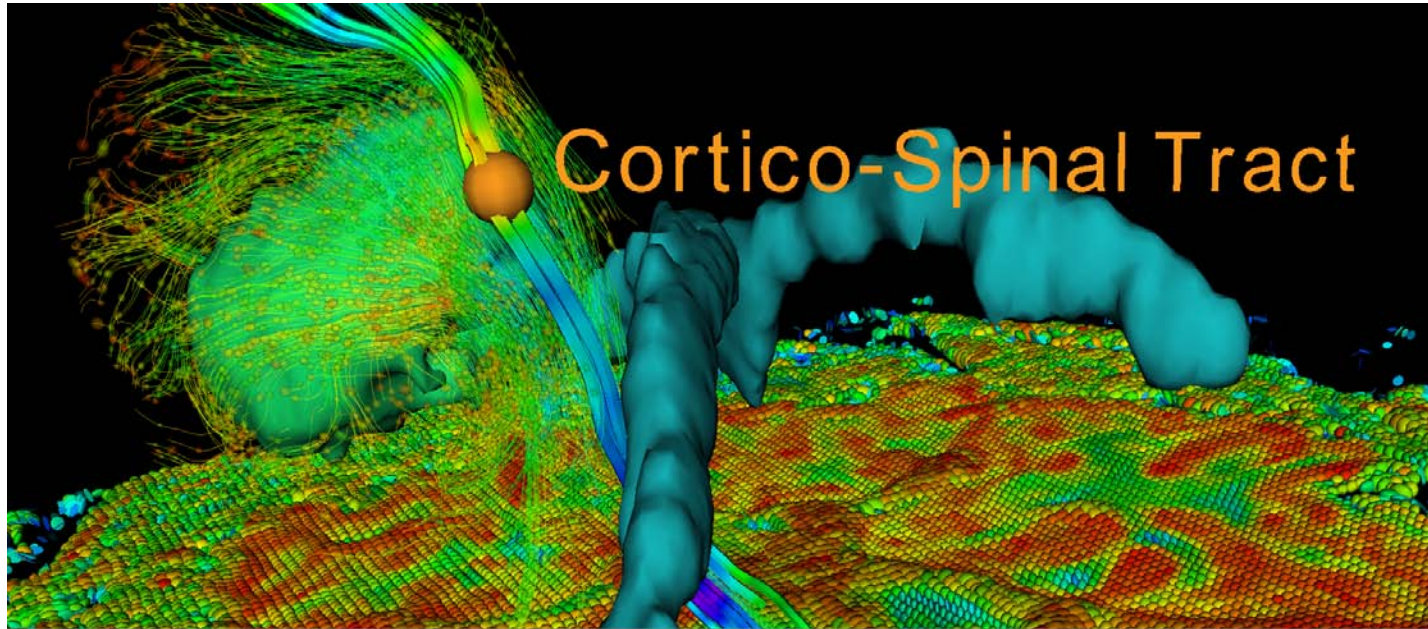
Validation



Golby, Black, Kikinis



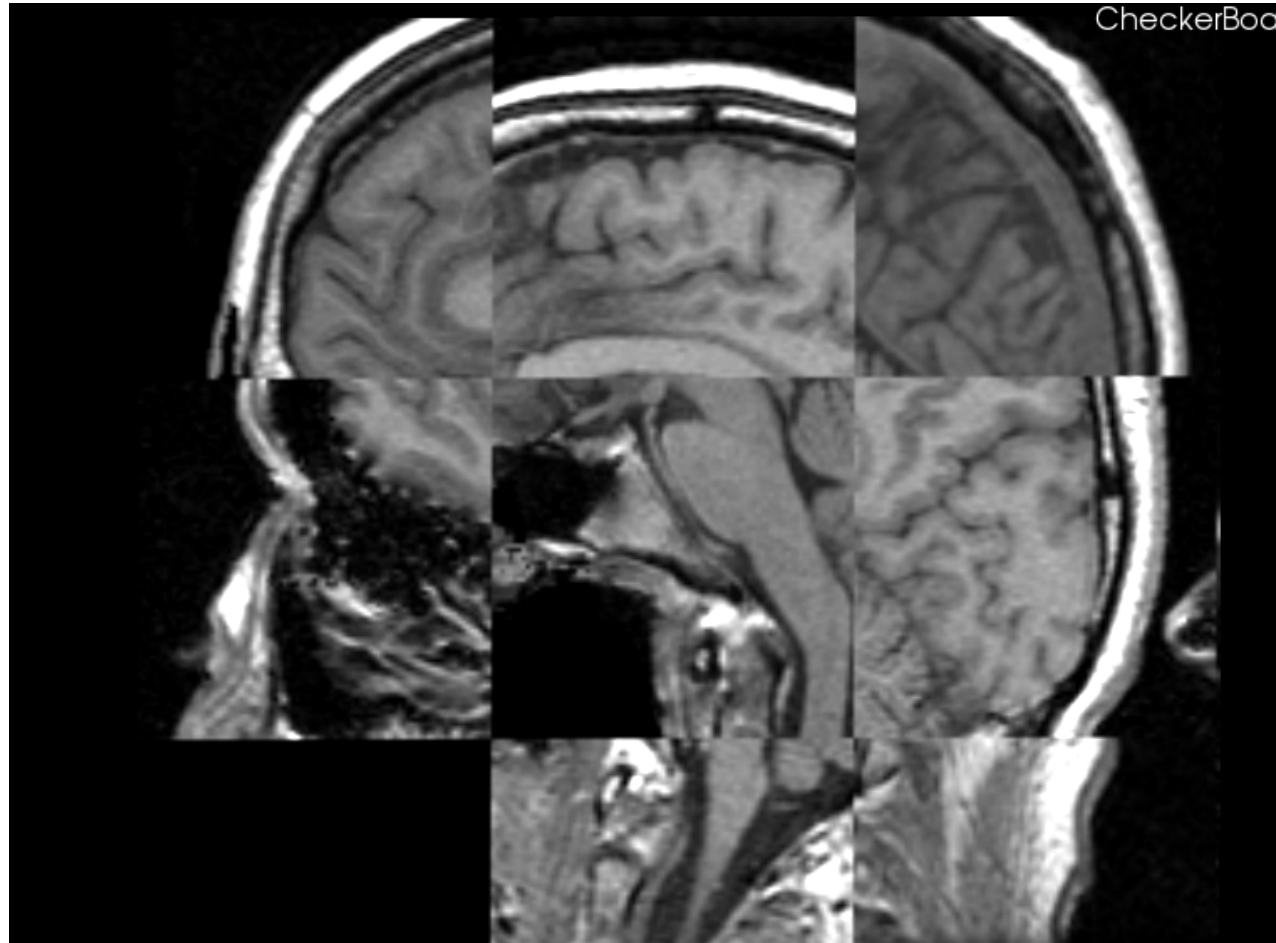
Validation



Courtesy of Alexandra Golby, MD, Jean-Jacques Lemaire, MD, PhD, Steve Pieper, PhD

