



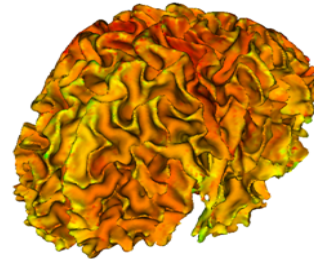
NA-MIC

*National Alliance for Medical Image Computing*

*<http://na-mic.org>*

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# Cortical Thickness Analysis with Slicer



Martin Styner

UNC - Departments of Computer Science and Psychiatry  
NIRAL, UNC IDDRC

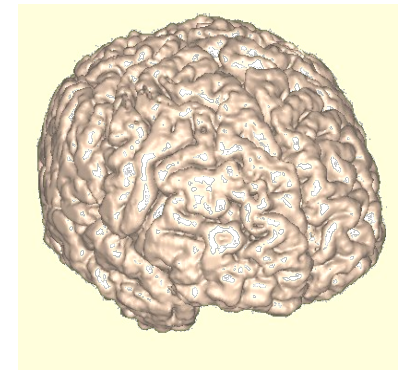
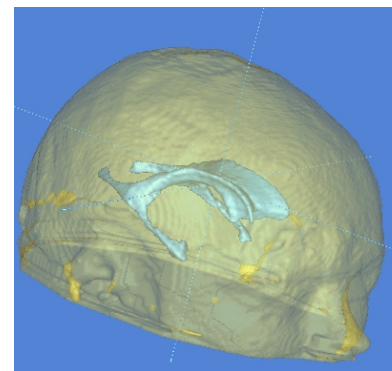
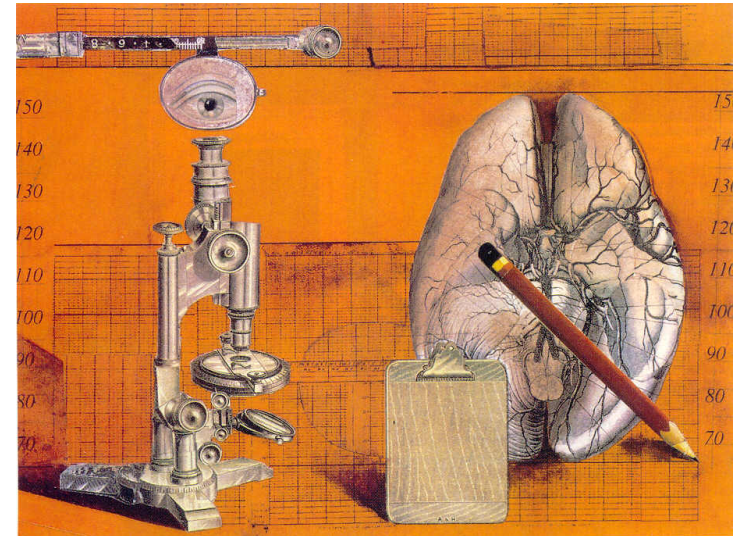
Guido Gerig, Ipek Oguz, Josh Cates, Clement  
Vachet, Cedric Mathieu, Marc Niethammer

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# Motivation Neuroimaging

- Morphometry  $\Leftrightarrow$  Pathology
  - Cortical Gray Matter thickness
- Schizophrenia, Autism, Alzheimer's, Huntington's...
- This talk:
  - Cortical thickness examples
  - Existing methods for cortical thickness
  - NA-MIC/Slicer modules
  - Future work

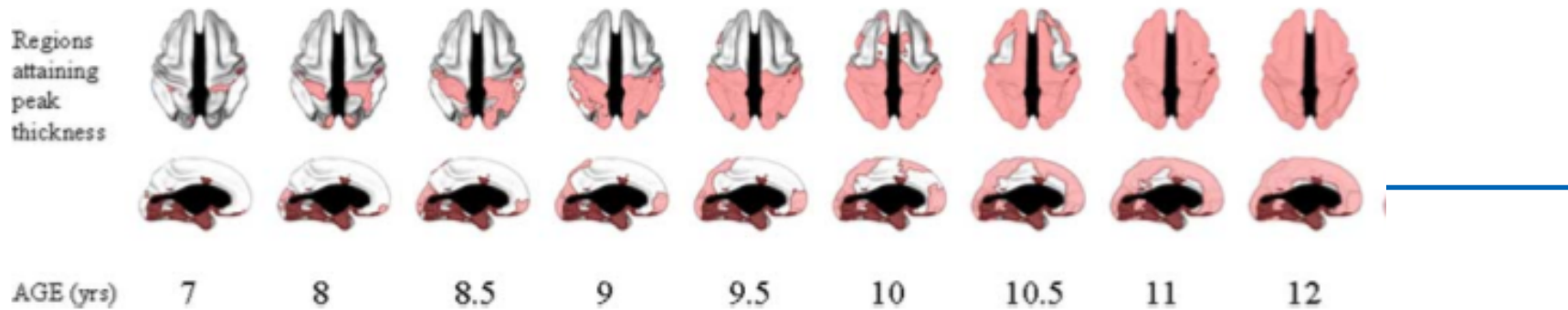
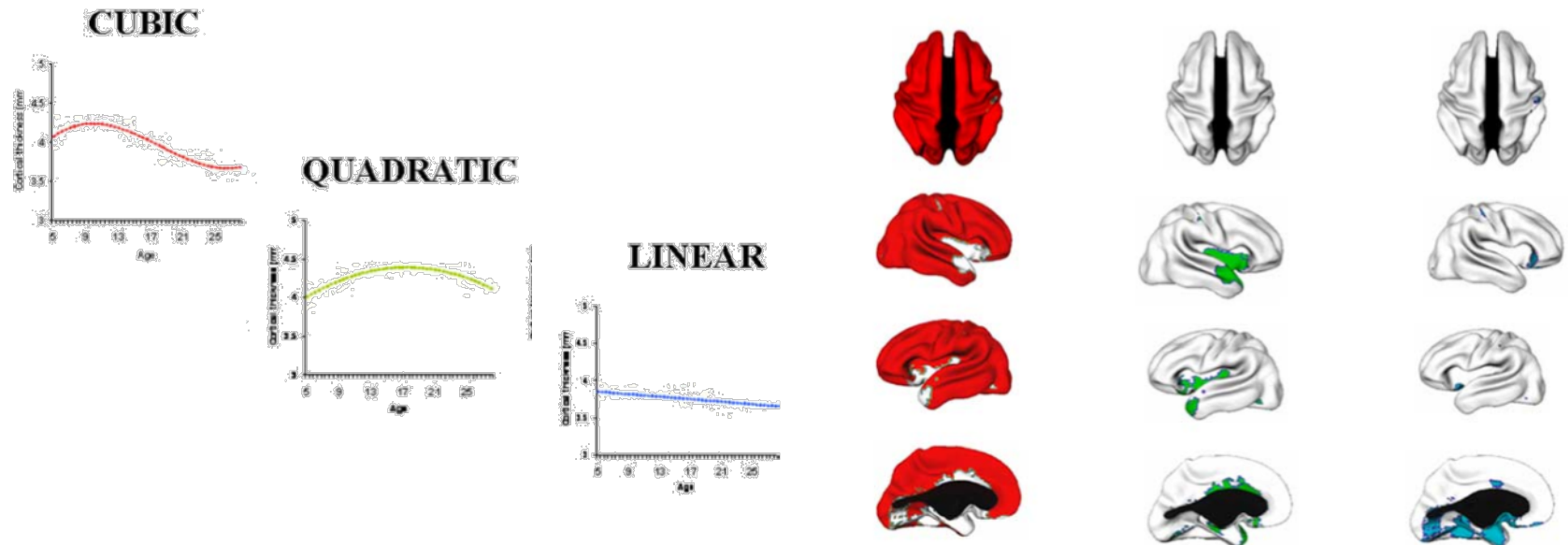




# Neurodevelopmental Trajectories of the Human Cerebral Cortex

Philip Shaw,<sup>1</sup> Noor J. Kabani,<sup>3</sup> Jason P. Lerch,<sup>4</sup> Kristen Eckstrand,<sup>1</sup> Rhoshel Lenroot,<sup>1</sup> Nitin Gogtay,<sup>1</sup> Deanna Greenstein,<sup>1</sup> Liv Clasen,<sup>1</sup> Alan Evans,<sup>4</sup> Judith L. Rapoport,<sup>1</sup> Jay N. Giedd,<sup>1</sup> and Steve P. Wise<sup>2</sup>

