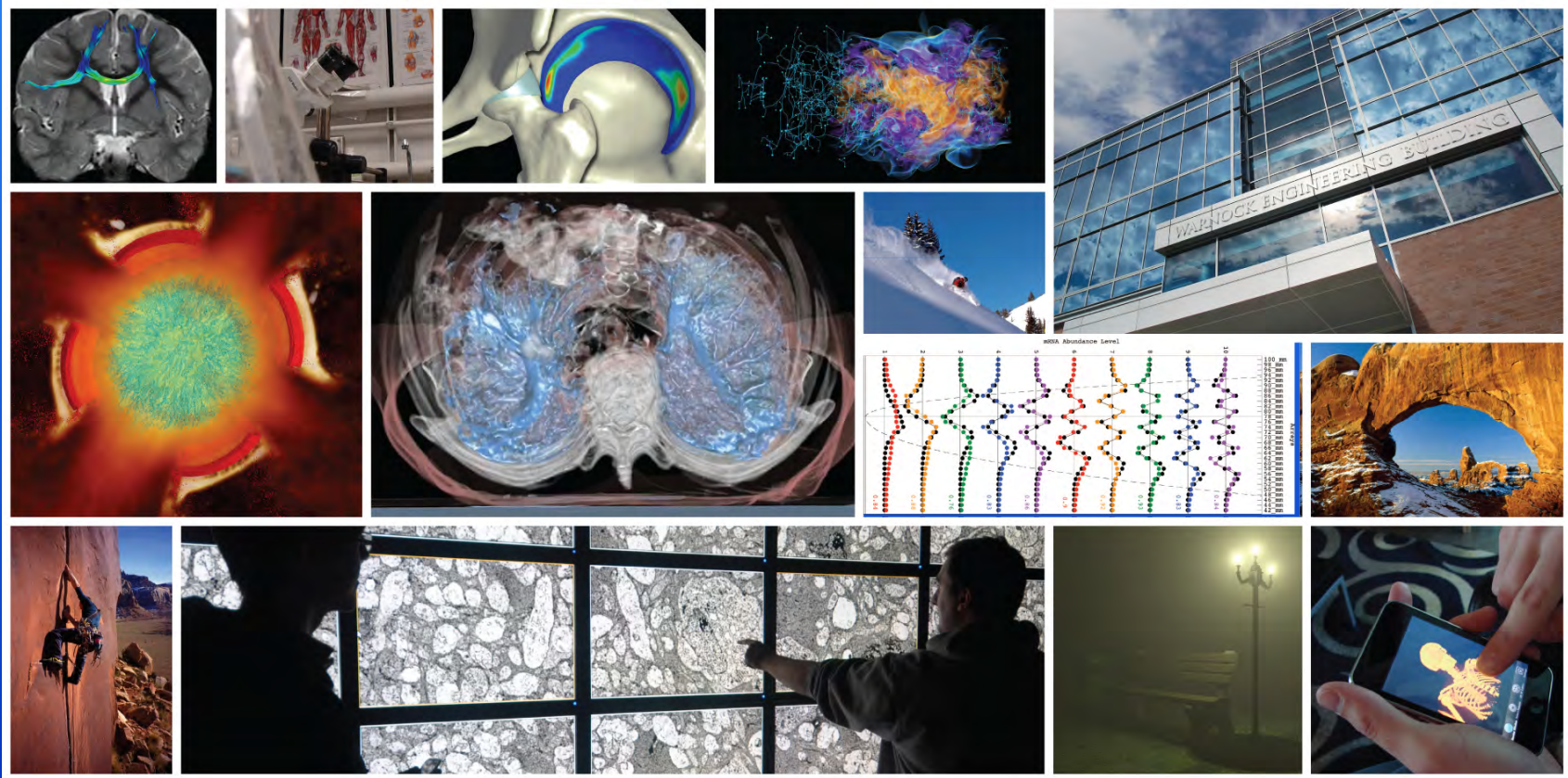


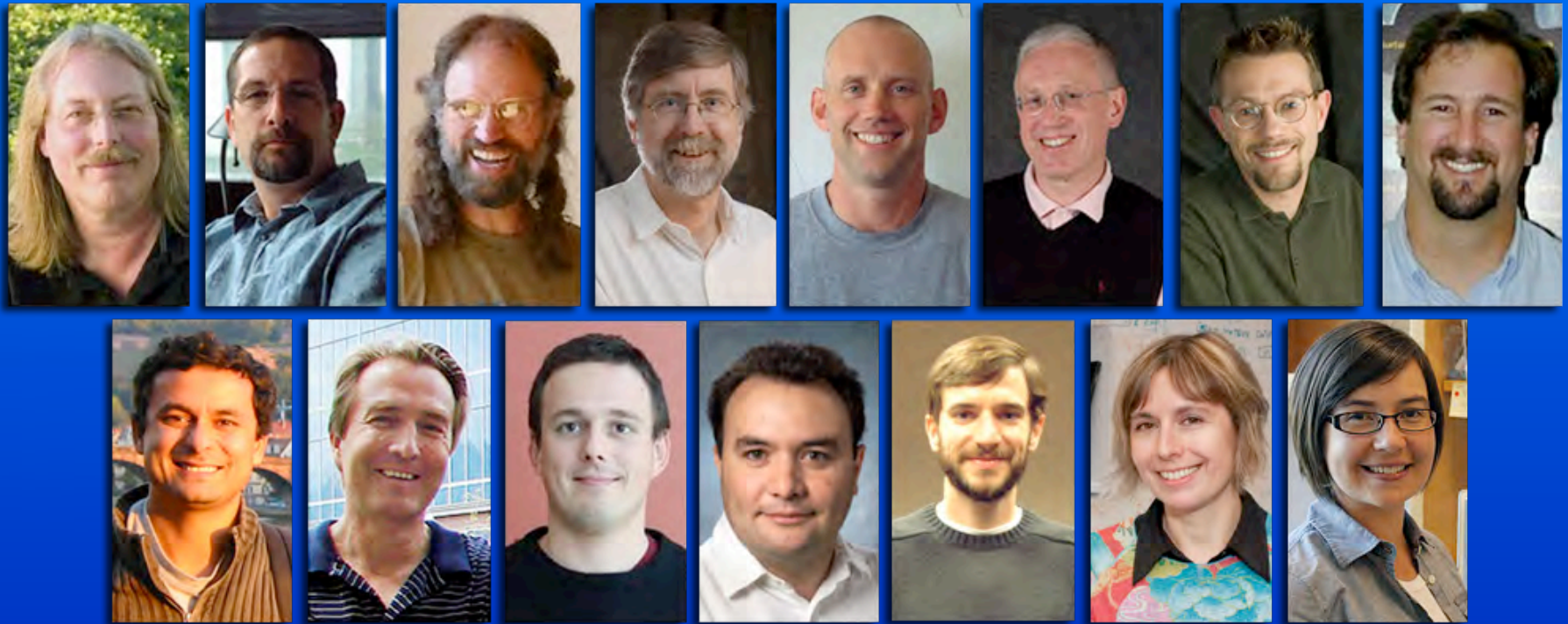
# Large Scale Biomedical Visualization



**Chris Johnson**  
**Scientific Computing and Imaging Institute**  
**University of Utah**

# SCI Institute Faculty

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# Image-Based Modeling, Simulation, and Visualization



Image & Data Acquisition

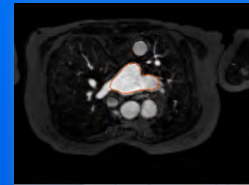


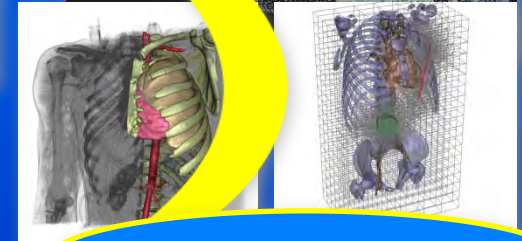
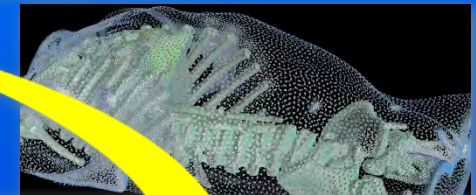
Image Processing



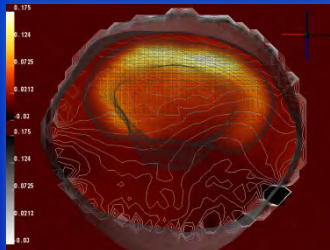
Lab/Clinic



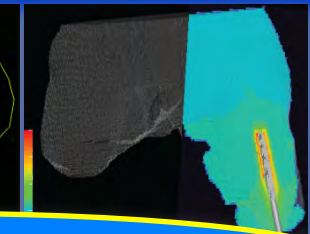
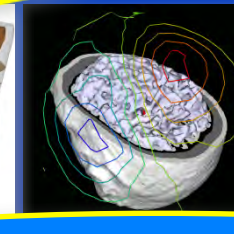
Integrated Software Tools



Geometry Processing



Visualization



Modeling, Simulation & Validation





# CIBC Software Infrastructure



**SCIRun** is a modular dataflow programming Problem Solving Environment (PSE). SCIRun has a set of Modules that perform specific functions on a data stream. Each module reads data from its input ports, calculates the data, and sends new data from output ports.

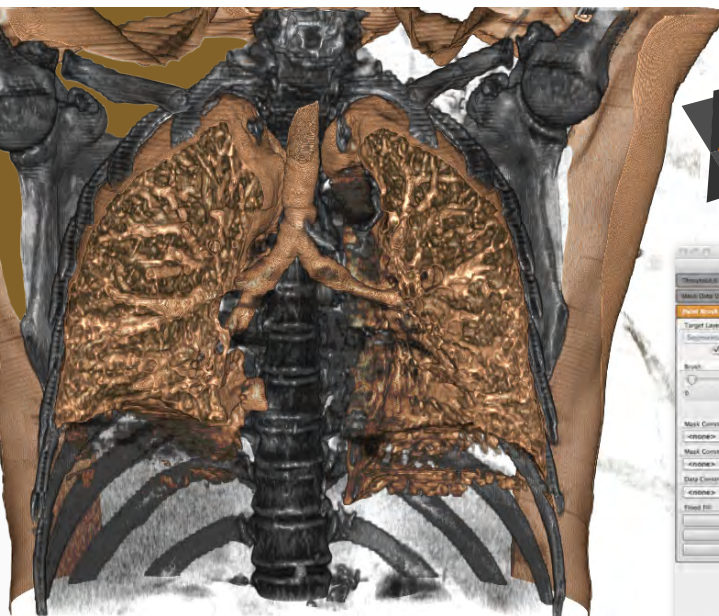
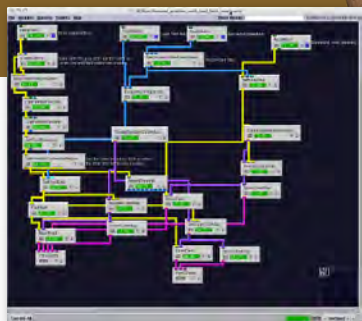
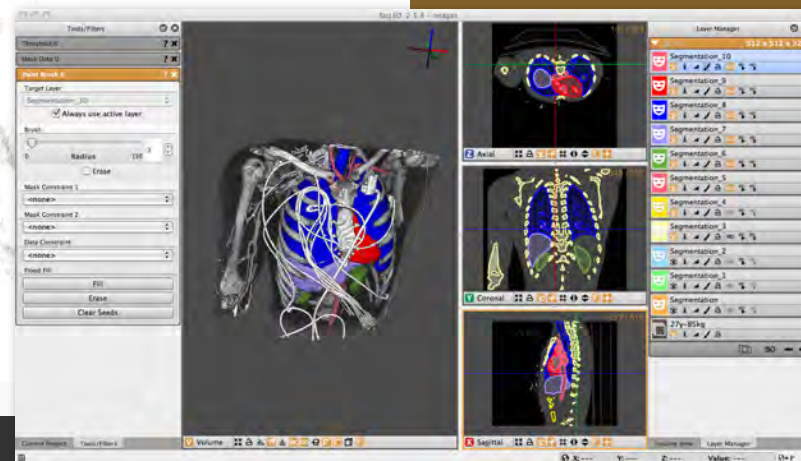


Image: Burak Erem



## Seg3D2

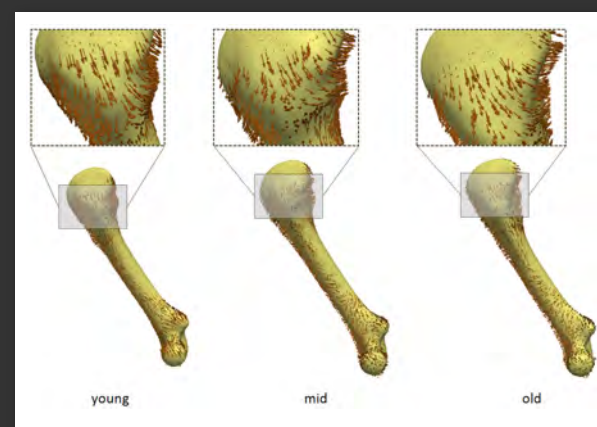
**Seg3d2** is a recent redesigned volume segmentation and processing tool that combines a flexible manual segmentation interface with powerful higher-dimensional image processing and segmentation algorithms from the Insight Toolkit. Users can easily explore and label image volumes using volume rendering and orthogonal slice view windows.



**BioMesh3D** is a tetrahedral mesh generator for multi-material quality meshes out of segmented biomedical image data. The BioMesh3D program uses a particle system to distribute nodes on the separating surfaces that separate the different materials and then uses the TetGen software package to generate a full tetrahedral mesh. A client server interface is available to guide the user through the process of building a mesh. Because building a high quality mesh often requires a lot of computation, this application allows the user to connect to the SCI facility servers for computing their meshes.



The **ShapeWorks** software makes available a method for constructing compact statistical point-based models of ensembles of similar shapes that does not rely on any specific surface parameterization. The method requires very little preprocessing or parameter tuning, and is applicable to a wide range of shape analysis problems, including nonmanifold surfaces and objects of arbitrary topology. Tools are available for preprocessing data, computing pointbased shape models, and visualizing the results.





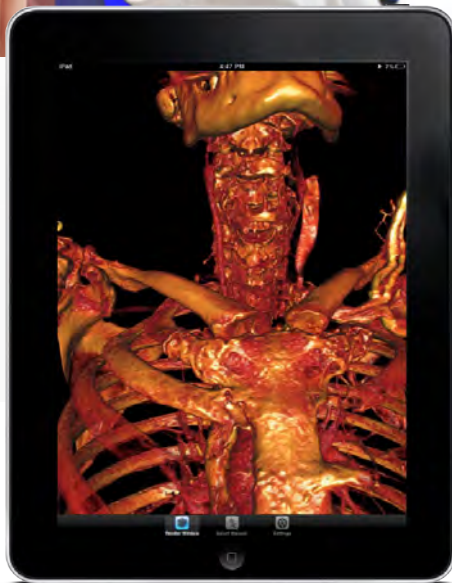
# CIBC Software Infrastructure



Handheld devices have become a ubiquitous means of interacting with personal data. Expanding their use for interacting with complex rendered volume data means that scientists can now explore data with just their mobile device. Shown here, users interacting with the ImageVis3d volume renderer running on a large display wall using a tablet PC and iPhone. The large visualization changes in real time based on interactions on the mobile device.



ImageVis3D is a new volume rendering program developed by the NIH/NCRR Center for Integrative Biomedical Computing (CIBC). The main design goals of ImageVis3D are: simplicity, scalability, and interactivity. Simplicity is achieved with a new user interface that gives an unprecedented level of flexibility (as shown in the images). Scalability and interactivity for ImageVis3D mean that both on a notebook computer as well as on a high end graphics workstation, the user can interactively explore terabyte sized data sets. Finally, the open source nature as well as the strict component-by-component design allow developers not only to extend ImageVis3D itself but also reuse parts of it, such as the rendering core. This rendering core for instance is planned to replace the volume rendering subsystems in many applications at the SCI Institute and with our collaborators.



Center for Integrative Biomedical Computing



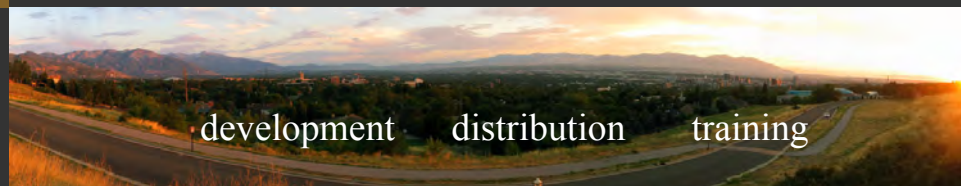
## Scientific Software Solutions

The Center for Integrative Biomedical Computing (CIBC) is dedicated to producing open-source software tools for biomedical image-based modeling, biomedical simulation and estimation, and the visualization of biomedical data. The Center works closely with software users and collaborators in a range of scientific domains to produce user-optimized tools and provides advice, technical support, workshops, and education to enhance user success. Biological projects and collaborations drive our development efforts, all with a single unifying vision: to develop the role of image-based modeling and analysis in biomedical science and clinical practice.



Center for Integrative  
Biomedical Computing  
72 S Central Campus Drive  
Room 3850  
Salt Lake City, UT 84112  
Phone: 801-585-1867

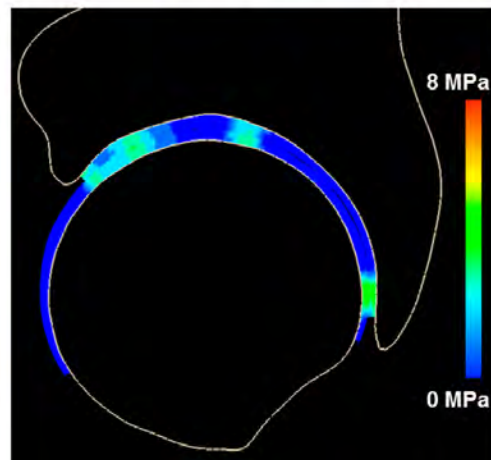
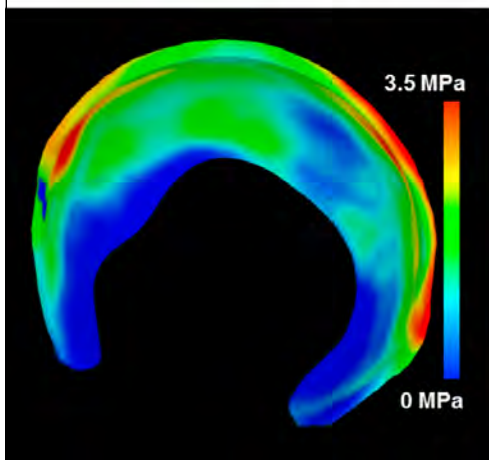
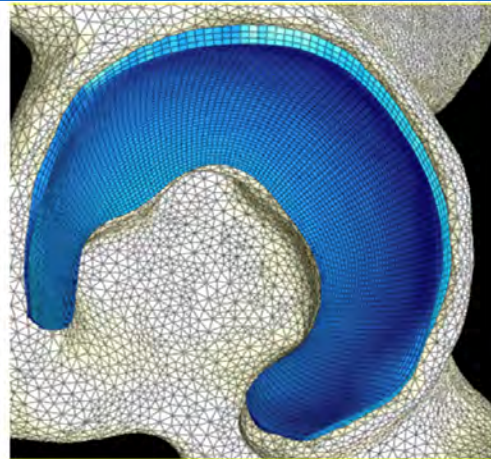
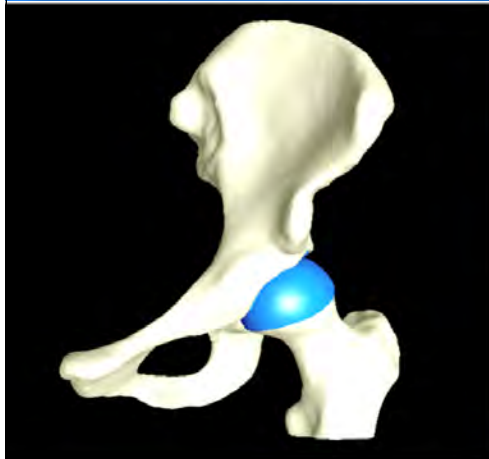
Chris Johnson - PI, Director - [crj@sci.utah.edu](mailto:crj@sci.utah.edu)  
Rob MacLeod - PI, Co-Director - [macleod@sci.utah.edu](mailto:macleod@sci.utah.edu)  
Ross Whitaker - PI - [whitaker@sci.utah.edu](mailto:whitaker@sci.utah.edu)  
Dana Brooks - PI - [brooks@ece.neu.edu](mailto:brooks@ece.neu.edu)  
Greg Jones - Executive Administrator - [greg@sci.utah.edu](mailto:greg@sci.utah.edu)  
Elizabeth Jurrus - Technical Manager - [liz@sci.utah.edu](mailto:liz@sci.utah.edu)



development distribution training

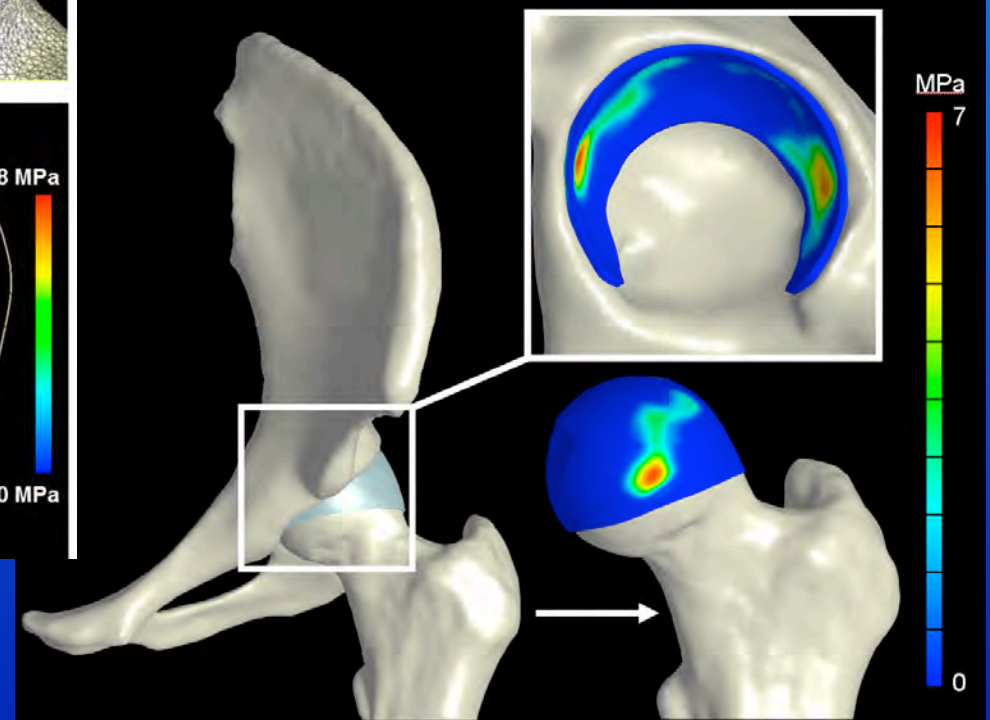


# Simulate Stresses in the Articular Cartilage of Normal and Dysplastic Hips During Activities of Daily Living



## Hip Biomechanics Pipeline:

- CT Scan
- Segmentation
- Mesh Generation
- FE Simulation
- Visualization and Evaluation

