



The Nighres Toolbox

Pierre-Louis Bazin

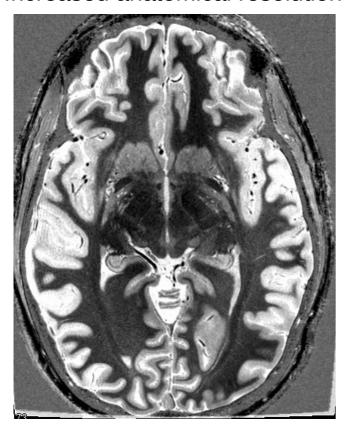
pilou.bazin@uva.nl
Integrative Model-based Cognitive Neuroscience research unit
Universiteit van Amsterdam





High resolution MRI at 7T

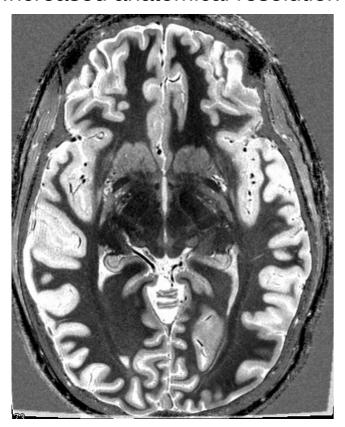
Increased anatomical resolution



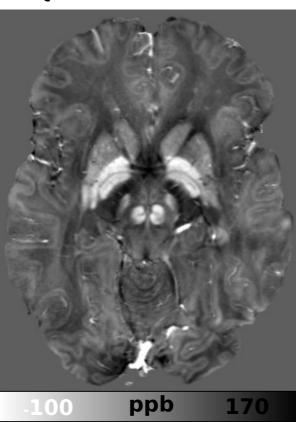
[Gallichan and Marques, ESMRMB 2015]

High resolution MRI at 7T

Increased anatomical resolution



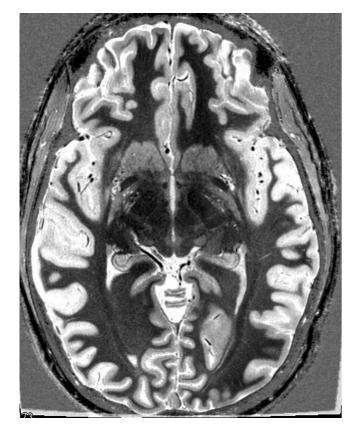
Quantitative contrasts



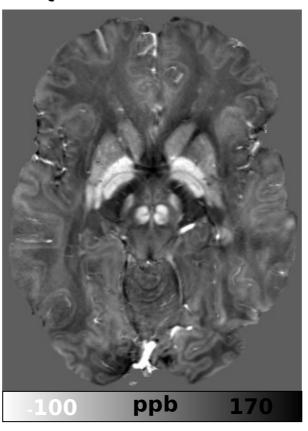
[Gallichan and Marques, ESMRMB 2015] [Deistung A et al. Neuroimage. 2013]

High resolution MRI at 7T

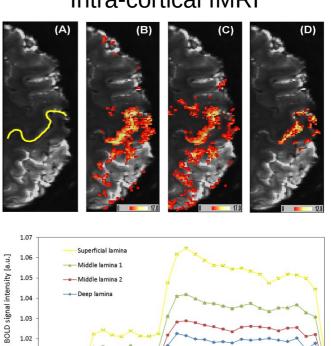
Increased anatomical resolution



Quantitative contrasts

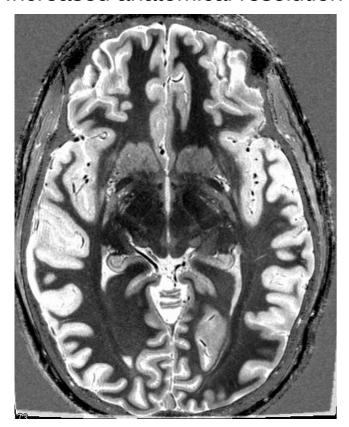


Intra-cortical fMRI



[Gallichan and Marques, ESMRMB 2015] [Deistung A et al. Neuroimage. 2013] [Trampel et al., SfN 2011]

Increased anatomical resolution

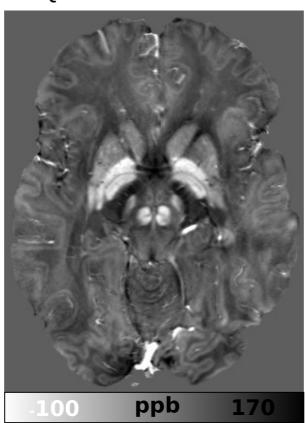


Explosion of data size and processing times

Increased anatomical resolution



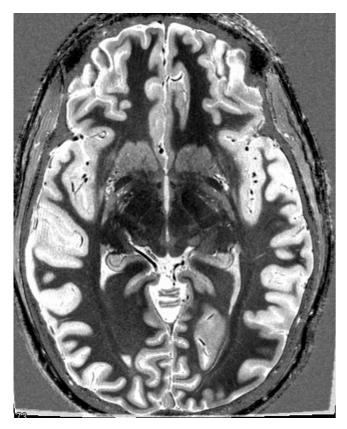
Quantitative contrasts



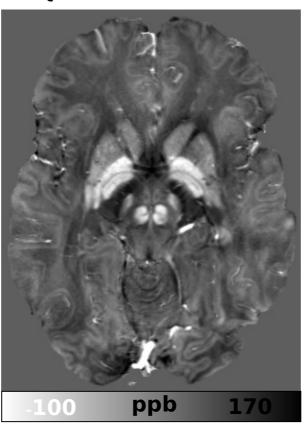
Explosion of data size and processing times

New models of the signal needed

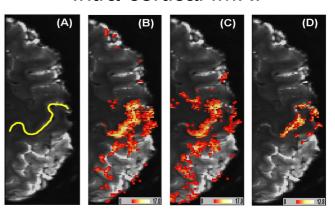
Increased anatomical resolution

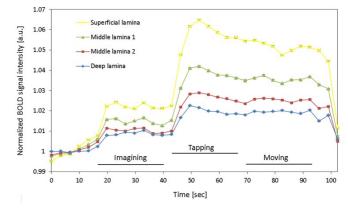


Quantitative contrasts



Intra-cortical fMRI





Explosion of data size and processing times

New models of the signal needed

Increase in required spatial precision

Quantitative contrasts Increased anatomical resolution Intra-cortical fMRI ppb

Explosion of data size and processing times

Optimized numerical methods

New models of the signal needed

Anatomy-driven approaches

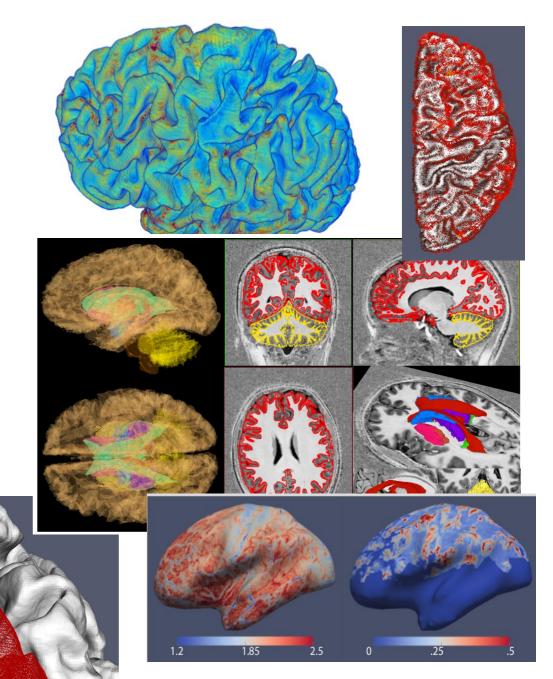
Quantitative MRI reconstruction

Increase in required spatial precision

What is Nighres?