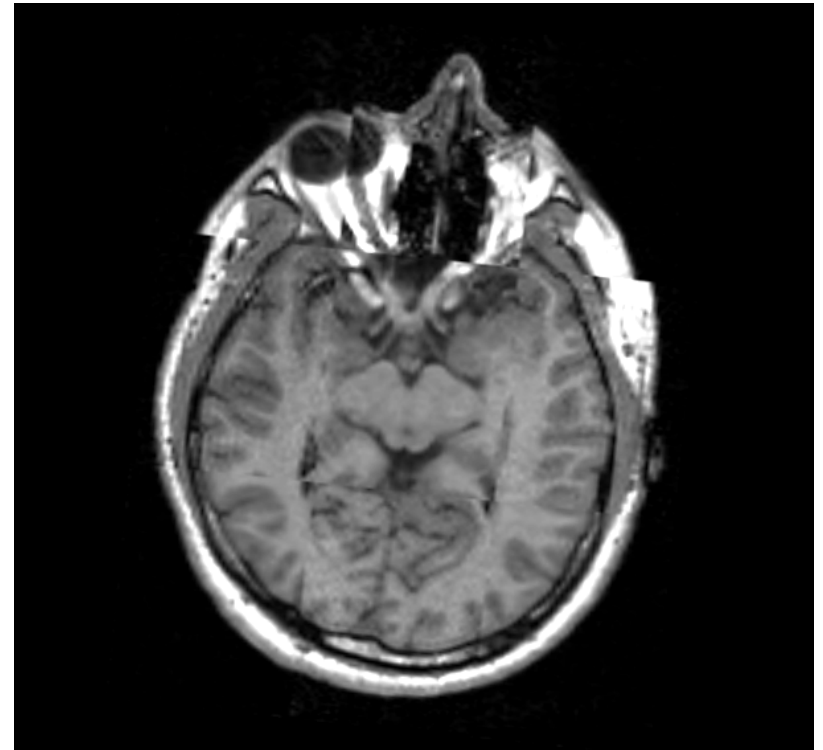
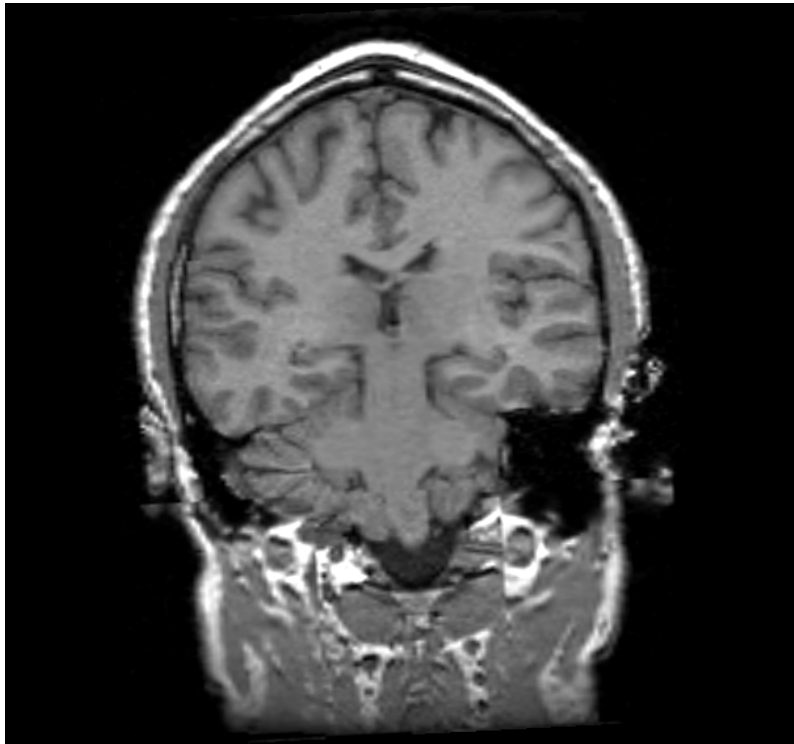


