# Neuroconductor: An R Platform for Medical Imaging Analysis

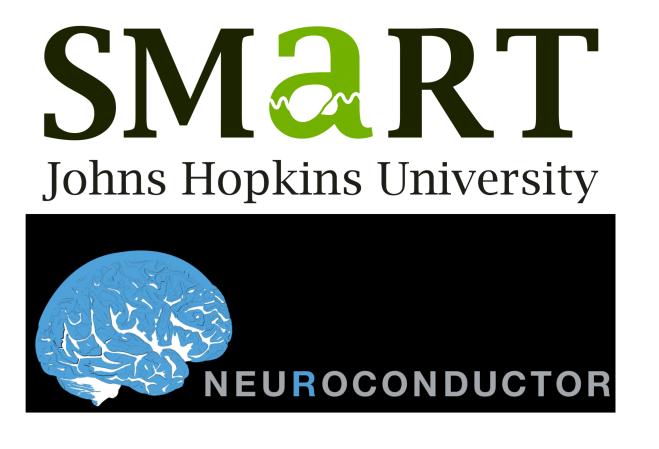


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### What is Neuroconductor?

Neuroconductor (https://neuroconductor.org/) is a a centralized repository of R software dedicated to medical image analysis.

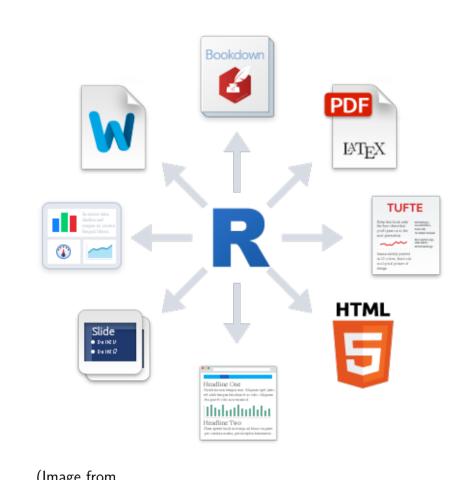
#### Goals of Neuroconductor

- Disseminate quickly software updates
- Educate a large, diverse community of scientists using detailed tutorials and short courses
- Ensure quality via automatic and manual quality controls
- Promote the reproducibility of image data analysis

#### Benefits of Imaging in R

Allow medical imaging to use all R has to offer:

- Statistics and Machine Learning
- Package versioning, testing, and distribution
- Reproducibile reports and analyses (knitr and rmarkdown)
- Shiny applications for the



## http://rmarkdown.rstudio.com/images/RMarkdownOutputFormats.lng)

#### **Current Neuroconductor Capabilities**

Capabilities DICOM Images NIfTI Images Image Registration Inhomogeneity Correction Brain Extraction Structure Segmentation Intensity Normalization 3D Smoothing Temporal Filtering Slice-timing correction DTI models