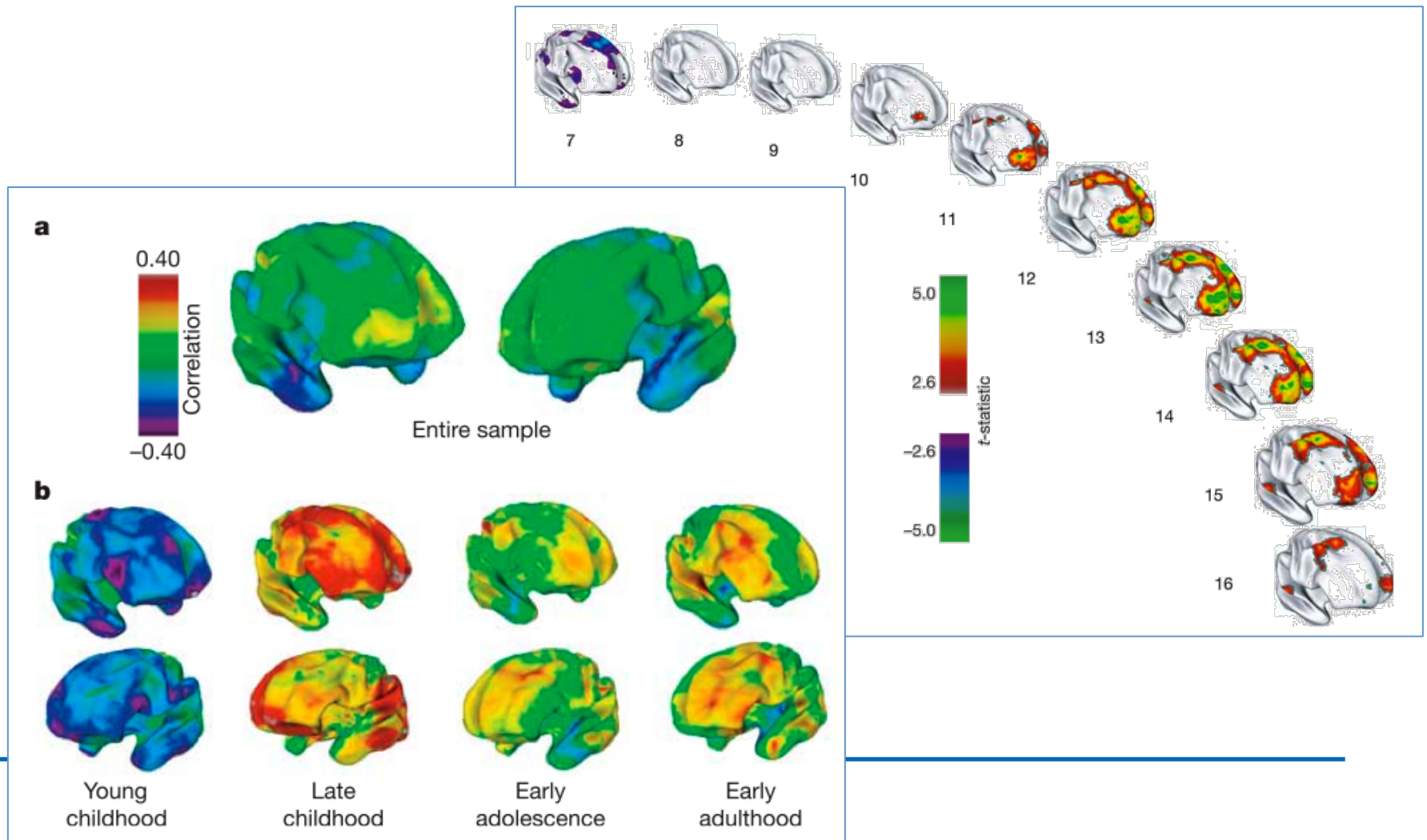
<sup>1</sup>Child Psychiatry Branch and <sup>2</sup>Laboratory of Systems Neuroscience, National Institute of Mental Health, Bethesda, Maryland 20892, <sup>3</sup>Sunnybrook Health Sciences Centre, Toronto, Ontario, Canada M4N 3N1, and <sup>4</sup>Montreal Neurological Institute, McGill University, Montreal, Quebec, Canada H3A 2B4





# Intellectual ability and cortical development in children and adolescents

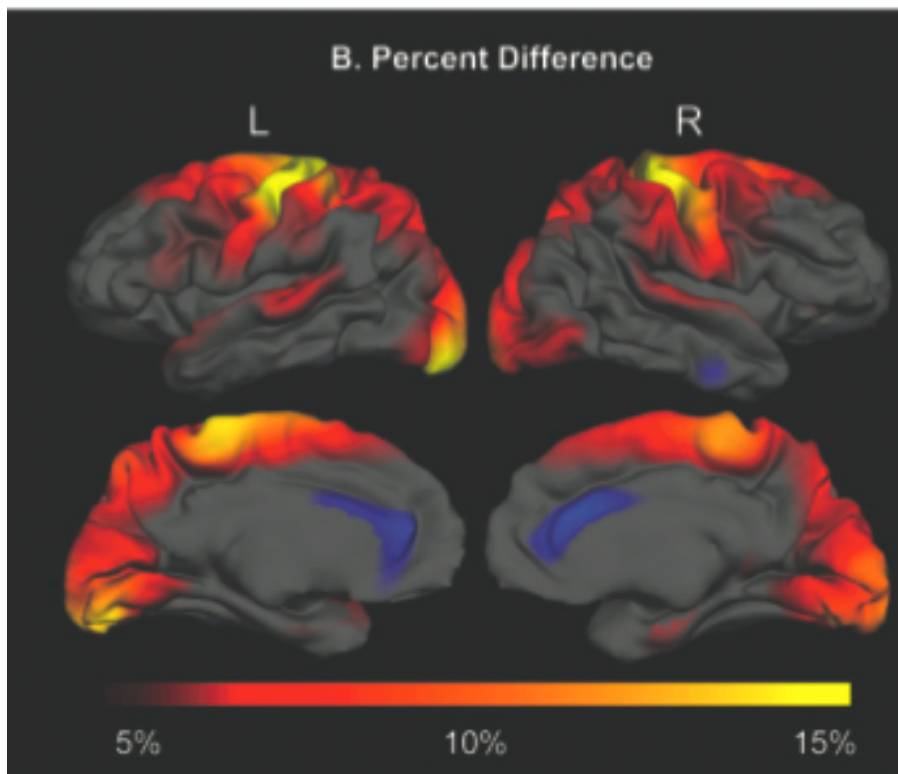
P. Shaw<sup>1</sup>, D. Greenstein<sup>1</sup>, J. Lerch<sup>2</sup>, L. Clasen<sup>1</sup>, R. Lenroot<sup>1</sup>, N. Gogtay<sup>1</sup>, A. Evans<sup>2</sup>, J. Rapoport<sup>1</sup> & J. Giedd<sup>1</sup>