Mis-registration



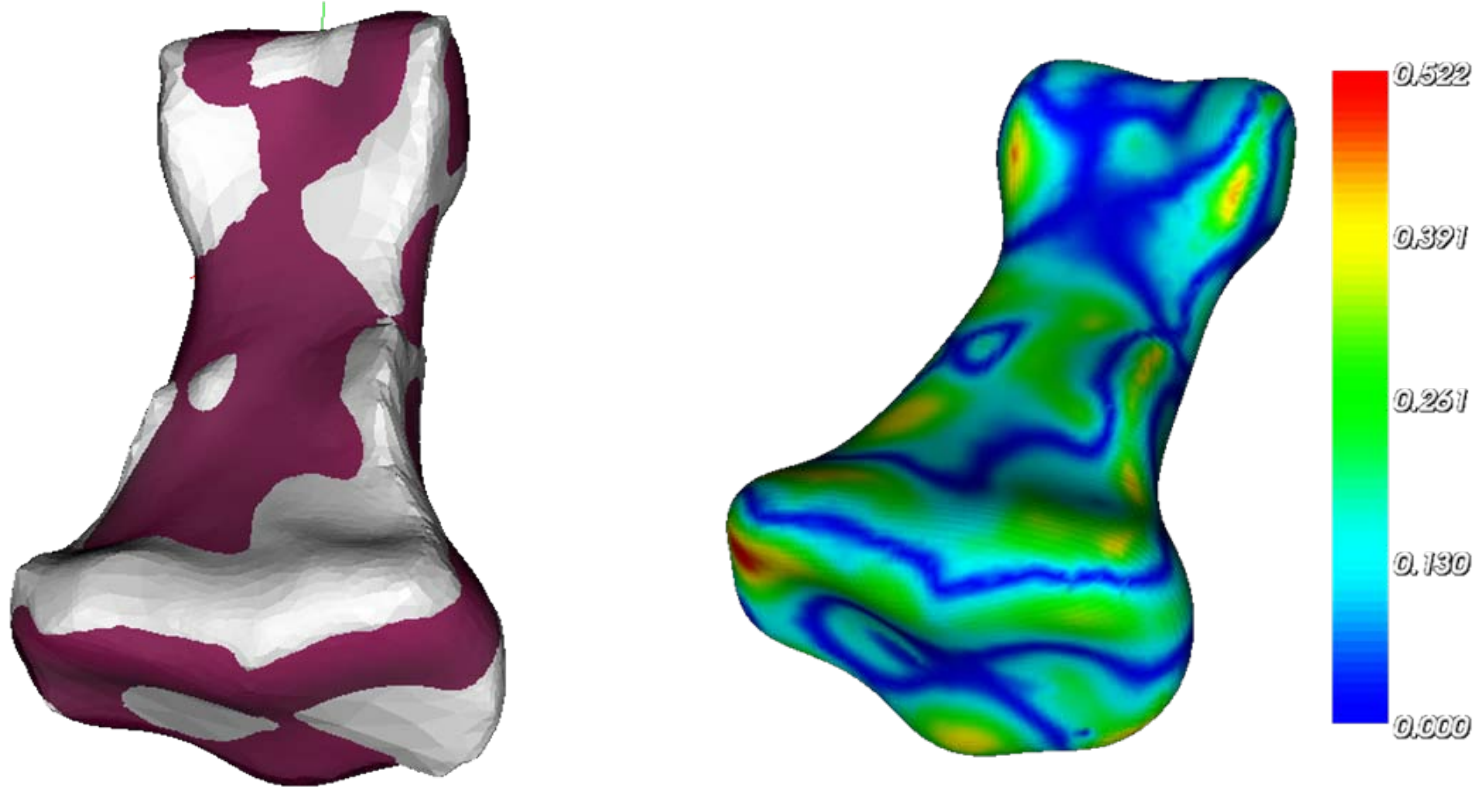


Registration Validation





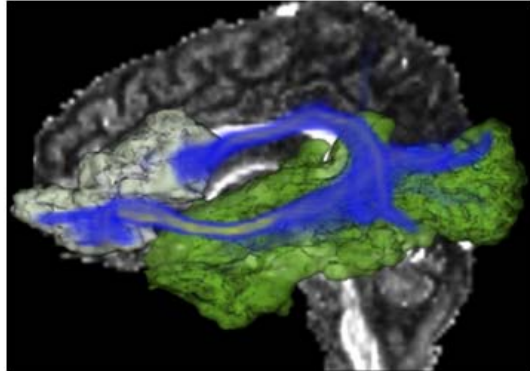
Surface Reconstruction Validation



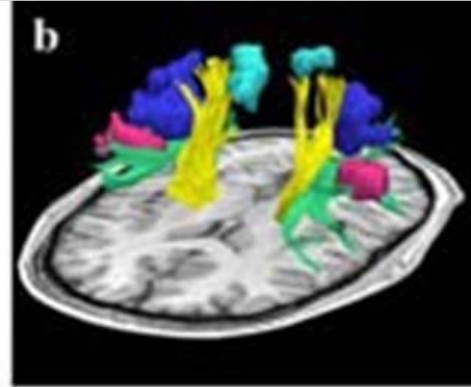
Courtesy of Nicole Grosland, PhD, Vincent Magnotta, PhD, Nicole DeVries, PhD,