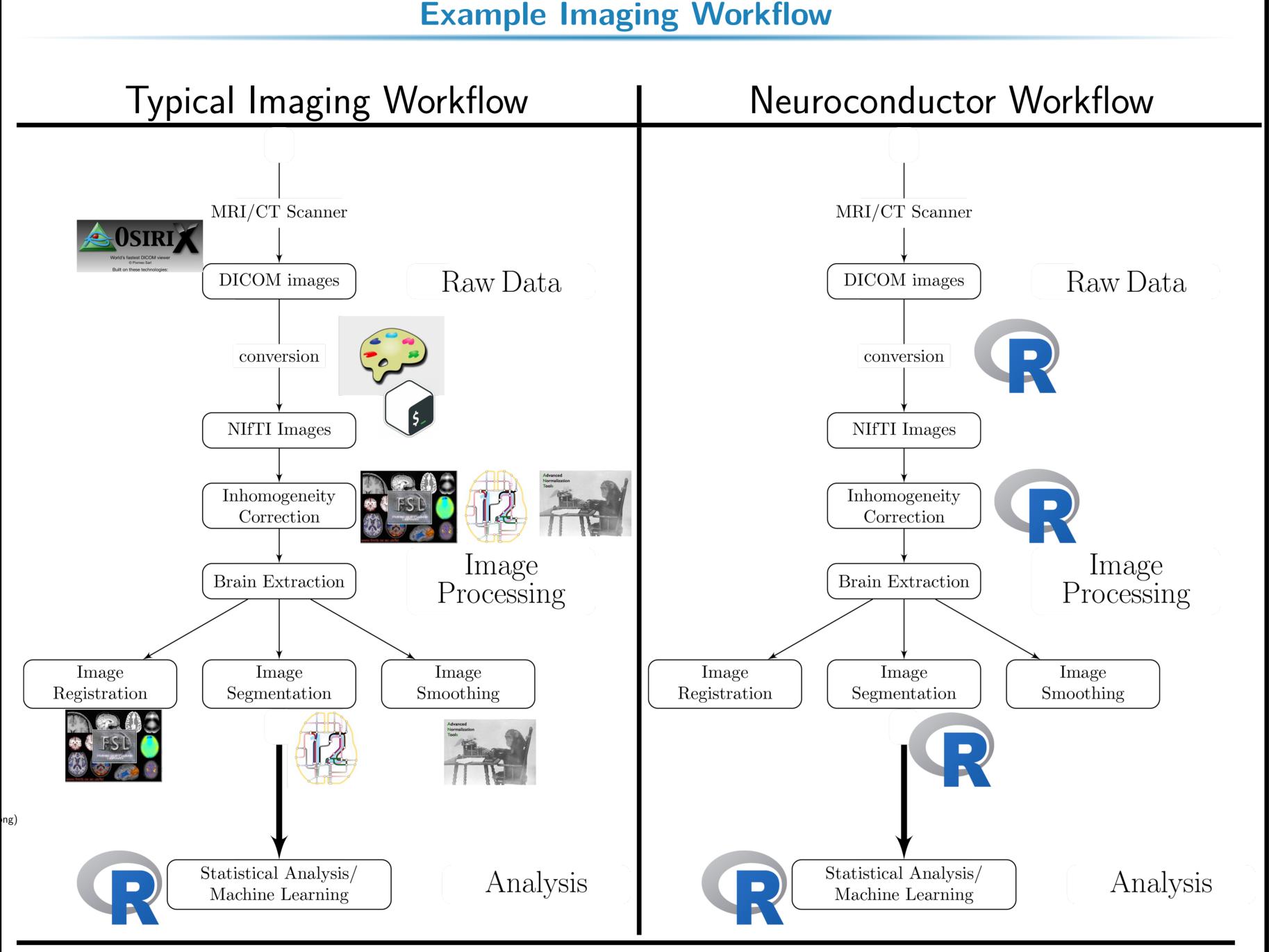
#### Packages oro.dicom, dcm2niir, divest, ANTsR oro.nifti, RNifti, ANTsR spm12r, fslr, ANTsR, freesurfer spm12r, fslr, ANTsR spm12r, fslr, ANTsR, extrantsr spm12r, fslr, ANTsR, extrantsr, freesurfer WhiteStripe, neurobase, ANTsR ANTsR, spm12r, fslr spm12r, fslr, ANTsR spm12r, fslr

rcamino, oro.dti, fslr

#### References

- [1] Bennett A Landman et al. "Multi-parametric neuroimaging reproducibility: a 3-T resource study". In: Neuroimage
- [2] Kenichi Oishi et al. "Atlas-based whole brain white matter analysis using large deformation diffeomorphic metric mapping: application to normal elderly and Alzheimer's disease participants". In: Neuroimage 46.2 (2009), pp. 486-
- [3] Vladimir Fonov et al. "Unbiased average age-appropriate atlases for pediatric studies". In: Neurolmage 54.1 (2011),
- [4] Vladimir S Fonov et al. "Unbiased nonlinear average age-appropriate brain templates from birth to adulthood". In: Neurolmage 47 (2009), S102.
- [5] Bennett Allan Landman et al. MICCAI 2012 Workshop on Multi-Atlas Labeling. CreateSpace Independent Pub-

[6] David C Van Essen et al. "The WU-Minn human connectome project: an overview". In: Neuroimage 80 (2013), pp. 62–79.





bash - shell scripting is usually required for command-line tools or pipelining

MRIcroGL - imaging

analysis suite, with

dcm2nii - DICOM to

NIfTI software



FSL (FMRIB Software Library) suite of neuroimaging analysis tools



- state-of-the-art tools for neuroimaging analysis SPM 12 - statistical parametric mapping requires MATLAB (Mathworks, Natick, Massachusetts, USA) - analysis tools for PET/SPECT/fMRI