High resolution image processing algorithms **designed for 7T** data

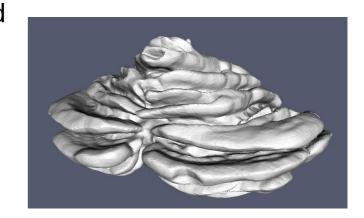
- Handles MP2RAGE data, other quantitative contrasts
- Segmentation: cortical and sub-cortical structures
- Cortical surface extraction and inflation (cerebral and cerebellar)
- Processing in MNI space at 0.4 mm
- Highly accurate cortical layering, profiling and co-registration

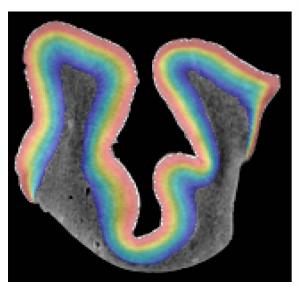


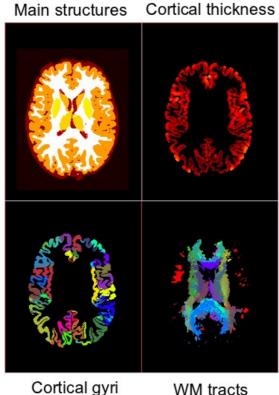
[Bazin et al., 2014] [Tardif et al., 2015] [Waehnert et al., 2016]

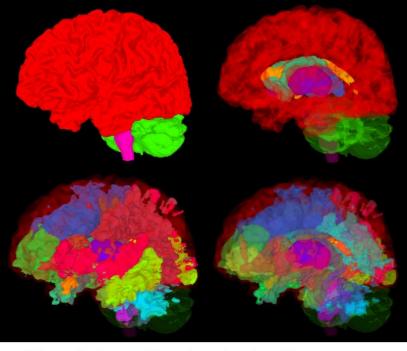
Can Nighres handle 3T data?

- Many prior tools developed for 3T data included (see Landman et al. Neuroinformatics 2012)
- Most 7T processing tools are 3T compatible
- Easy interfacing with python-based tools





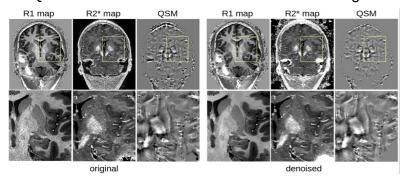




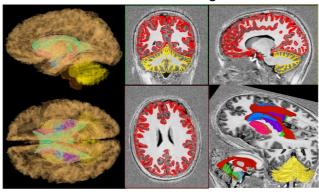
3D renderings with various levels of transparency

A growing collection of tools

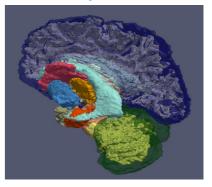
Quantitative MRI reconstruction and denoising



MP2RAGE Whole brain segmentation



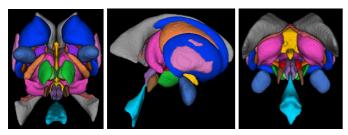
DWI segmentation



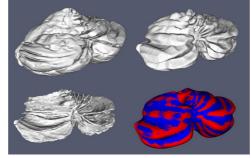
Subcortical Parcellation

Vascular reconstruction

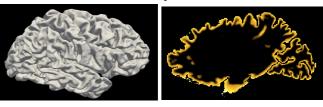
low variance (LV)

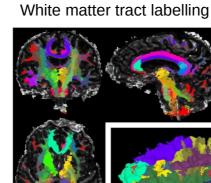


Cerebellar surface processing

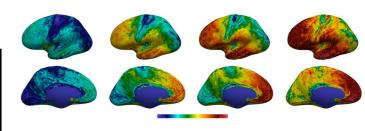


Cortical & laminar analysis





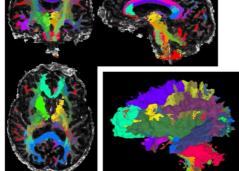
Volume-preserving lamination



Surface-based registration





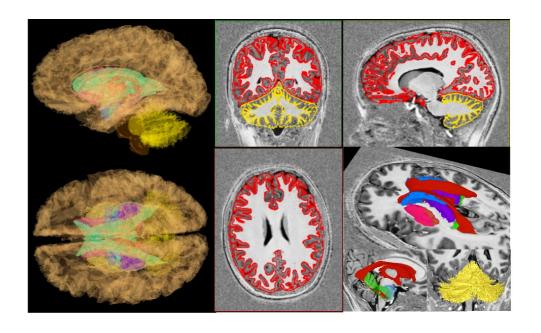


Brain segmentation

Handled base contrasts:

- Quantitative T1 at 3T, 7T, 9.4T
- HCP T1w, T2w data
- MPRAGE 3T (ADNI)
- MPM at 3T
- DWI 3T (FA and MD)
- R2* and QSM
- Further extensible...

Segmented structures: cerebral & cerebellar cortices, sub-cortical nuclei, vasculature, white matter tracts...

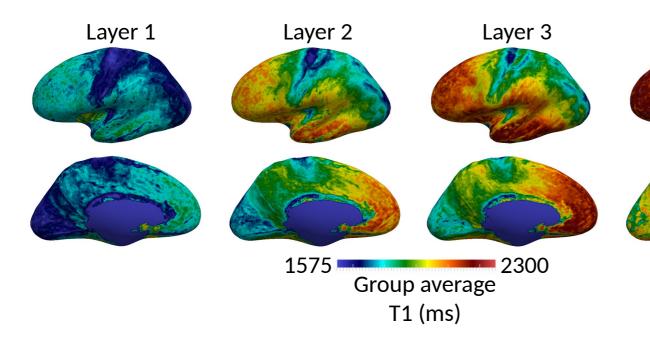


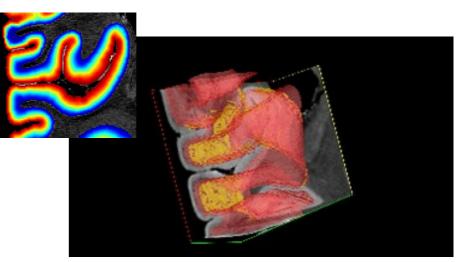
Additional tools & filters:
CSF partial voluming,
intensity normalization,
skull stripping,
background suppression,
exponential fitting,
noise estimation and regularization,

. . .

