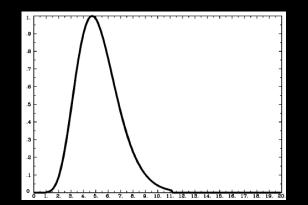
fMRI Course, Day 12: Reproducibility August 13th, 2022



From stimulus to the BOLD response

How tissue properties, blood flow, and magnetic properties interact

Creating contrast images from T1- and T2-weightings



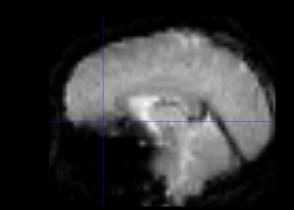
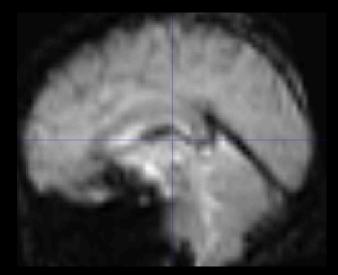
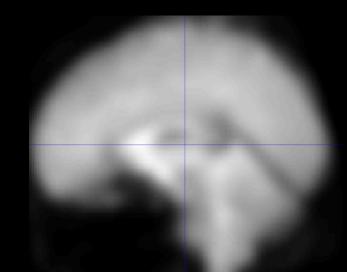


Image artifacts: How to preprocess and why

Quality assurance checks after each step

Parameters that stay the same, versus those you can modify





When would you want to use a smaller smoothing kernel? A larger smoothing kernel? Why?

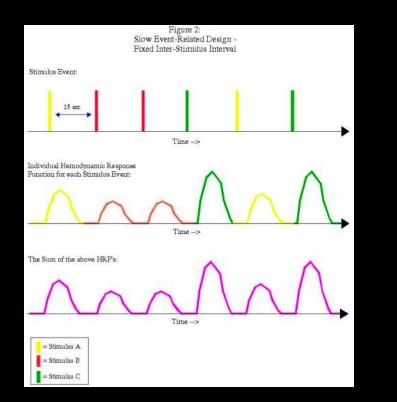
When would you not want to use slice-timing correction? Or should it always be used, no matter what?

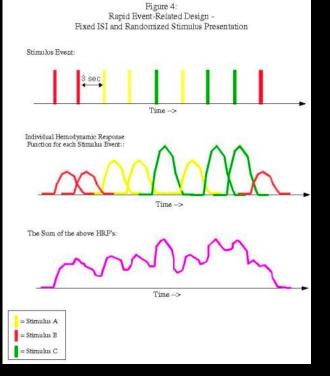
What is the argument for using the mean functional image as the Reference and the anatomical image as the Source? Would you ever want to swap them?

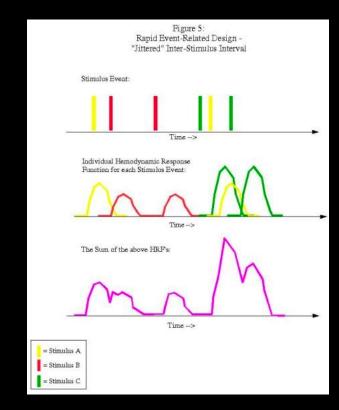
Experimental Design: Block vs. event-related

Slow vs. fast event-related

Jitter, collinearity, and power







What are the main advantages and disadvantages of each?

What is Reproducibility?

Replication: Arriving at the same result, using an independent dataset

Reproducibility: Ability to obtain the same result, using the same data and methods

Today: Use an open-access website to reproduce the results of that study

What is Reproducibility?

Replication and reproducibility have become more talked about in the past decade

Methods such as pre-registration can help to increase the likelihood of a successful replication

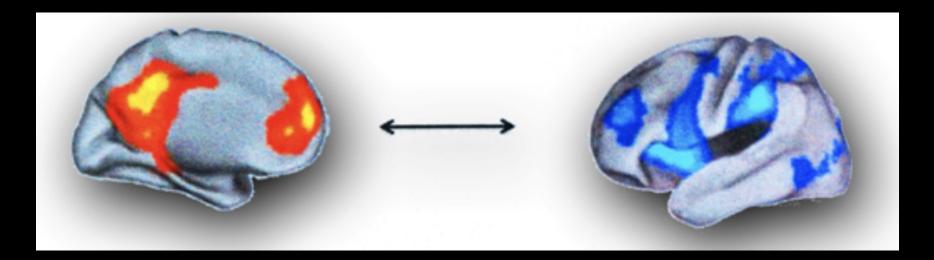
In other words: Minimize the researcher degrees of freedom

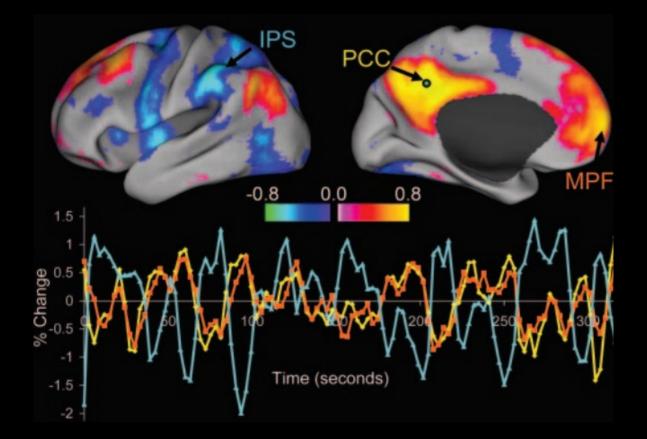
Theory-driven: Based on previous studies, reasonable predictions about what a region does