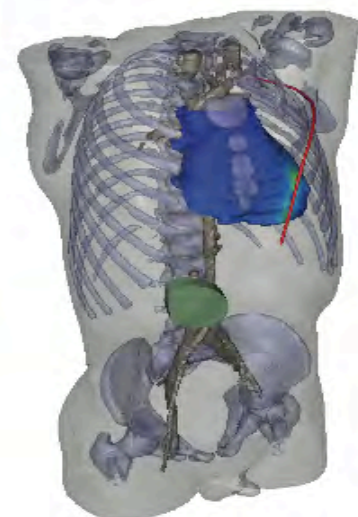
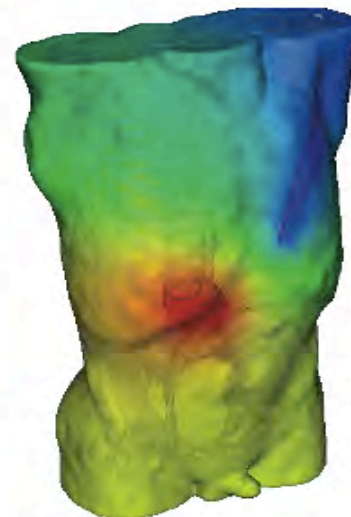
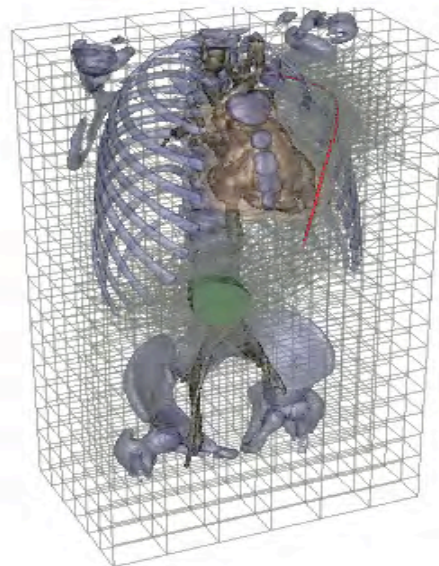
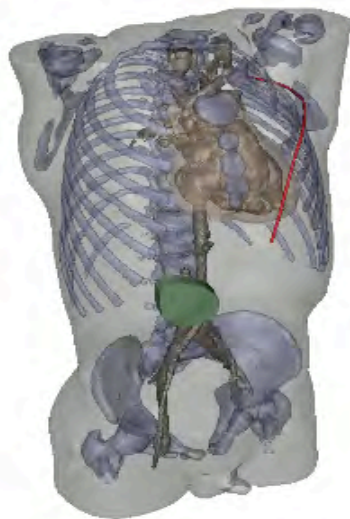
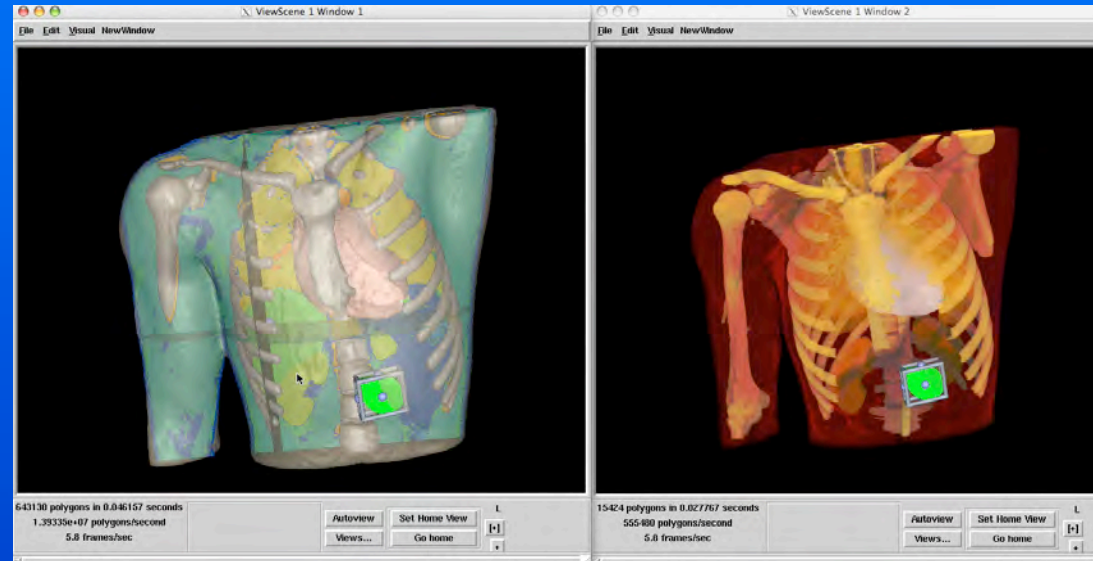


Normal Hip Pressures due to Walking



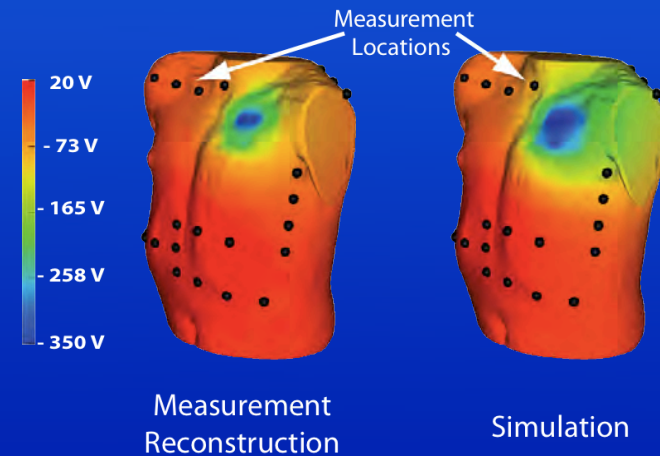
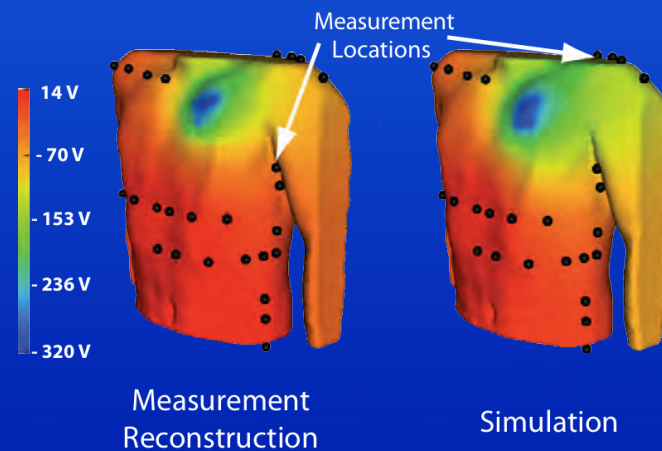
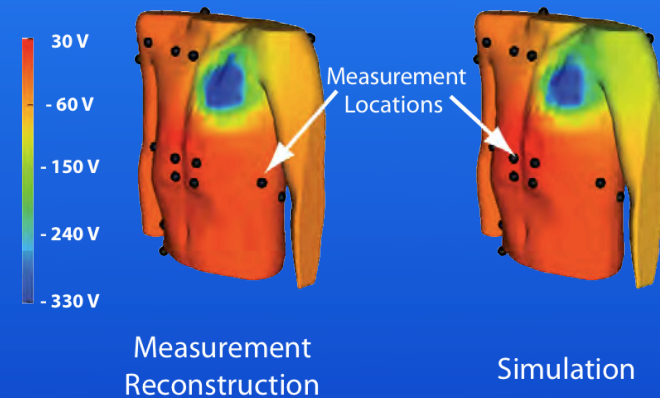
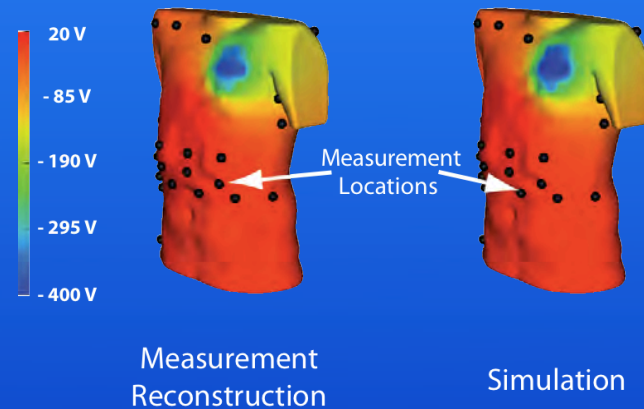
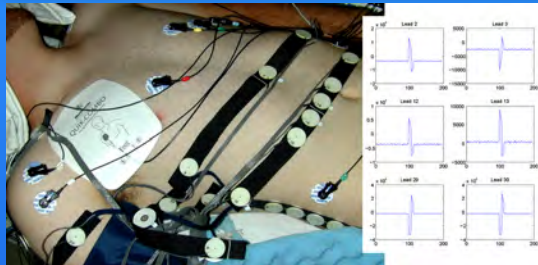
# Personalized Medicine: Cardiac Defibrillation

## Image-Based Modeling, Simulation, and Visualization Pipeline





# Defibrillation Simulation Results





# Atrial Fibrillation Ablation

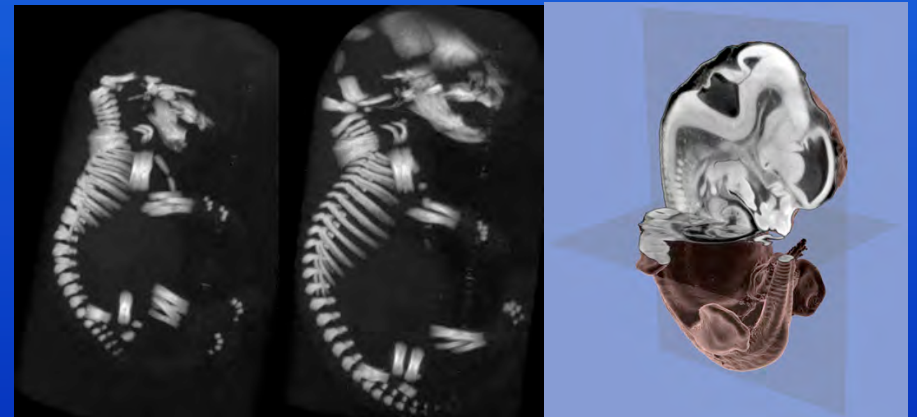
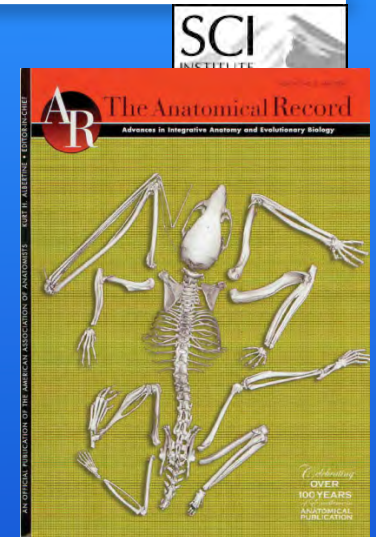
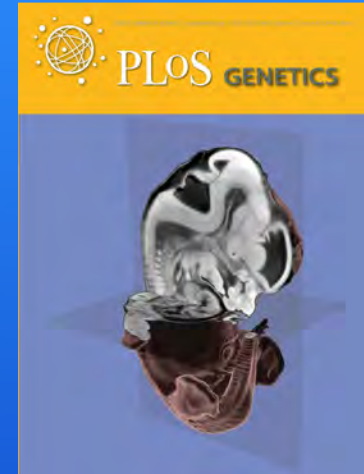


**Nassir Marrouche, M.D.**  
**Director, Comprehensive**  
**Arrhythmia Research and**  
**Management Center: CARMA**



# Genetics

Often, scientific breakthroughs stem from an enabling new technology



J.T. Johnson III, M.S. Hansen, I. Wu, L.J. Healy, C.R. Johnson, G.M. Jones, M.R. Capecchi, C. Keller.  
"Virtual Histology of Transgenic Mouse Embryos for High-Throughput Phenotyping,"  
In PLoS Genetics, Vol. 2, No. 1, pp. 471--477. April, 2006.

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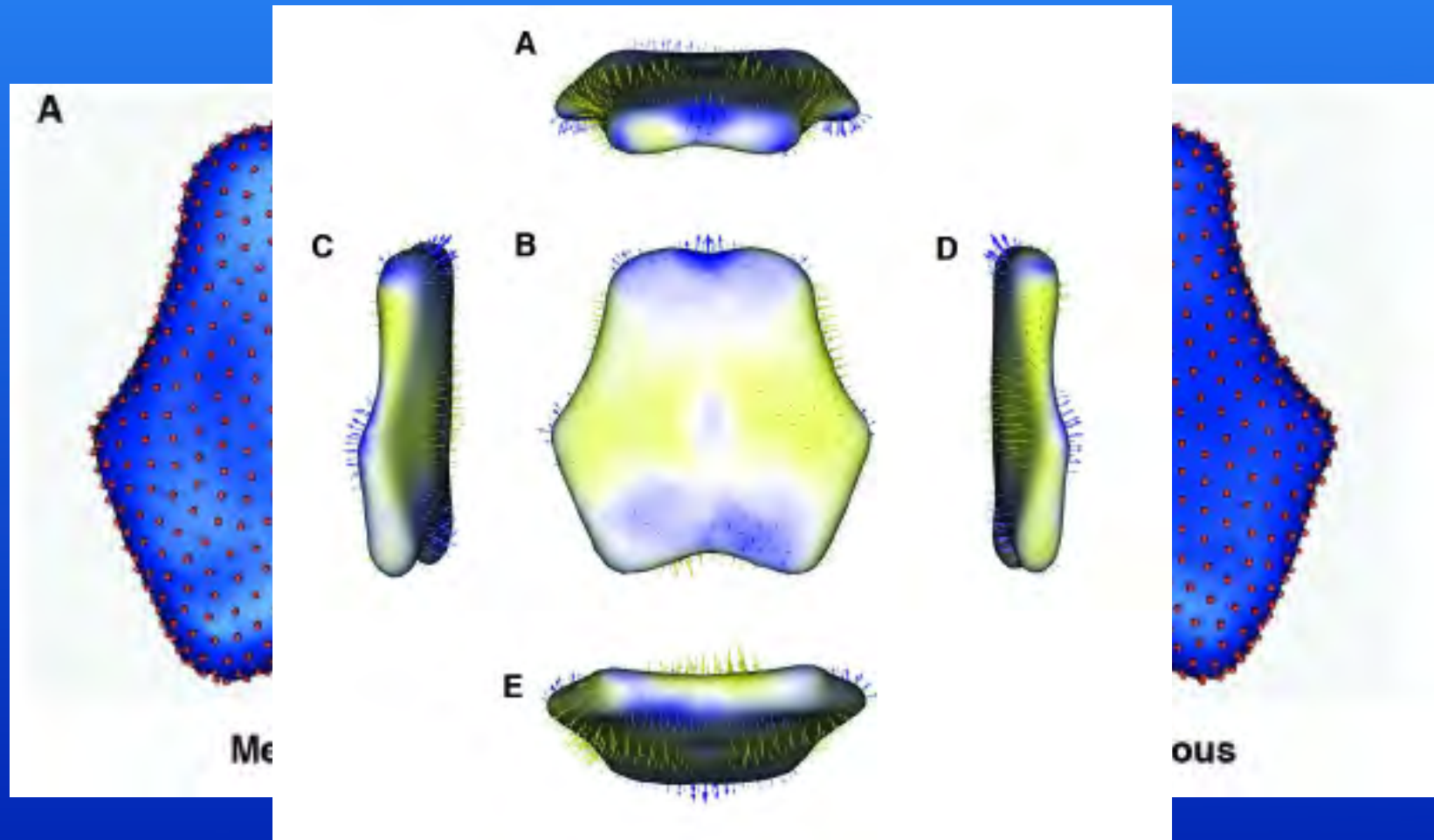
Scientific Computing and Imaging Institute, University of Utah



# Shape, Genetics, and Evolution



## Evolution of the Cranial Base



# Shape, Genetics, and Cancer



## Brain Tumor Progression

Shape Change: Preneoplastic, Invasion, Biomarker of Rx

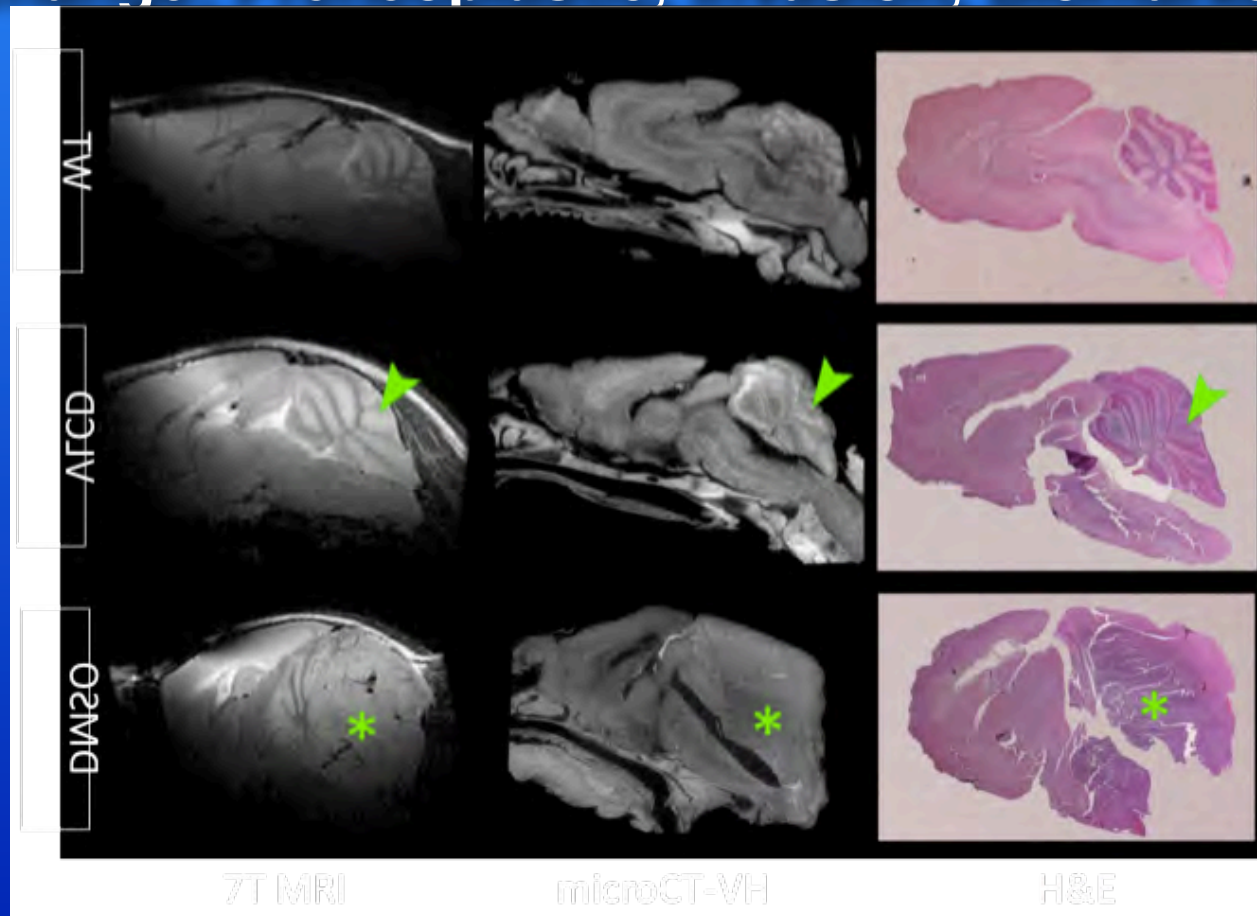


Image Courtesy of Charles Keller

Scientific Computing and Imaging Institute, University of Utah



# Relating Anatomical Shape to Neuropsychological Measures

---

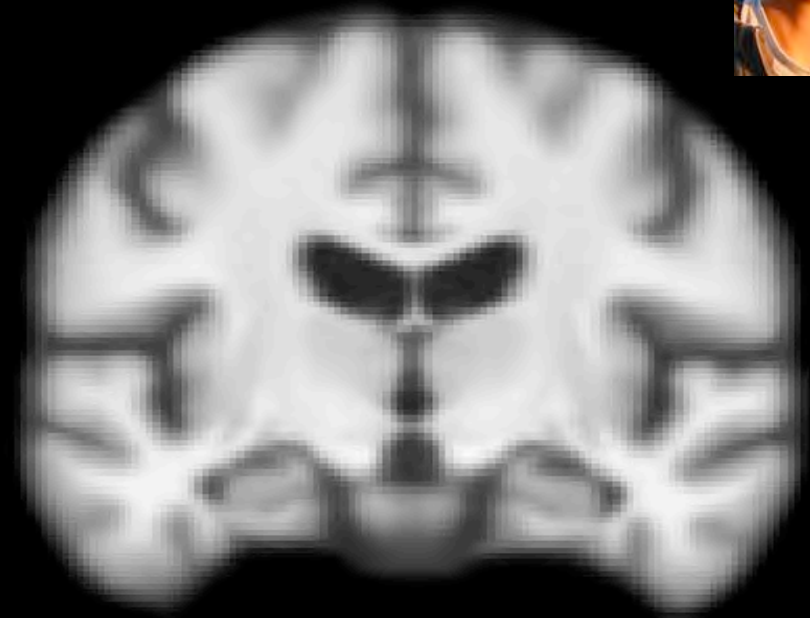
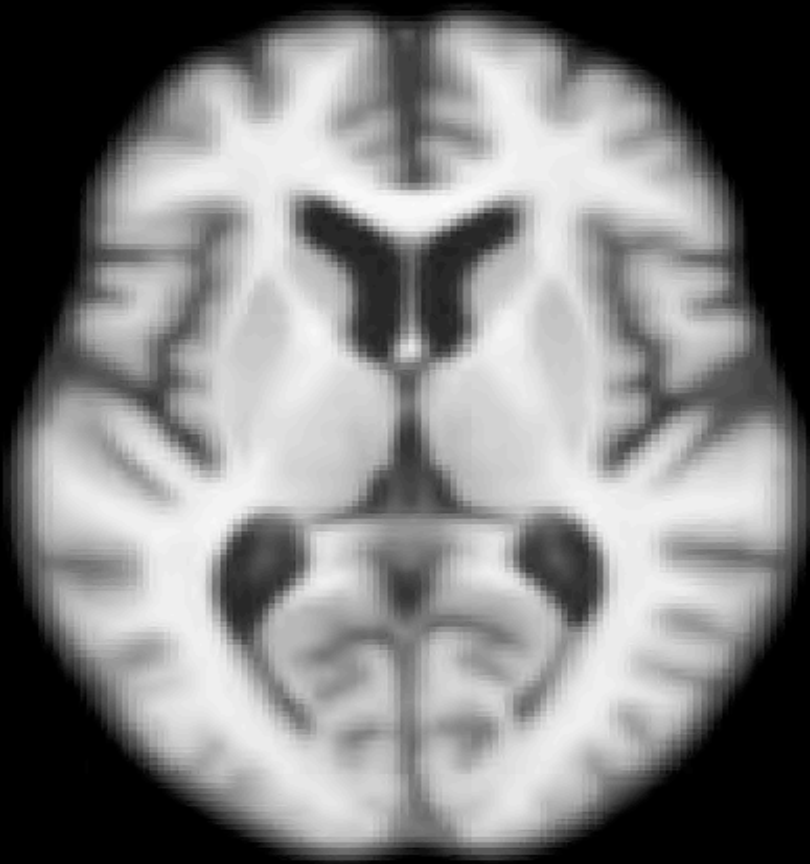


