

Guorong Wu*, Xiaodong Tao+, Jim Miller+, and Dinggang Shen*

*Department of Radiology and BRIC, University of North Carolina at Chapel Hill, U.S.A.

+Visualization and Computer Vision Laboratory, GE Research, U.S.A.









Contents

- Introduction
- Data processing pipeline
- Registration using HAMMER
- Step-by-step tutorial



HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

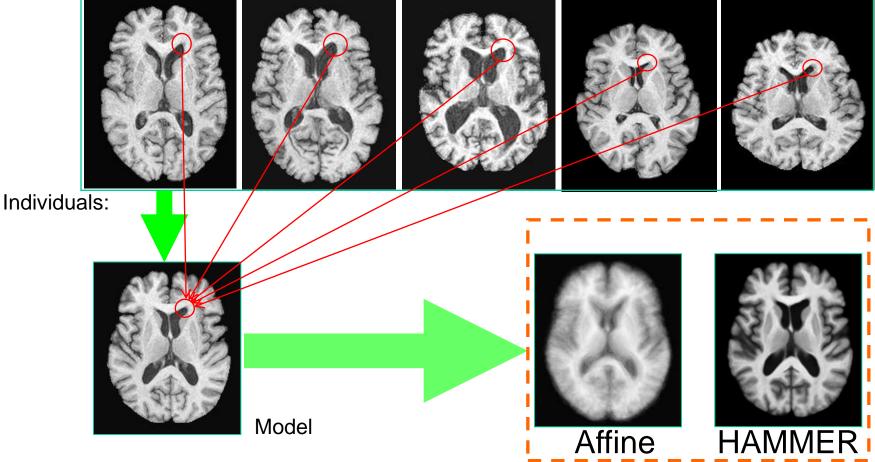








The goal of deformable registration of brain images --- Establish anatomical correspondences





HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration









- Clinical applications:
 - + Spatial normalization of functional images, for group analysis.
 - + Measurement of structures, by deforming a model to individual.
 - + Image data mining in lesion-deficit studies.
 - HAMMER has been used to align over 8,000 brains image since 2002.
 - The TMI paper describing HAMMER received the 2006 Best Paper Award from the IEEE Signal Process Society.



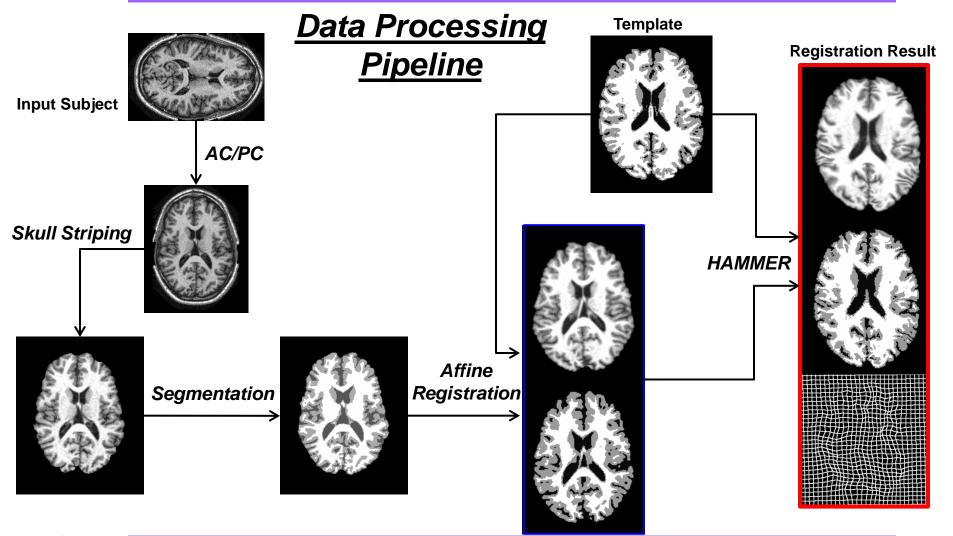
IAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration





" HAMMER in 3D Slicer3







HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration







HAMMER in 3D Slicer3



AC/PC alignment

Modules ACPC Transform I I I I I I I I I I I I I I I I I I I
 Help & Acknowledgement
Help Acknowledgement
Calculate a transformation from two lists of fiducial points. ACPC line is two fiducial points, one at the anterior commissure and one at the posterior commissure. The resulting transform will bring the line connecting them to horizontal to the AP axis. The midline is a series of points defining the division between the hemispheres of the brain (the mid sagittal plane). The resulting transform will put the output volume with the mid sagittal plane lined up with the AS plane. Use the Filtering module Resample Scalar/Vector/DWI Volume to apply the transformation to a volume. For more detailed documentation see: http://wiki.slicer.org/slicer/Wiki/index.php/Modules:RealignVolume-Document ation-3.4
ACPC Transform
Parameter set
Status Idle
 Transform
ACPC Line None
Midline None
Output transform None 🔤 🛋
▼ Debug



HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration







HAMMER in 3D Slicer



Help & Acknowledgement Help Acknowledgement This work is part of the National Alliance for Medical Image Computing (NAMIC), funded by the National Institutes of Health through the NIH Roadmap for Medical Research, Grant US4 EB005149.	Skull striping
Xiaodong Tao, taox @ research . ge . com	
 Skull Stripper For Structural MR 	
Parameter set 🖪 🖃 🗲	— Default parameter set
Status Completed	
▲ IO Input Volume t.r □ ▲ 4	Input file name
Output brain surface SI	Output brain surface file name
Brain Mask e 🔤 🚔 🧲	— Brain mask file
 Skull Stripping Parameters 	. Iterations used in skull stripping
Iterations 100 🕨 🗲	Iterations used in skull stripping
Subdivisions 20	— The number of sub-divisions
Dilation Radius after deformation 3	The dilation radius after deformation
▲ Optional Output	
Default Cancel Apply	