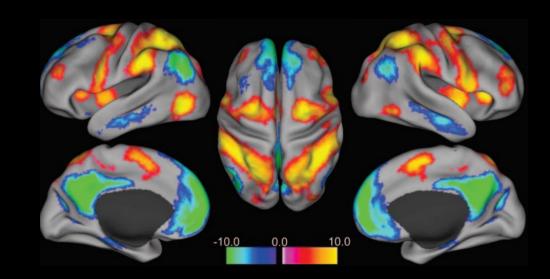
Data-driven: Uses the data itself to identify patterns, and then possibly create theories

Theory-driven approaches have usually been more popular

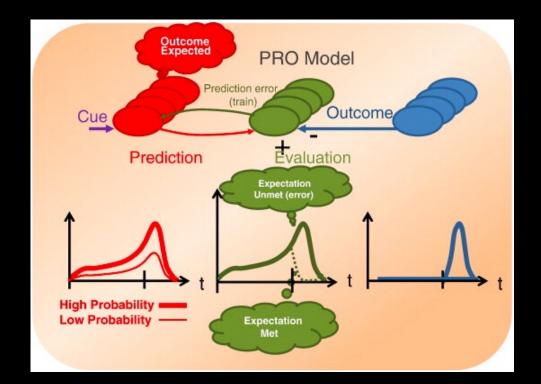
Example: Fox et al., 2005



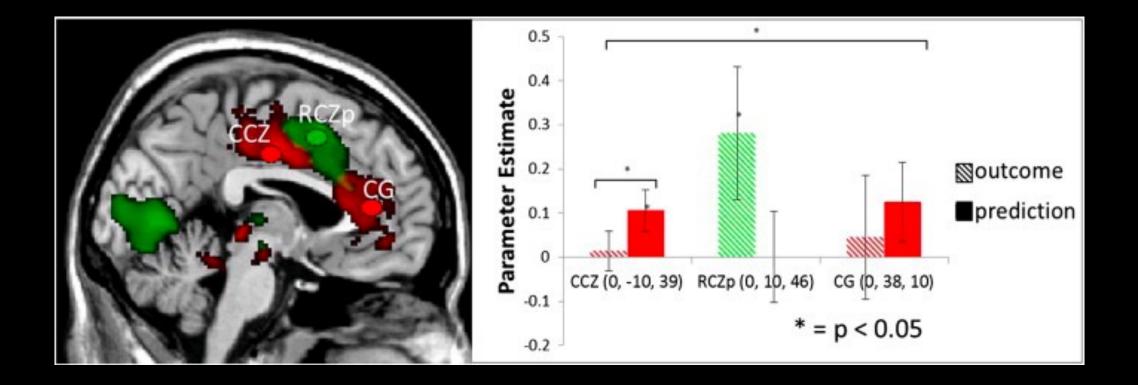




Can also use a theoretical framework to create regressors



$$Activit\,y_t = \sum_i \lfloor \operatorname{Pr} edicted \ Outcom \, e_{i,t} - Actual \ Outcom \, e_{i,t}
floor^+$$



Useful results can be generated from the data itself

Usually requires a large number of observations or subjects

Popular data-driven method: Multivariate Pattern Analysis

Other methods can be used: e.g., clustering



Training data vs. Testing data

Example: Height and hair length in males and females





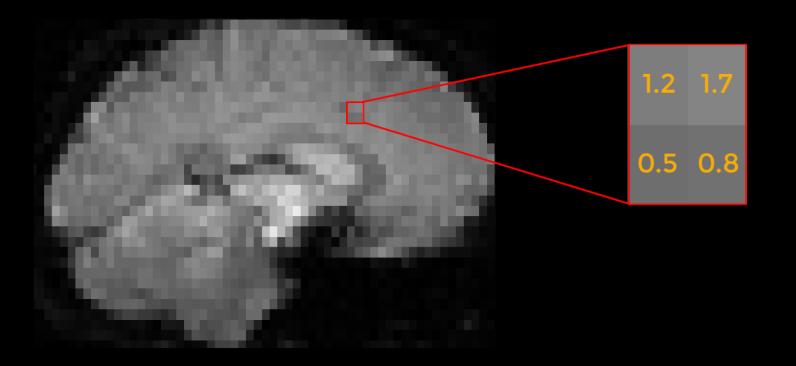
Someone is 6'4" with hair length of 3 inches