Cortical analysis

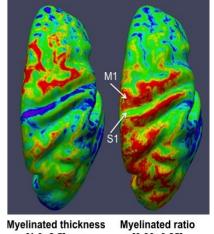
- Cortical reconstruction and surface inflation with CRUISE
- Anatomical representation of depth
- Multi-contrast alignment
- Mixed contrast and morphology measures





Layer 4

Volume-preserving lamination



[1.0; 2.5] mm

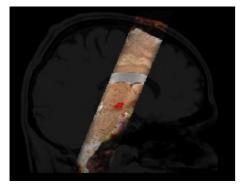
[0.30; 0.85]

Myelinated thickness

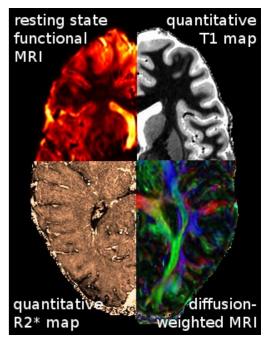
[Waehnert et al., Neuroimage 2014] [Tardif et al., Neuroimage 2015] [Rowley et al., Frontiers 2015]

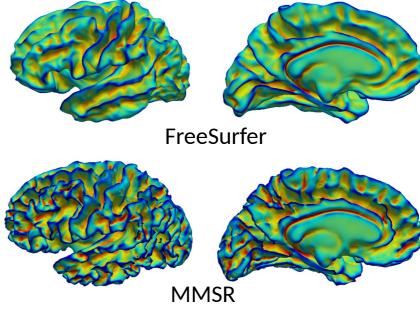
Multimodal alignment

- Integrated linear and non-linear alignment (encapsulating ANTS)
- Scanner-based alignment (especially important for slab data)
- Transformation and deformation composition tools: register many times, transform once
- Multi-contrast cortical surface alignment



Slab data alignment

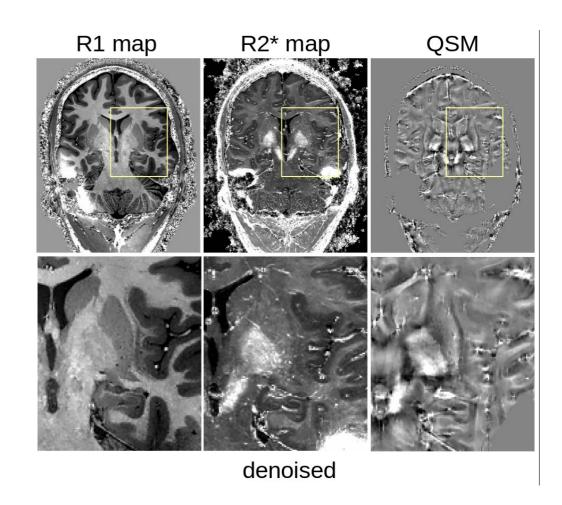




Cortical surface registration [Tardif et al., Neuroimage 2015]

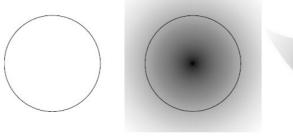
Quantitative MRI reconstruction & denoising

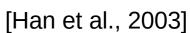
- MP2RAGE-based T1 mapping
- T2*/R2* model fitting
- PD ratio estimation
- Multi-contrast PCA denoising
- Fast phase unwarping

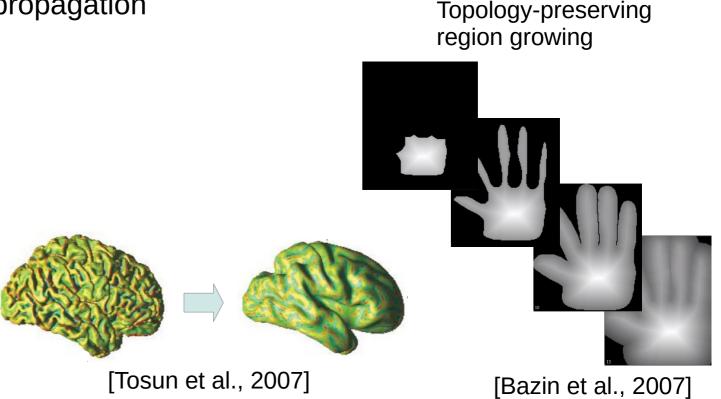


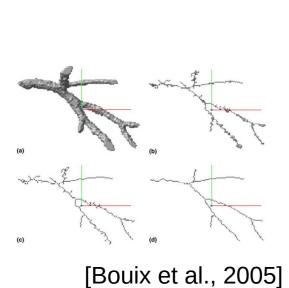
Shape analysis & processing

- Probability / levelset mapping
- Surface smoothing, inflation, meshing
- Skeletonization
- Topology correction
- Shape-based data propagation



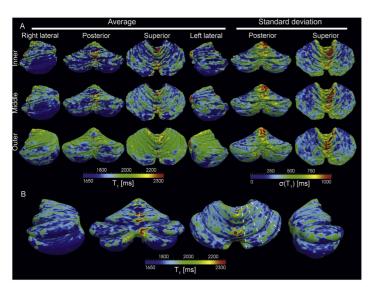






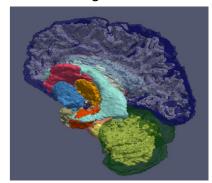
Anatomical parcellation

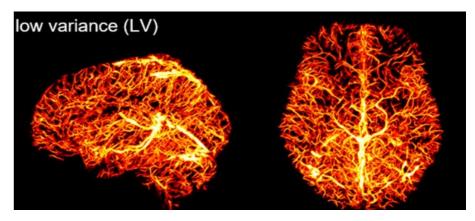
- Whole brain / Cortex
- Cerebellum
- Subcortex
- Vasculature



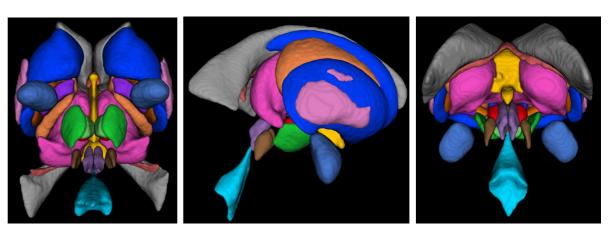
[Boillat et al., 2018]

DWI segmentation





[Huck et al., 2019]



[Bazin et al., 2020]







github.com/nighres/nighres

 Python wrappers for Java algorithms via JCC (optimized performance, code continuity)







github.com/nighres/nighres

- Python wrappers for Java algorithms via JCC (optimized performance, code continuity)
- Standardized modular structure built on Nibabel images (pipeline behavior and popular image formats)
- Automated testing (Travis), documentation building (Sphinx)
- Docker containerization
- Advanced processing examples for 7T brain segmentation, cortical layering, normalization, ...
- Open source code, documentation, example scripts, and real data sets





Summer of Code





♠ + + @ +

Edit

★ Star 13 🖁 Fork 12

Apache-2.0 واله

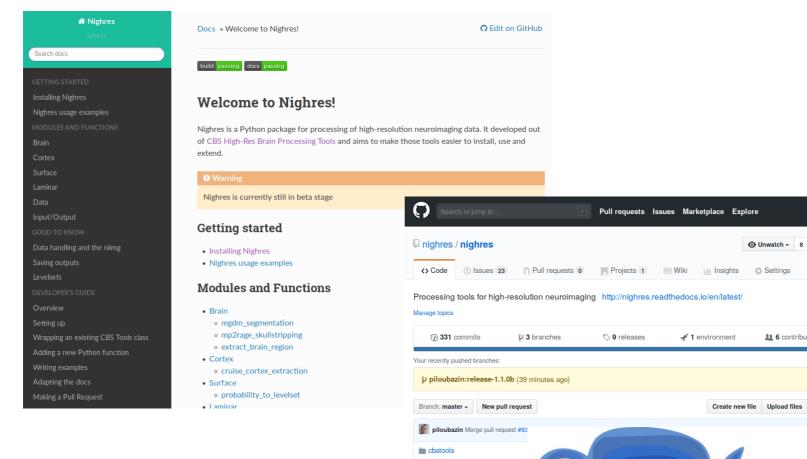
NIGHRES

Neuroimaging at

high resolution

££ 6 contributors

nighres.readthedocs.io



i doc docker examples **nighres**

m travis





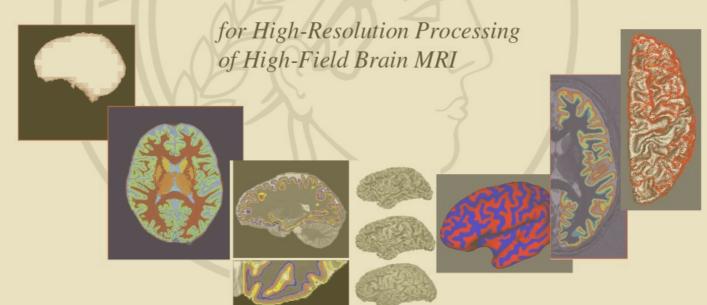


github.com/nighres/nighres

- Python wrappers for Java algorithms via JCC (optimized performance, code continuity)
- Standardized modular structure built on Nibabel images (pipeline behavior and popular image formats)
- Automated testing (Travis), documentation building (Sphinx)
- Docker containerization
- Advanced processing examples for 7T brain segmentation, cortical layering, normalization, ...
- Open source code, documentation, example scripts, and real data sets