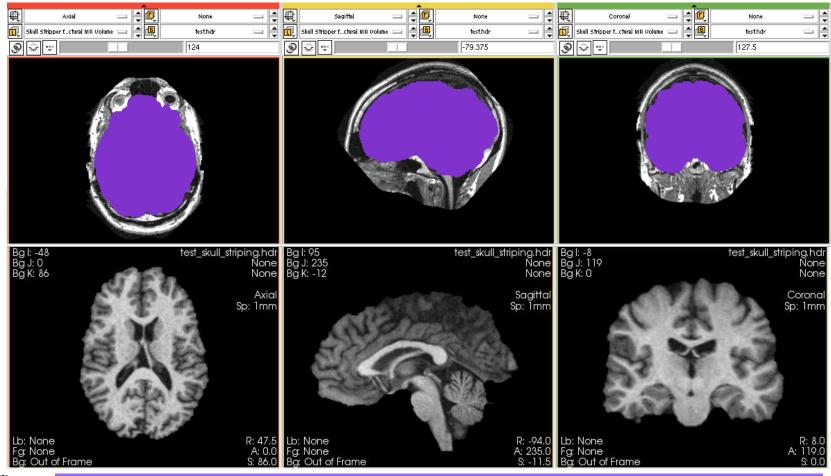
HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration







Skull Striping





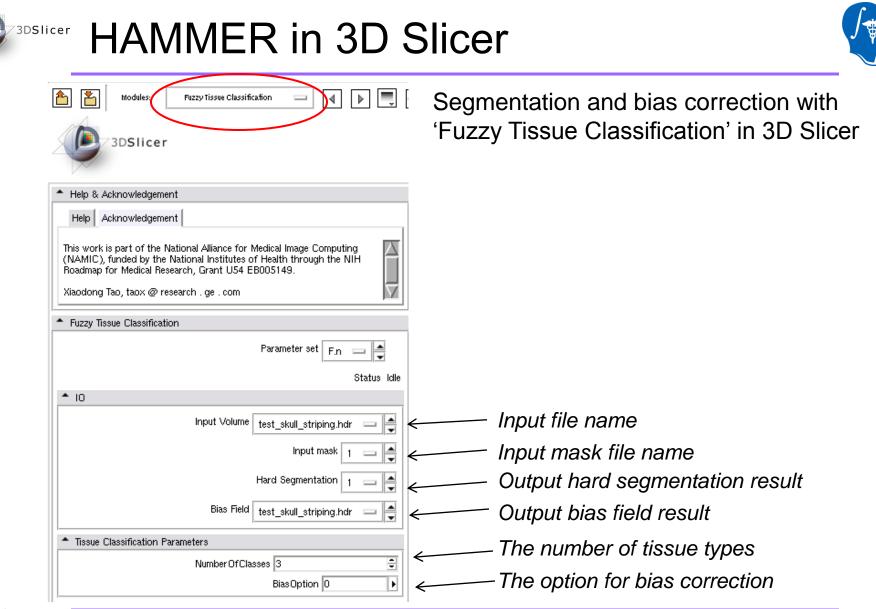
HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