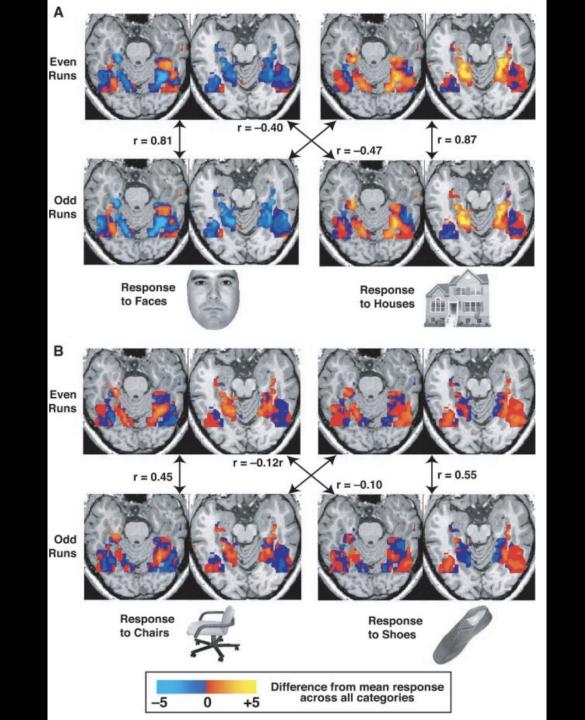
Someone is 5'7" with hair length of 8 inches

Hits/#Observations = Accuracy



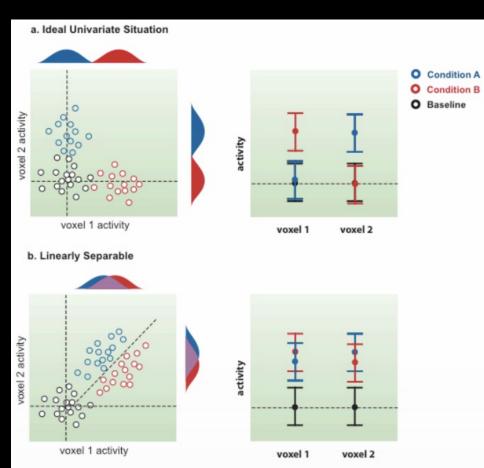
Applied to fMRI Data

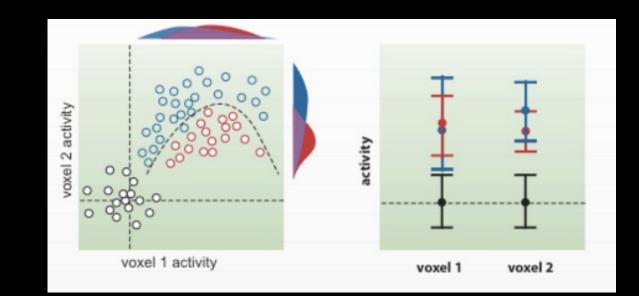




MVPA

Use Support Vector Machines to classify beta maps







Versions

≪ _____*

580166c2cce88d000aa33631 2018-07-13

00001 2018-07-13

Visual object recognition

uploaded by Chris Gorgolewski on 2016-10-14 - almost 4 years ago last modified on 2018-07-14 - about 2 years ago authored by Haxby, J.V., Gobbini, M.I., Furey, M.L., Ishai, A., Schouten, J.L., Pietrini, P. 807 @ 15359



OpenNeuro Accession Number: ds000105 Files: 1095, Size: 1.75GB, Subjects: 6, Session: 1 Available Tasks: object viewing Available Modalities: T1w, bold

README

This dataset was obtained from the OpenfMRI project (http://www.openfmri.org). Accession #: ds105

Description: Visual object recognition

Please cite the following references if you use these data:

Haxby, J.V., Gobbini, M.I., Furey, M.L., Ishai, A., Schouten, J.L., Pietrini, P. (2001). Distributed and overlapping representations of faces and objects in ventral temporal cortex. Science, 293(5539):2425-30

Hanson, S.J., Matsuka, T., Haxby, J.V. (2004). Combinatorial codes in ventral temporal lobe for object recognition: Haxby (2001) revisited: is there a "face" area? Neuroimage. 23(1):156-66

O'Toole, A.J., Jiang, F., Abdi, H., Haxby, J.V. (2005). Partially distributed representations of objects and faces in ventral temporal cortex. J Cogn Neurosci, 17(4):580-90

Release history: 10/12/2011: initial release

BIDS Validation

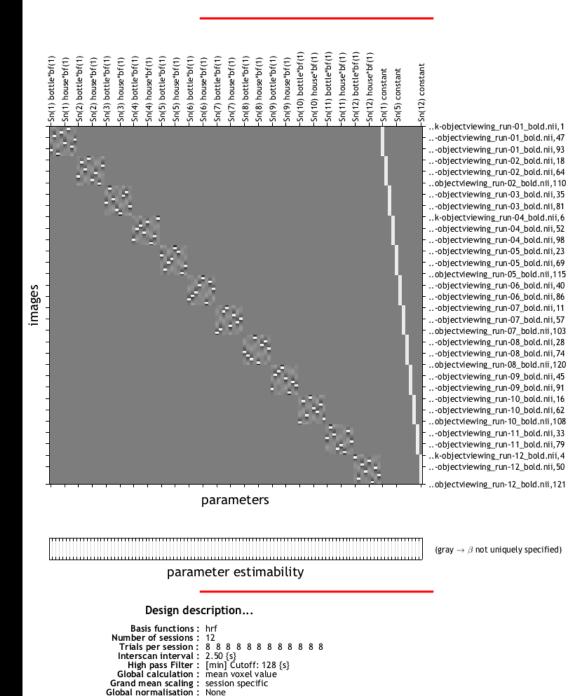


Dataset File Tree

⊳ Visual object recognition
- CHANGES
🛓 DOWNLOAD 🗶 VIEW
datasetdescription.json
LOWNLOAD SVIEW
README
🛓 DOWNLOAD 🗶 VIEW
_ task-objectviewing_bold.json
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B DOWNLOAD @ VIEW
 derivatives
— 🖿 sub-1
— 🖿 sub-2
- b sub-3
— 🖿 sub-4
— 🖿 sub-5
- 🖿 sub-6