The University of Iowa



Tractography Validation



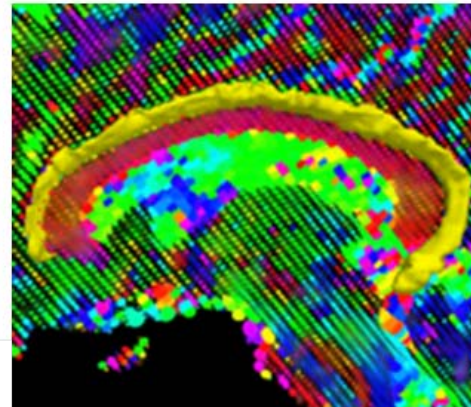
Courtesy of CF Westin, PNL-LMI



Courtesy of CF Westin, BWH-LMI



Courtesy of T. Fletcher &
R. Whitaker, SCI Utah

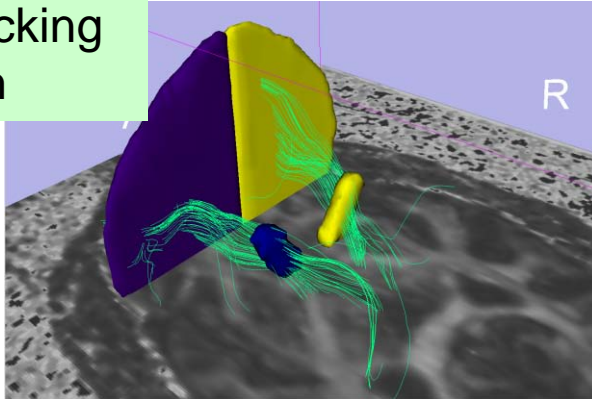


Courtesy of A. Tannenbaum,
Georgia Tech.