Guorong Wu, Ph.D., University of North Carolina at Chapel Hill

TH of N at C

THE UNIVERSITY of NORTH CAROLINA at CHAPEL HILL

-8-



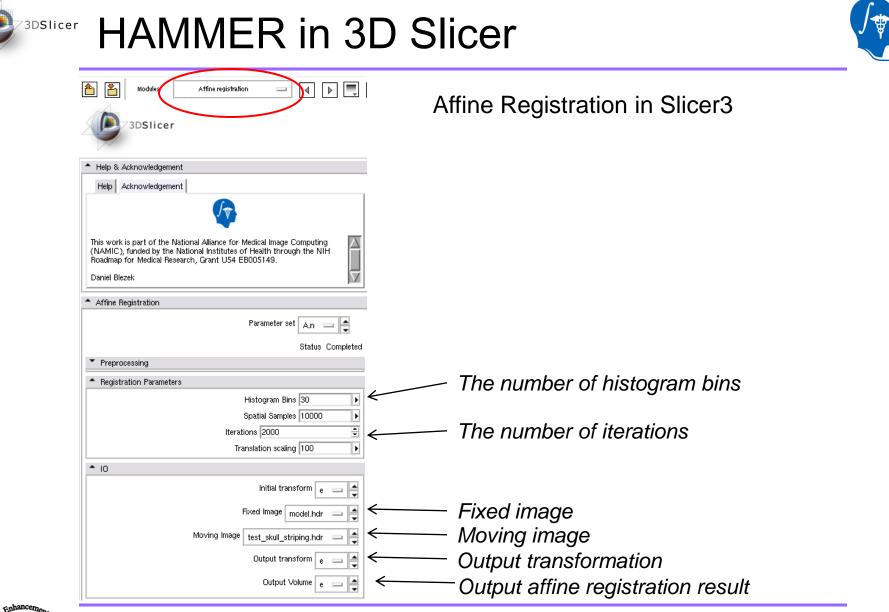


HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

Guorong Wu, Ph.D., University of North Carolina at Chapel Hill



-9-



IDEA

HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

Guorong Wu, Ph.D., University of North Carolina at Chapel Hill

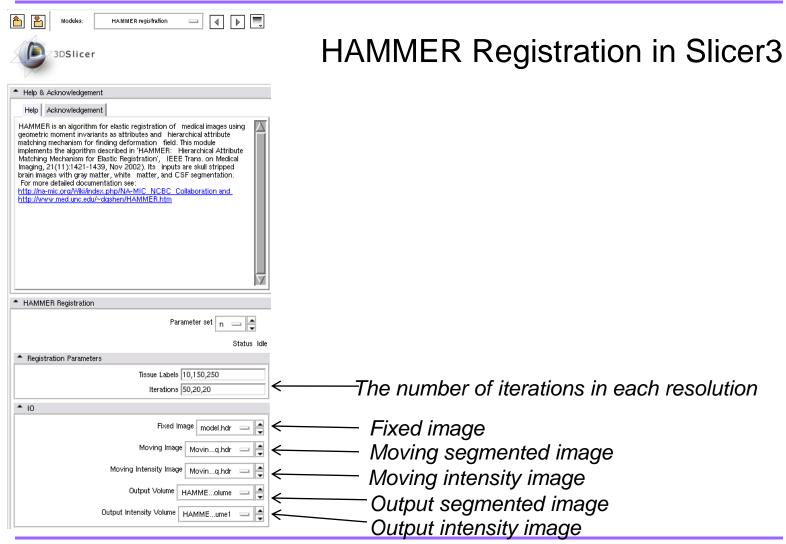


-10-



HAMMER in 3D Slicer







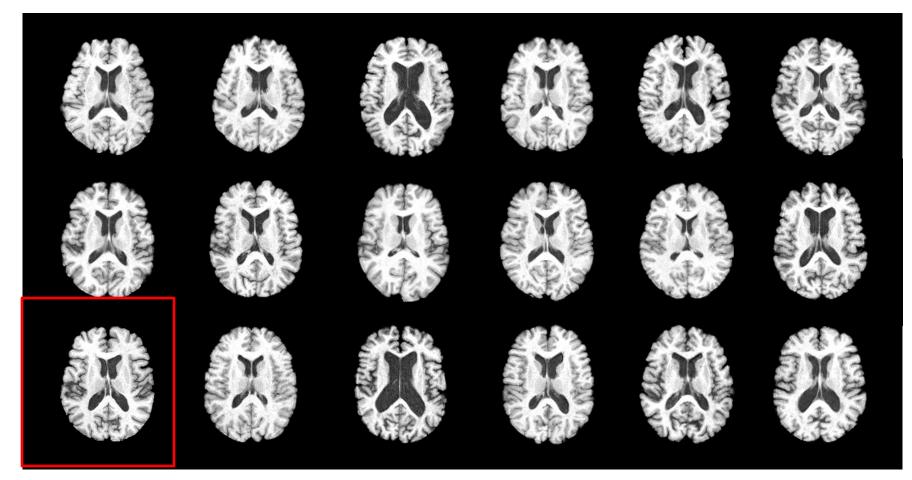
HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration







Experiment 1: 18 Elderly Brains From BLSA Dataset

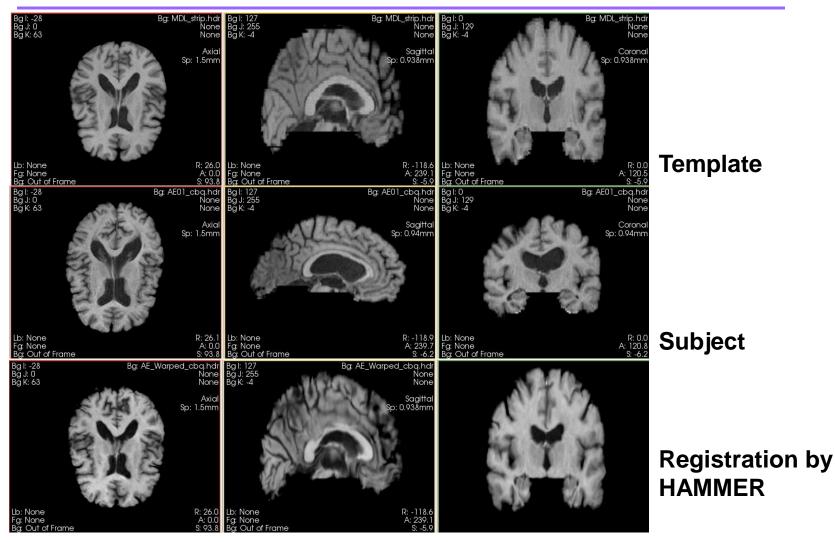










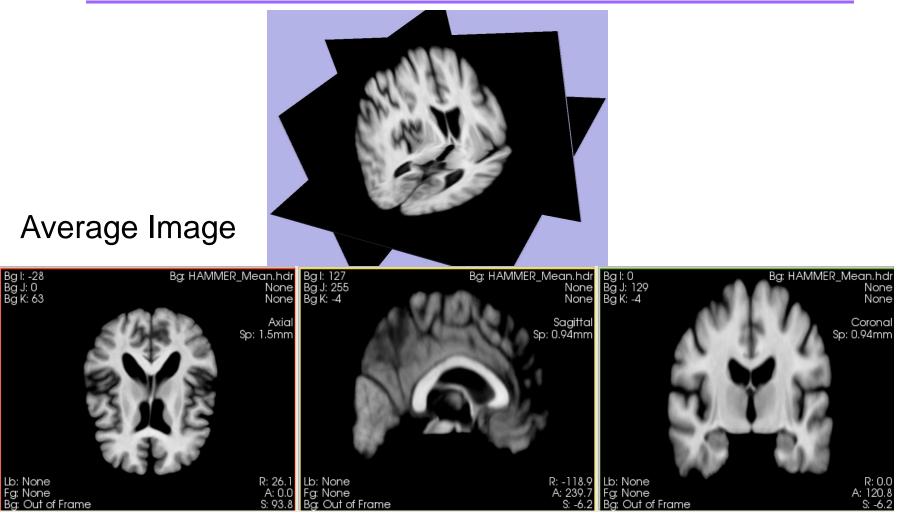


of IDEA

















40 LONI Dataset with 54 manually labeled RIOs

Labo	oratory	of Ne	uro Ima	aging			Enter search keyword	Search
Home	About LONI	Research	Visualization	News & Events	Software	Data		