CBS Tools

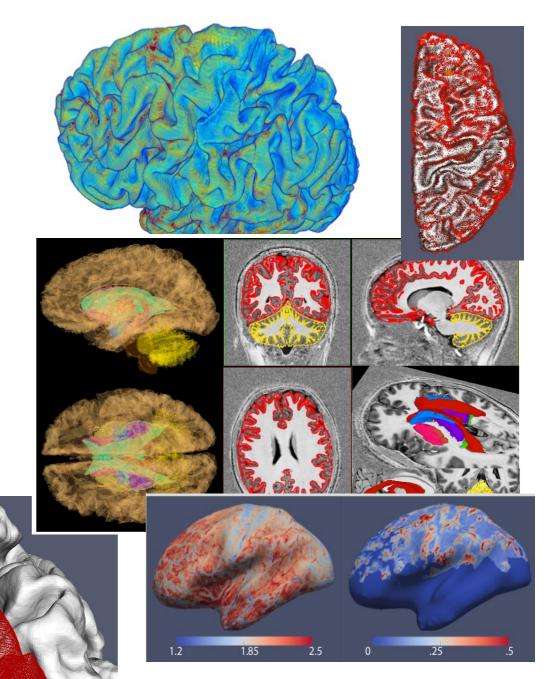


or: whatever happens to old toolboxes?

What were the CBS Tools?

High resolution image processing algorithms **designed for 7T** data

- Handles MP2RAGE data, other quantitative contrasts
- Segmentation: cortical and sub-cortical structures
- Cortical surface extraction and inflation (cerebral and cerebellar)
- Processing in MNI space at 0.4 mm
- Highly accurate cortical layering, profiling and co-registration

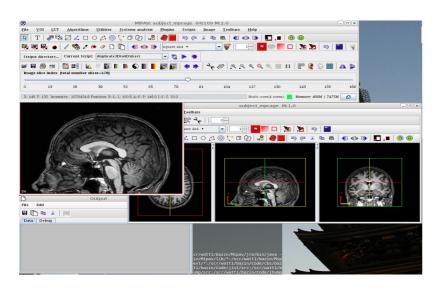


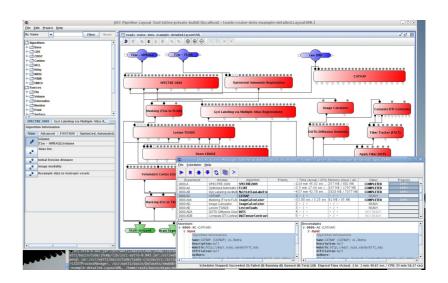
[Bazin et al., 2014] [Tardif et al., 2015] [Waehnert et al., 2016]

How was the software organized?

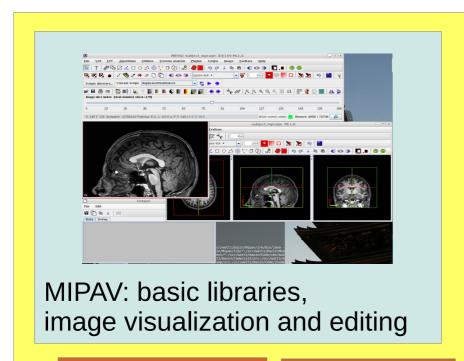
All algorithms are built as **plug-ins** for the **MIPAV** and **JIST** software:

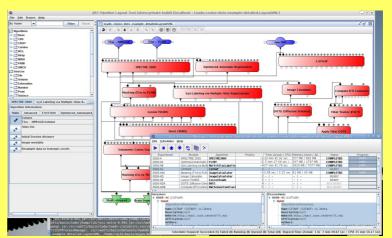
- Support for most medical image formats
- User-friendly graphical interface
- Intuitive pipeline system for batch processing
- Integration with many additional software tools
- Ongoing development and support at participating institutions (NIH, MPI, JHU, Vanderbilt, ...)
- Open source and freely available in NITRC, NeuroDebian



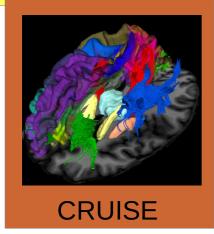


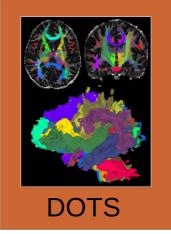
How was the software organized?

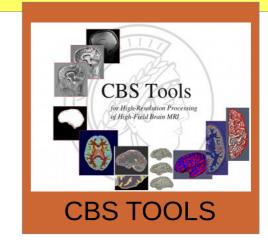




JIST: pipelining environment

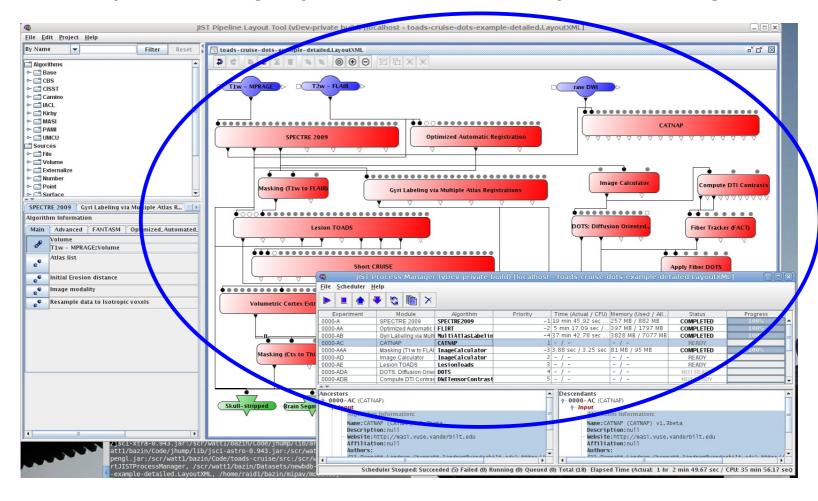




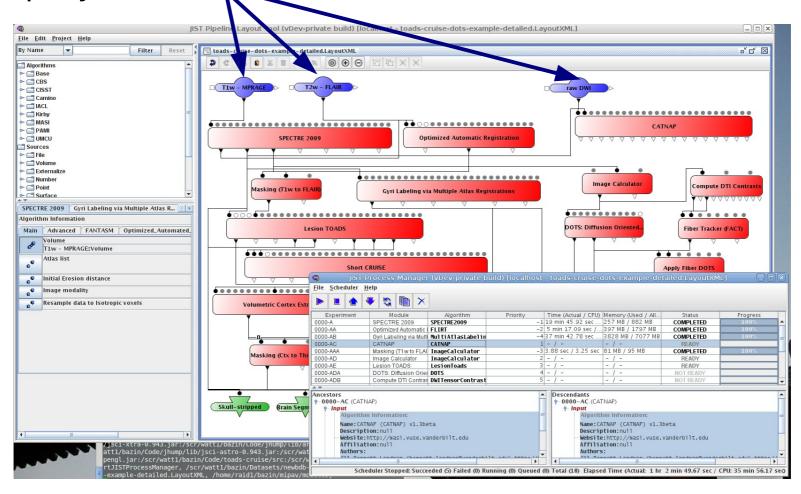


. . .