Preprocessing an MVPA experiment is similar to fMRI, with the exception of smoothing

• •		Batch Editor				
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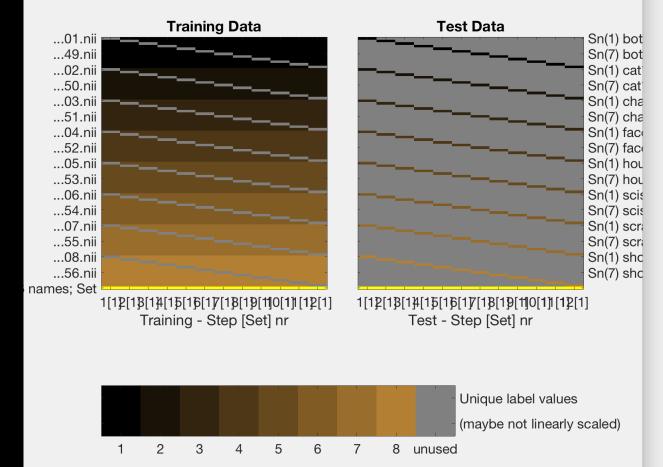
Statistical analysis: Design

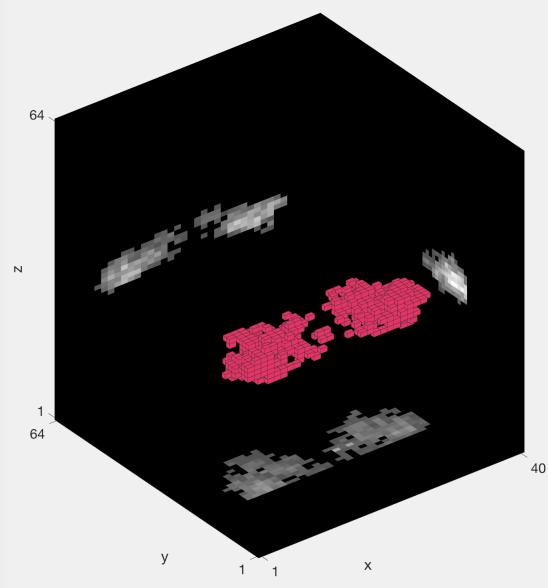
labelname1 = 'bottle'; labelname2 = 'cat'; labelname3 = 'chair'; labelname4 = 'face'; labelname5 = 'house'; labelname6 = 'scissors'; labelname7 = 'scrambledpix'; labelname8 = 'shoe';

8	% Make sure the decoding toolbox and your favorite software (SPM or AFNI)
9	<pre>% are on the Matlab path (e.g. addpath('/home/decoding_toolbox'))</pre>
10	% addpath('\$ADD FULL PATH TO TOOLBOX AS STRING OR MAKE THIS LINE A COMMENT IF IT IS ALREADY\$')
11	<pre>% addpath('\$ADD FULL PATH TO TOOLBOX AS STRING OR MAKE THIS LINE A COMMENT IF IT IS ALREADY\$')</pre>
12	
13	% Set defaults
14 -	cfg = decoding_defaults;
15 –	cfg.results.overwrite = 1;
16	
17	% Set the analysis that should be performed (default is 'searchlight')
18 -	cfg.analysis = 'ROI';
19 –	cfg.searchlight.radius = 3; % use searchlight of radius 3 (by default in voxels), see more details below
20	
21	% Set the output directory where data will be saved, e.g. 'c:\exp\results\buttonpress'
22 -	cfg.results.dir = [pwd '/SPM_Results_1'];
23	
24	% Set the filepath where your SPM.mat and all related betas are, e.g. 'c:\exp\glm\model_button'
25 -	<pre>beta_loc = [pwd '/SPM_Results_1'];</pre>
26	A Cat the fileness of your brain mark (or your DOT marks or call matrix)
27	% Set the filename of your brain mask (or your ROI masks as cell matrix)
28 29	% for searchlight or wholebrain e.g. 'c:\exp\glm\model_button\mask.img' OR % for ROI e.g. {'c:\exp\roi\roimaskleft.img', 'c:\exp\roi\roimaskright.img'}
29 30	% You can also use a mask file with multiple masks inside that are
30	% separated by different integer values (a "multi-mask")
32 -	cfg.files.mask = [pwd '/Haxby Masks/sub-1_mask4_vt.nii'];
33	cry.rices.mask = [pwu /naxby_nasks/sub-i_masks_vt.nii],
34	% Set the label names to the regressor names which you want to use for
35	% decoding, e.g. 'button left' and 'button right'
36	% don't remember the names? -> run display regressor names(beta loc)
37 -	labelname1 = 'bottle':
38 -	labelname2 = 'cat';
39 -	labelname3 = 'chair';
40 -	<pre>labelname4 = 'face';</pre>
41 -	<pre>labelname5 = 'house';</pre>
42 -	<pre>labelname6 = 'scissors';</pre>
43 -	<pre>labelname7 = 'scrambledpix';</pre>