LONI Atlases

LONE>

An atlas of the brain allows us to define its spatial characteristics. Where is a given structure; relative to what other features; what are its shape and characteristics and how do we refer to it? Where is this region of functional activation? How different is this brain compared with a normal database? An atlas allows us to answer these and related questions quantitatively.

Brain atlases are built from one or more representations of brain. They describe one or more aspects of brain structure and/or function and their relationships after applying appropriate registration and warping strategies, indexing schemes and nomenclature systems. Atlases made from multiple modalities and individuals provide the capability to describe image data with statistical and visual power.

An atlas can take on many forms, from descriptions of structure or function of the whole brain to maps of groups or populations. Individual systems of the brain can be mapped as can changes over time, as in development or degeneration. An atlas enables comparison across individuals, modalities or states. Differences between species can be catalogued. But in most cases, the value added by brain atlases is the unique and critical ability to integrate information from multiple sources. The utility of an atlas is dependent upon appropriate coordinate systems, registration and deformation methods along with useful visualization strategies. Accurate and representative atlases of brain hold the most promise for helping to create a comprehensive understanding of brain in health and disease.

IN THIS SECTION:

Available Atlases

Alzheimer's Disease
Template
Human Atlas
ICBM 452 T1 Atlas
ICBM DTI-81 Atlas
ICBM Probabilistic Atlases
ICBM T2 Atlas
ICBM Template
LPBA40
Monkey Atlas
Mouse Atlas
Mouse Minimum
Deformation Atlas (MDA)
Neonatal (P0) Mouse Nissl
Brain Atlas
Neonatal (P0) MRI Mouse
Brain Atlas
Rat Atlas



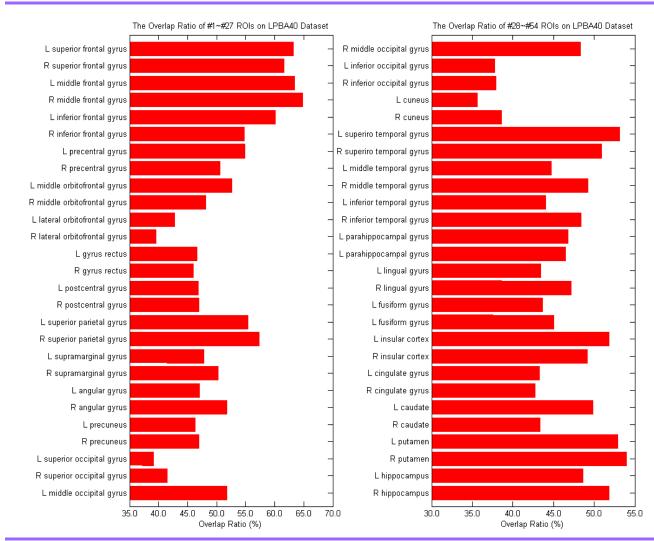
HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration













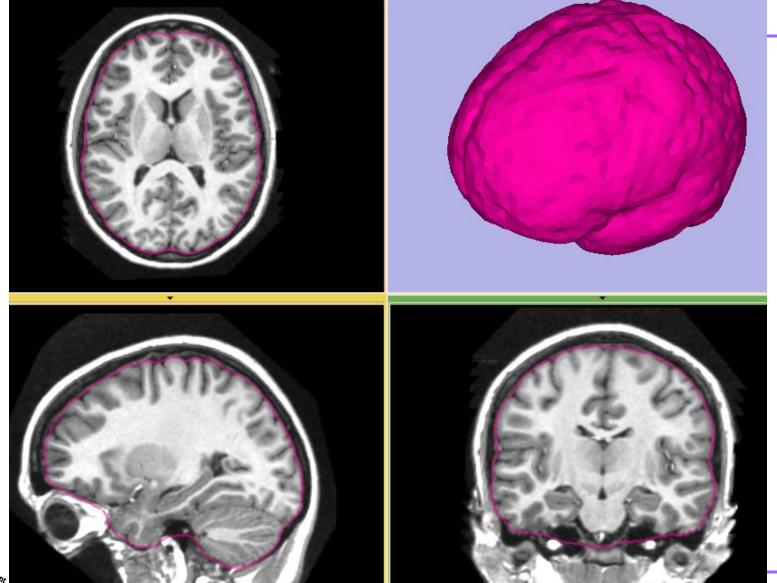
HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

