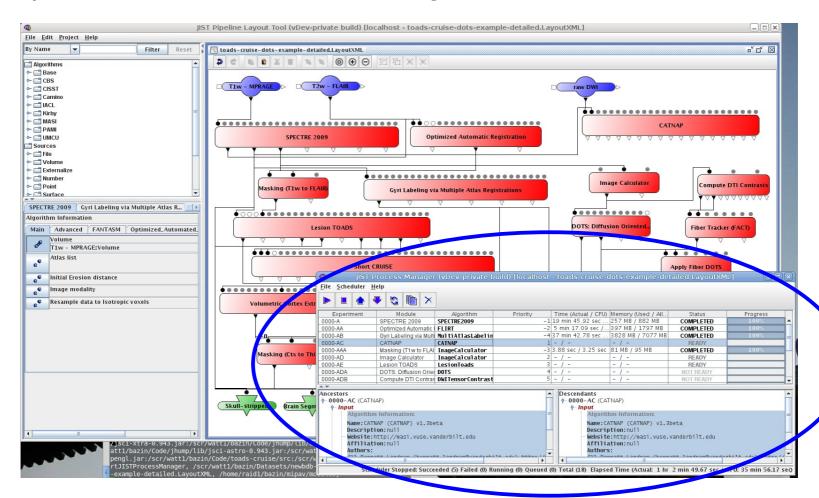
1. Load a processing layout in the JIST layout manager

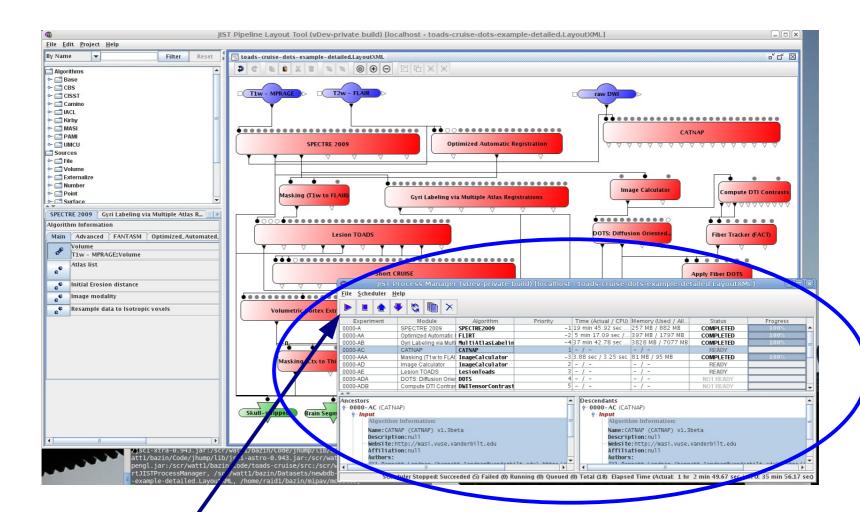


2. Input your data



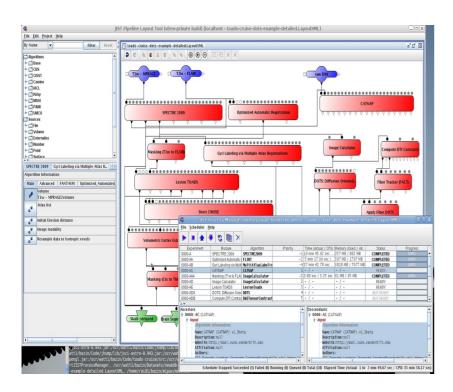
3. Open the JIST Process Manager





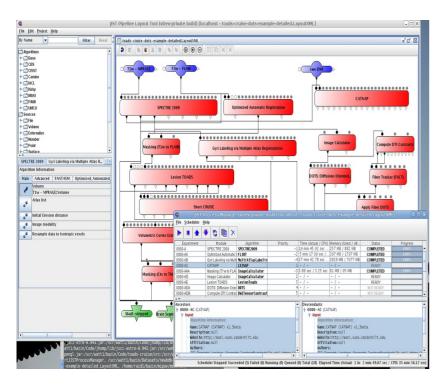
4. Press play

Could the software adapt?

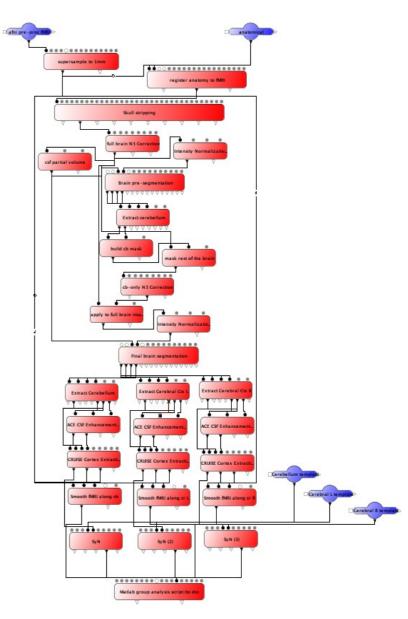


Standard pipelines

Could the software adapt?



Standard pipelines



Customized pipelines

A perfect solution...?

A perfect solution...?



Installation dependencies: MIPAV (easy), JIST (not easy)



External tool encapsulation possible, but complicated



JAVA-based (efficient, cross-platform, but not *popular*)

A perfect solution...?



Installation dependencies: MIPAV (easy), JIST (not easy)



External tool encapsulation possible, but complicated



JAVA-based (efficient, cross-platform, but not popular)



Alternative: Neuroimaging in Python initiatives



Python-based (hugely popular)



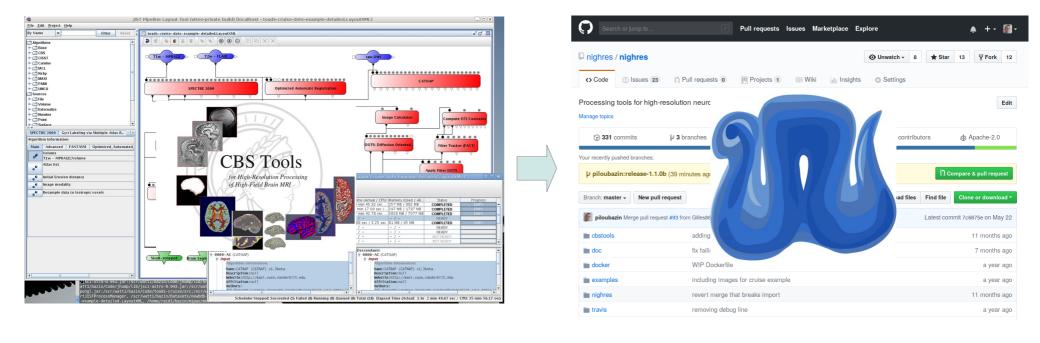
All the cool neuroimaging software is (wrapped) in Python



Massive online *user community*



From CBS Tools to Nighres



Open scientific tools: open source code is not enough...