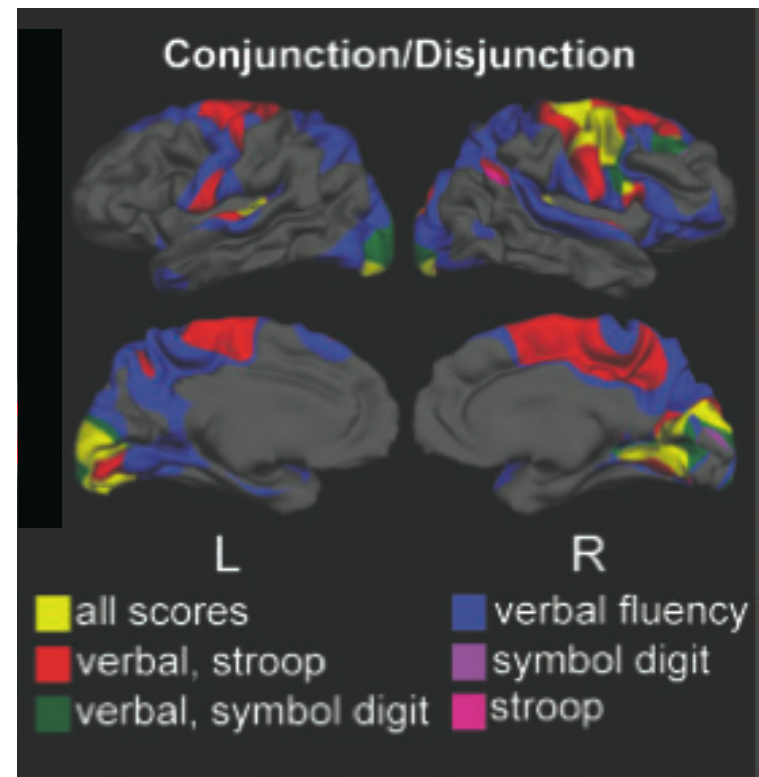


# Cerebral cortex and the clinical expression of Huntington's disease: complexity and heterogeneity

H. Diana Rosas,<sup>1,2,3</sup> David H. Salat,<sup>2,3</sup> Stephanie Y. Lee,<sup>1,2,3</sup> Alexandra K. Zaleta,<sup>1,2,3</sup> Vasanth Pappu,<sup>1,2,3</sup> Bruce Fischl,<sup>3,4</sup> Doug Greve,<sup>3,4</sup> Nathanael Hevelone<sup>5</sup> and Steven M. Hersch<sup>1</sup>



Cortical thinning

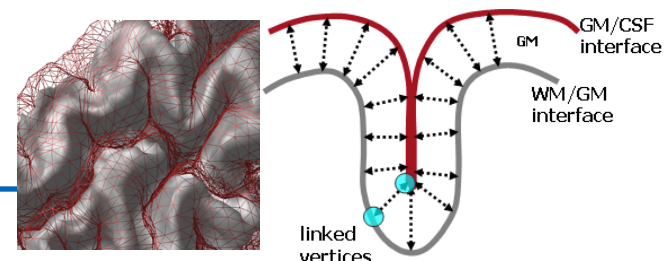
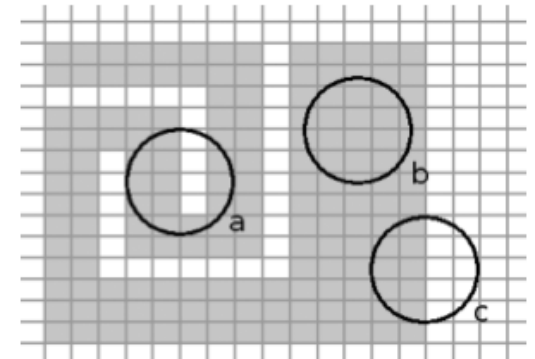


Correlation with cortical thinning



# Existing Methods

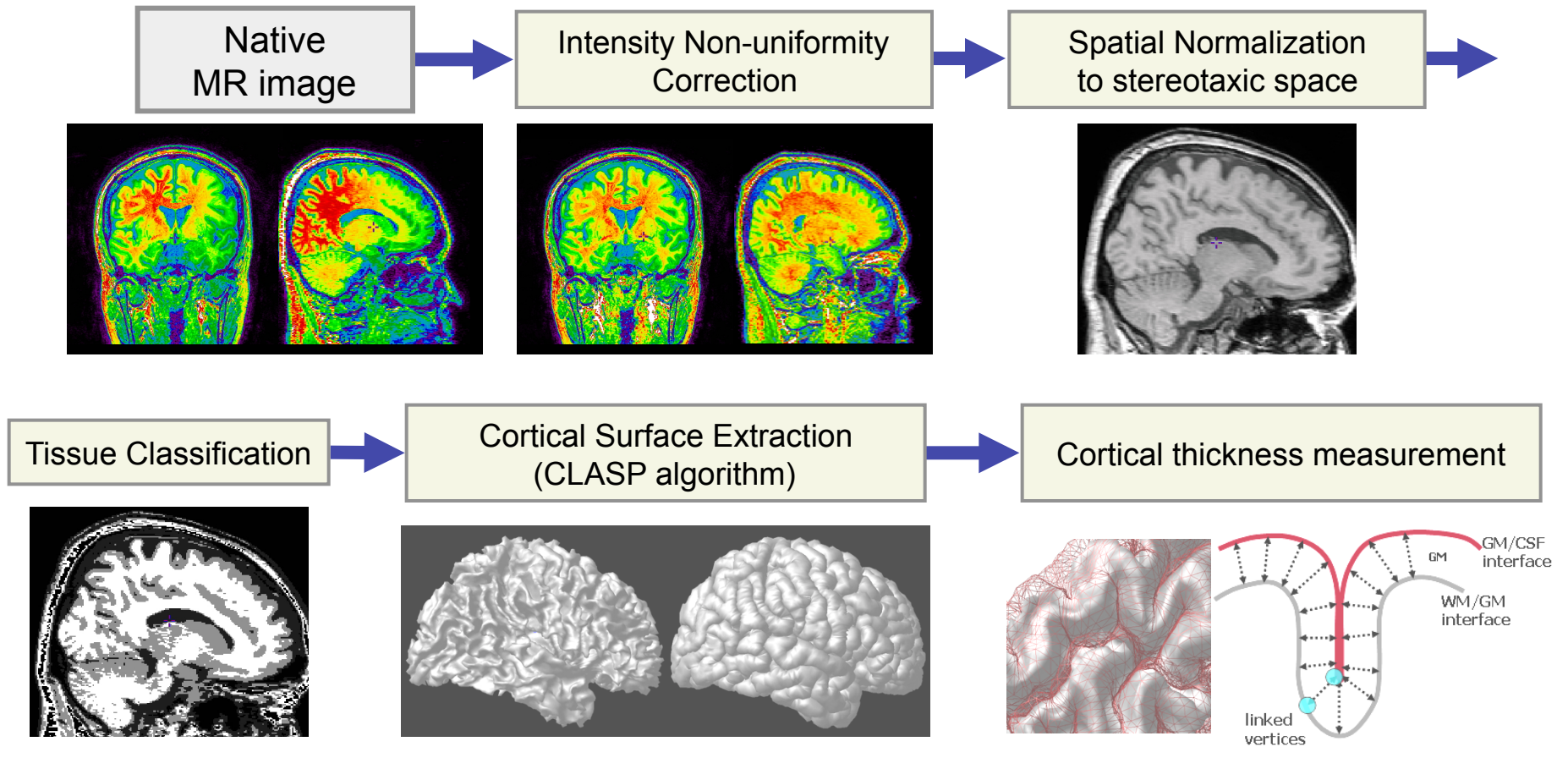
- Cortical thickness  $\neq$  Graymatter density
  - M Chung, TMI 2007, negatively correl.
- Major methods
  - BrainVoyager, Goebel
    - Commercialized, Brain Innovation
  - CLASP, Evans et al (MNI)
  - FreeSurfer, Fischl et al (MGH)
  - CRUISE, Tosun et al (JHU,UCLA,UCSF)