ANTs (Advanced

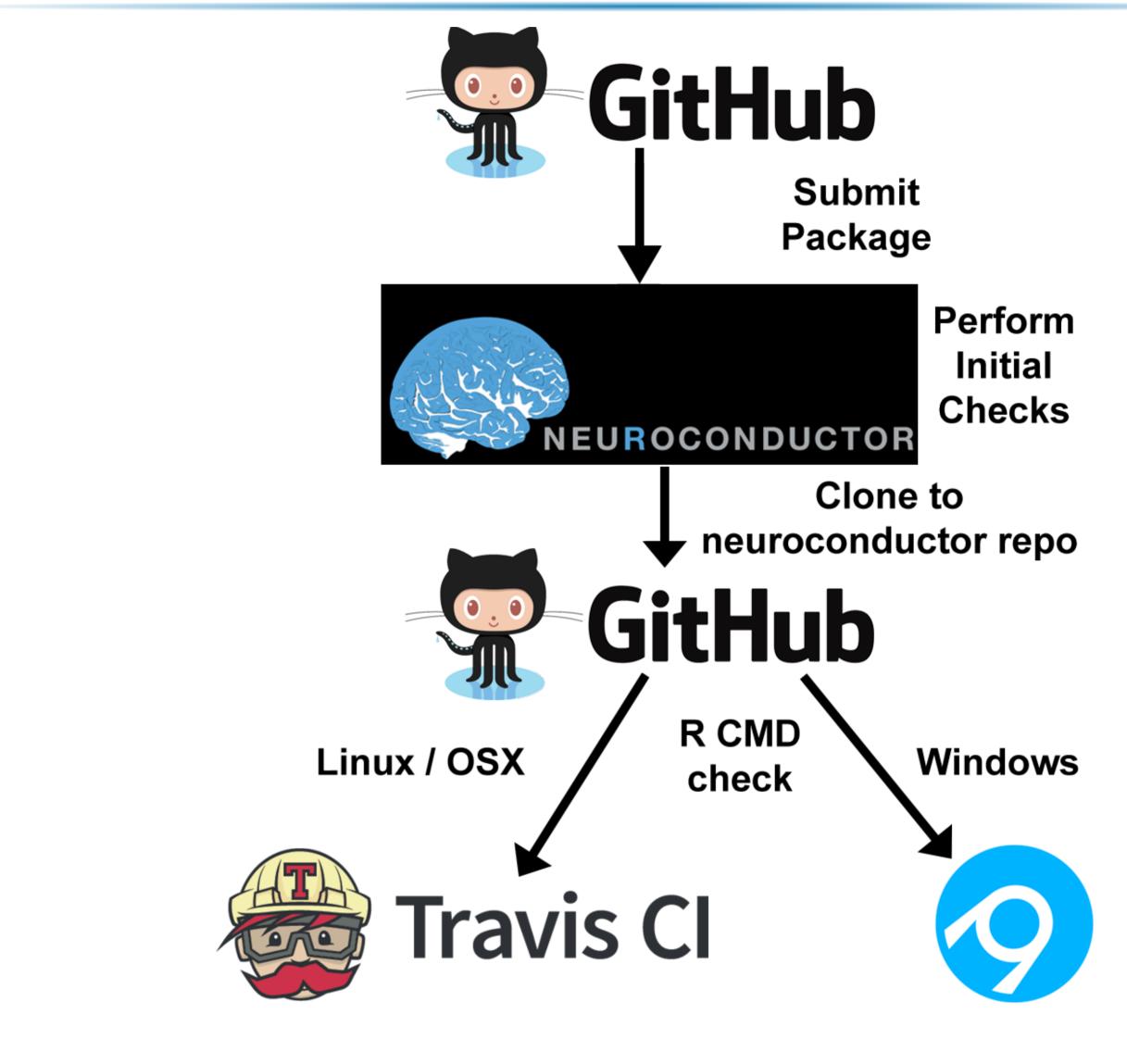
Normalization Tools)

#### OsiriX - standalone **≜**0SIRI**X** DICOM viewer

#### **Data Packages**

Description Package kirby21 Scan-rescan data for 42 subjects with structural and functional MRI and diffusion data [1] EveTemplate, MNITemplate Templates for population-level analyses [2, 3, 4] Templates [5] for Multi-Atlas Label Fusion (MALF) and Skull Stripping malf.templates Download data from the Human Connectome Project [6] hcp

#### Neuroconductor Developer Workflow

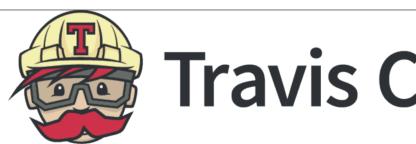




GitHub - a online hosting service of git repositories. All Neuroconductor packages are hosted on GitHub.



Before uploading to GitHub, checks are performed, a confirmatory email is sent (reduce spam), and Travis/Appveyor configuration files are added



Travis CI (continuous integration) - an online service of Linux/Mac OSX virtual machines that build and check packages



AppVeyor - a similar CI service that builds and checks packages on Windows

#### Potential Downsides to Neuroconductor

- More control over the workflow = more work (e.g. for statisticians)
- Users need external software (versions/installation)
- No control over external software
- if maintainer changes something, not much recourse
- Need the content (buy-in from the imaging/R/statistical communities)

#### **Sources of Funding**

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