- Given a Large collection of anatomical images of subjects with detailed Neuropsychological assessments how does one relate anatomical variation to Neuropsychological variables.
- Driving problem: The ADNI database currently has ~900 subjects each with detailed Neuropsychological evaluations.
- Extract and identify shape deformation patterns in brain anatomy that relate to observed clinical scores depicting cognitive abilities.

# Changes in anatomy associated with cognitive decline in Mild Cognitive Impairment (MCI)



**MCI**

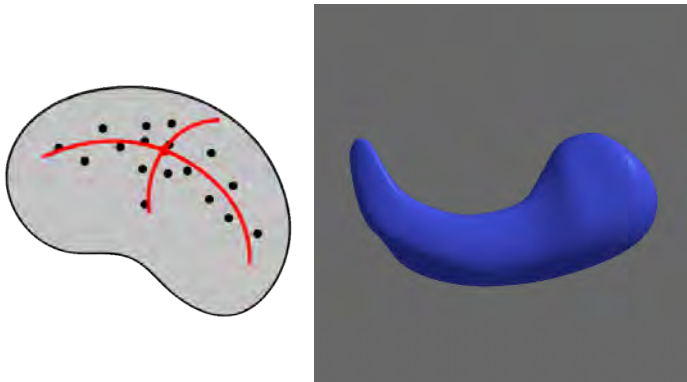


**LV1 Direction**

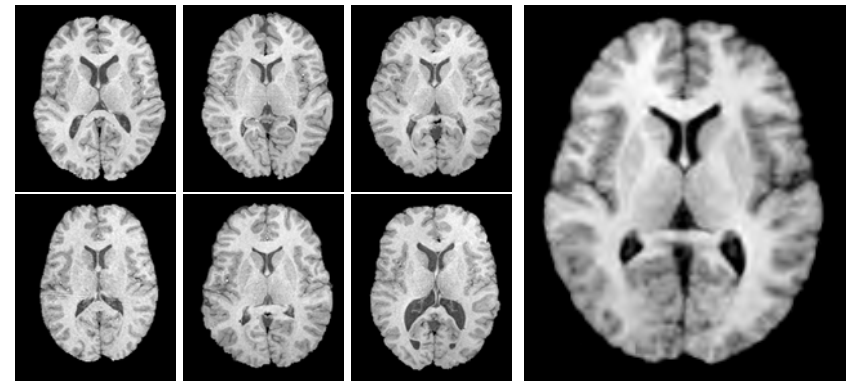
Scientific Computing and Imaging Institute, University of Utah



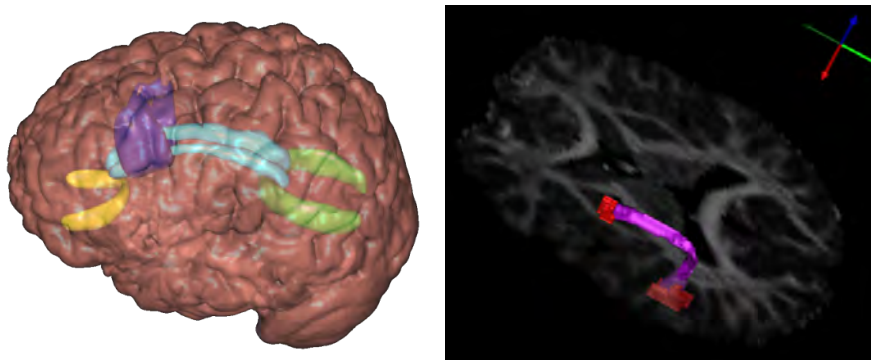
# Statistics of Shape, Connectivity, and Function



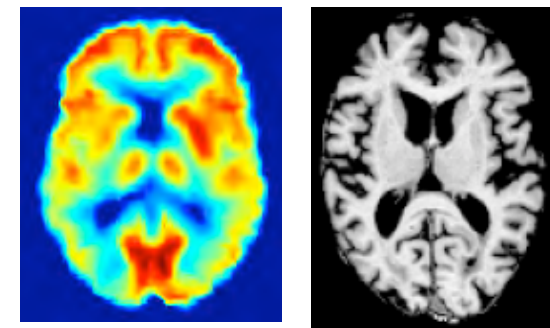
**Computational Statistics  
in Nonlinear Spaces**



**Anatomical shape averaging  
and variability**



**Diffusion Tensor Image Analysis  
Autism project**

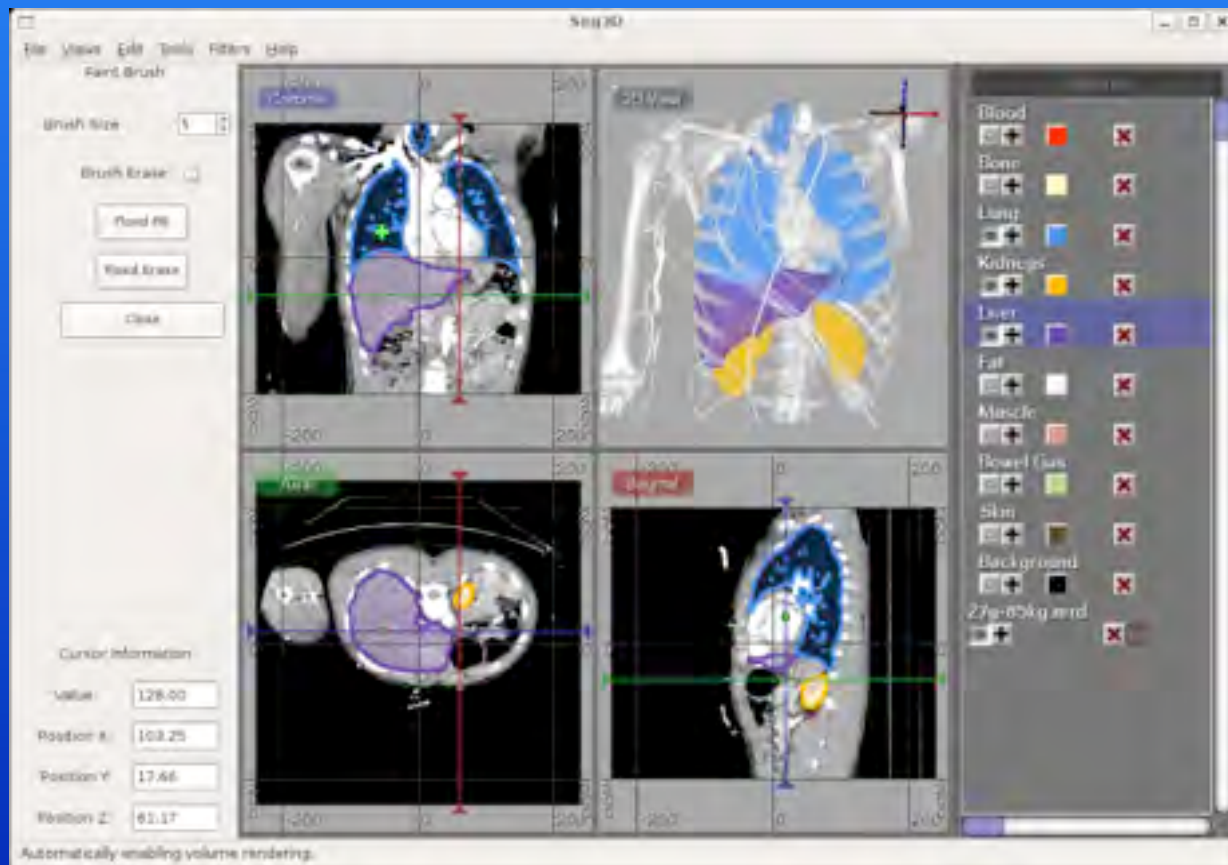


**Combined PET + MRI analysis  
Alzheimer's disease project**

# Seg3D - 3D Segmentation



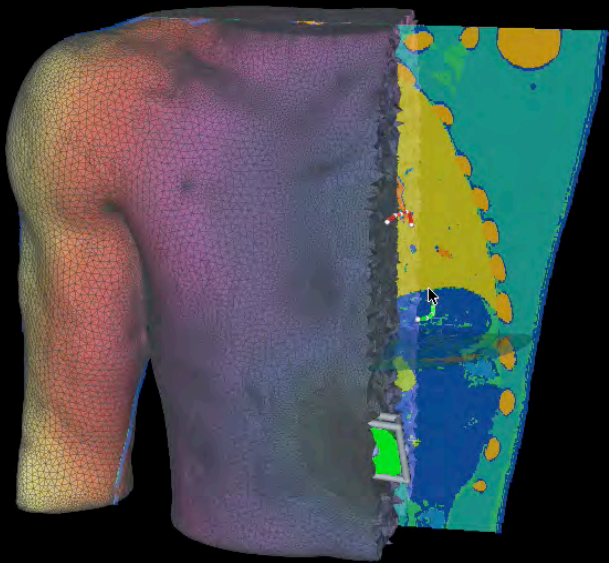
**ITK-based  
Layers (like  
Photoshop)  
Light-weight  
Open Source**



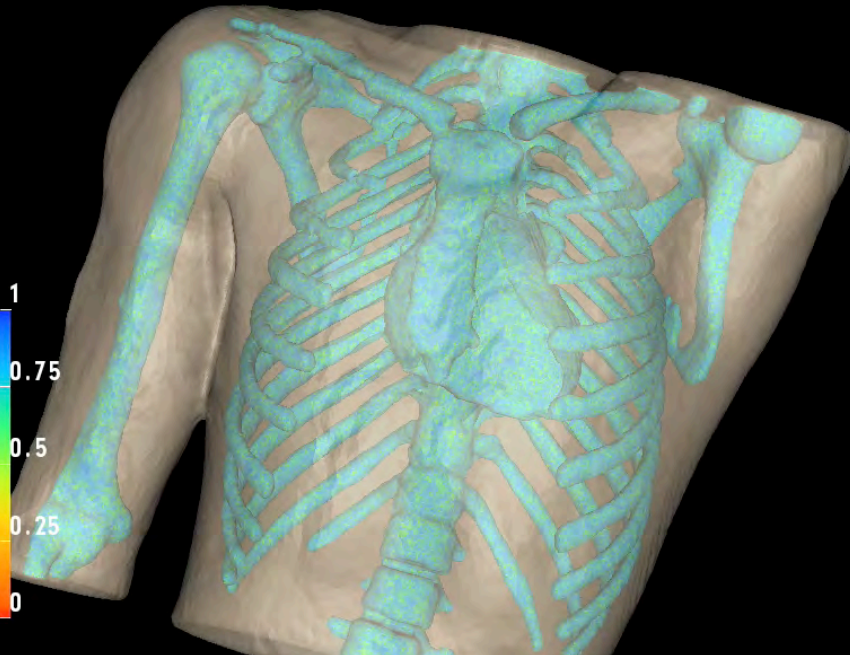
**[software.sci.utah.edu](http://software.sci.utah.edu)**

Scientific Computing and Imaging Institute, University of Utah



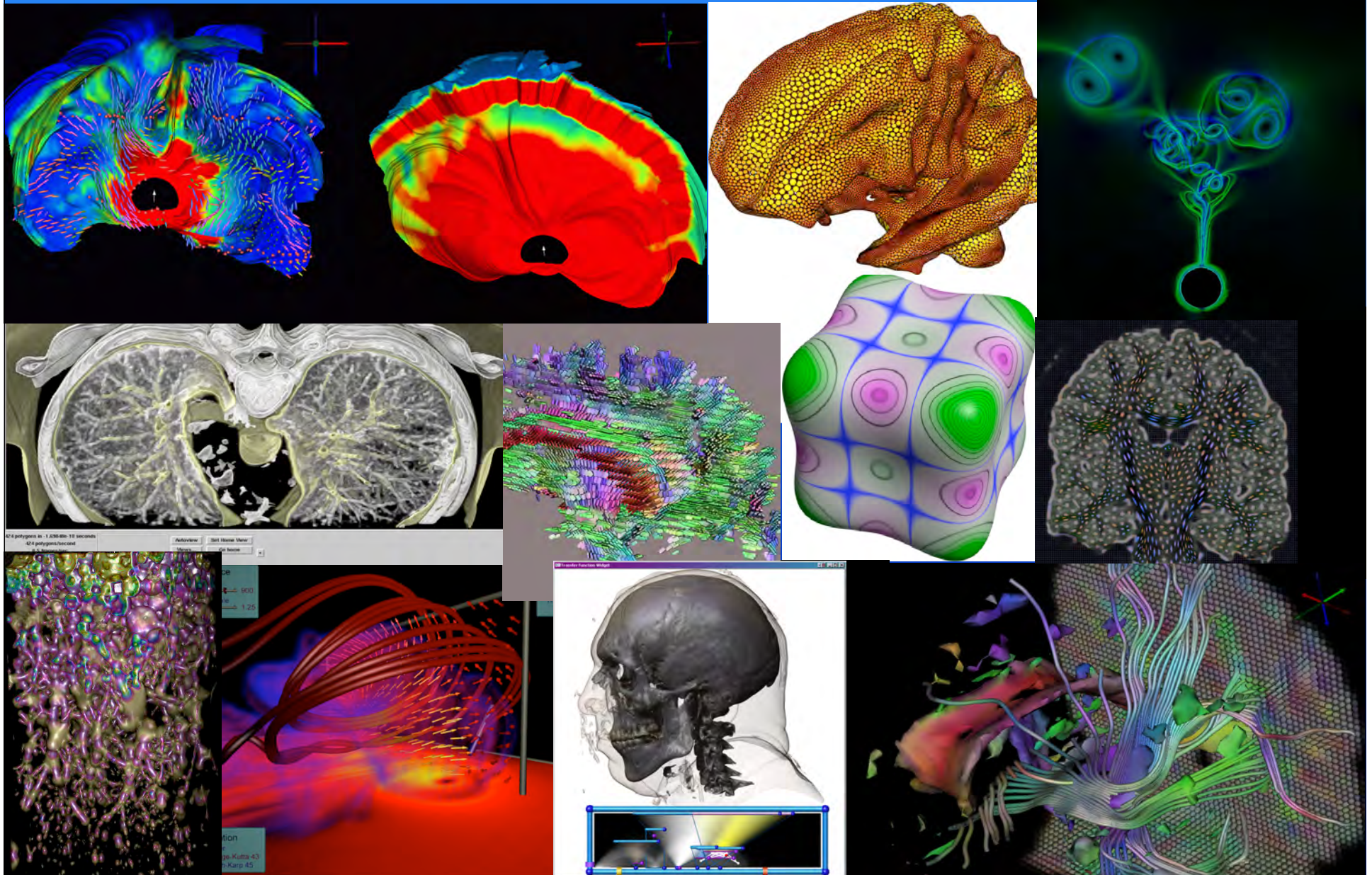


Element Quality (Scaled Jacobian)





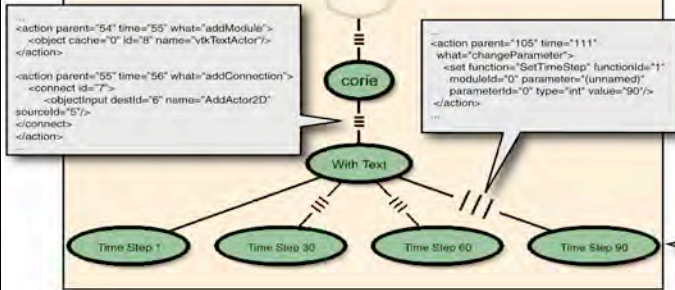
# New Visualization Techniques



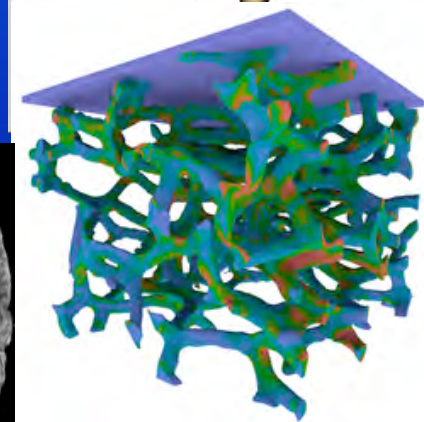
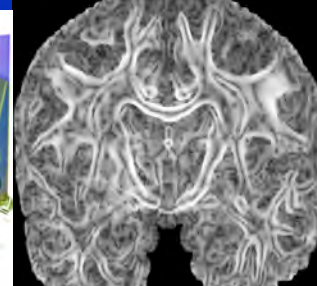
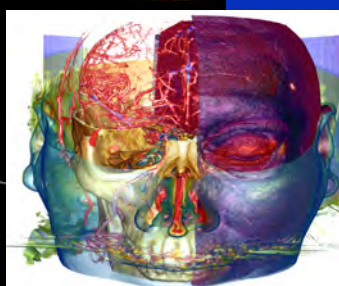
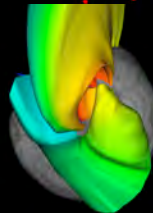
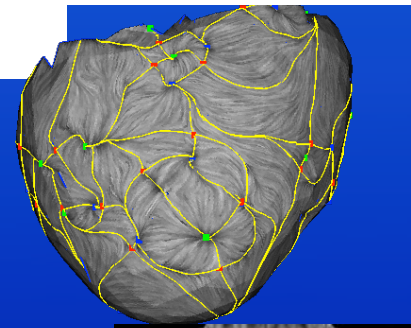
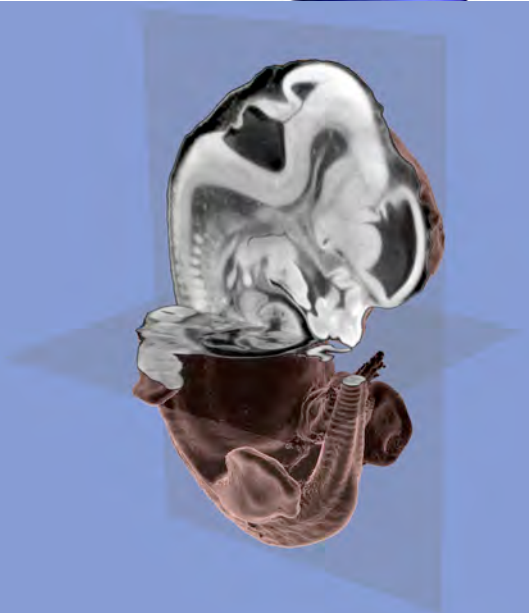
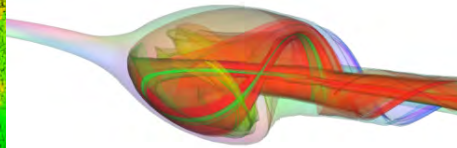
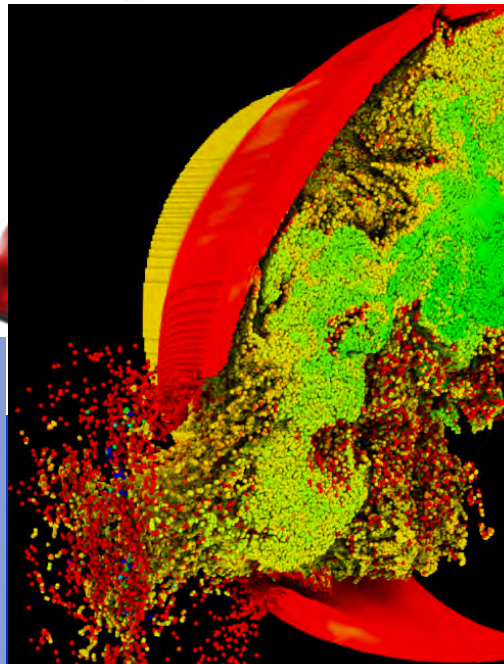
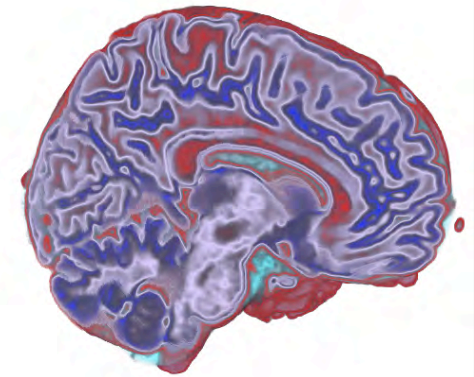
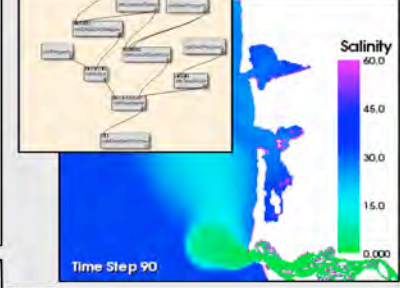