# CLASP - MNI

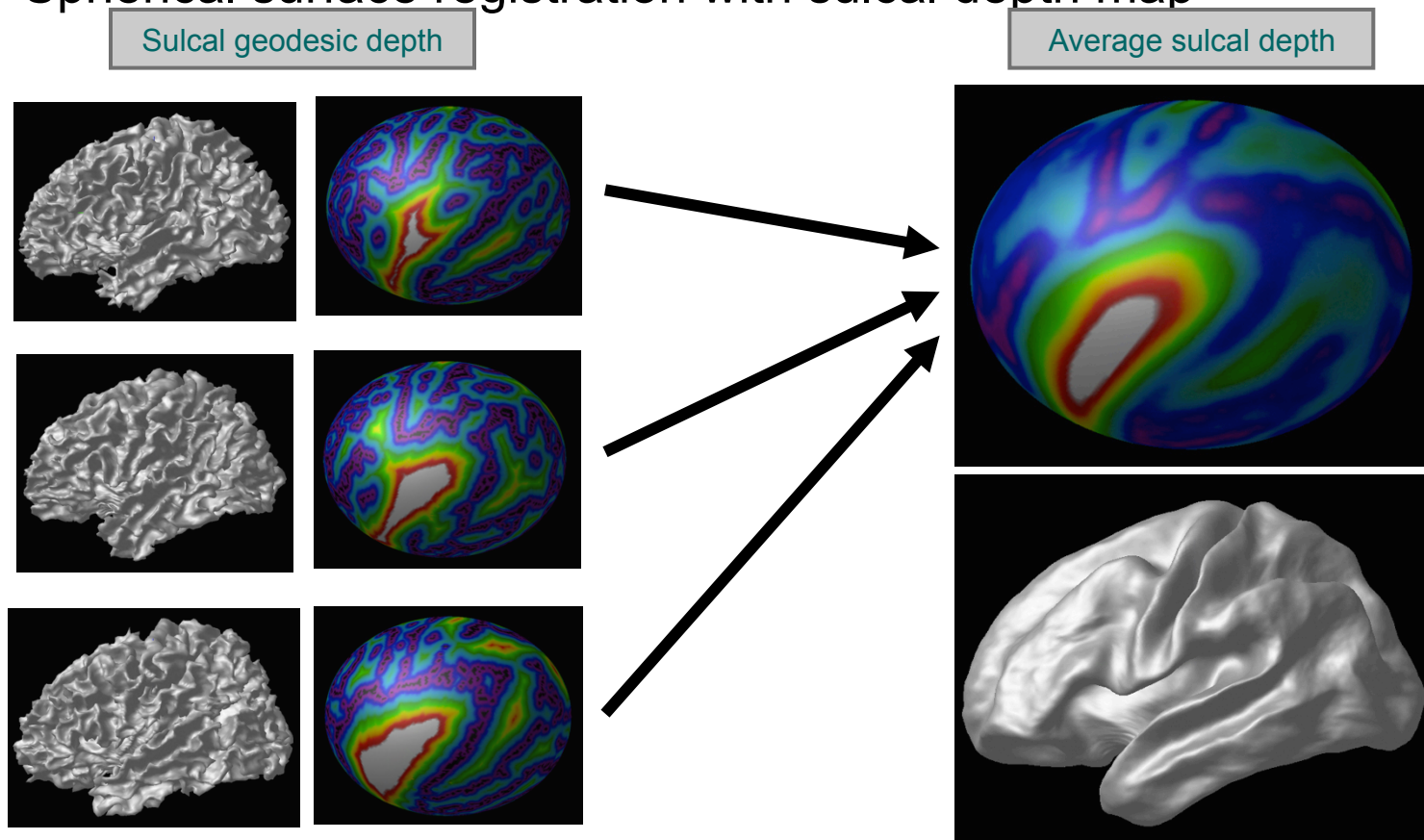
## • Image preprocessing & Cortical surface extraction





# CLASP Correspondence

- Nonlinear registration on 2D sphere surfaces
- Spherical surface registration with sulcal depth map

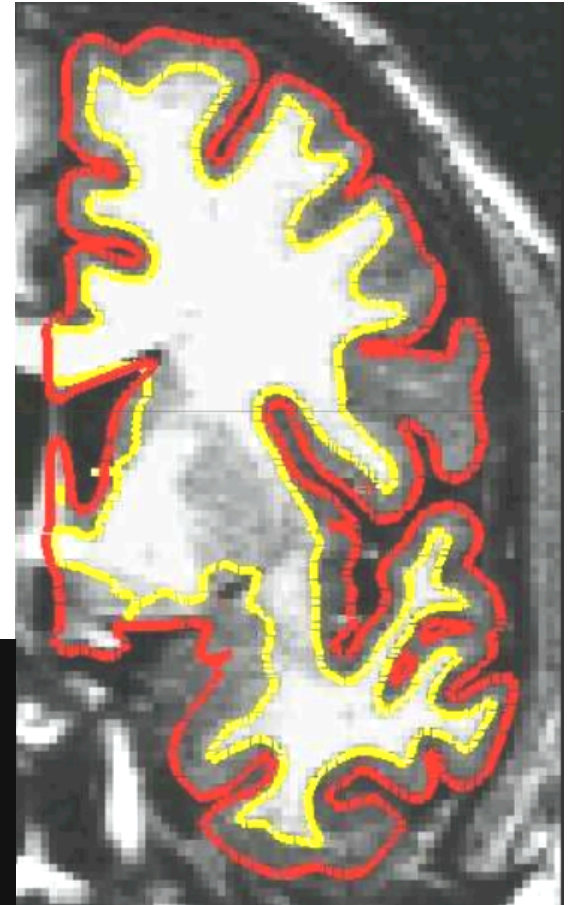
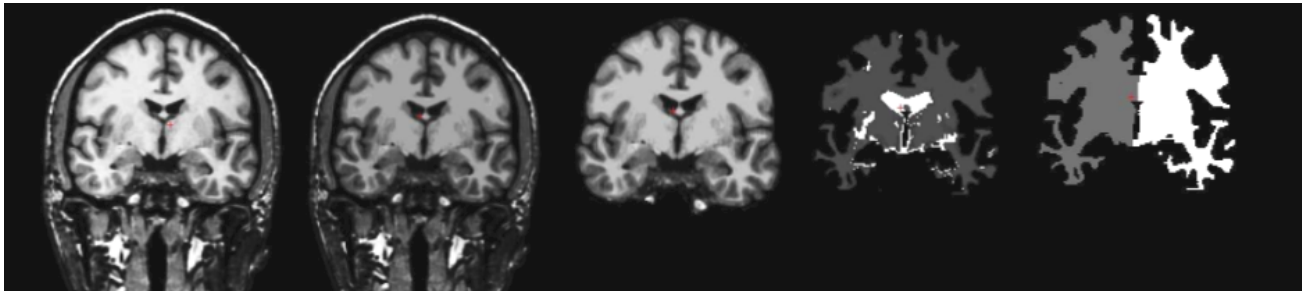






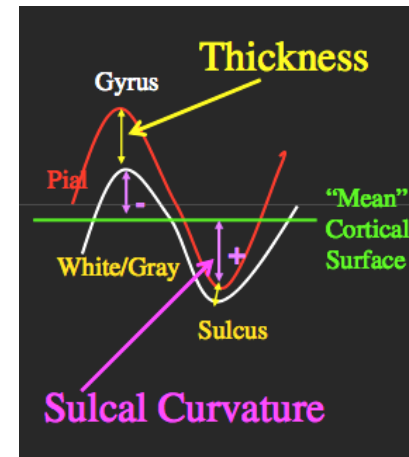
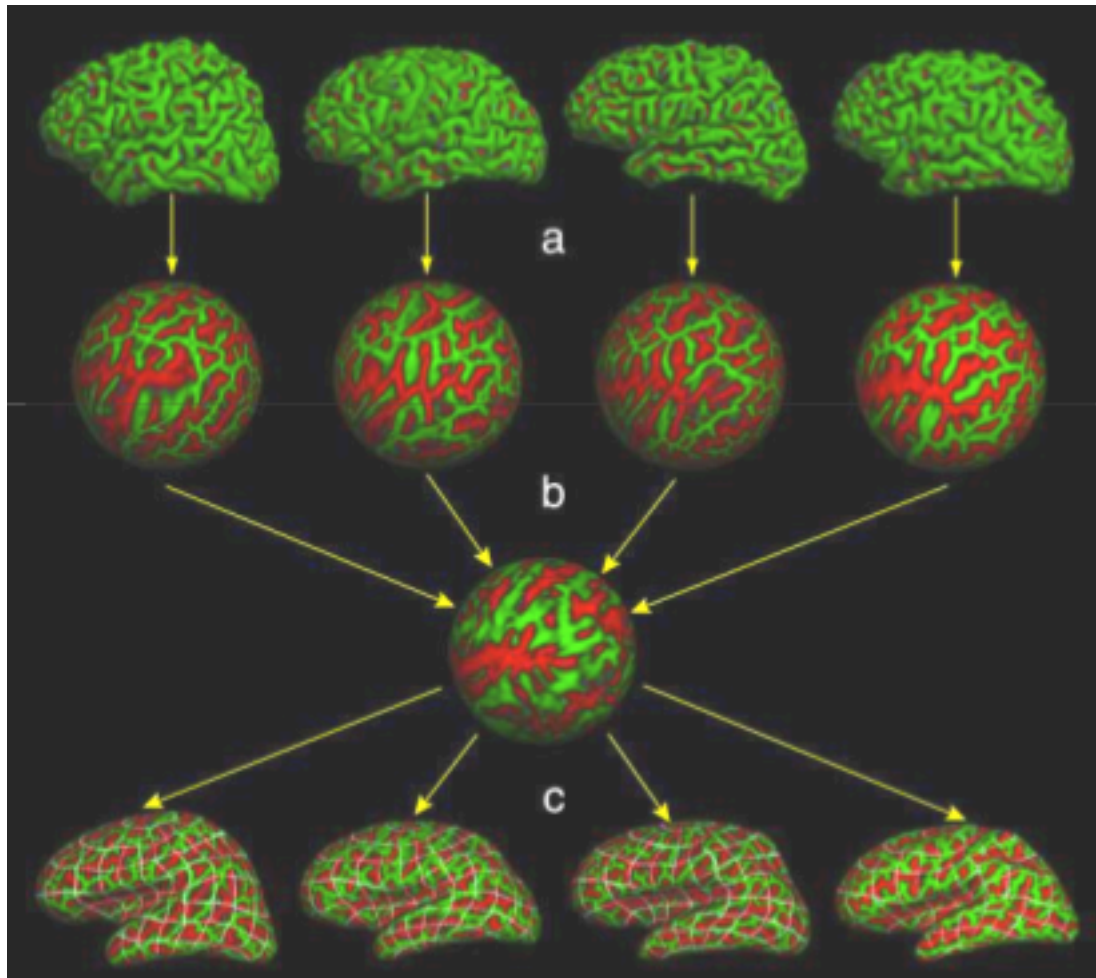
# FreeSurfer