Increasing ease of use may include:

- Getting rid of user interfaces (back to old-fashioned scripting)
- Providing interfaces to competing tools
- Complying with today's software *fashion* (python, docker, github...) to benefit from today's software *infrastructure* and online community

Installation procedure(s)



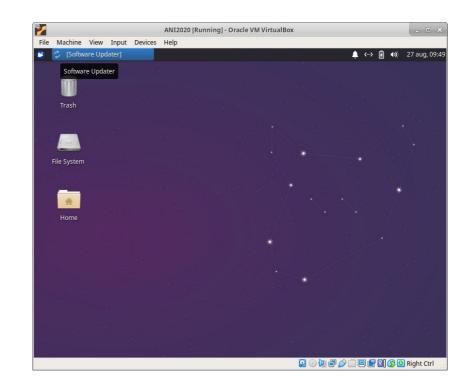
Installation instructions

Virtual box installation for trial (docker also an option)

Preferred environment:
UNIX system (Linux / MacOS)

Main dependencies:

- Python3 (numpy, pandas, nibabel...)
- Java 8+ JDK (Java developer kit)
- JCC (Java to C compiler for python integration)
- ANTs for registration routines

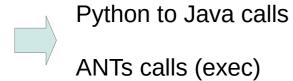


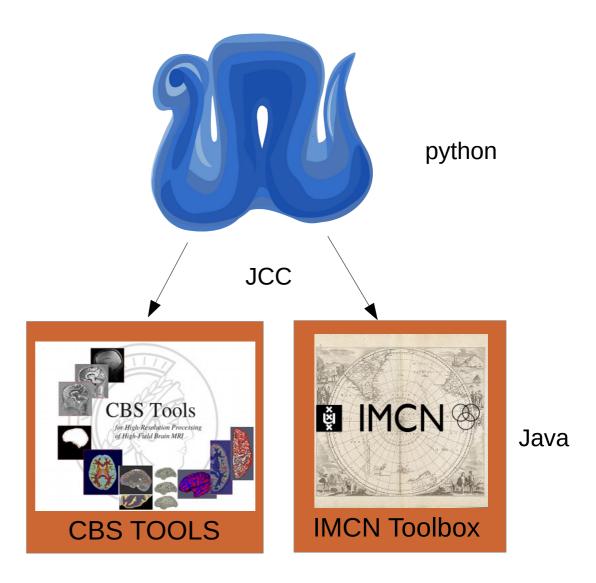
Under the hood

Nighres modules:

python routines

- + Java wrappers
- + ANTs wrappers





Common issues

python2 - python3 rivalry

Multiple versions of python3.x installed

Anaconda / Miniconda python

Java *JDK* not installed

JCC not finding the JDK

Compatibility issues of helper software (pip, docker, ...)

ANTs binaries not on the Unix PATH variable

Memory limitations on high resolution data

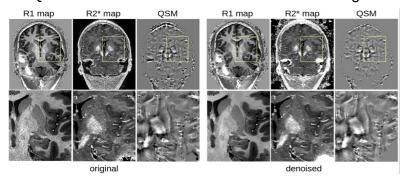


Nighres modules step-by-step

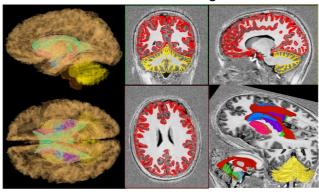


Modules, modules, modules...

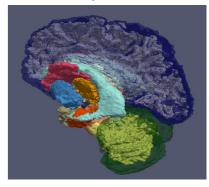
Quantitative MRI reconstruction and denoising



MP2RAGE Whole brain segmentation



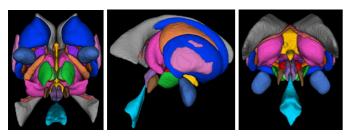
DWI segmentation



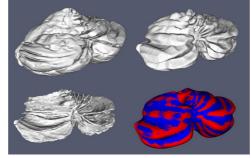
Subcortical Parcellation

Vascular reconstruction

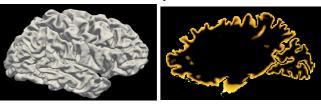
low variance (LV)



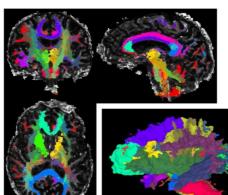
Cerebellar surface processing



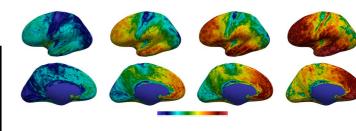
Cortical & laminar analysis

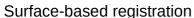


White matter tract labelling



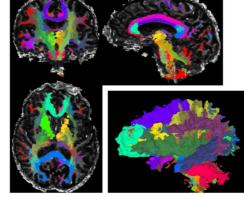
Volume-preserving lamination



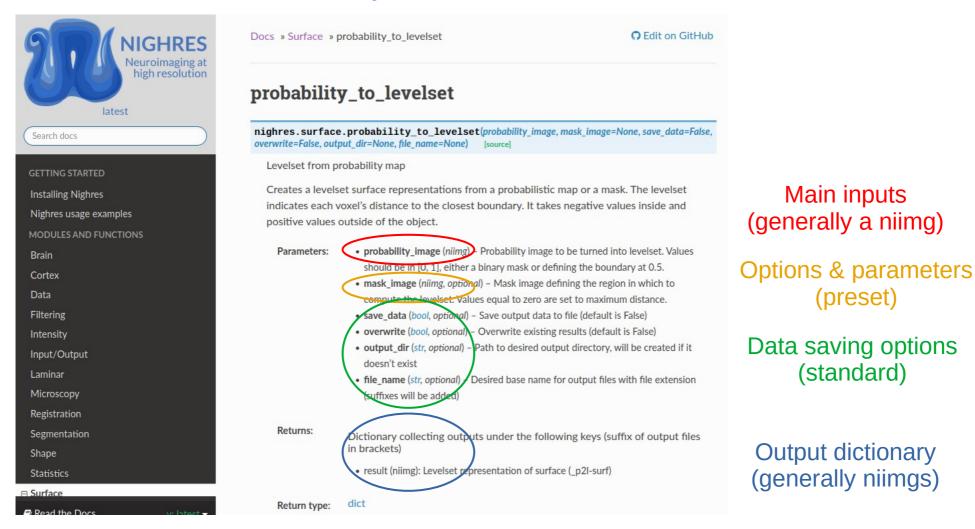








General module anatomy



When saving to disk:

- modules pass file names rather than niimg objects
- data is not recomputed if file name exists

Modules of particular interest

Nighres.brain.mgdm_segmentation

Nighres.parcellation.massp

Nighres.brain.extract_brain_region

Nighres.cortex.cruise_cortex_extraction

Nighres.laminar.volumetric_layering

Nighres.laminar_iterative_smoothing

Nighres.laminar.profile_sampling

Nighres.laminar.profile_meshing

Nighres.registration.embedded_antsreg

Nighres.registration.apply_coordinate_mappings

Nighres.surface.surface_inflation

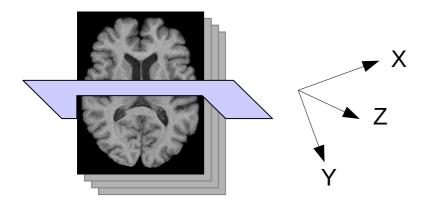
Nighres.brain.intensity_based_skullstripping Nighres.intensity.background_estimation

Nighres.intensity.lcpca_denoising Nighres.intensity.mp2rage_t1_mapping

Nighres.intensity_propagation

Important concepts: coordinate mappings

Image coordinate systems



Coordinate transforms between scanner and voxel spaces:

Stored in **image header**

NIFTI format: S-form, Q-form

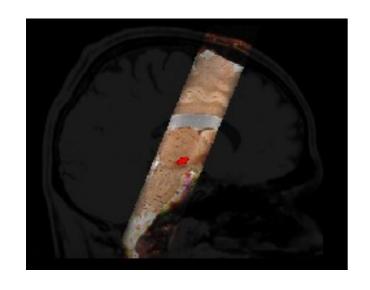


$$\begin{bmatrix} x' \\ y' \\ z' \\ 1 \end{bmatrix} = \begin{bmatrix} e_{11} & e_{12} & e_{13} & e_{14} \\ e_{21} & e_{22} & e_{23} & e_{24} \\ e_{31} & e_{32} & e_{33} & e_{34} \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix}$$

Scanner (world) coordinates

Voxels

Aligning images



Images from the same scanning session have common scanner coordinates



Pre-computed rigid transform (S/Q-form)

Subject may still move slightly between scans



Rigid transformation

Distortions?