# New Visualization Techniques

“VisTrail”



“Dataflow”



# ImageVis3D and Tuvok

## IO

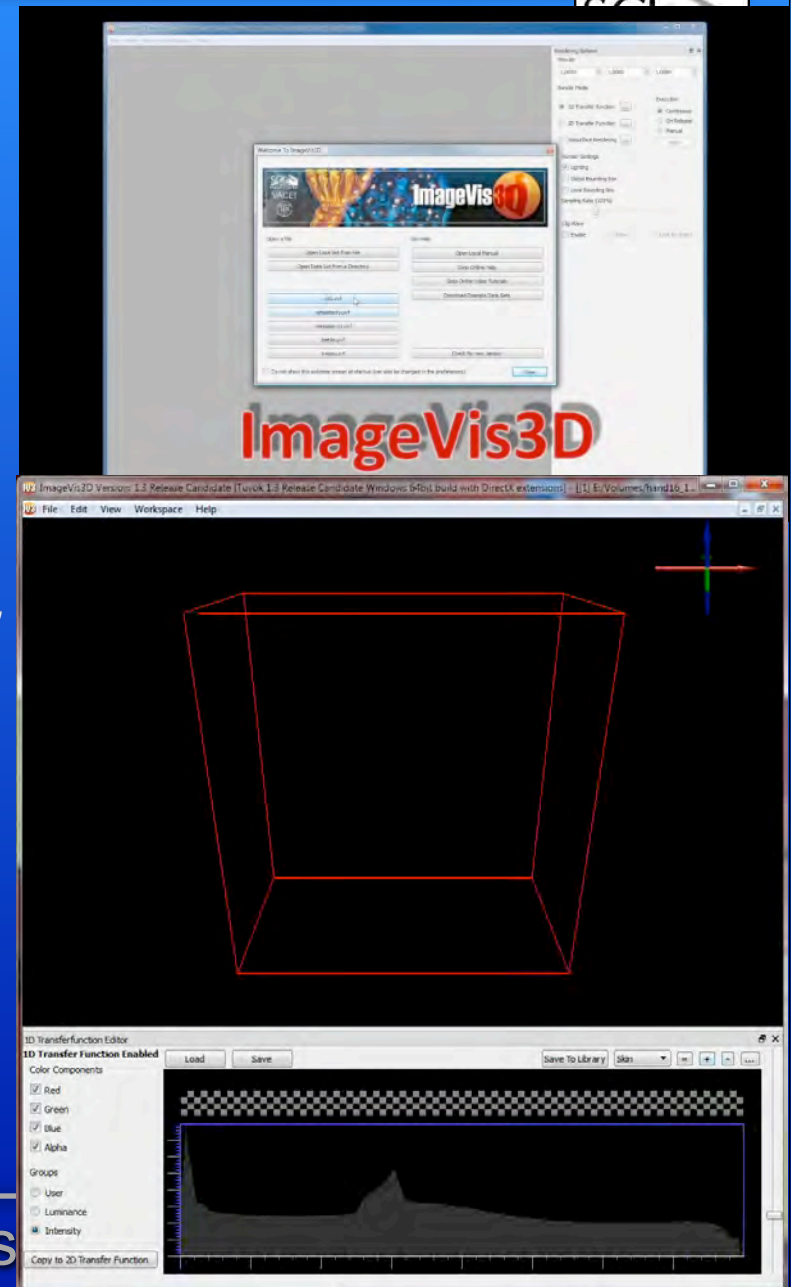
- Understands various file formats including DICOM
- Reads and handles data of up to 18 EB
- Provides Bricking and LoD computations

## Renderer

- Supports Raycasting and Slicing
- Supports 1D, 2D TFs, Isosurfacing, and ClearView
- Provides extensive support for older hardware

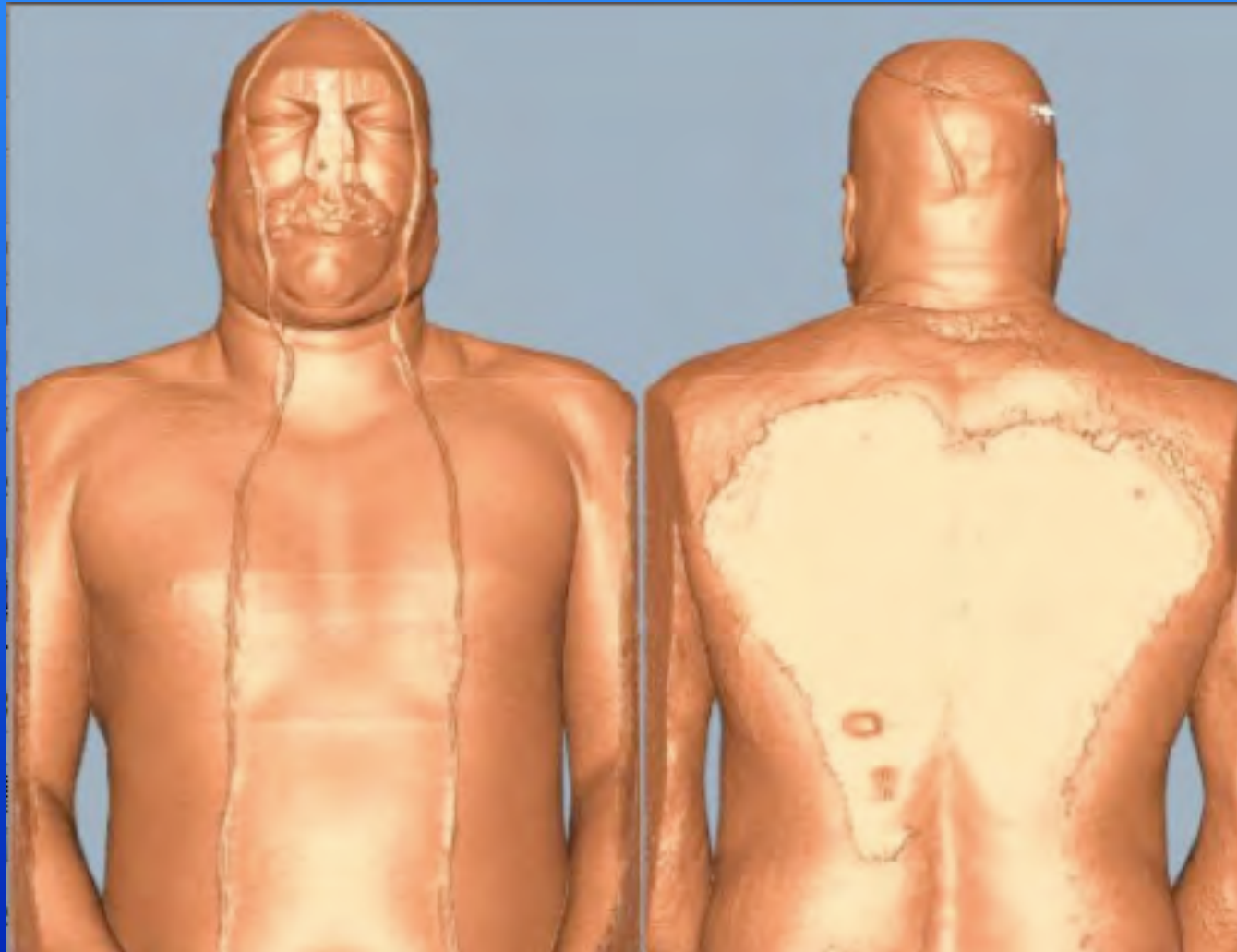
## General

- Cross platform
- Intuitive and Configurable UI
- Supports multiple windows
- Open Source - MIT License





# NIH Visible Male



Scientific Computing and Imaging Institute, University of Utah

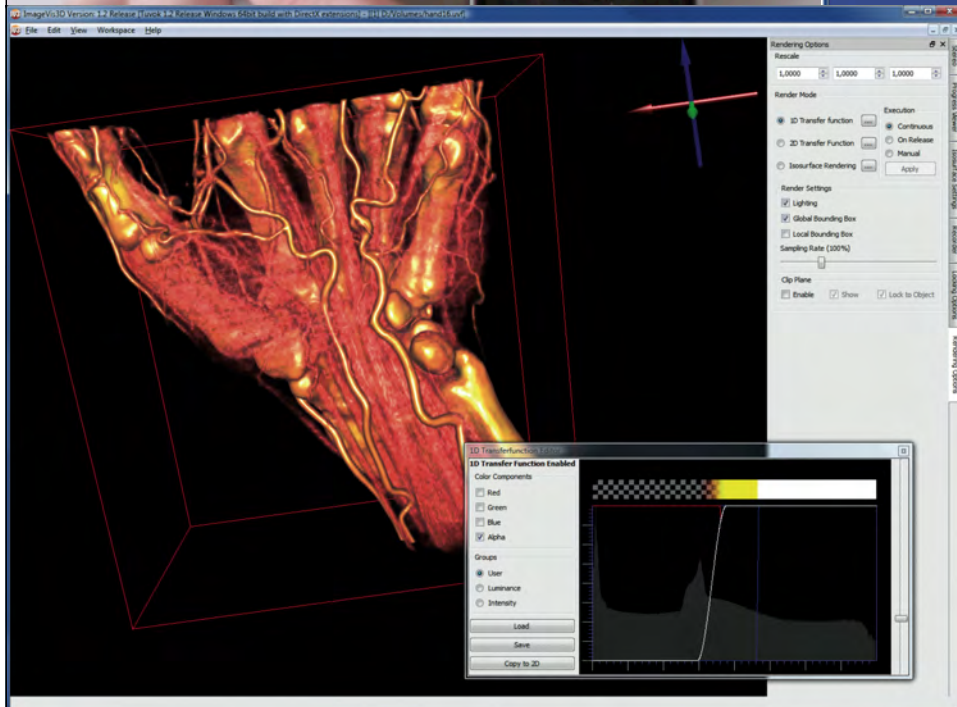
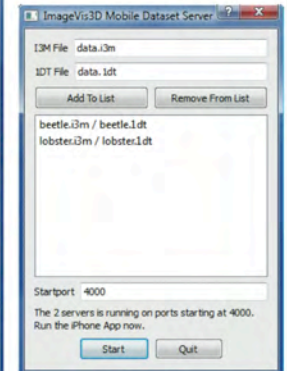
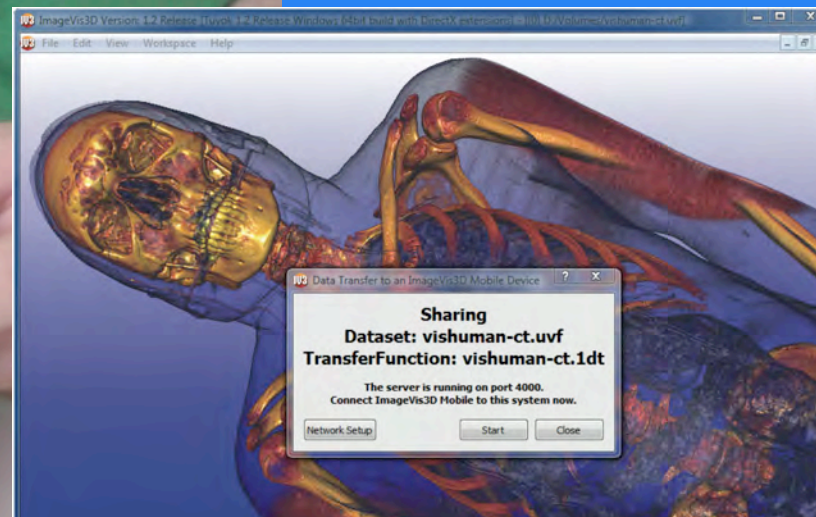
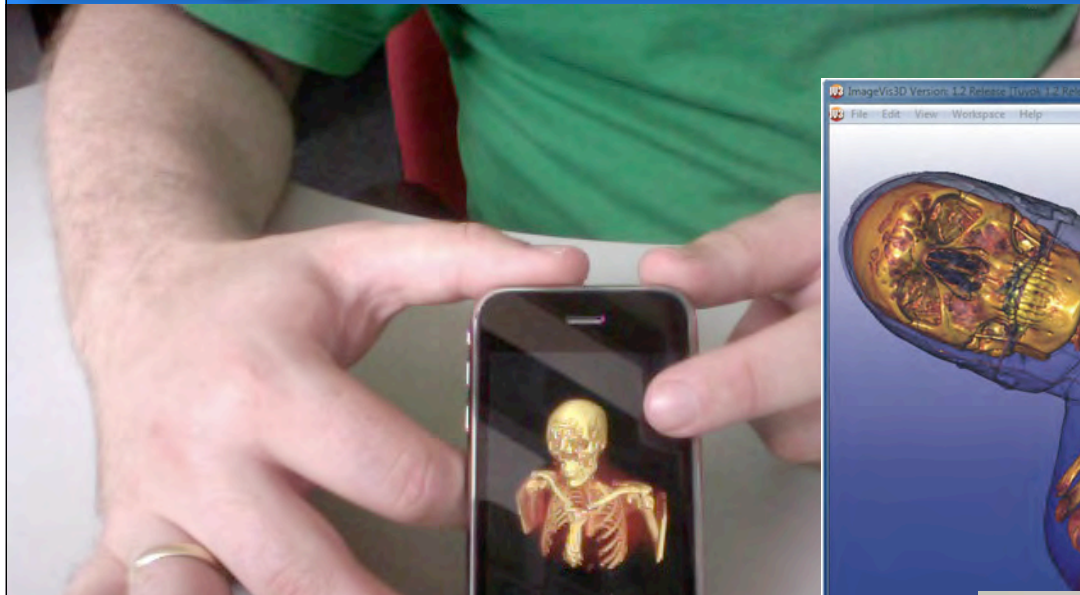
# Visible Human - High Resolution



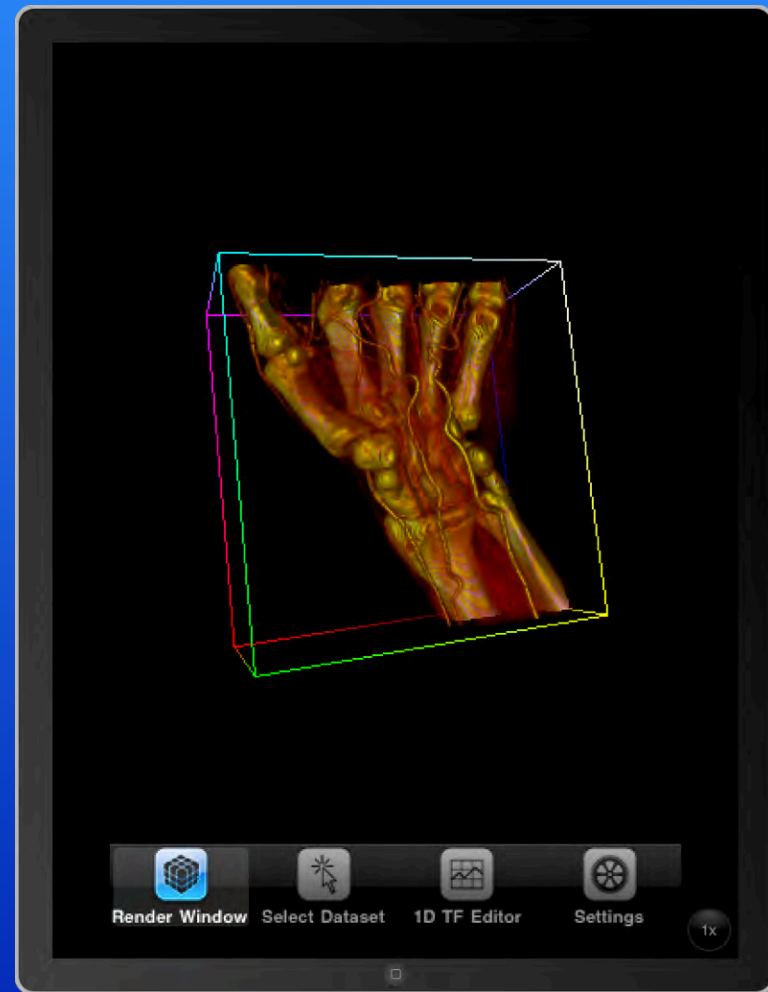
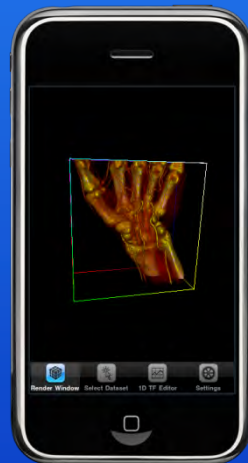
Scientific Computing and Imaging Institute, University of Utah



# ImageVis3D - Mobile



# ImageVis3D Mobile

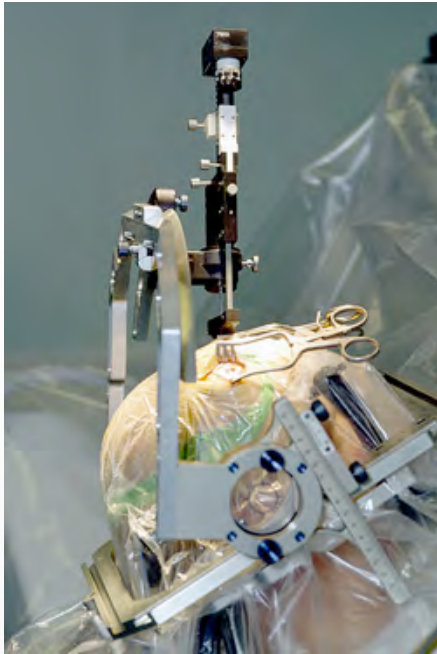


Scientific Computing and Imaging Institute, University of Utah



# ImageVis3D Mobile DBS App

Introduction



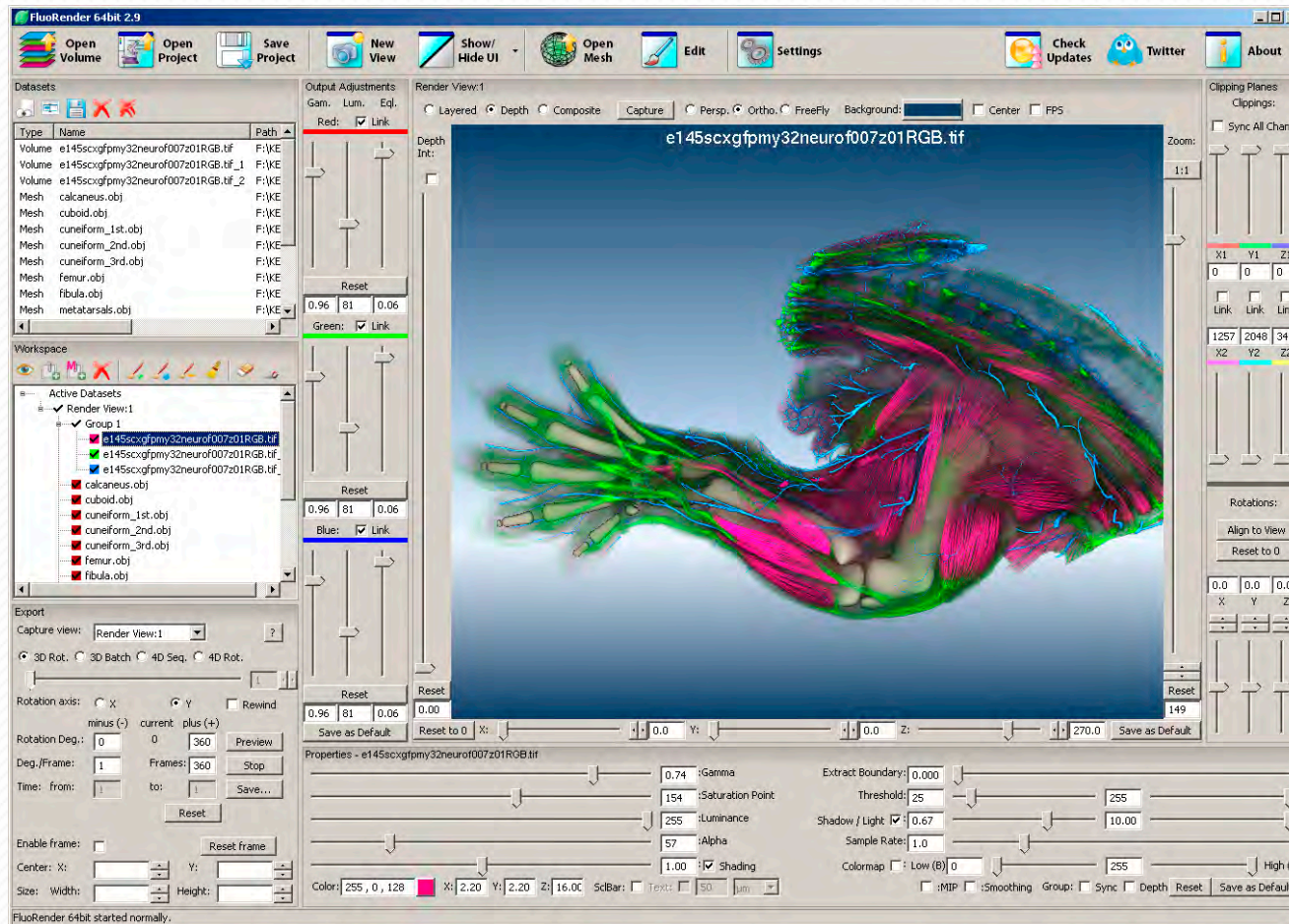
Deep Brain Stimulation  
DBP: Chris Butson



C. Butson, G. Tamm, S. Jain, T. Fogal and J. Krüger  
"Evaluation of Interactive Visualization on Mobile  
Computing Platforms for Selection of Deep Brain  
Stimulation Parameters" *IEEE Transactions on  
Visualization and Computer Graphics*, 2012 (in  
press).