- Similar preprocessing
  - Different order of steps
- WM from segmentation and topology correction
- GM surface from evolution along T1 intensity gradient





# FreeSurfer Correspondence



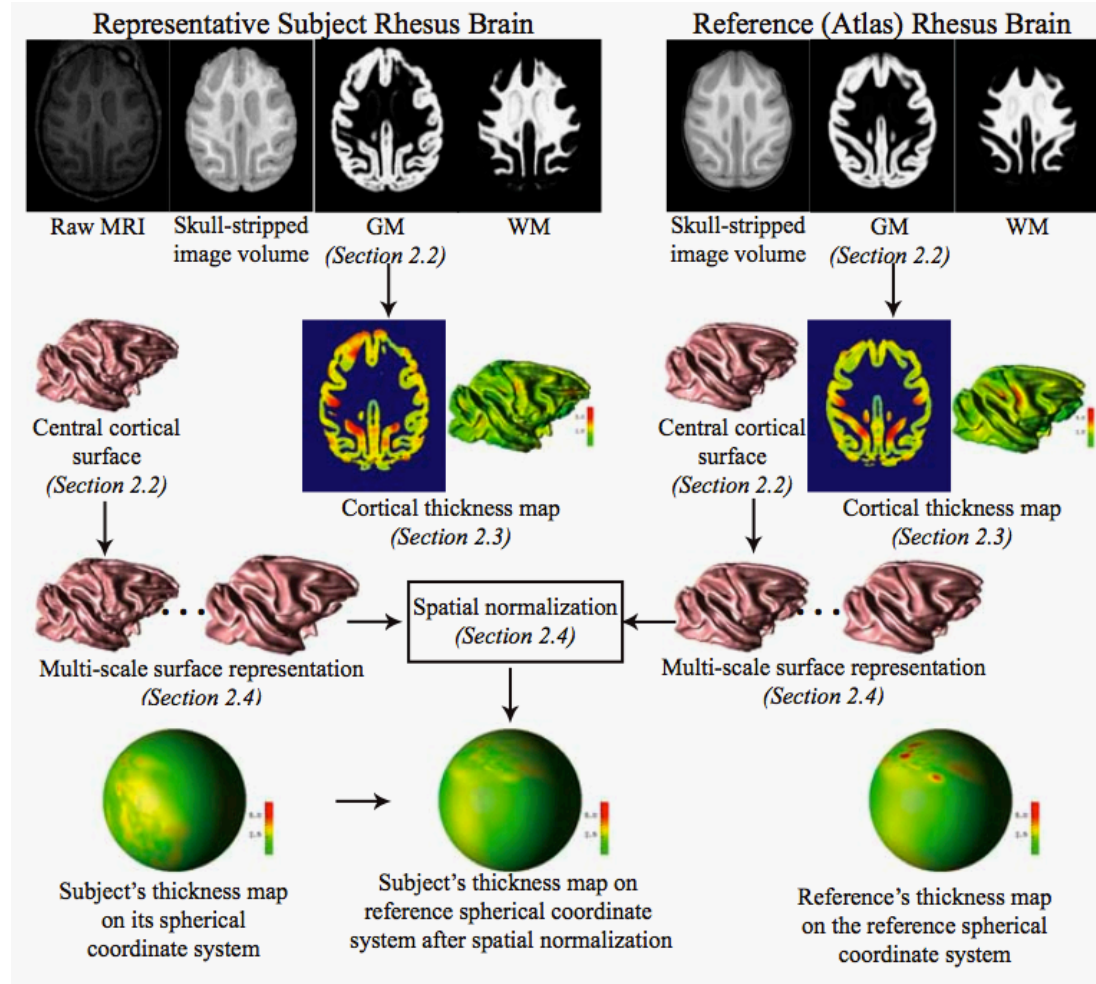
Sulcal depth

Surface registration  
to atlas



# CRUISE Cortical Reconstruction Using Implicit Surface Evolution

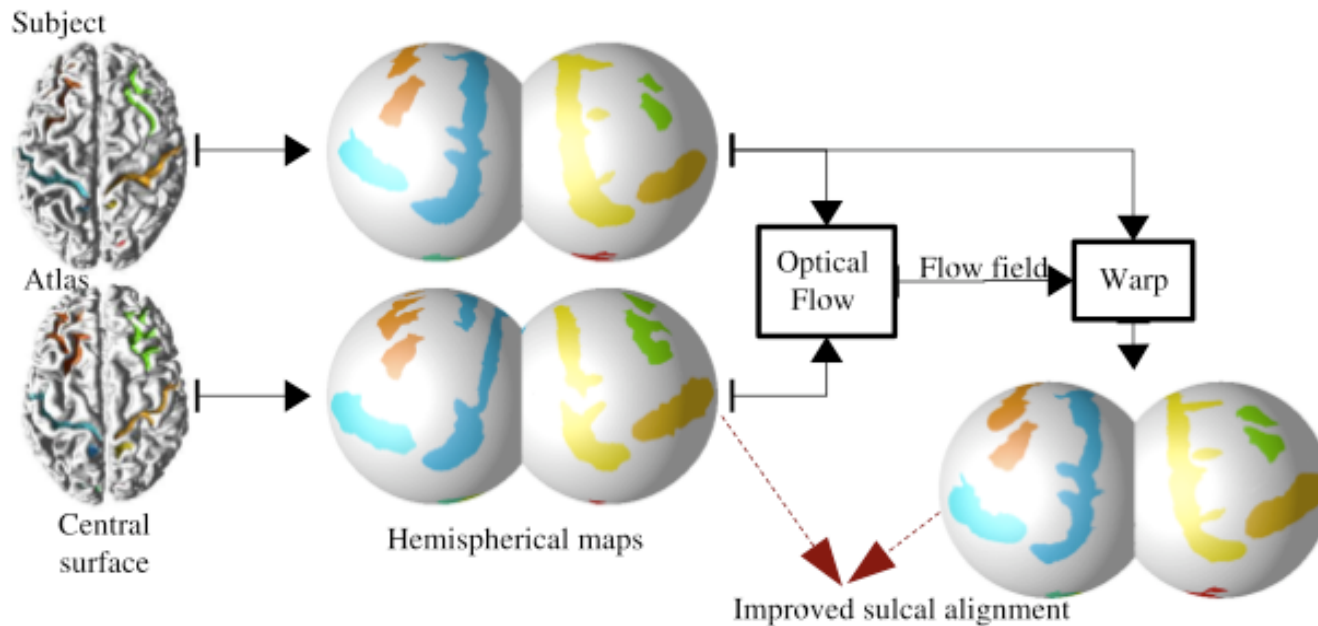
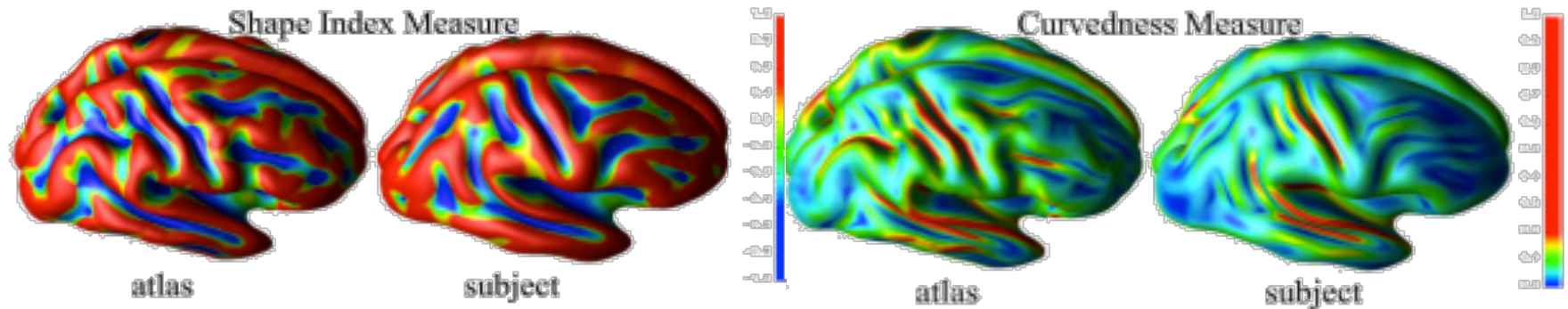
Laplacian based  
Cortical Thickness