- 1. Correct from additional data when possible (reversed encoding in DWI, fieldmaps in fMRI)
- 2. Non-linear registration (with ANTS)



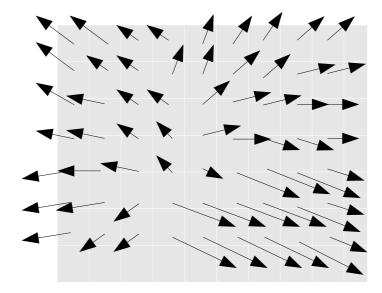
Non-linear deformation

The problem: combining transformations

Linear transformations: 4x4 matrix

	R_{xx}	R_{xy}	R_{xz}	T_x	
	R_{yx}	R_{yy}	R_{yz}	T_{y}	
	R_{zx}	R_{zy}	R_{zz}	T_{z}	
	0	0	0	1	

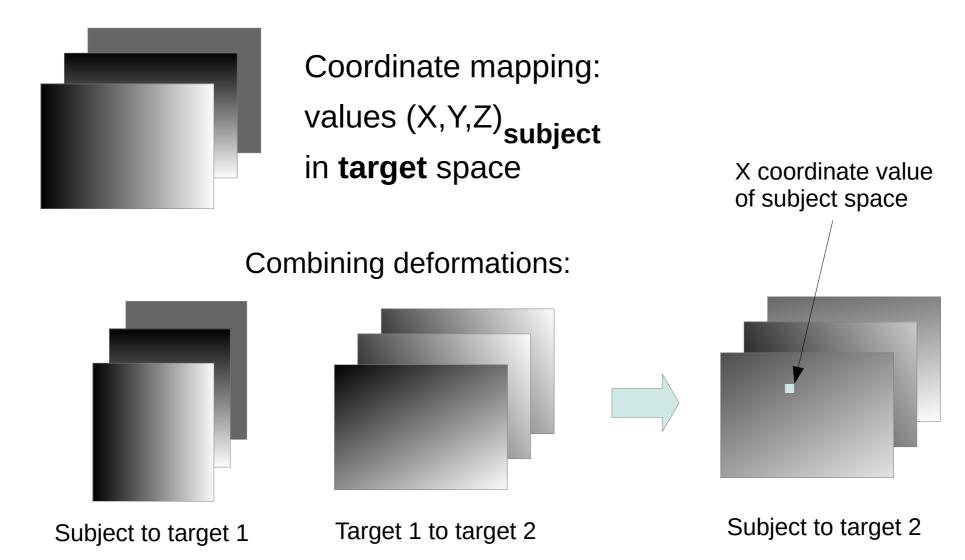
Non-linear deformations: vector fields





In which space?

Introducing: coordinate mappings





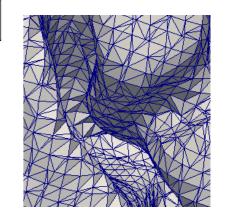
- Mappings have same dimensions as target
- Transformations can be checked by looking at coordinate values
- Combining transformations from different spaces easier

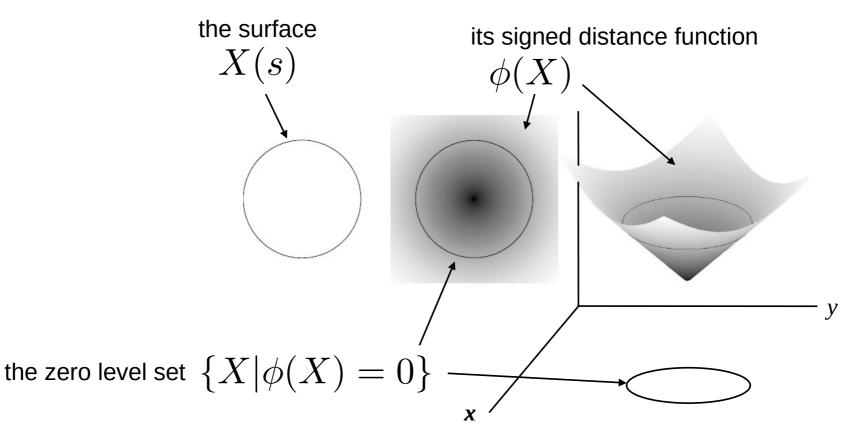
Important concepts: level set surfaces

Surface: $X(u,v)=[x(u,v),y(u,v),z(u,v)], u,v \in [0,1]$

Parametric model: Piecewise-linear approximation: Points + triangles (meshes)

Geometric model: $\varphi(X(u,v))=0$

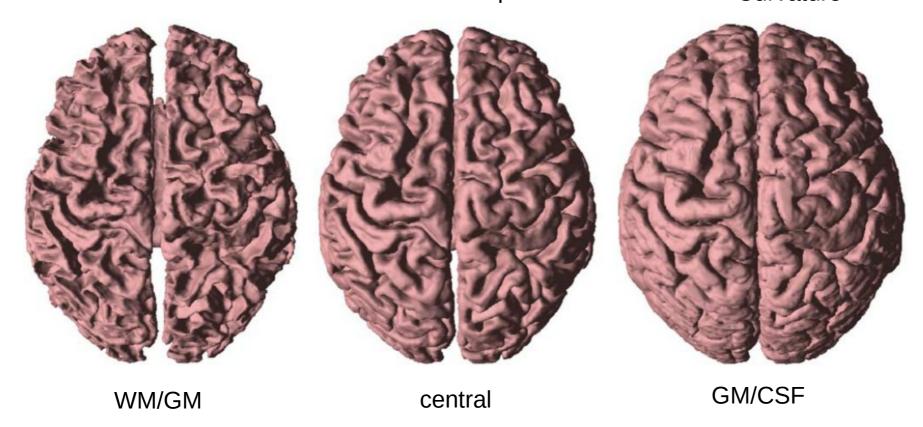




Advantages of level set surfaces

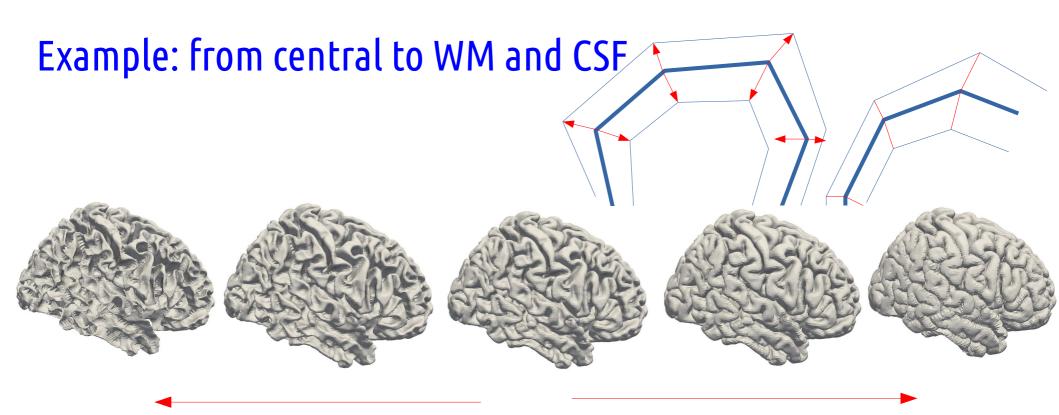
Surface evolution (e.g. CRUISE):