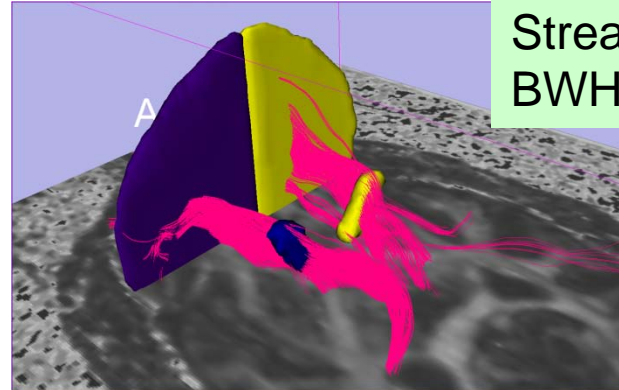


Tractography Validation

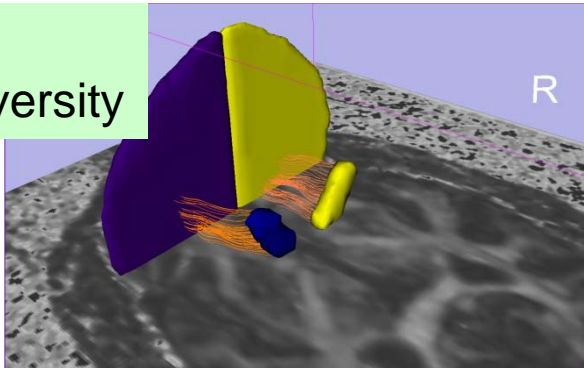
Fiber Tracking
SCI, Utah



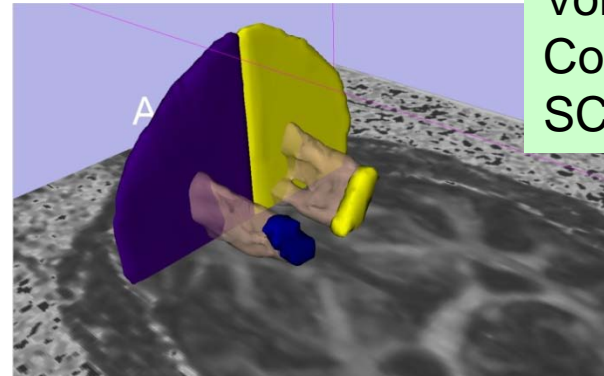
Streamline
BWH, Harvard



GTRACT
Iowa University



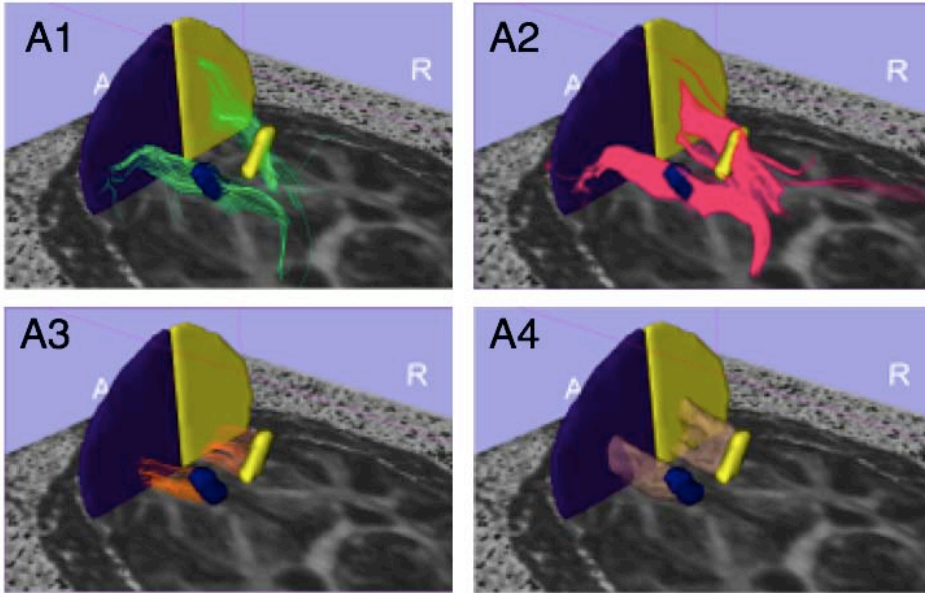
Volumetric
Connectivity
SCI, Utah



Preliminary results on the use of STAPLE for evaluating DT-MRI tractography in the absence of ground truth. Pujol et al. ISMRM 2009.



Tractography Validation



Preliminary results on the use of STAPLE for evaluating DT-MRI tractography in the absence of ground truth. Pujol et al. ISMRM 2009.

- Evaluation of the sensitivity and specificity of tractography algorithms
- Quantitative analysis of fiber bundles



Conclusion

- 3D Visualization of anatomy and function
- Multimodal data fusion
- Computer-assisted surgical Navigation
- Importance of validation



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