# CRUISE Correspondence

## Koenderink Shape Measures





# Major Differences

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- Cortical topology
  - Spherical topology needed?
  - During or After WM/GM segmentation
- Thickness measurement
  - Closest point, skeleton based, deformation based and laplacian solution based
- Cortical correspondence
  - Many based on sulcal depth based or curvature
  - Template vs Group-wise? Parametrization?



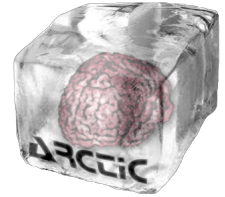
# NAMIC Approach for CT

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- 2 separate module pipelines

## 1. Regional/image based CT analysis:

- Template based registration, simple but stable, good for regional analysis



## 2. Local/surface based CT analysis

- Spherical topology, but **tolerance against violations**
- **Group-wise correspondence**
- **Extensible generic framework** that easily incorporates landmarks, connectivity, vessels, functional
- Full framework in open source, NAMIC Kit





# Regional CT – Pipeline

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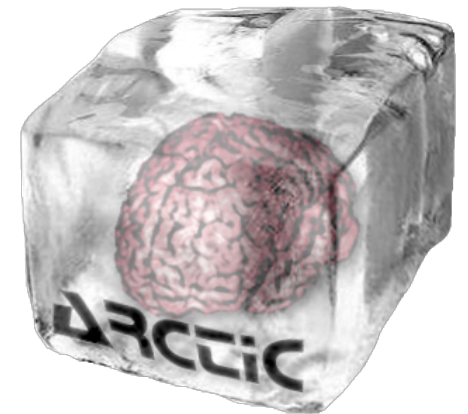
**Slicer external module (loadable via extension manager)**

*ARCTIC (Automatic Regional Cortical ThIckness)*

Input: raw data (T1-w, T2-w, PD-w images)

Three steps in the pipeline:

- 1. Tissue segmentation**
- 2. Regional atlas deformable registration**
- 3. Cortical Thickness**



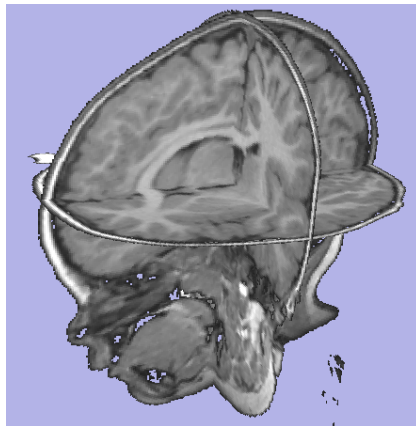


# ARCTIC pipeline

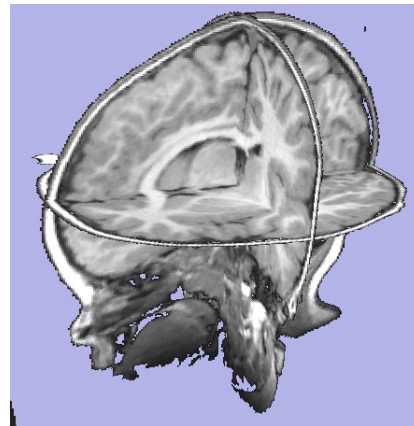
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## Step 1: Tissue segmentation

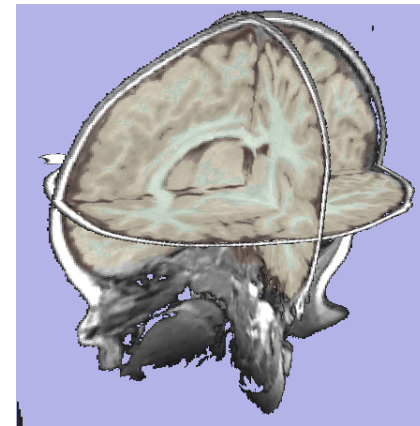
- Probabilistic atlas-based automatic tissue segmentation via an Expectation-Maximization scheme
- Tool: itkEMS or ABC (Automatic Brain Classification on NITRC, UNC & UUtah)



T1w image



Corrected image



Label image





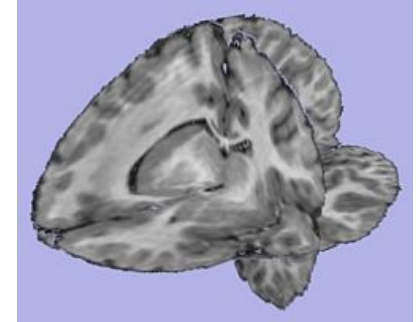
# ARCTIC pipeline (2)

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## Step 2. Regional atlas deformable registration

- **2.1** Skull stripping using previously computed tissue segmentation label image

Tool: SegPostProcess (UNC Slicer3 ext module)

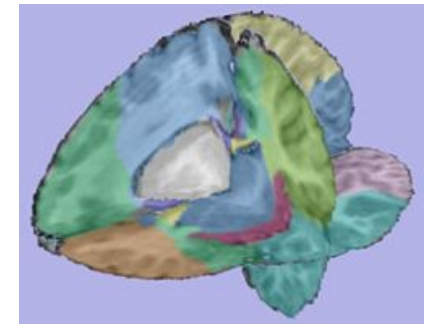


- **2.2** T1-weighted atlas deformable registration using a B-spline pipeline registration

Tool: RegisterImages (Slicer3 modules)

- **2.3** Applying transformation to the parcellation map

Tool: ResampleVolume2 (Slicer3 module)





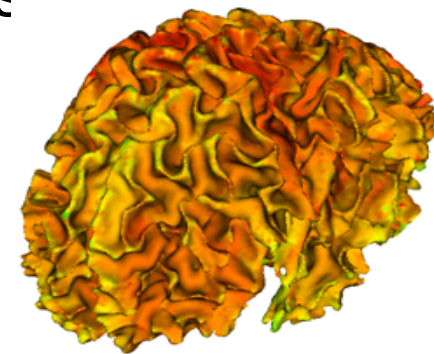
# ARCTIC pipeline (3)

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## Step 3. Cortical Thickness

- Sparse asymmetric local cortical thickness
- Uses distance map based local maxima to correct for CSF/GM errors (akin to skeleton based CT)
- Tool: CortThick (UNC Slicer3 module)

*Note:* All the tools used in the pipeline are Slicer3 modules, some of them being UNC external modules. All can be run as command line and thus are scriptable





# ARCTIC Validation

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## ARCTIC vs. Freesurfer:

Freesurfer's tutorial dataset consisting of 40 healthy subjects, ranging in age from 18 to 93, Pearson correlation of the mean lobar CT's

- As is: Good correlation for parietal lobe, other lobes  $r < 0.7$
- When using Freesurfer's WM/GM segmentation: all lobes  $r > 0.75$
- Also using Freesurfer's parcellation: all lobes  $r > 0.85$

Longitudinal autism study of 86 subjects aged 2-4 years.