Figure 1: Decoding Design Figure 2: Online ROI, showing 1/500 steps (cfg.plot_selected_voxels=0 for more speed) File Edit View Insert Tools Desktop Window Help ^a File Edit View Insert Tools Desktop Window Help 🔍 🔍 👋 🕲 🐙 🔏 🗸 2 1 🖸 🗔 🎦 🗃 🛃 🔍 🔍 👋 🐌 🐙 🔏 -2 \Xi 🔳 🛄 D. ĺ₹.

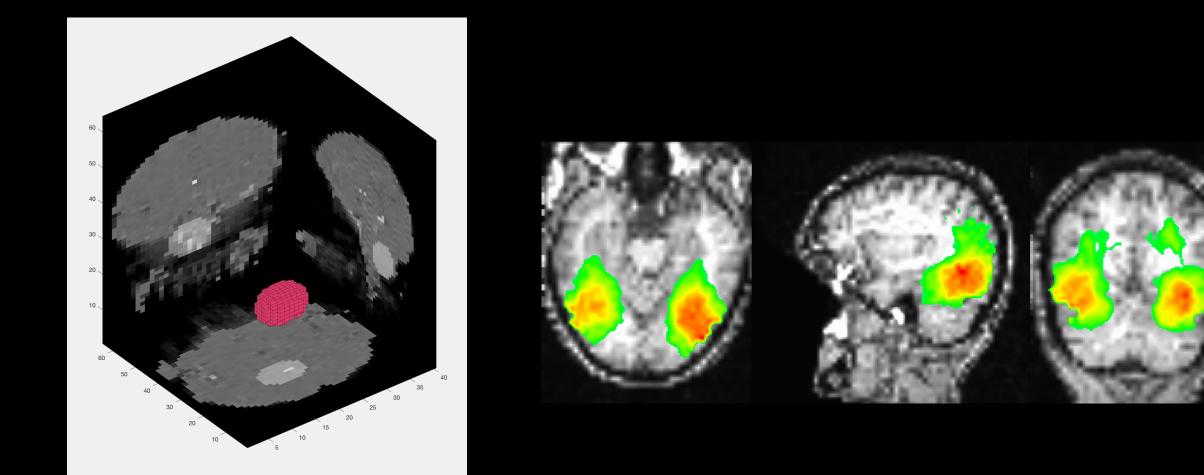
TDT - Decoding details Filestart: /Users/ajahn/Desktop/Haxby_Data/SPM_Results_1/beta_00 Results: /Users/ajahn/Desktop/Haxby_Data/SPM_Results_1 Start: 28-Sep-2020 15:36:29, End: 28-Sep-2020 15:36:32





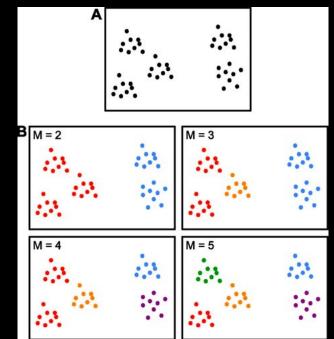
1	58.33	8.333	8.333	0	0	8.333	8.333	8.333	90
2	8.333	75	0	16.67	0	0	0	0	- 80
3	16.67	0	58.33	0	8.333	0	8.333	8.333	- 60
4	0	8.333	0	91.67	0	0	0	0	- 50
5	0	0	8.333	0	91.67	0	0	0	- 40
6	25	0	16.67	0	0	33.33	0	25	- 30
7	8.333	0	8.333	0	0	0	83.33	0	- 20
8	16.67	0	8.333	0	0	16.67	0	58.33	- 10
	1	2	3	4	5	6	7	8	0

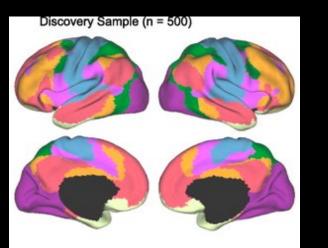
Searchlight Analysis



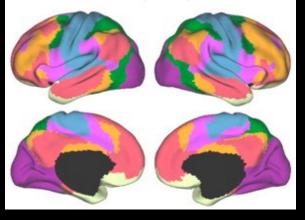
Example of Clustering: Yeo et al., 2011

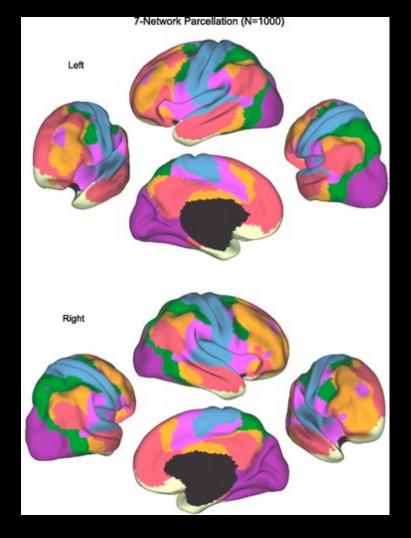
Used clustering to reveal intrinsic FC networks