# FluoRender Ver 2.9



Mouse hindLimb

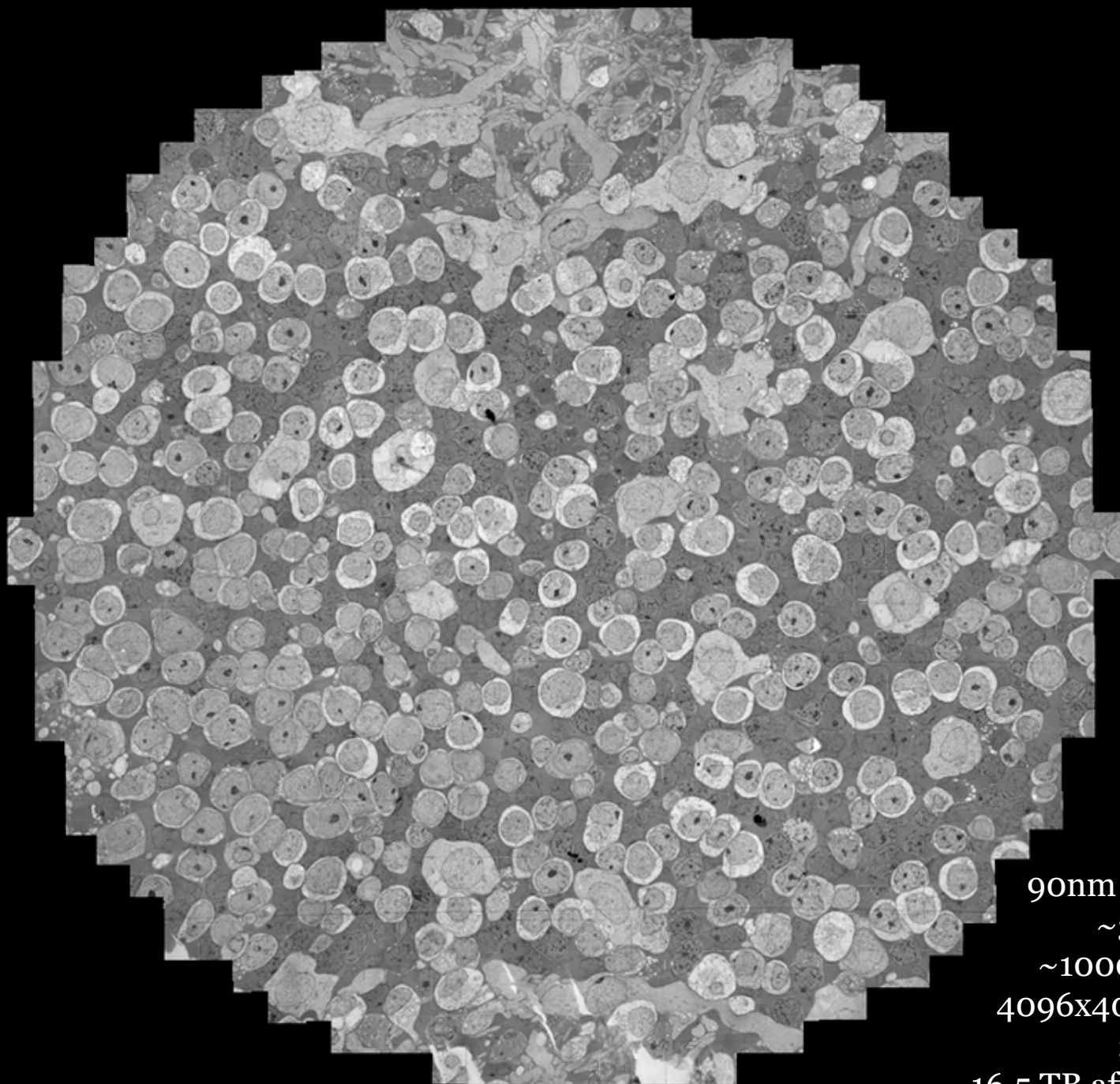
A. Kelsey Lewis, Human Genetics, Univ. of Utah



UNIVERSITY OF UTAH  
SCHOOL OF MEDICINE  
Department of Neurobiology and Anatomy







341 Sections  
90nm thick sections  
~32GB/Section  
~1000 tiles/section  
4096x4096 pixels/tile  
2.18 nm/Pixel  
16.5 TB after processing

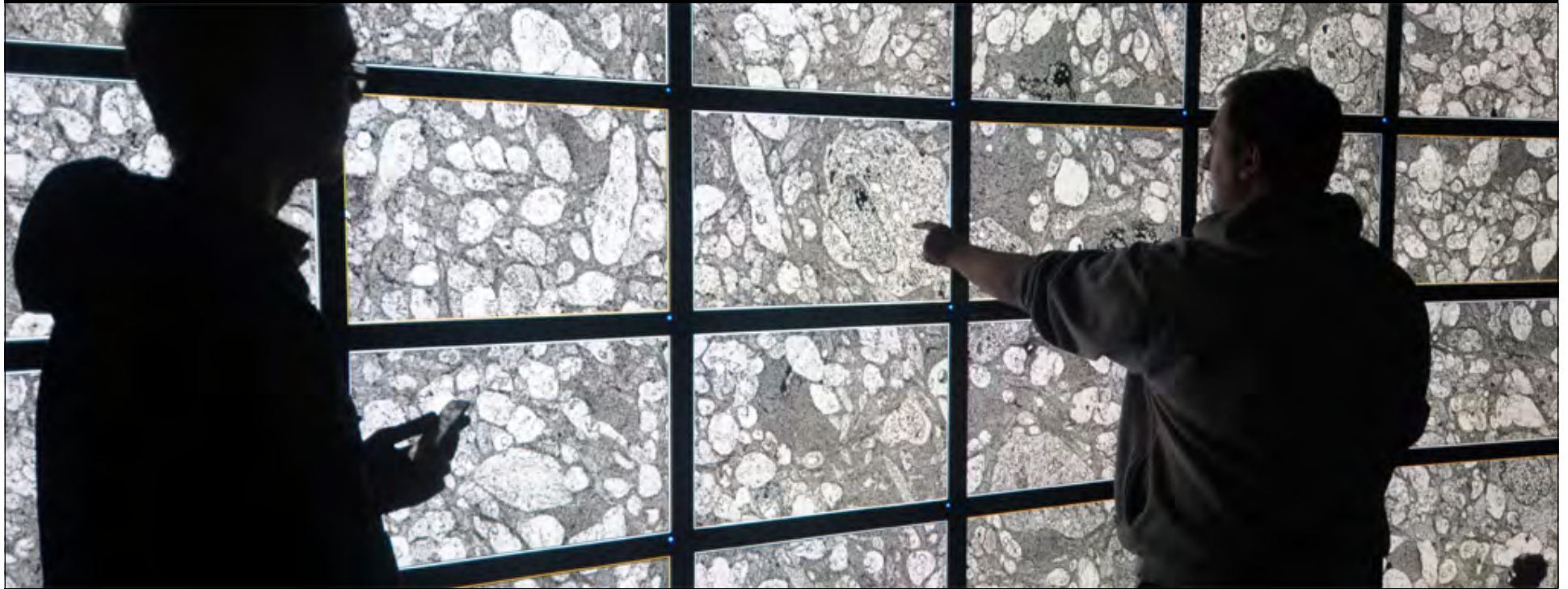
# Antony van Leeuwenhoek (1632-1723)



... my work, which I've done for a long time, was not pursued in order to gain the praise I now enjoy, but chiefly from a craving after knowledge, which I notice resides in me more than in most other men. And therewithal, whenever I found out anything remarkable, I have thought it my duty to put down my discovery on paper, so that all ingenious people might be informed thereof.

Antony van Leeuwenhoek. Letter of June 12, 1716





# Michelangelo David



**One billion polygons  
to billions of pixels**

Welcome to the first  
gigapixel, multi-view  
rendering of

The Digital Michelangelo  
Project's David



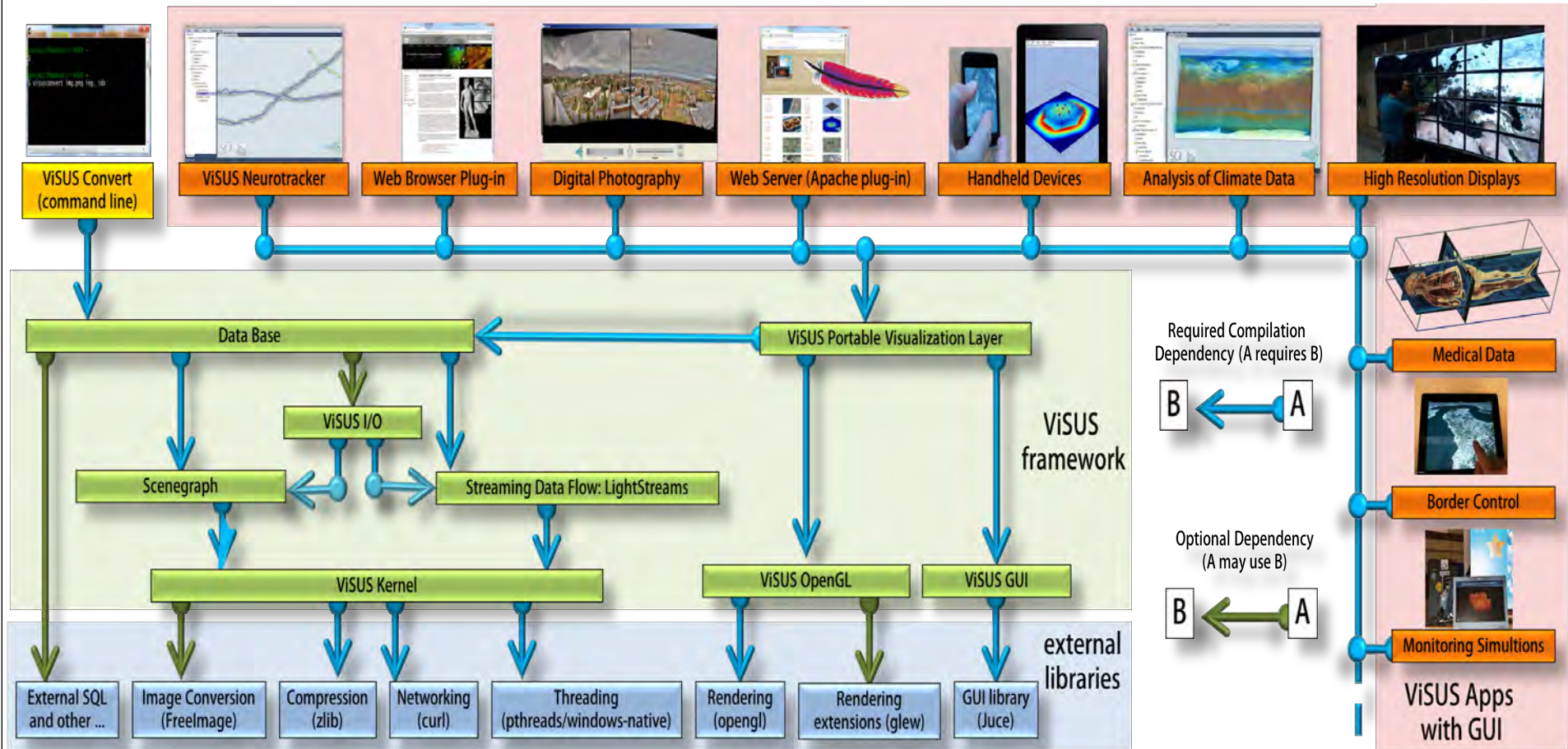
**Manta**  
interactive renderer



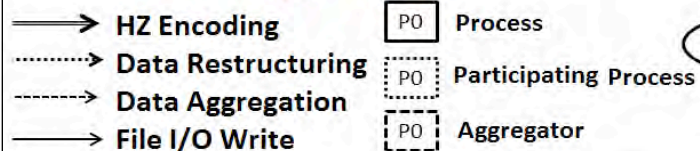
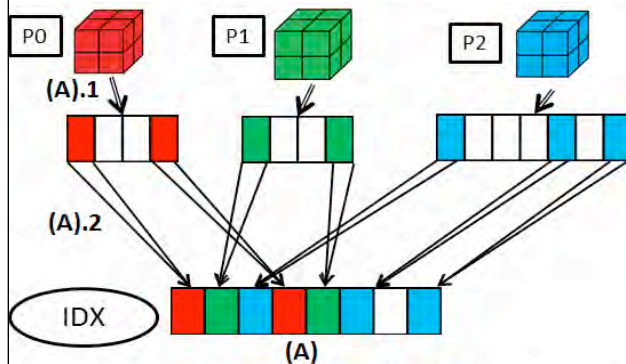
Scientific Computing and Imaging Institute, University of Utah



# ViSUS Framework for Scalable Data



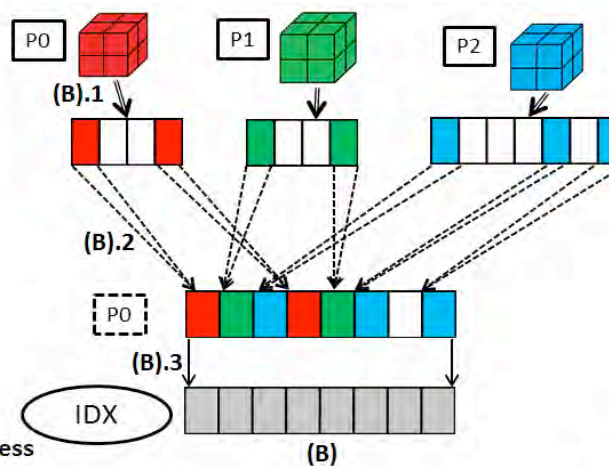
# The ViSUS Parallel I/O Infrastructure (PIDX) Adopts a 3-Phase Data Transfer Model



## One-Phase I/O:

**(A).1** HZ encoding of irregular data set leads to sparse data buffers interleaved across processes.

**(A).2** I/O writes to underlying IDX file by each process, leading to a large number of small accesses to each file.

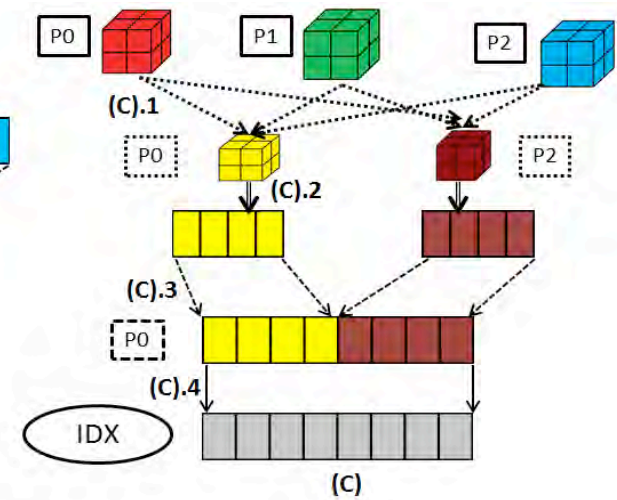


## Two-Phase I/O:

**(B).1** HZ encoding of irregular data set leads to sparse data buffers interleaved across processes.

**(B).2** Data transfer from in-memory HZ ordered data to an aggregation buffer involving large number of small sized data packets.

**(B).3** Large sized aligned I/O writes from aggregation buffer to the IDX file.



## Three-Phase I/O:

**(C).1** Data restructuring among processes transforms irregular data blocks at processes P0, P1 and P2 to regular data blocks at processes P0 and P2.

**(C).2** HZ encoding of regular blocks leading to dense and non-overlapping data buffer.

**(C).3** Data transfer from in-memory HZ ordered data to an aggregation buffer involving fewer large sized data packets.

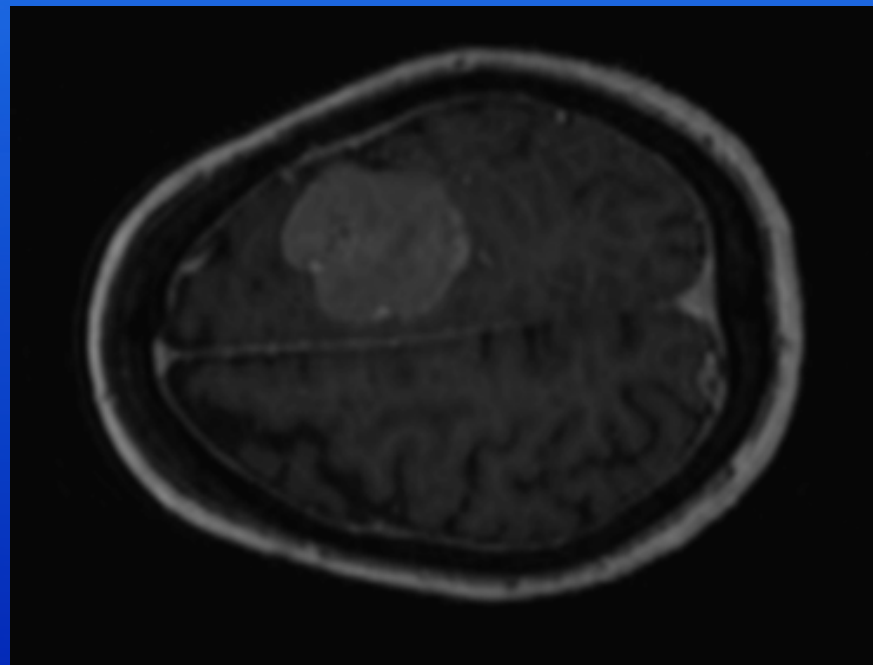
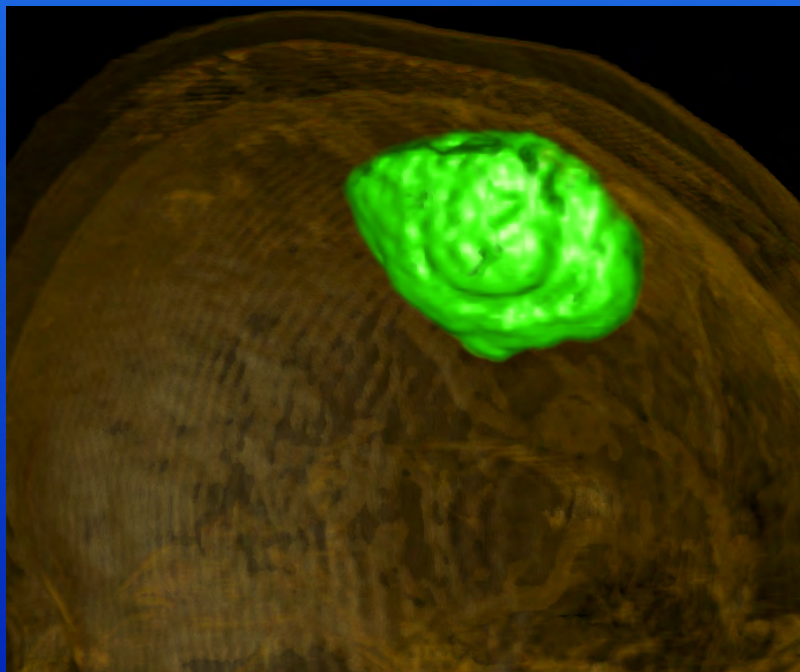
**(C).4** I/O writes from aggregation buffer to a IDX file.