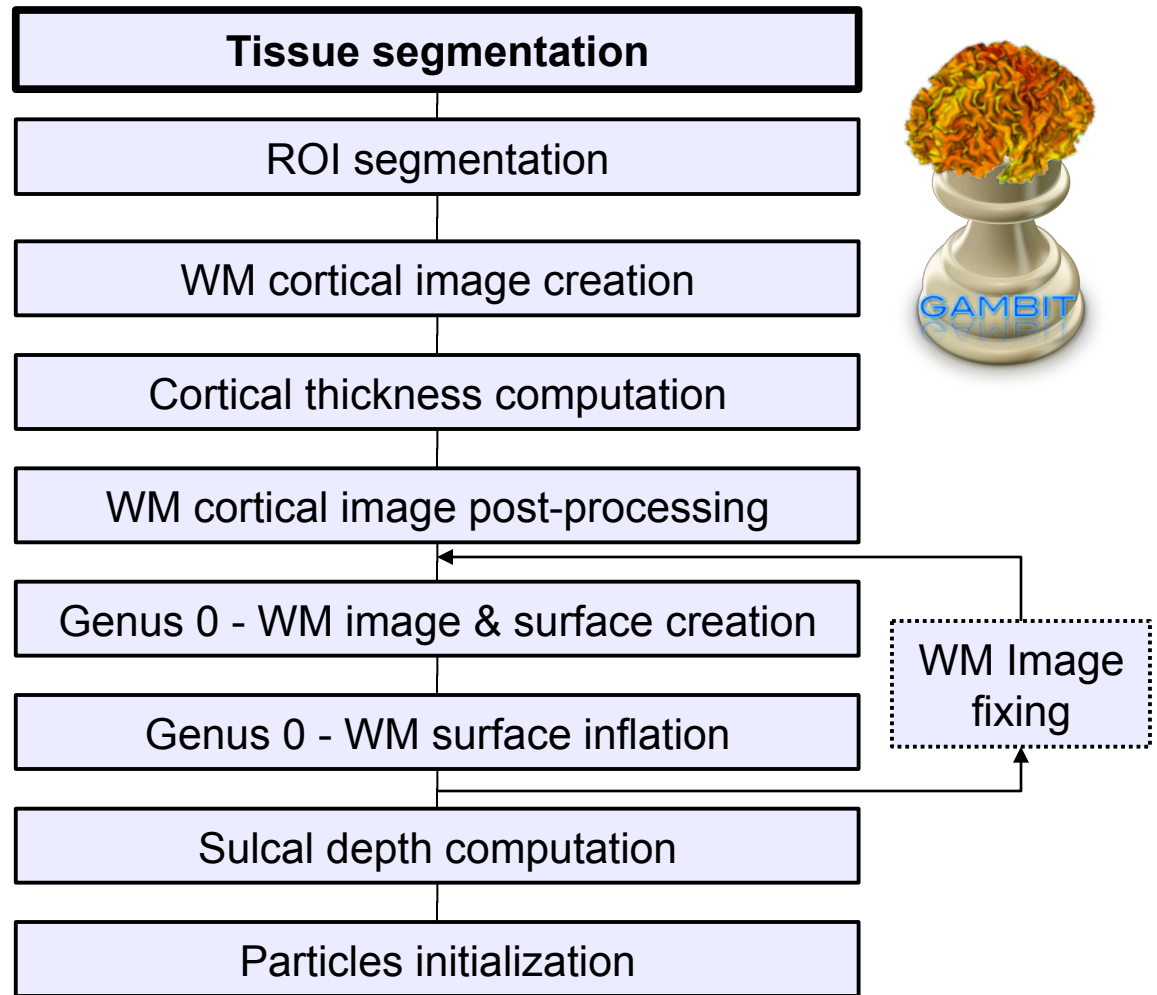
- FreeSurfer low success: <40% without, <70% manual intervention
- ARCTIC: 98% success rate



# GAMBIT: local CT analysis

Group-wise  
Automatic Mesh-  
Based Analysis  
of Cortical  
Thickness  
(GAMBIT)

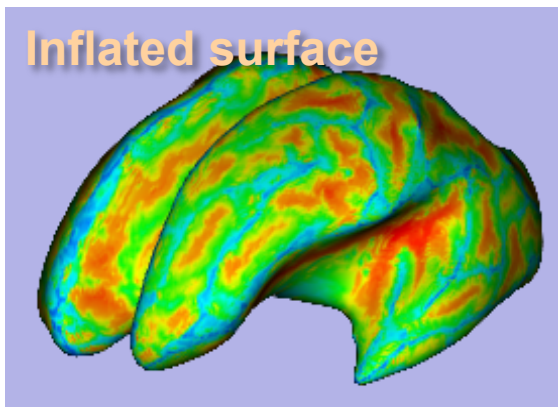
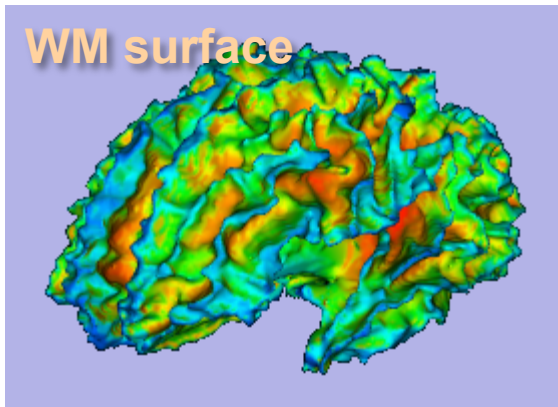
Similar processing  
to other local  
approaches



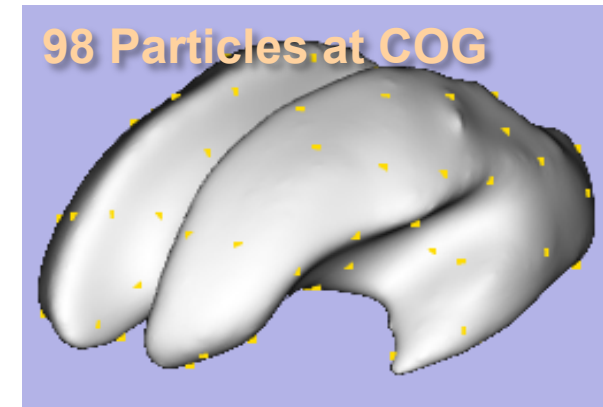
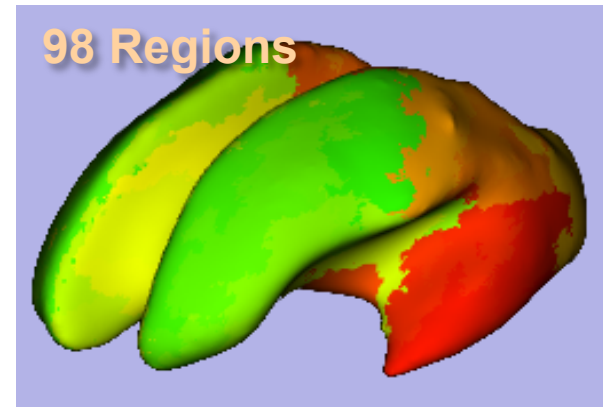