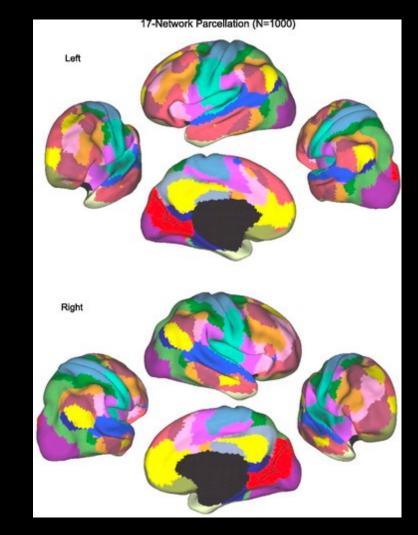


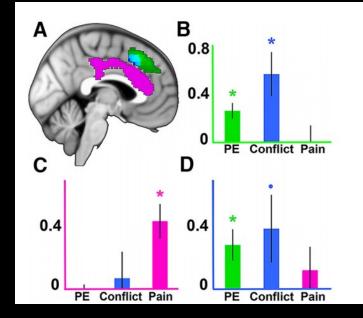


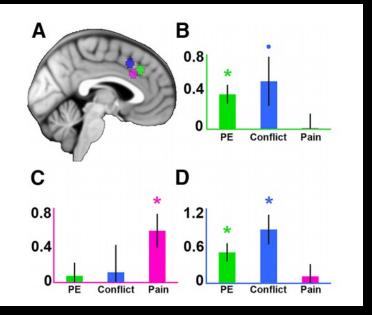
Replication Sample (n = 500)

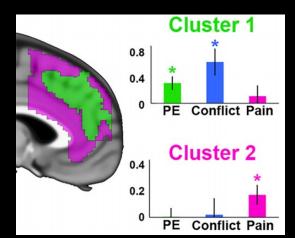












Summary: Comparison of each Approach

Theory-driven: Builds upon previous research; logically coherent; consecutive results; can be done with relatively few subjects

Data-driven: Can leverage large open-access datasets to answer new questions; depending on number of subjects and trials, has huge power

Word of Caution

Does not protect you from statistical fallacies discussed earlier

Large datasets provide more power; also, more opportunities for fishing and p-hacking

Tools for Reproducibility

Open-access repositories

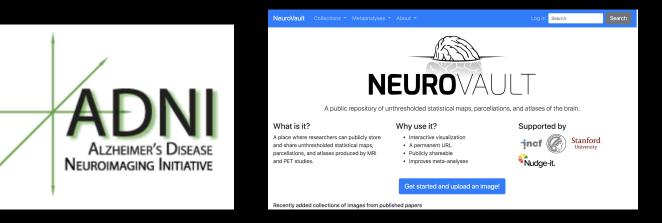


OpenNEURO

A free and open platform for sharing MRI, MEG, EEG, iEEG, ECoG, ASL, and PET data



Human Connectome Project										
Home	About	Data	Informatics	Gallery	Publications	News				



Overview of Openneuro

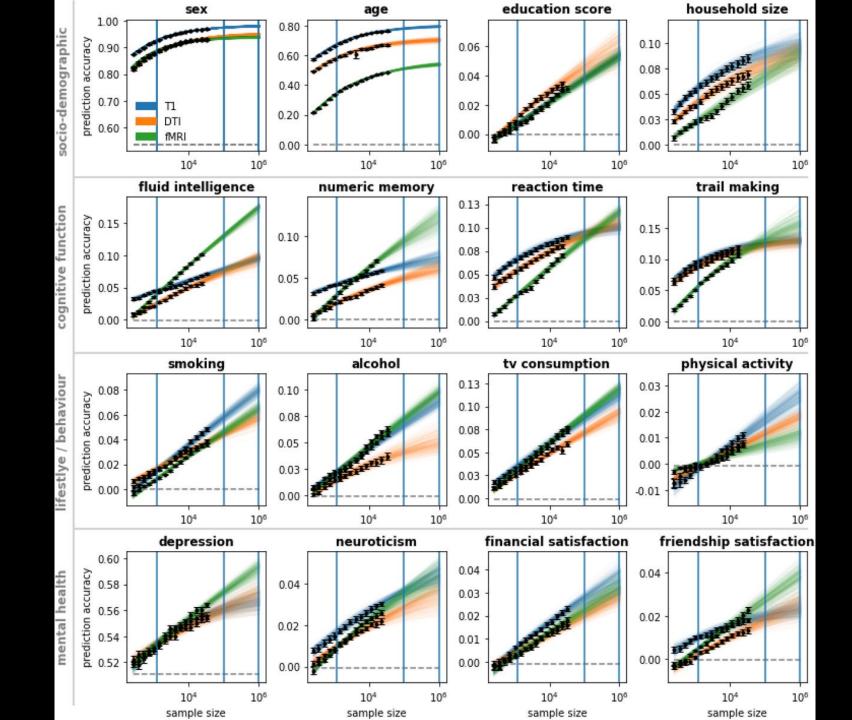
Growing use of large databases

ABCD (n=11,874)