# Uncertainty Visualization



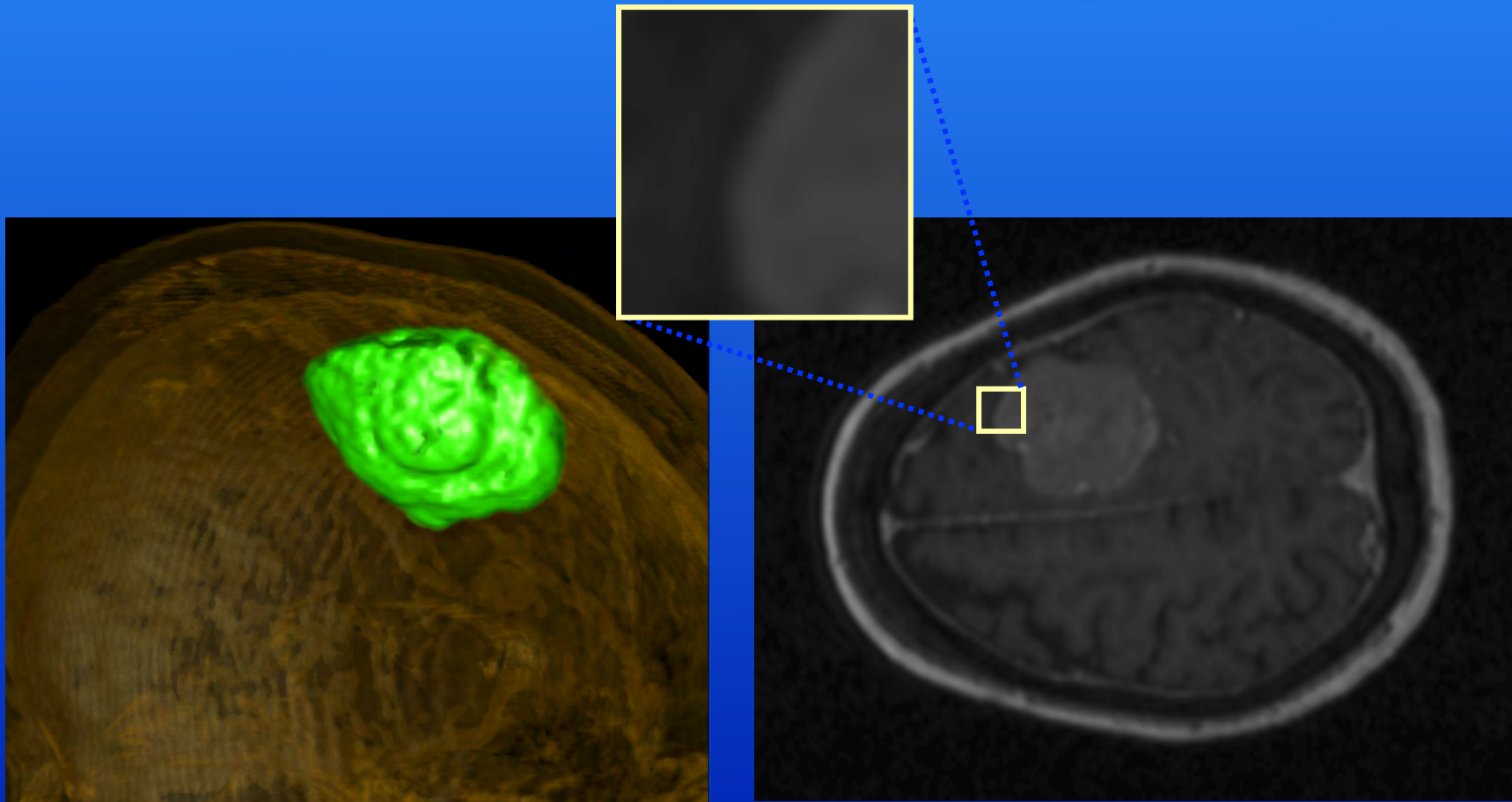
**When is the last time you've seen an error bar in a 3D visualization?**



# Uncertainty Visualization



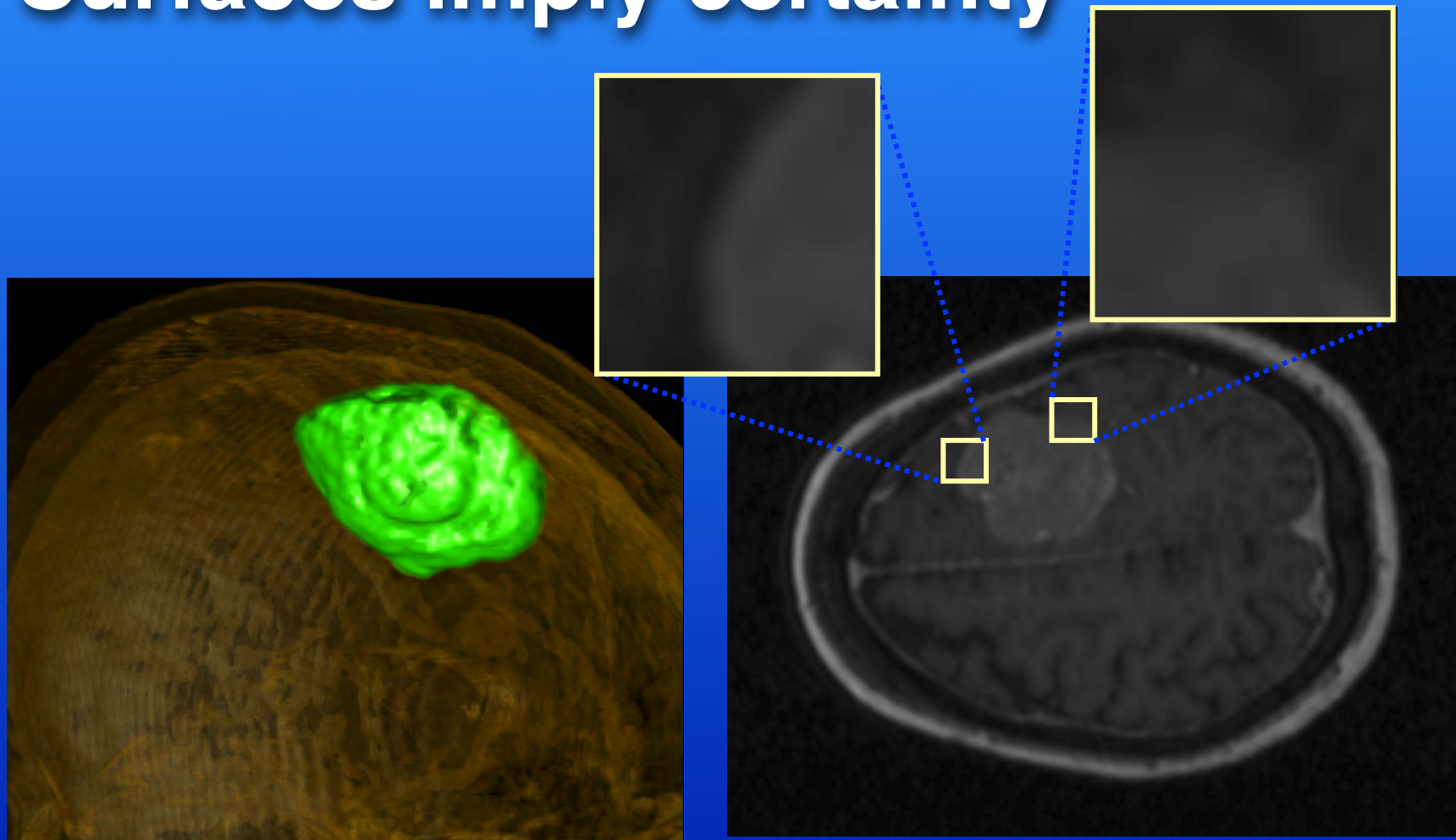
## Surfaces imply certainty





# Uncertainty Visualization

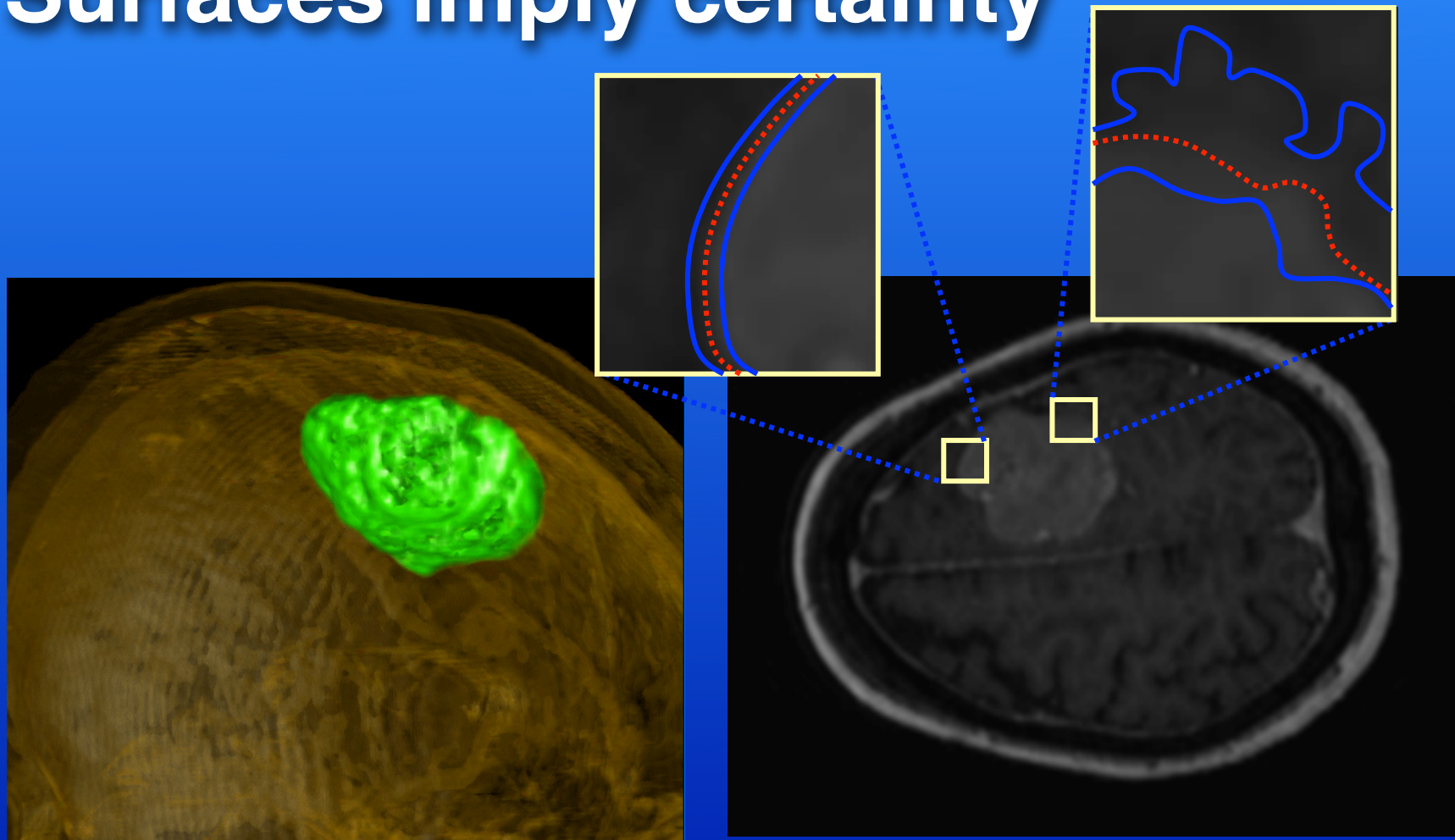
## Surfaces imply certainty



# Uncertainty Visualization

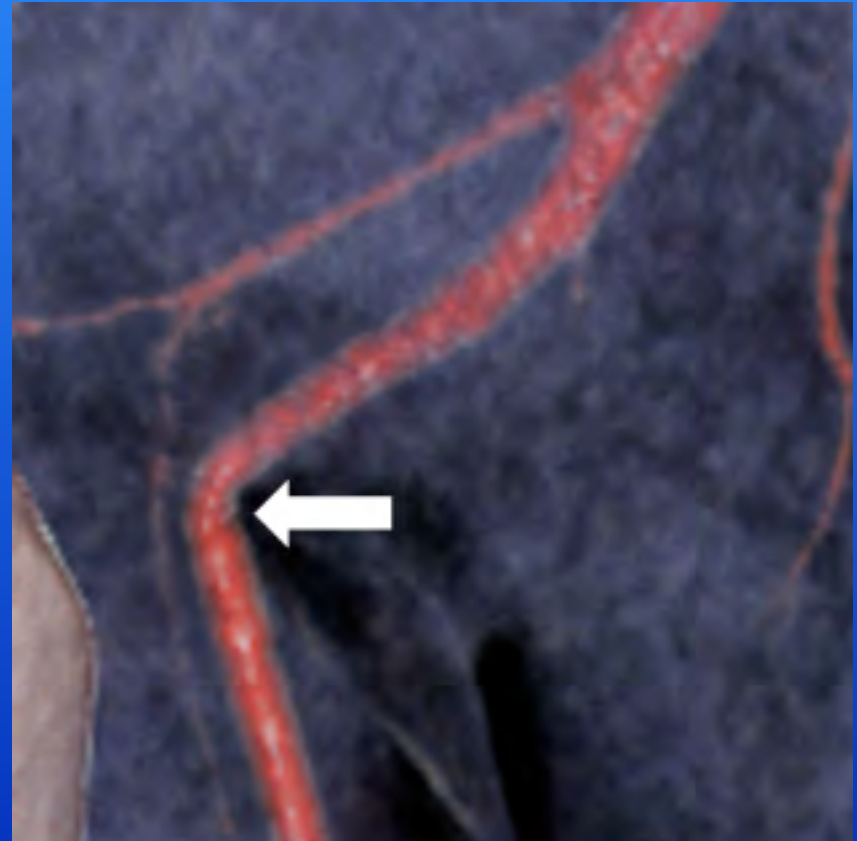
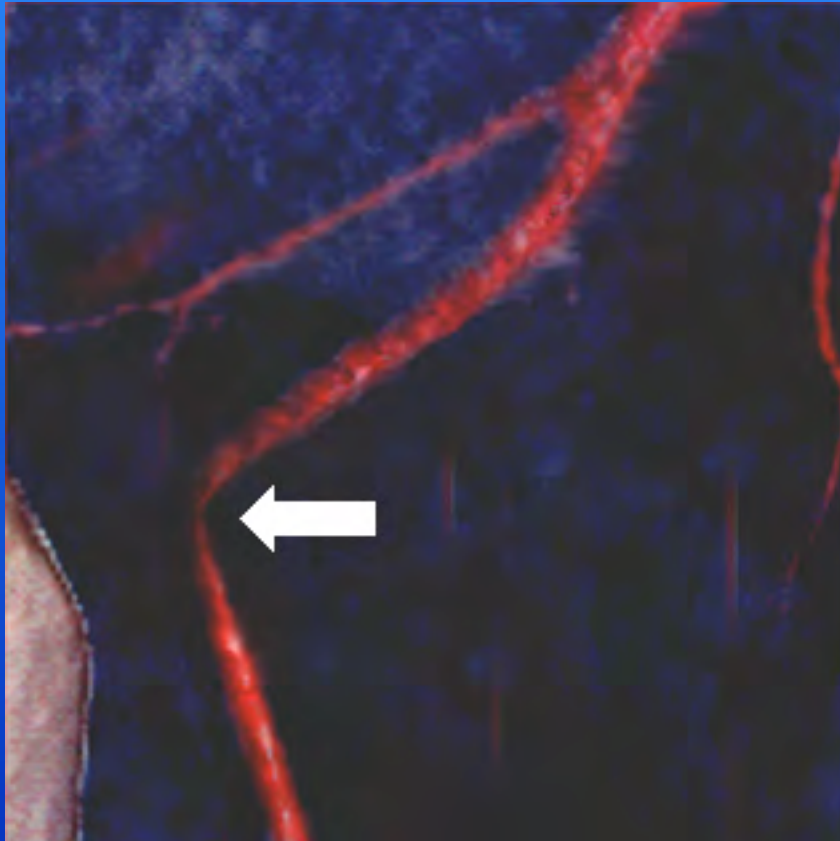


## Surfaces imply certainty





# Uncertainty Visualization

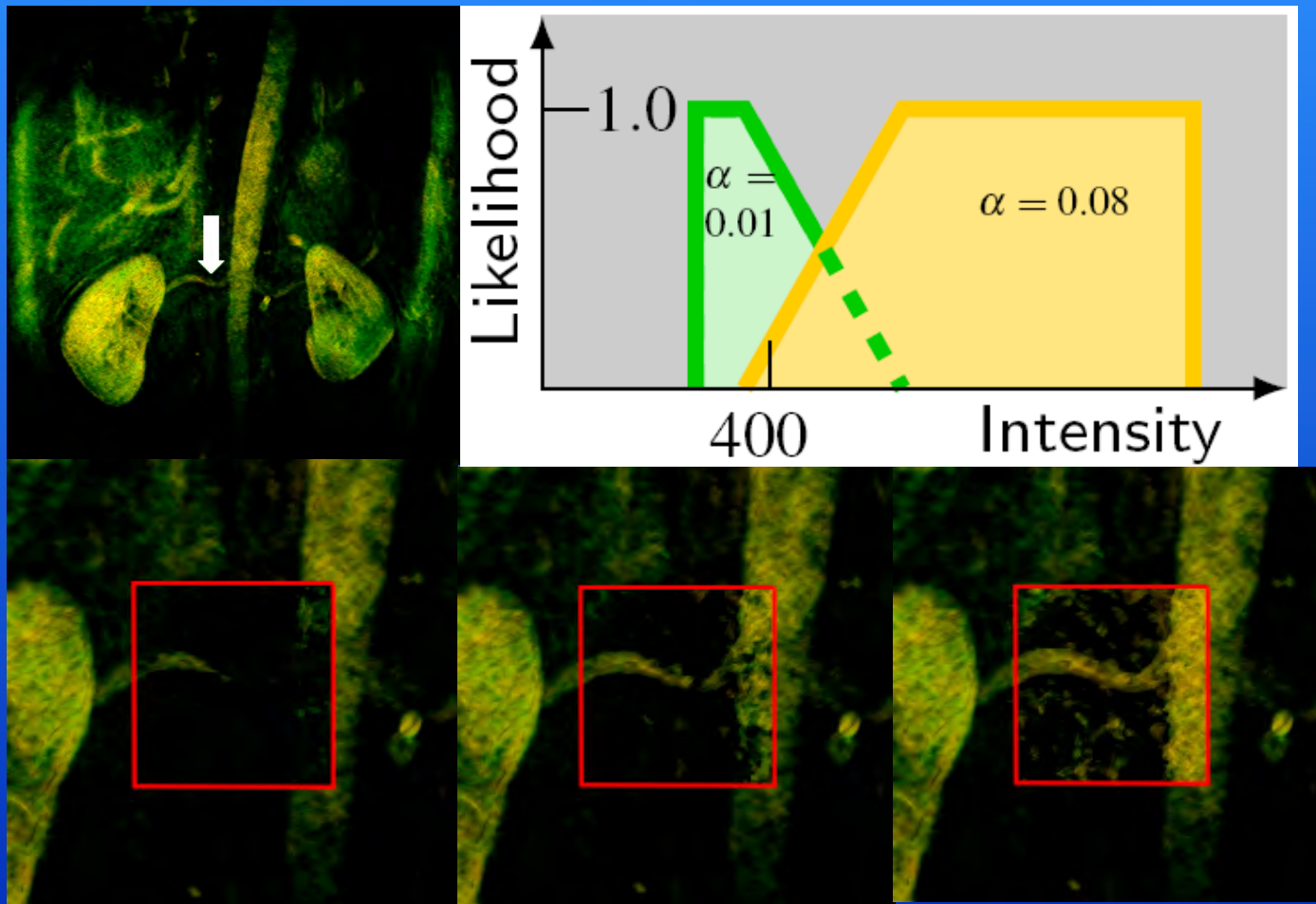


Images Courtesy of Claes Lundström, Patric Ljung, Anders Persson, Anders Ynnerman.

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# Uncertainty Visualization

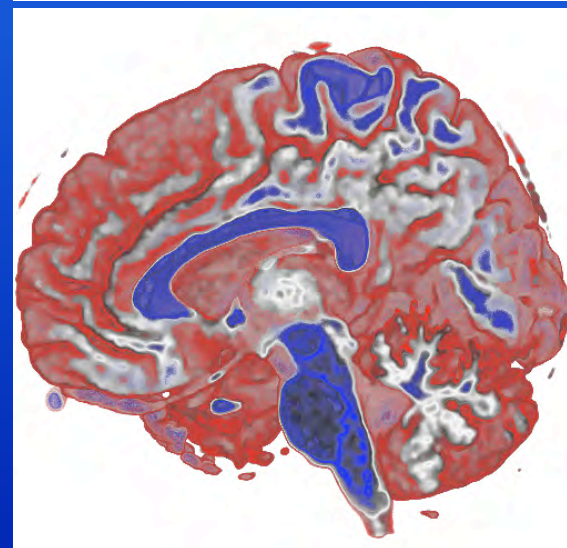
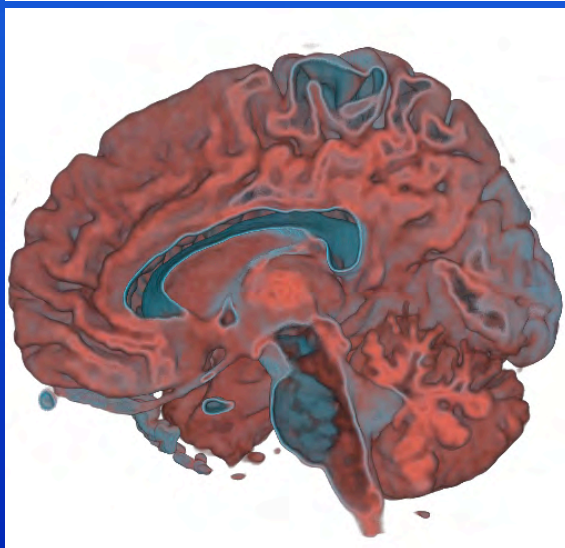
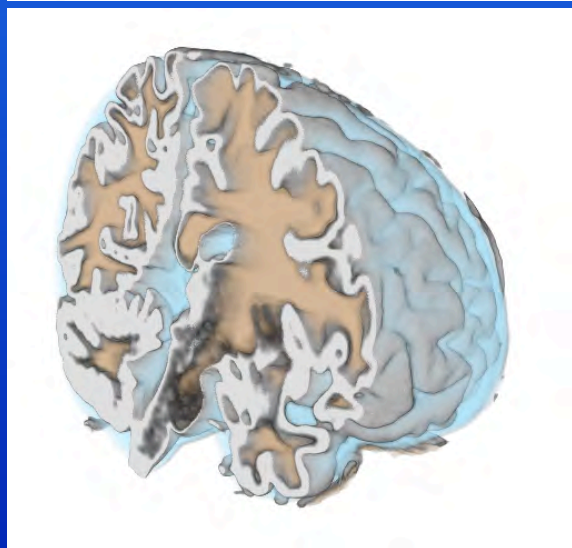
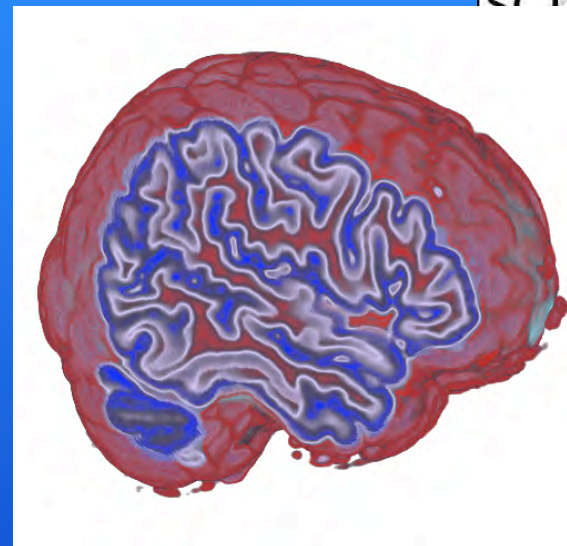
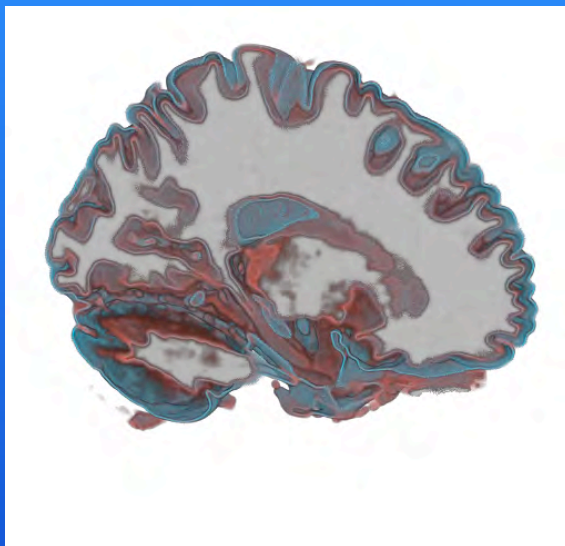
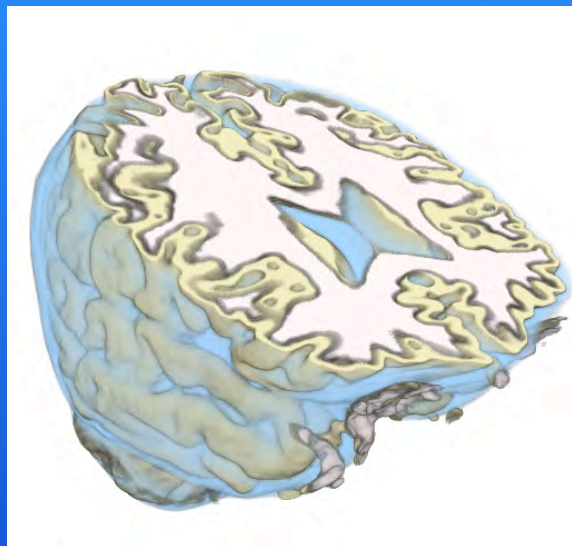