Step-by-step tutorial



HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration









Di	🕯 grwu@ bass-comp4:~	×
	<pre>u Last login: Tue Jan 5 15:16:21 2010 from bass-comp0.cs Kickstarted Wed Oct 7 09:34:55 EDT 2009 -bash-3.2\$ source "grwu/.bashrc [grwu@bass-comp4:"] \$ svn co http://svn.slicer.org/Slice A Slicer3/CMake/Slicer3ValgrindSuppressions.supp A Slicer3/CMake/Slicer3ValgrindSuppressions.supp A Slicer3/CMake/Slicer3ModuleMacros.cmake A Slicer3/CMake/Slicer3ParseArgumentsMacro.cmake A Slicer3/CMake/Cuda/make2cmake.cmake A Slicer3/CMake/cuda/make2cmake.cmake A Slicer3/CMake/cuda/make2cmake.cmake A Slicer3/CMake/cuda/parse_cubin.cmake A Slicer3/CMake/cuda/parse_cubin.cmake A Slicer3/CMake/cuda/FindCuda.cmake A Slicer3/CMake/CMakeLists.txt A Slicer3/CMake/Slicer3ParsistenceMacros.cmake A Slicer3/CMake/Slicer3ParsistenceMacros.cmake A Slicer3/CMake/Slicer3ParsistenceMacros.cmake A Slicer3/CMake/Slicer3ParsistenceMacros.cmake A Slicer3/CMake/Slicer3ParsistenceMacros.cmake A Slicer3/CMake/Slicer3ParsistenceMacros.cmake A Slicer3/CMake/Slicer3ParsistenceMacros.cmake A Slicer3/CMake/Slicer3ParsistenceMacros.cmake A Slicer3/CMake/Slicer3ParsistenceMacros.cmake</pre>	



HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration





grwu@bass-comp4	4:~/Software					
Attic/	QTModules/					
Base/	README.txt					
Chake/	Resources/					
CMakeLists.txt	Scripts/					
CTestConfig.cmake	Slicer3Config.cmake.in					
CTestCustom.cmake.in	Slicer3InstallConfig.cmake.in					
Boc/	slicer_variables2.tcl					
Doxyfile	slicer_variables.tcl					
Extensions/	Testing/					
GenerateSlicer3Config.cmake	UseSlicer3.cmake.in					
launch.tcl.in*	Utilities/					
Libs/ vtkSlicerConfigure.h.in						
License, txt*						
[grwu@bass-comp4:"/Software/Slicer3] \$./Slicer3/Scripts/getbuildtest.tclupda						
tereleasecd						
[grwu@bass-comp4:~/Software/Slicer3] \$ cd						
[grwu@bass-comp4:"/Software] \$./Slicer3/Scripts/getbuildtest.tclupdaterel						
ease						
Sourcing /home/grwu/Software/Slicer3/slicer_variables.tcl						
Slicer3_HOME is /home/grwu/	Software/Slicer3					
making with make -j 16						
running: svn switch http://	svn.slicer.org/Slicer3/trunk					



HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

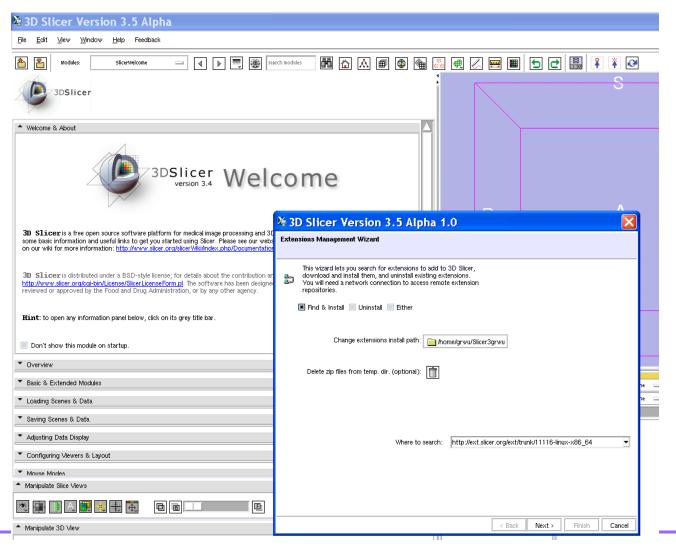


home/grwu/Software/Slicer3-ext/HammerRegistration-build/LMakeFiles | 1 2 [100%] Built target HammerRegistration make[1]: Leaving directory `/home/grwu/Software/Slicer3-ext/HammerRegistration-b lui 1d' /home/grwu/Software/Slicer3-lib/CMake-build/bin/cmake -E cmake_progress_start /h ome/grwu/Software/Slicer3-ext/HammerRegistration-build/CMakeFiles 0 make -f CMakeFiles/Makefile2 preinstall make[1]: Entering directory `/home/grwu/Software/Slicer3-ext/HammerRegistrationbuild' make[1]: Nothing to be done for `preinstall'. make[1]: Leaving directory `/home/grwu/Software/Slicer3-ext/HammerRegistration-b uild' Install the project... /home/grwu/Software/Slicer3-lib/CMake-build/bin/cmake -P cmake_install.cmake -- Install configuration: "Debug" -- Installing: /home/grwu/Software/Slicer3/../Slicer3-ext/HammerRegistration-ins tall/lib/Slicer3/Plugins/HammerRegistration -- Removed runtime path from "/home/grwu/Software/Slicer3/.../Slicer3-ext/HammerR egistration-install/lib/Slicer3/Plugins/HammerRegistration" running: zip -r9 /home/grwu/Software/Slicer3/../Slicer3-ext/HammerRegistration-i nstall/lib/Slicer3/Plugins/HammerRegistration-svn153-2010-01-05-linux-x86_64.zip adding: HammerRegistration (deflated 79%) Uploading /home/grwu/Software/Slicer3/,,/Slicer3-ext/HammerRegistration-install/ lib/Slicer3/Plugins/HammerRegistration-svn153-2010-01-05-linux-x86 64.zip to ext .slicer.org port 8845... uploaded /home/grwu/Software/Slicer3/../Slicer3-ext/HammerRegistration-install/l ib/Slicer3/Plugins/HammerRegistration-svn153-2010-01-05-linux-x86_64.zip (964240 butes) UpĪoading /home/grwu/Software/Slicer3/../Slicer3-ext/Extensions/HammerRegistrati on.s3ext to ext.slicer.org port 8845... uploaded /home/grwu/Software/Slicer3/.../Slicer3-ext/Extensions/HammerRegistratio n.s3ext (787 butes) BUILT: /home/grwu/Software/Slicer3/../Slicer3-ext/Extensions/HammerRegistration.s3ext 100.0% succeeded [grwu@bass-comp4:~/Software/Slicer3] \$ 📱