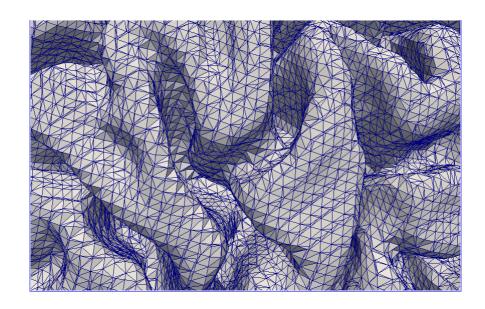
$$\frac{\partial \phi}{\partial t} = \left[\alpha(2\mu_{WM,WM+GM} - 1) + \beta\kappa(\phi)\right] \left|\frac{\partial \phi}{\partial X}\right|$$
 Membership functions Curvature

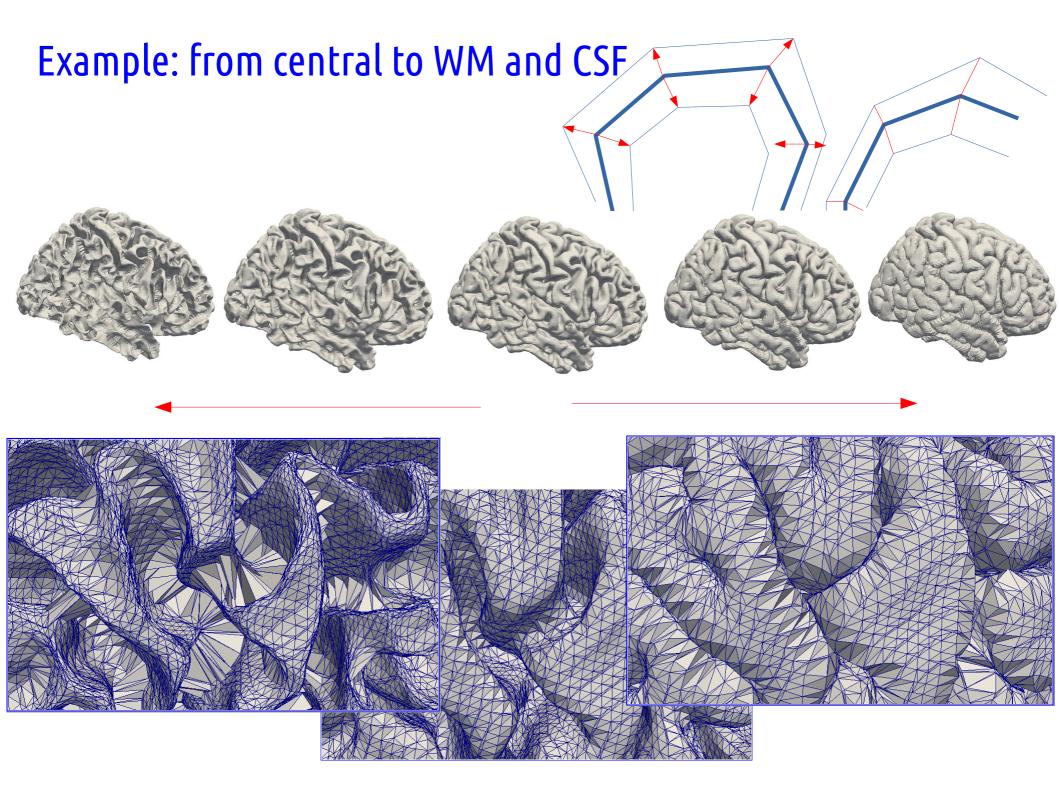




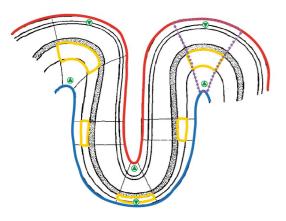
- Curvature formulas, differential geometry via PDEs
- No bookkeeping for self-intersection, triangle shape
- Isotropic resolution independent of shape

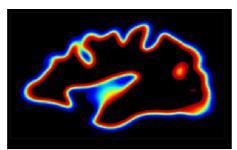






From surfaces to laminar depth







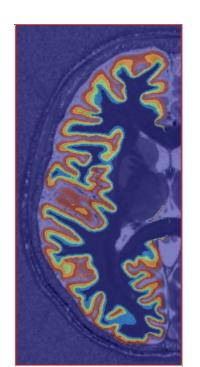
Defined in volumetric space

Constant sampling resolution

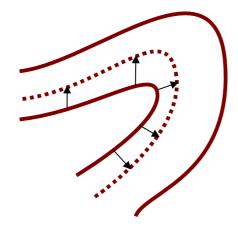
1-to-1 correspondence? With profiles

Surface processing? With lamination

Dual lamination and profile estimation

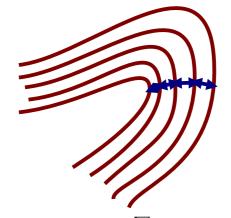


Level set lamination:



$$\frac{\partial \phi}{\partial t} = \alpha \kappa |\nabla \phi| + \beta (\phi - \phi_0) |\nabla \phi|$$

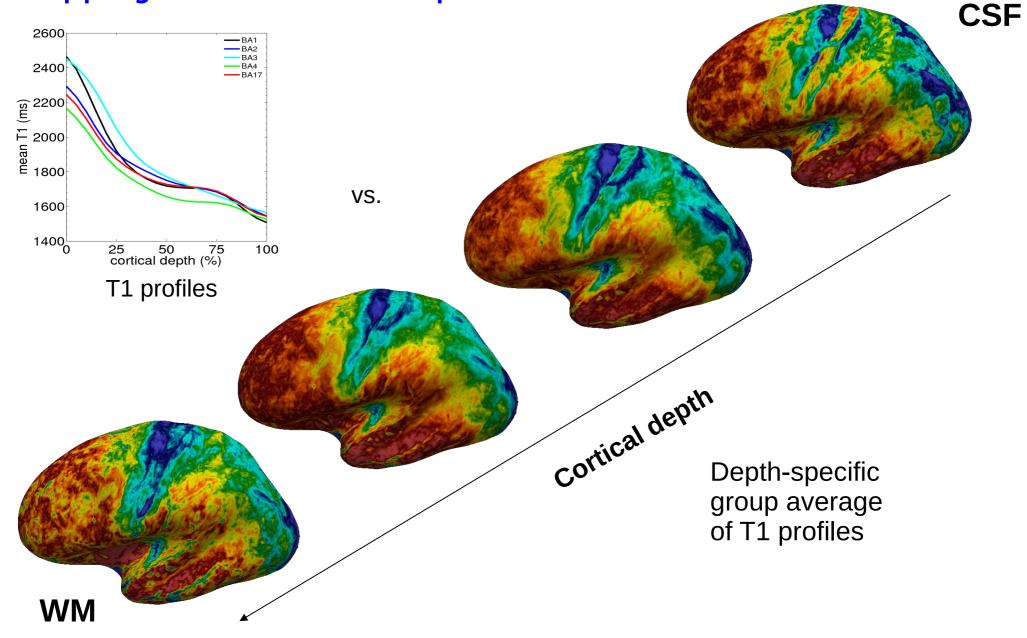
Cortical profile sampling:



$$P_{l+1} = P_{l} - \phi_{l+1}(P_{l}) \frac{\nabla \phi_{l+1}}{\|\nabla \phi_{l+1}\|}(P_{l})$$



Mapping across laminar depth



Note: underlying mesh is the same

Nighres modules case by case