# Inflation, Sulcal Depth and Particle Initialization

Sulcal Depthmap



Particle Placement

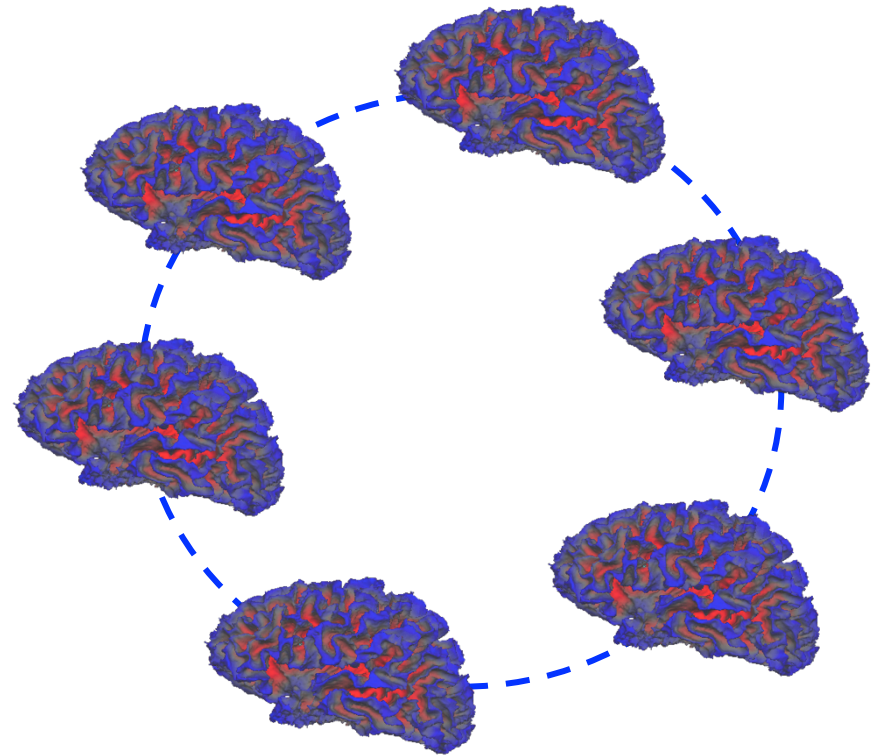




# Group-wise Correspondence

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- Template free
- Correspondence over all surfaces
- Minimum Description Length
  - Davies et al
  - Parametric framework
- Entropy: Oguz & Cates
  - UNC & Utah

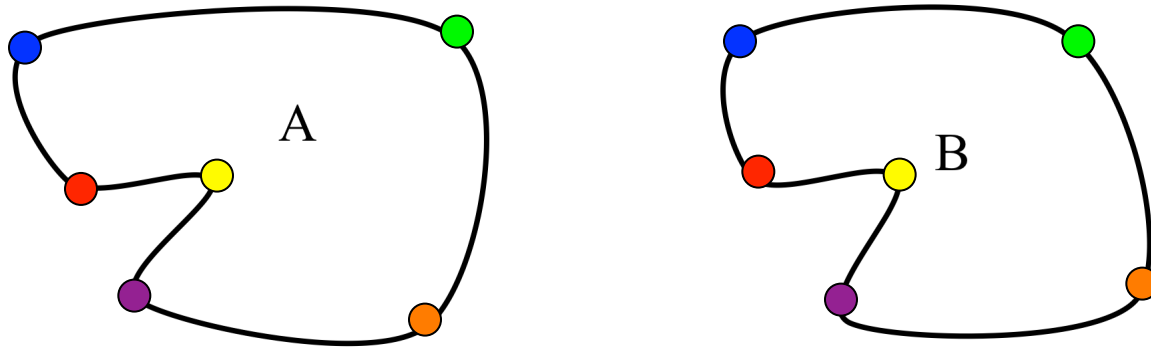




# Particle Approach (Cates & Oguz)

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- Point-based sampling of the surface
  - Same number of particles per shape
  - Very different from all other parametric approaches
- Particles are ordered → correspondence
- Incorporates functions of position
  - Local curvature, Sulcal depth, DTI connectivity





# Entropy Tradeoff

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- Simultaneously maximize both the **geometric accuracy** and the **statistical simplicity** of the model

$$Q = H(Z) - \sum_k H(P^k)$$

k: shape id  
P: particle locations  
Z: ensemble distribution

↓  
**Ensemble entropy**  
(small = simple)

↓  
**Surface entropy**  
(large = accurate)

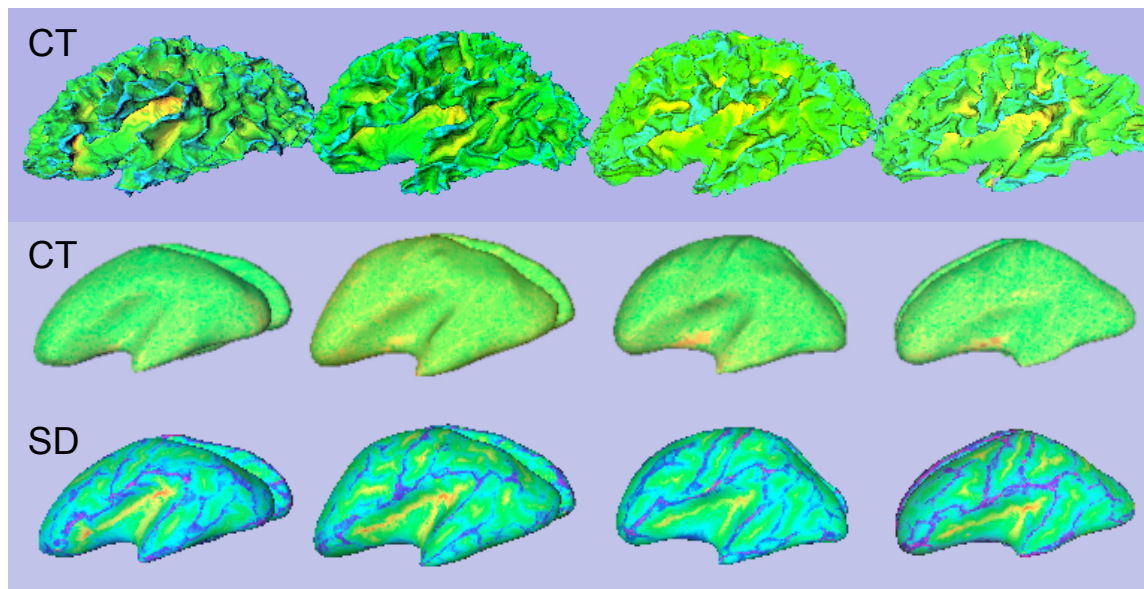




# Dealing with Cortical Geometry

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- Highly convoluted surface is a problem
  - Particle correspondence computed on 3D image grid
- Solution: run correspondence on inflated brain
  - Convex move in, concave move out





# Experiments

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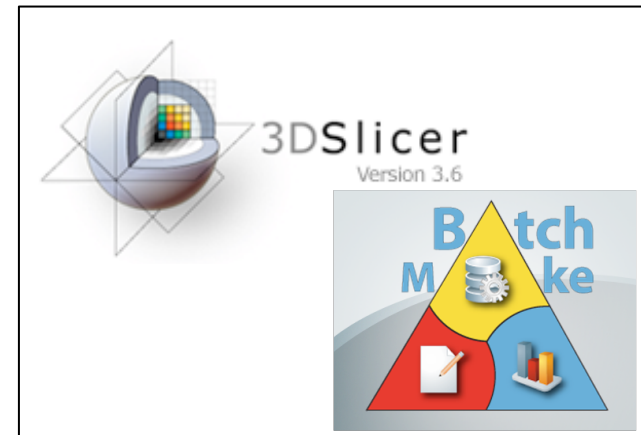
- 9 healthy subjects
- Correspondence metric: sulcal depth
- Reduction of sulcal depth variance
- Compare vs Freesurfer, same init

	Sulcal Depth	Cortical Thickness
Initial Data	0.227634	0.334858
XYZ-entropy	0.219627	0.341715
<b>SulcalDepth-entropy</b>	<b>0.00346167</b>	<b>0.310751</b>
FreeSurfer	0.075644	0.303376



# Open Source Framework

- All BSD style open source
- Slicer external modules for all individual steps
- “Super” modules (ARCTIC and GAMBIT)
  - Generates and run BatchMake script that calls steps
  - Can be run local or on grid





# Discussion & Future Work

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- Cortical thickness
  - Important for neuroimaging studies
  - Many tools, NAMIC cortical thickness
- Next steps
  - Regional CT: First study papers in review on cortical thickness in Autism (DPB II)
  - Full Framework, testing, tutorials
  - Cortical thickness in rodents