Human Connectome Project (n=1,200)

UK Biobank (n=36,735)

Typical fMRI study n = ~25

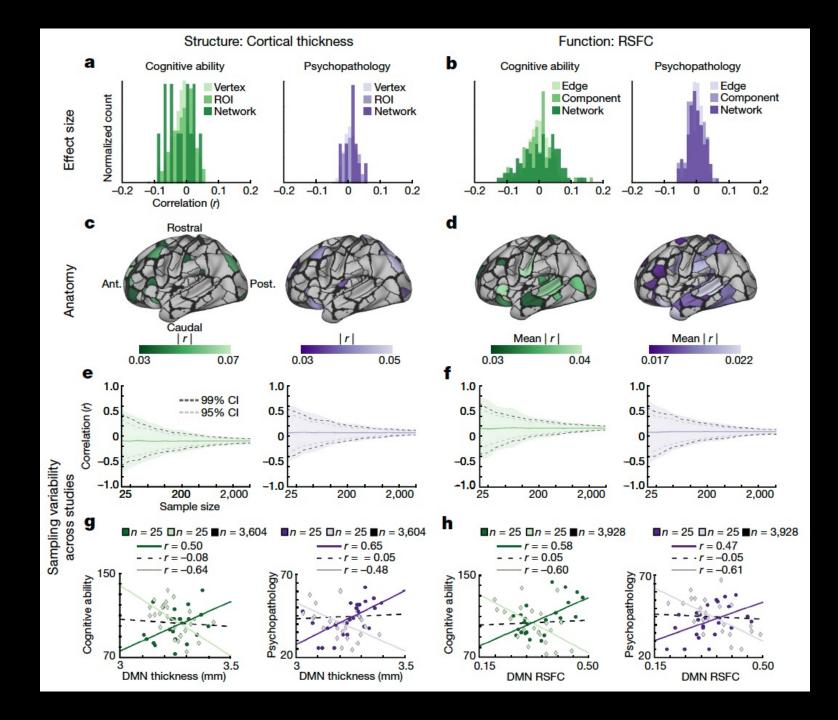


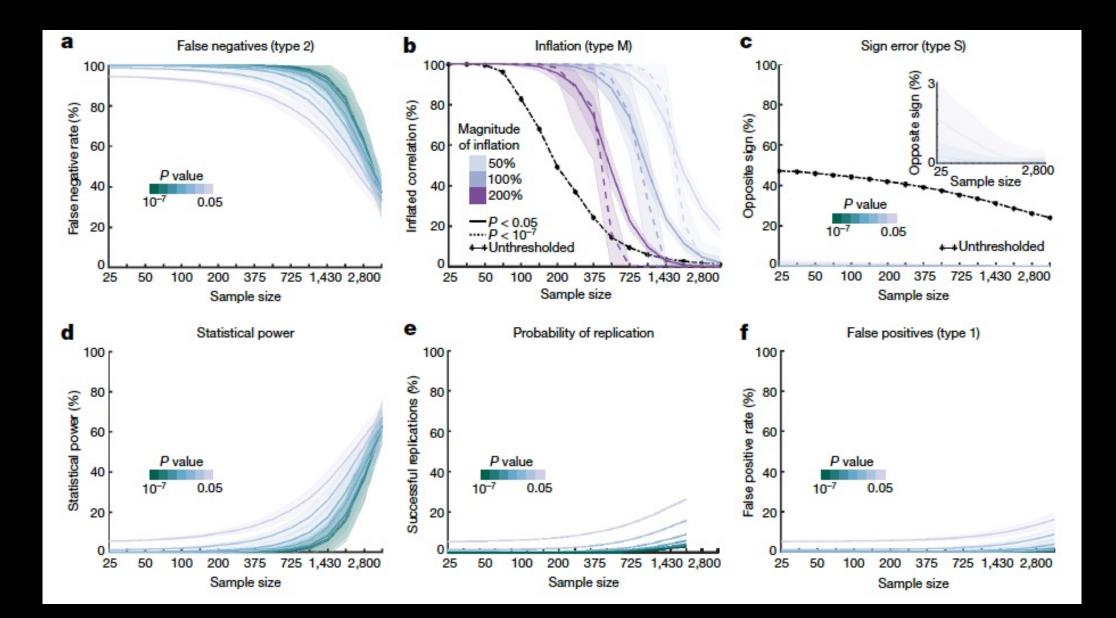
Large database issues

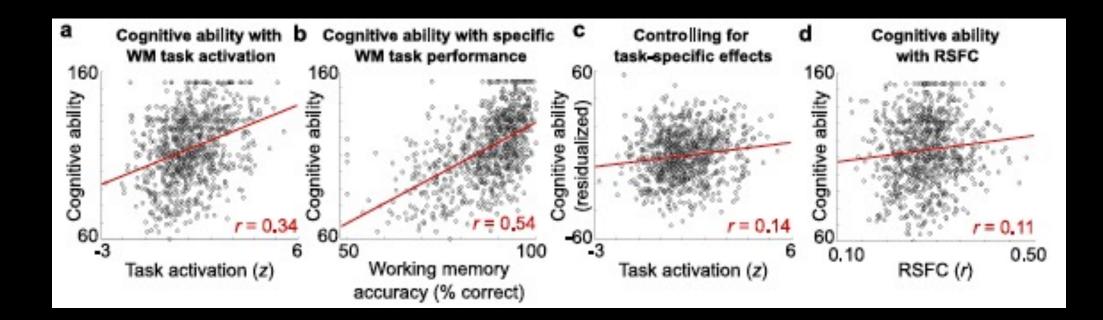
Can be collected from different sites

Changes in acquisition protocols over time (e.g., ADNI phases 1-3)