Claes Lundström, Patric Ljung, Anders Persson, Anders Ynnerman. Uncertainty Visualization in Medical Volume Rendering Using Probabilistic Animation, IEEE Transactions on Visualization and Computer Graphics, 13(2007): no. 5

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# Visualizing Uncertainty



Fuzzy

Sensitivity

Confidence

# Brain Structure - Fiber Tracks



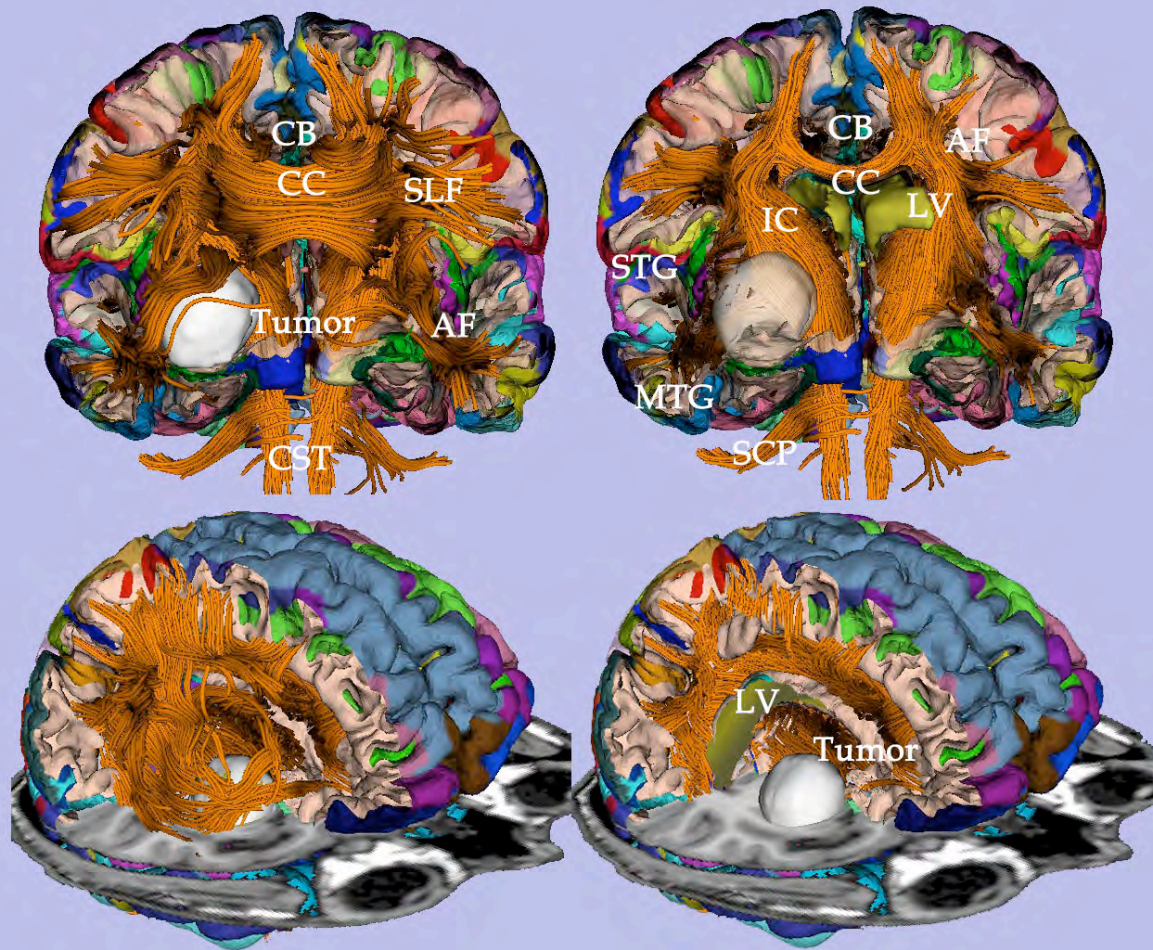
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# White Matter Tracts

Hae-Jeong Park, Ph.D., 2003

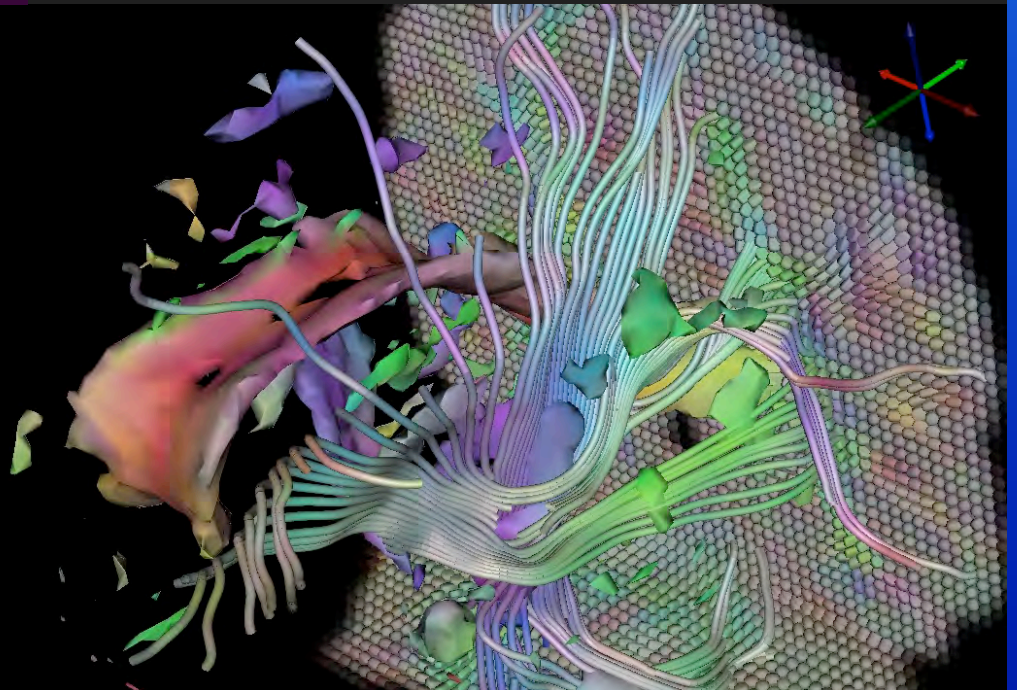
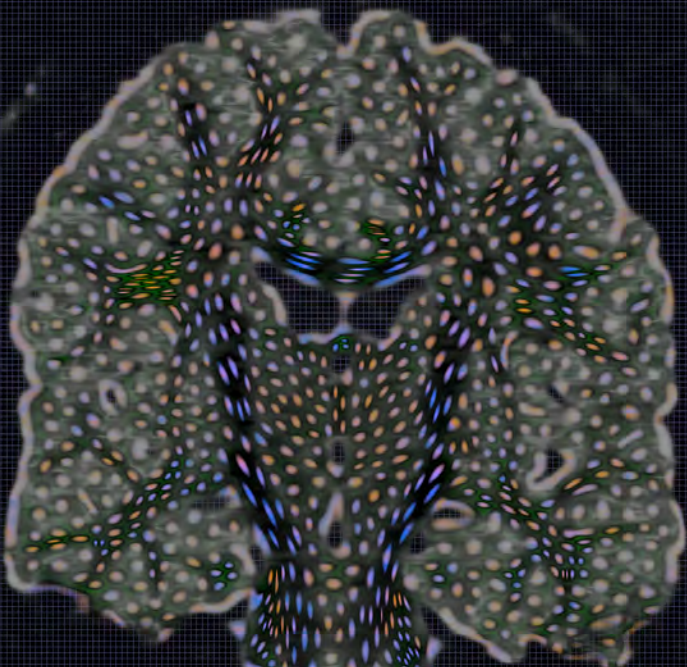
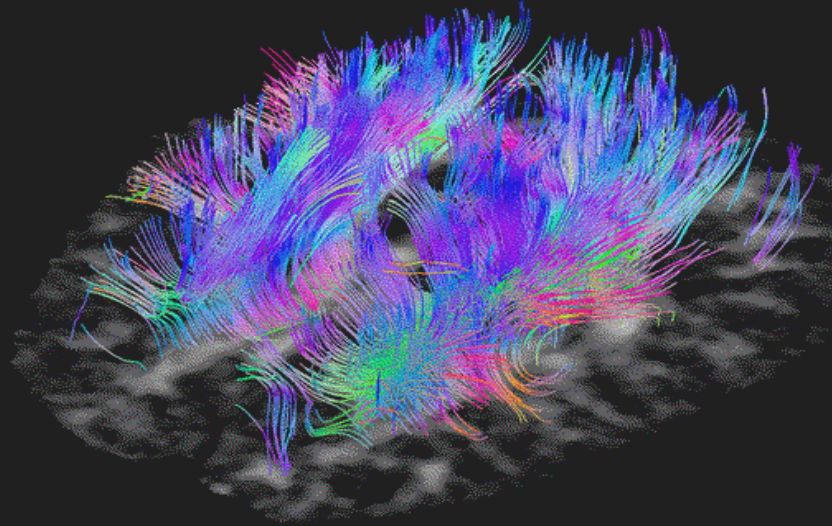


Park, Westin, and Kikinis, BWH, Harvard Medical School, 2003

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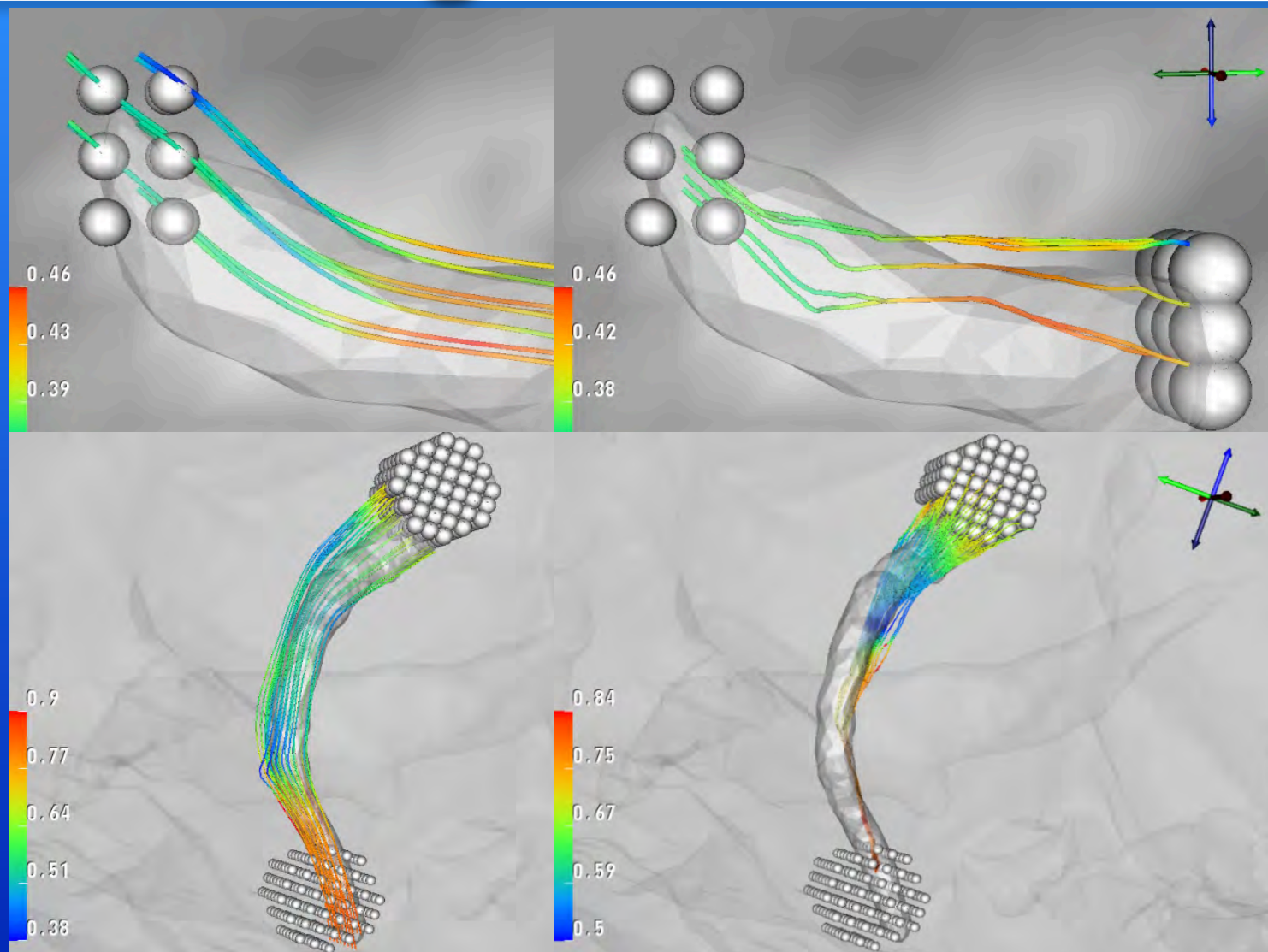


# Diffusion Tensor Visualization





# Fiber Tracking Results

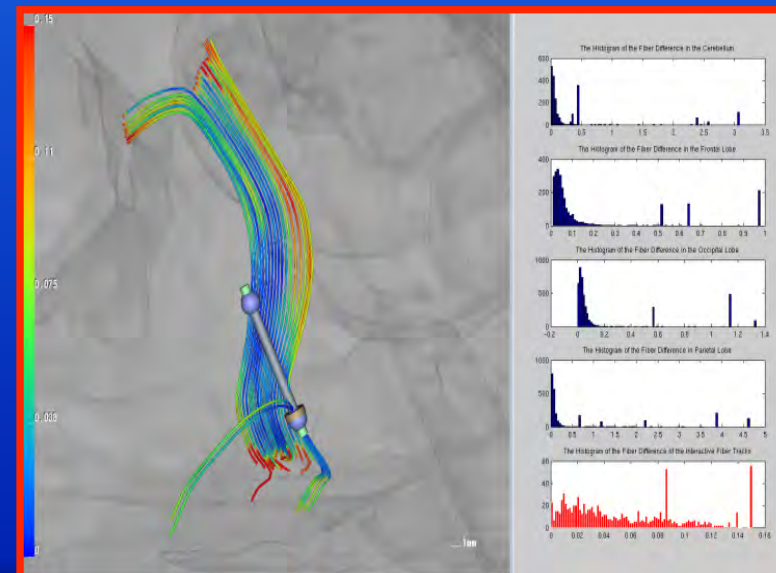
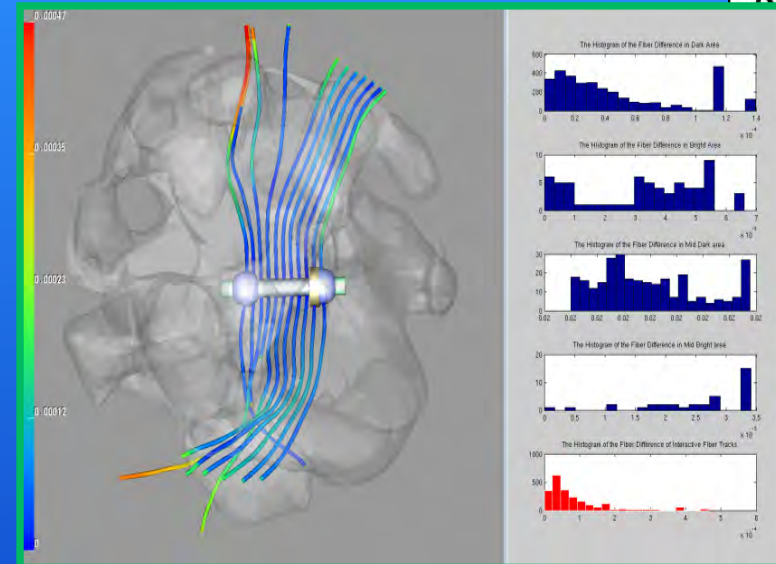
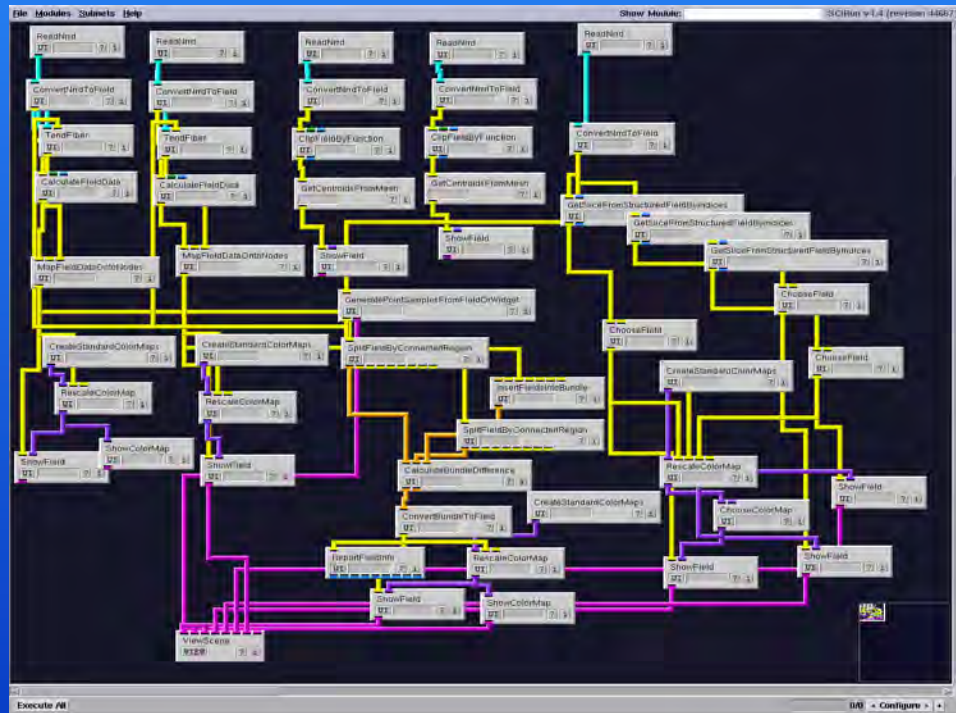