IDEA

HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration







HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

of NORTH CAROLINA at CHAPEL HILL





🔌 3D Slicer	Version 3.5 Alp	ha 1.0			×
Extension Manage	ment Wizard				
	en click uninstall to remove ther licer, or click download to retrie				
Select Status	Name	Category	Description	HomePage	Binary 🛆
	HammerRegistration	Work in Progress	HammerRegistrati		http://
\triangleleft					
Download & Install	Uninstall				
			< Back Next :	> Finish	Cancel

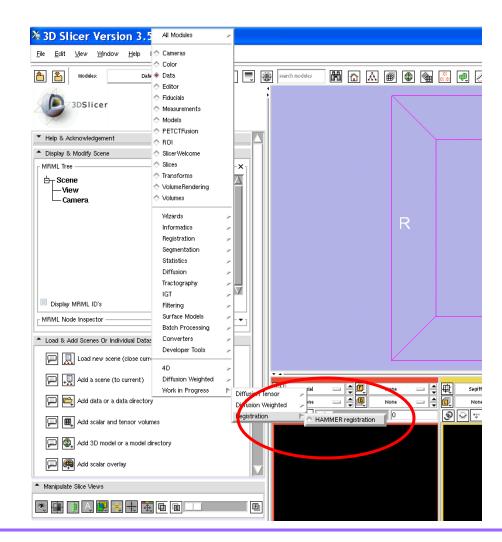


HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration











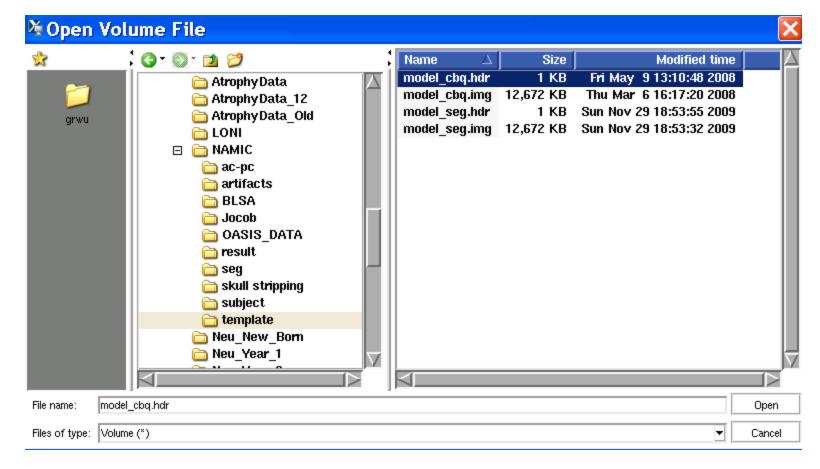






📲 🖉 Using HAMMER in 3D Slicer

Load model images





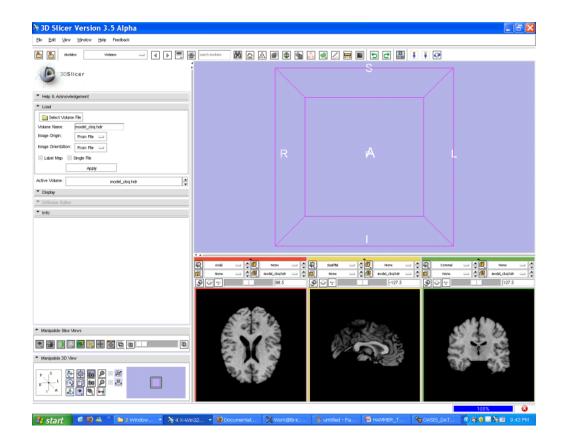
HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration







Load images





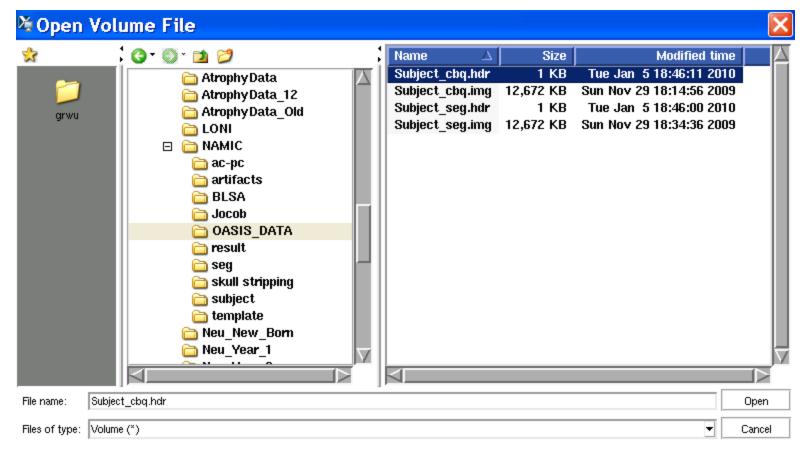






📲 🖉 Using HAMMER in 3D Slicer

Load subject images



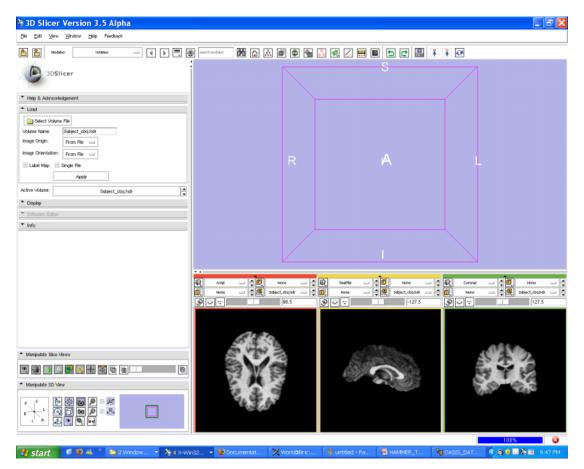


HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration





Load subject images



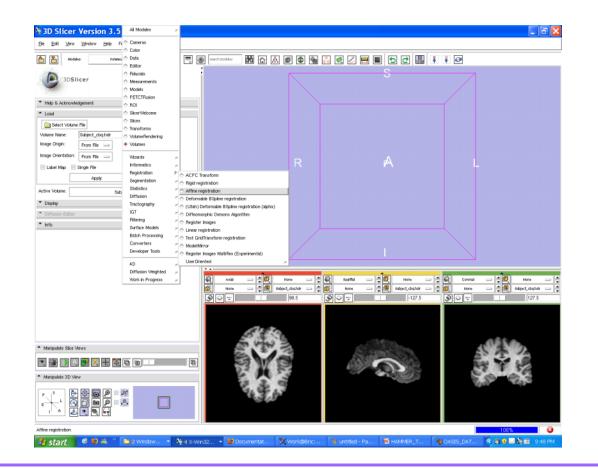








Affine registration in 3D Slicer











Check the 4x4 affine transformation matrix

All	ata ditor ducials easurements odels ETCTFusion OI icier Welcome ices ansforms Diume Rendering		Help & Acknow Load Load Transfo isplay And Edit – Transform Kode 1.087444	edgement me Affine 0.021370	registration Transf 0.010223 -0.023259	form
Affine Registration Pereprocessing Registration Parameters Histor Spate Vo Iterations W W W V V V V V V V V V V	olor ata ditor ducials easurements odels ETCTFusion OI DI icer Welcome ices ansforms ouneRendering		Help & Acknow Load Load Transfo Isplay And Edit - Transform Editor Transform Node	edgement ms : Affine 0.021370	0.010223	6.591986
Help & Acknowledgement C Fic Affine Registration Me Para Preprocessing Si Registration Parameters Si Histo Vo Spatic Vo	ditor ducials easurements odels ETCTFusion DI icerWelcome ices ansforms Dlume Rendering		Load Load Transfo isplay And Edit - Transform Editor Transform Node 1.087444	ms : Affine 0.021370	0.010223	form
Help & Acknowledgement Affine Registration Affine Registration Affine Registration Affine Registration Para Silis Registration Parameters Silis Volume Affine Registration Parameters Spatic Volume Affine Registration Parameters Silis Volume Affine Registration Parameters Volume Affine Registration	ducials easurements odels ETCTFusion OI icerWelcome ices ansforms DlumeRendering		Load Transfo Display And Edit – Transform Editor Transform Node 1.087444	: Affine 0.021370	0.010223	6.591986
Affine Registration A Mu Para M Para	easurements odels ETCTFusion DI icerWelcome ices ansforms DlumeRendering		Load Transfo Display And Edit – Transform Editor Transform Node 1.087444	: Affine 0.021370	0.010223	form
Para A Mi Preprocessing A Mi Registration Parameters A Sili Histor Spatic Vor Iterations	odels ETCTFusion OI icerWelcome ices ansforms DlumeRendering		isplay And Edit – Transform Editor Transform Node 1.087444	: Affine 0.021370	0.010223	form
Preprocessing Pegistration Parameters Histor Spatic Vo Iterations W	ETCTFusion OI icerWelcome ices ansforms olumeRendering		Transform Editor Transform Node 1.087444	0.021370	0.010223	form
Preprocessing Preproc	OI icerWelcome ices ansforms olumeRendering		Transform Editor Transform Node 1.087444	0.021370	0.010223	form
Preprocessing Sill Registration Parameters Sill Histor Spati Iterations 2 W	icerWelcome ices ansforms olumeRendering		Transform Node	0.021370	0.010223	form
Registration Parameters	ices ansforms olumeRendering		1.087444	0.021370	0.010223	6.591986
Histor Spatic Iterations	ansforms olumeRendering					
Histor Vo Spatia Vo Iterations	olumeRendering					
Spatie 🔨 Vo Iterations 🖡 😽						
Iterations			-0.055841	1.065529		-14.738839
- Wi		-1	0.013686	0.006434	1.158510	-16.686951
Translati	izards	2	-0.000000	-0.000000	-0.000000	1.000000
Int	formatics	2	Translation —			>
10 Re	egistration	~				6.592
lr Se	egmentation	~	LR			5.582
St	tatistics	~				
Fixed Image Dit	iffusion	~	PA		-	14.739
Marita da la companya	actography	~				
Moving Image IG		~	IS		-	16.687
Output transfor	Itering	2				
Surface Models > Output Vol Batch Processing >				Min Translation	Limit -200	
	onverters	~		Max Translation	Limit 200	
Default Cano	eveloper Tools	~	 - Rotation			,
40	D	_			_	
	- iffusion Weighted	2	LR		0)



HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

of NC at CH





Apply affine matrix to segmented image

X 3D Slicer Version 3.5	All Modules	*	⅔ 3D Slicer Version 3.5 Alpha			
<u>File Edit View Window H</u> elp F	🔷 Cameras		Ele Edit Vew Window Help Feedback			
	Color					
Modules: Volum	🔿 Data] 📃 🛞 search modules 🛗 🟠 🔝	📤 🎦 bodales: Resample Scalar/Dector/DWD Volume 🔤 🚽 🕨 🗮 👰	search modeles 🕅 🏠 🛦 🗃 🕼 🌆		¥ @
	♦ Editor		3DSlicer		5	
200011000	 Fiducials Measurements 	i i				
	 Medasurements Models 		 Help & Acknowledgement 			
	PETCTFusion		Resample Scalar/Vector/DWI Volume			
▼ 11abr. O. Antonio statements	♦ ROI		Parameter set e			
▲ Load	SlicerWelcome		Status idie			
Select Volume File	Slices		 Input/Output 			
	Transforms		Input Volume Sudr 🔤 🚔	R	A	
	Volume Rendering		Reference Volume (To Set Output Parameters) 📶 📖 🖨			
	Volumes	_	Dutput Volume Ree			
Image Orientation: From File ===	Wizards	-	 Resampling Parameters 			
🔲 Label Map 📃 Single File	Informatics	*	 Transform Parameters 			
Apply	Registration	×	Transform Node Affm 😑 🖨			
	Segmentation	·	 Manual Transform (Dnly Used If No Transform Node Set) 			
Active Volume: Su	Statistics Diffusion		 Bigid/Affine Parametera 			
 Display 	Tractography		 Interpolation Type 			
Diffusion Editor	IGT		Interpolation inear I nn we be	••		
	Filtering	Cradient Anisotropic Filter	Windowed Sinc Interpolate Function Parameters		Sagittal Image: Constraint of the sage	Coronal - Corona
▼ Info	Surface Models	A MRI Bias Field Correction	BSpline Interpolate Function Parameters Output Parameters	Cancel Apply 98.5	Solution = 2, 2, 2, 3, 10, 10, 10, 10, 10, 10, 10, 10, 10, 10	S → ▼
	Batch Processing	CheckerBoard Filter				
	Converters	🔨 🔿 Extract Skeleton	Default Cancel Apply			
	Developer Tools	A Histogram Matching		14 49		
	4D	Image Label Combine	 Manipulate Silce Viewa 			Sec.
	Diffusion Weighted	Otsu Threshold				
	Work in Progress	Resample Scalar Volume				
		Resample Scalar/Vector/DWI Volume Threshold Image	 Manipulate 3D View 			
		♦ Voting Binary Hole Filling	P ^{\$} 📴 📴 🔎 🗉 🖉	1 9 A		
		Zero Crossing Based Edge Detection Filter				
		Arithmetic				
		Denoising	Bename			100%
		Morphology >>	🛃 start 🛛 🥙 🚢 🤌 🛅 2 Window 🔻 🎘 4 x-Wi	n32 🔻 🕲 Documentat 🛛 🗙 Work@Bric:	🍟 untitled - Pa 🚳 HAMMER_T 🧣	🗑 OASIS_DAT 🔍 🍣 M 🔤 🎘 📷 10:30 PM



HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

Guorong Wu, Ph.D., University of North Carolina at Chapel Hill



-31-



The input to HAMMER

🍹 Save	Save Scene and Unsaved Data						
Save Scene & Data Options ————————————————————————————————————							
Change Destination for All Selected: home/grwu/							
Select	Node Name	Node Type	Node Status	File Format	File Name	Data Directory	
	model_cbq.hdr	Volume	Not Modified	Analyze (.hdr)	model_cbq.hdr	stage/grwu/NAMIC/template	
	Subject_cbq.hdr	Volume	Not Modified	Analyze (.hdr)	Subject_cbq.hdr	stage/grwu/NAMIC/OASIS_DATA	
	Affine registration Transform	LinearTrans	Modified	Transform (.tfm)	Affine registration Tr	Mhome/grwu	
	Subject_cbq_LR.hdr	Volume	Not Modified	NRRD (.nrrd)	Subject_cbq_LR.hdr	Mome/grwu	
	model_seg.hdr	Volume	Not Modified	Analyze (.hdr)	model_seg.hdr	stage/grwu/NAMIC/template	
	Subject_seg.hdr	Volume	Not Modified	Analyze (.hdr)	Subject_seg.hdr	stage/grwu/NAMIC/OASIS_DATA	
	Subject_seg_LR.hdr	Volume	Not Modified	Analyze (.hdr)	Subject_seg_LR.hdr	stage/grwu/NAMIC/result	
						7	
\triangleleft							
	Save Selected Cancel						



HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration







Parameters for HAMMER

🌣 3D Slicer Version 3.5 Alpha	
<u>F</u> ile <u>E</u> dit <u>V</u> iew <u>W</u> indow <u>H</u> elp Feedback	
Modules: HAMMER registration 🔤 🕢 🕨	
3DSlicer	
Help & Acknowledgement	
HAMMER Registration	
Parameter set 🛛 n 🚍 🚍	
Status Idle	
Registration Parameters	
Tissue Labels 10,150,250	
Iterations 50,20,20	
▲ I0	
Fixed Image model_seg.hdr 🔤 🛋	
Moving Image SubjectLR.hdr 🔤 📮	
Moving Intensity Image SubjectLB.hdr 💳 🚔	Literally to run LIANANAED
Output Volume SubjectHAMMER 🔤 🚔	Hit apply to run HAMMER
Output Intensity Volume SubjectHAMMER	
Default Cancel Apply	



HAMMER: Hierarchical Attribute Matching Mechanism for Elastic Registration

Guorong Wu, Ph.D., University of North Carolina at Chapel Hill



-33-