**Streamline**

**Fast Marching**

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# iQuantVis

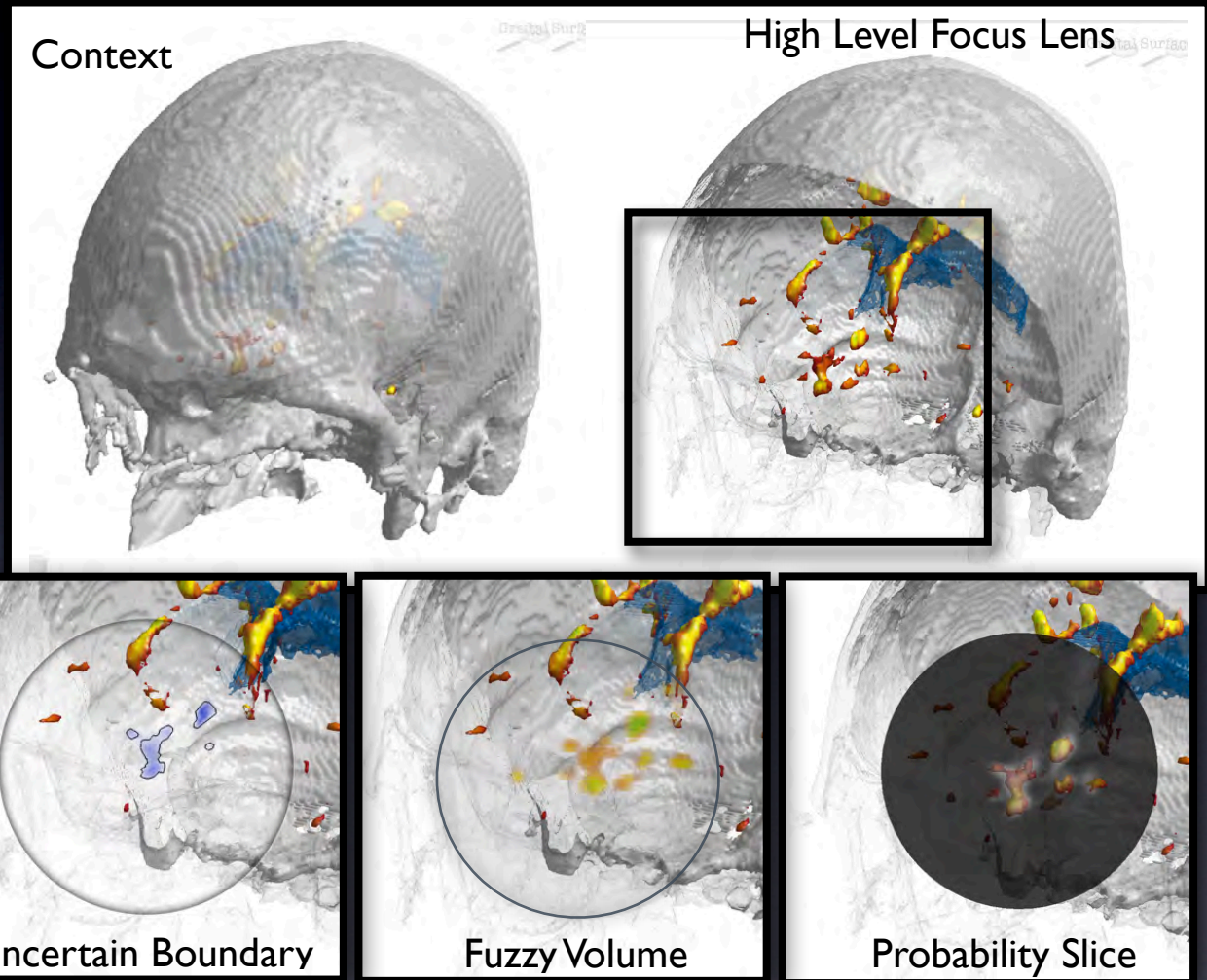


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# QuizLens: A Multi-lens approach for uncertainty exploration

- Global information important for qualitative evaluation & context
- Local information necessary for quantitative understanding
- Interchangeable lenses to explore various data characteristics



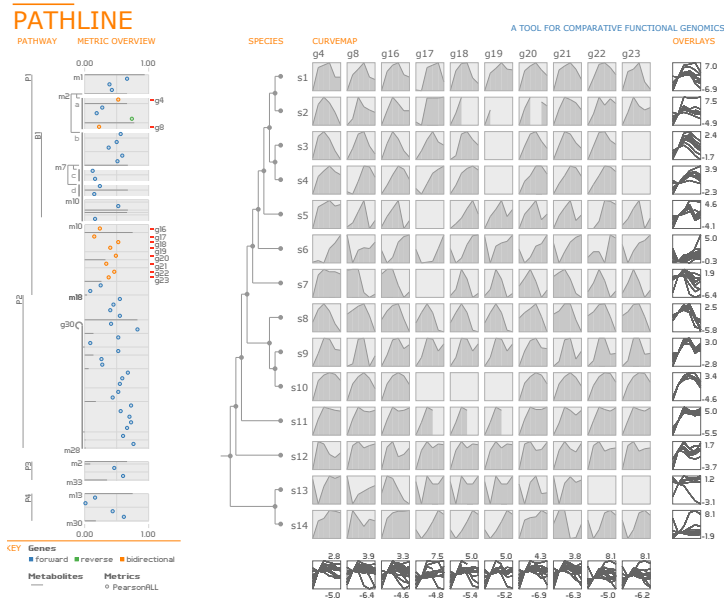
# PROBLEM-DRIVEN VISUALIZATION RESEARCH *for biological data*

- target specific biological problems
- close collaboration with biologists
- rapid, iterative prototyping
- focus on genomic and molecular data

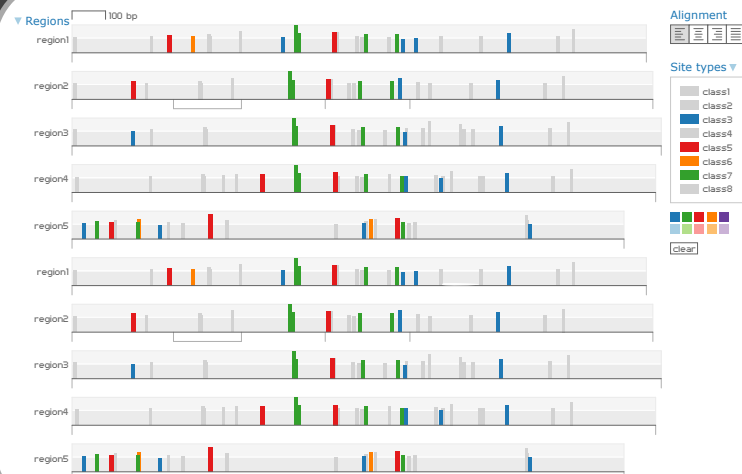
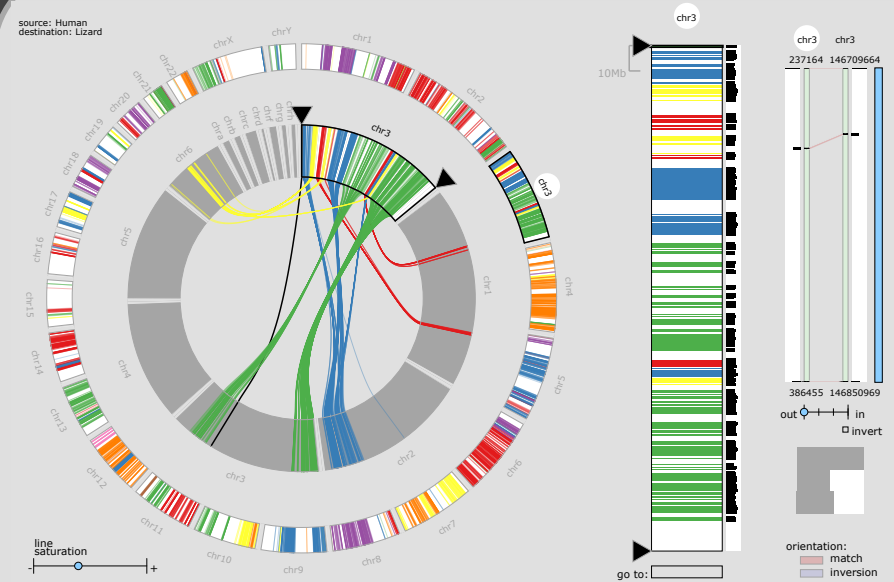




# Pathline

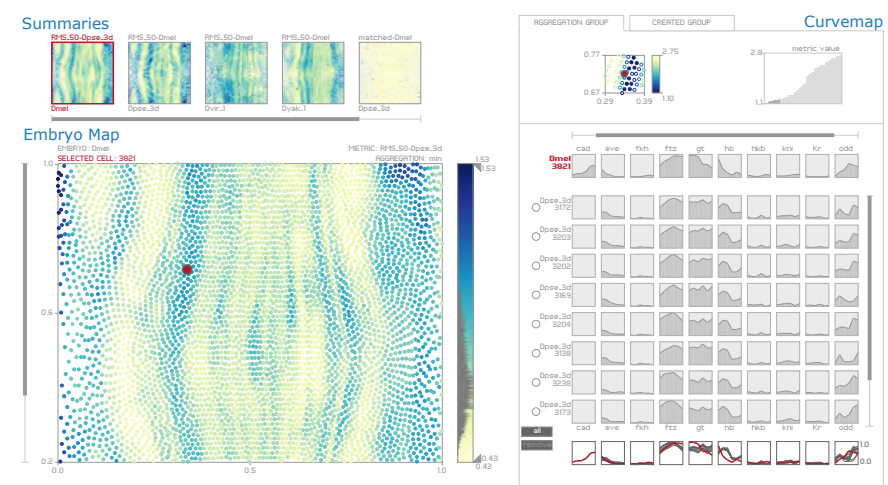


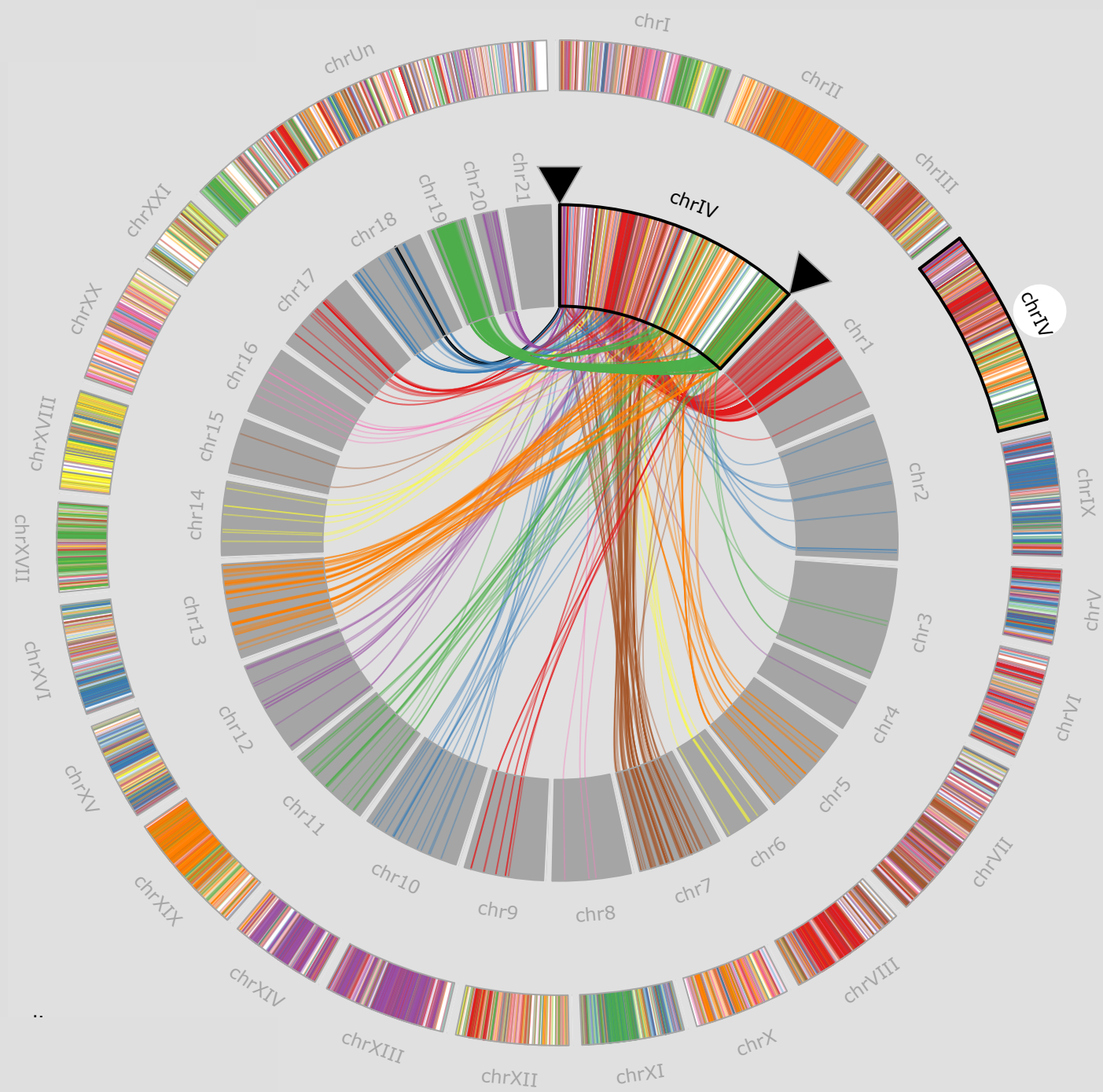
# MizBee



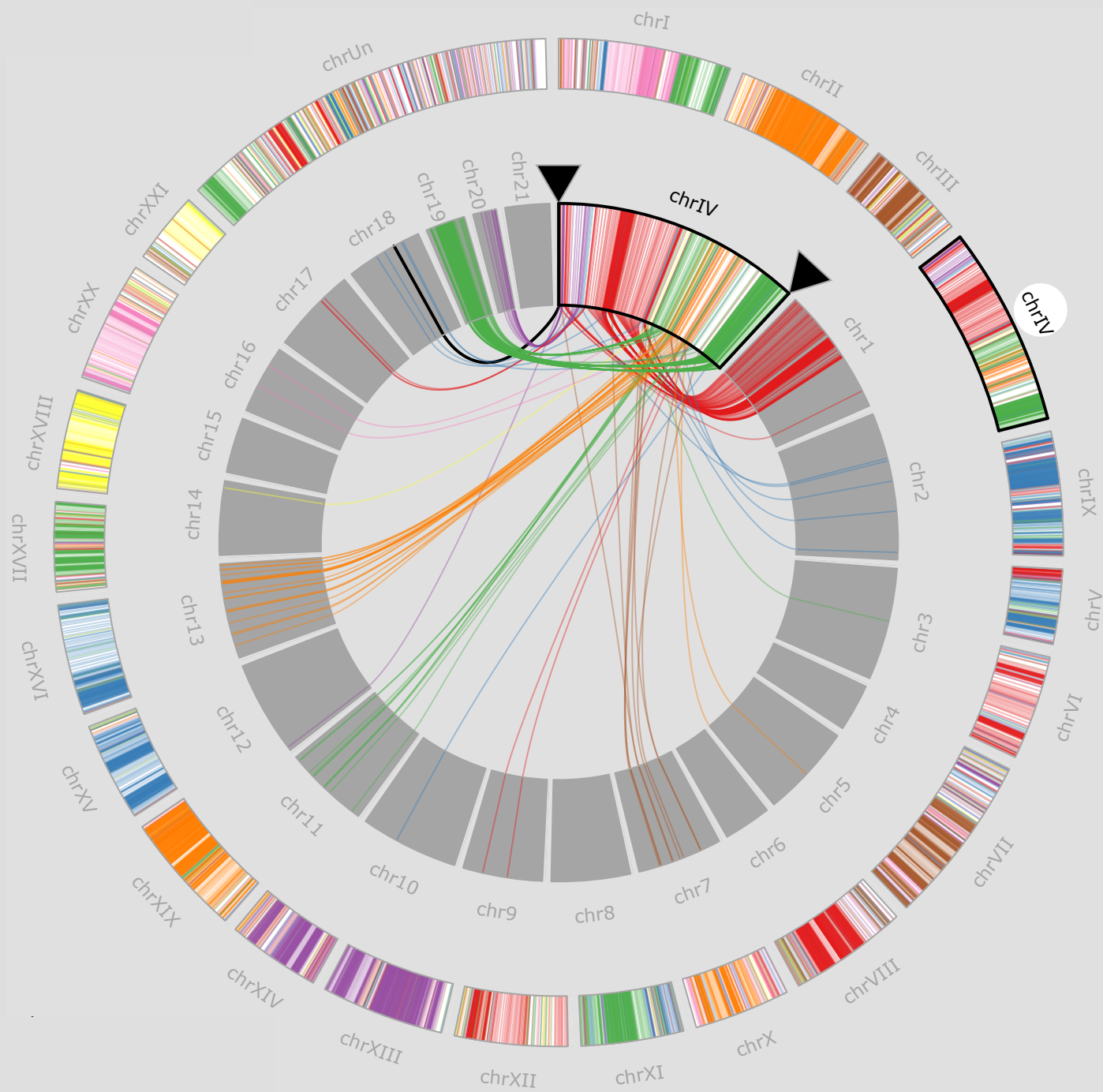
# InSite

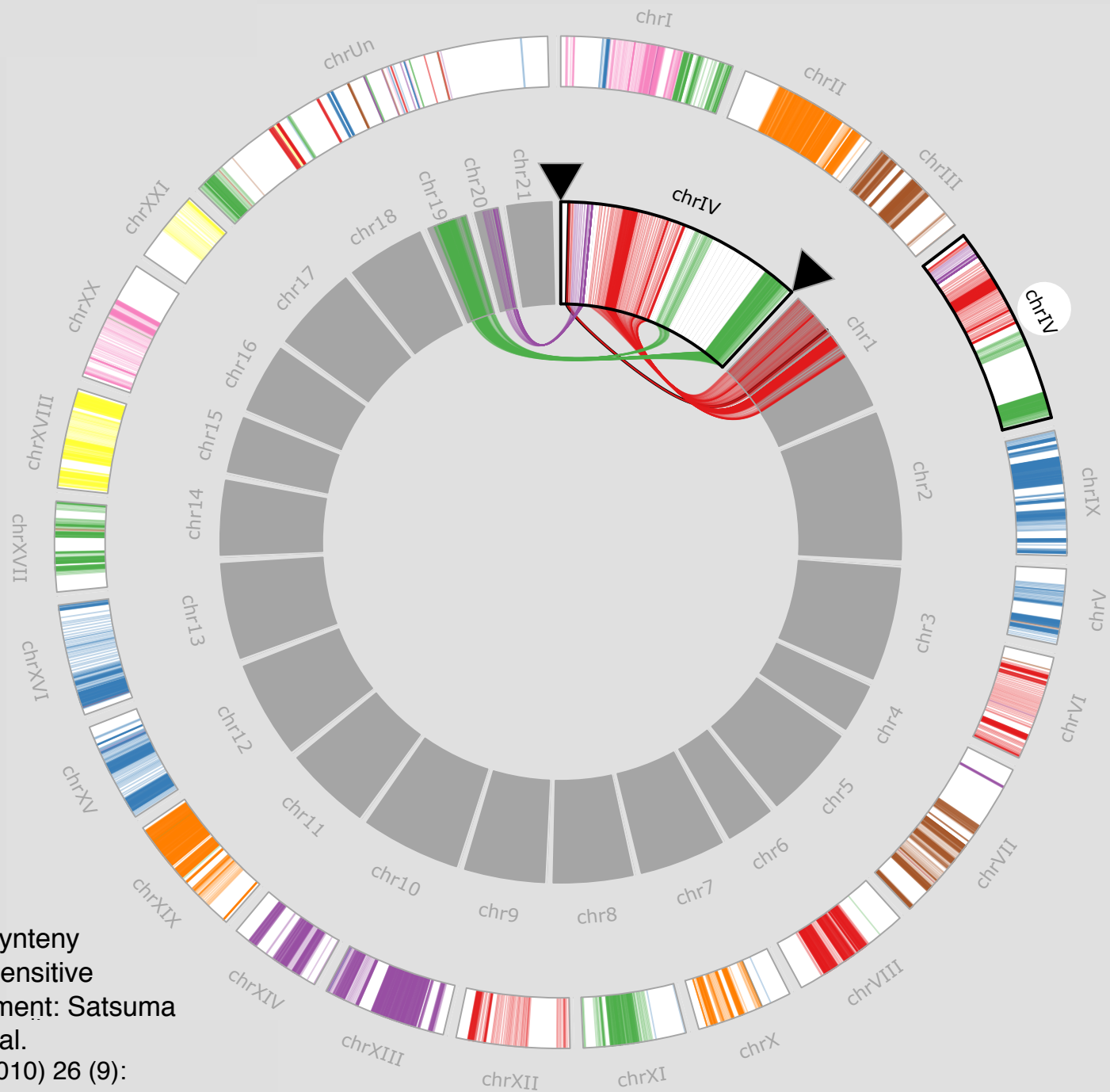
# MulteeSum











Genome-wide synteny  
through highly sensitive  
sequence alignment: Satsuma  
M. Grabherr, et al.  
Bioinformatics (2010) 26 (9):  
1145-1151.



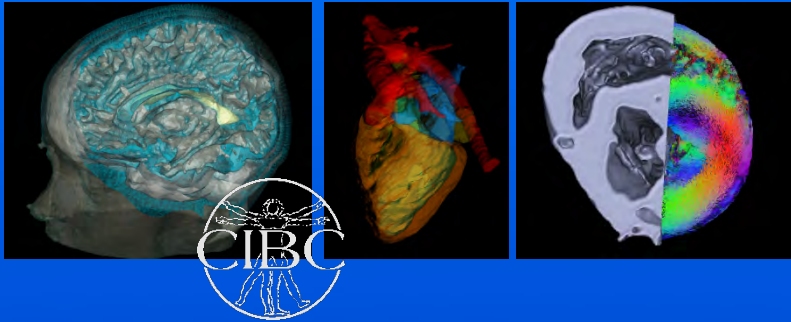
# The SCI Institute



# Acknowledgments

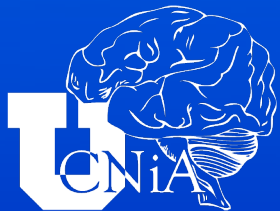
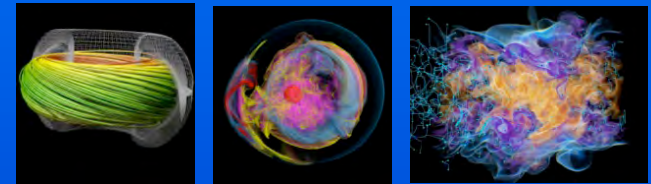


**NIH/NIGMS Center for Integrative  
Biomedical Computing**



## SDAV

**Scalable Data Management, Analysis  
and Visualization**



**Utah Center for Neuroimage Analysis**



**UTAH** Center for  
Computational Earth Sciences

**Center for Extreme Data Management,  
Analysis, and Visualization**



**NIH NAMIC**



**IAMCS**  
Institute for Applied Mathematics  
and Computational Science



## **More Information**

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**[crj@sci.utah.edu](mailto:crj@sci.utah.edu)**