Current study: Look at ABCD, HCP, and UK Biobank







Summary

Although not all measures were studied, we can assume the effect sizes are similar (e.g., with EEG)

Compared to GWAS, BWAS requires fewer subjects

Ways to boost power: Within-study designs, Multivariate methods, interventions vs. observations

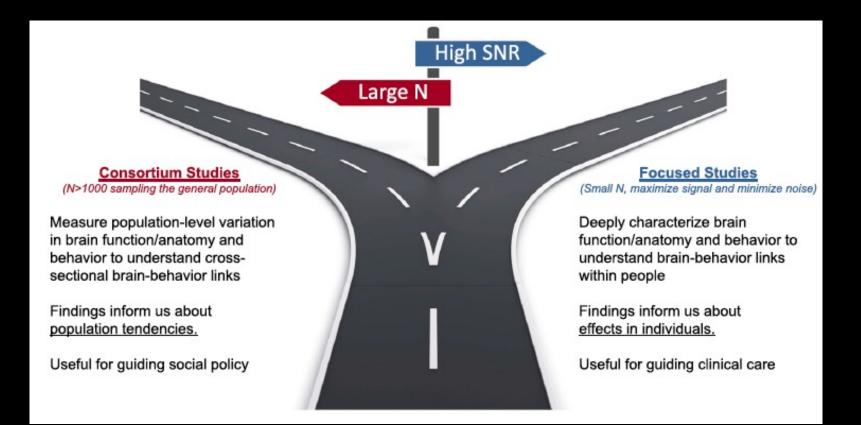
Gratton's Response

Cross-sectional studies with small N are useless

Consortia studies may have small effect sizes, but they are comparable to others that are useful

Nevertheless, they usually avoid novel experimental questions and designs

Gratton's Response



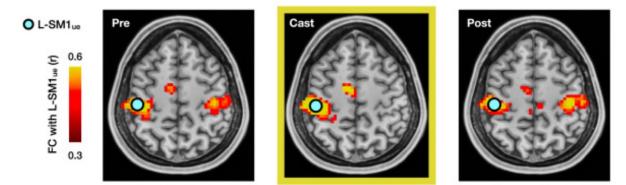
Other possibilities

Over-reliance on large-scale studies can limit funding opportunities for junior researchers

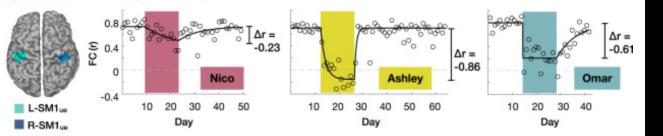
Smaller studies can still yield useful results through higher signal and lower noise designs

e.g., within-subjects designs, using designs that induce large alterations in behavior

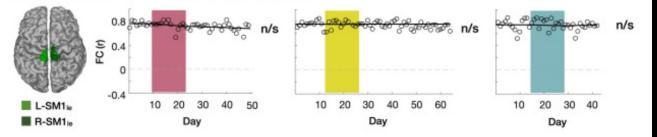
A Functional connectivity (FC) seed maps



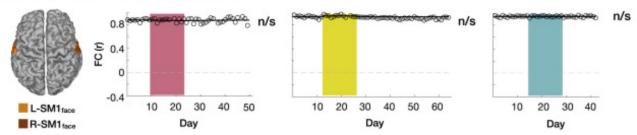
B Daily time course of FC: upper extremity



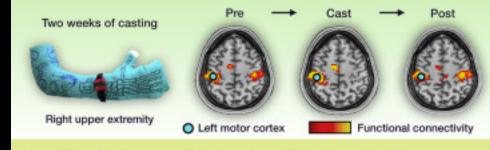
C Daily time course of FC: lower extremity (negative control)



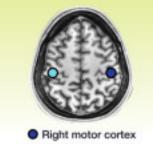
D Daily time course of FC: face (negative control)

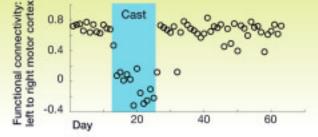


Disuse of brain circuits causes functional disconnection

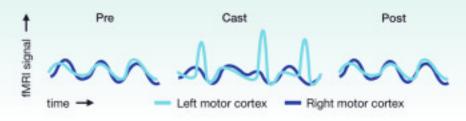


Functional disconnection begins within hours to days





Spontaneous activity pulses propagate through disused circuits



Newbold et al., 2020

Background to the IronTract Challenge

Historically, several issues with reconstructing pathways

Demands for higher spatial and angular resolution

Advanced acquisition parameters were developed by the Human Connectome Project (HCP)

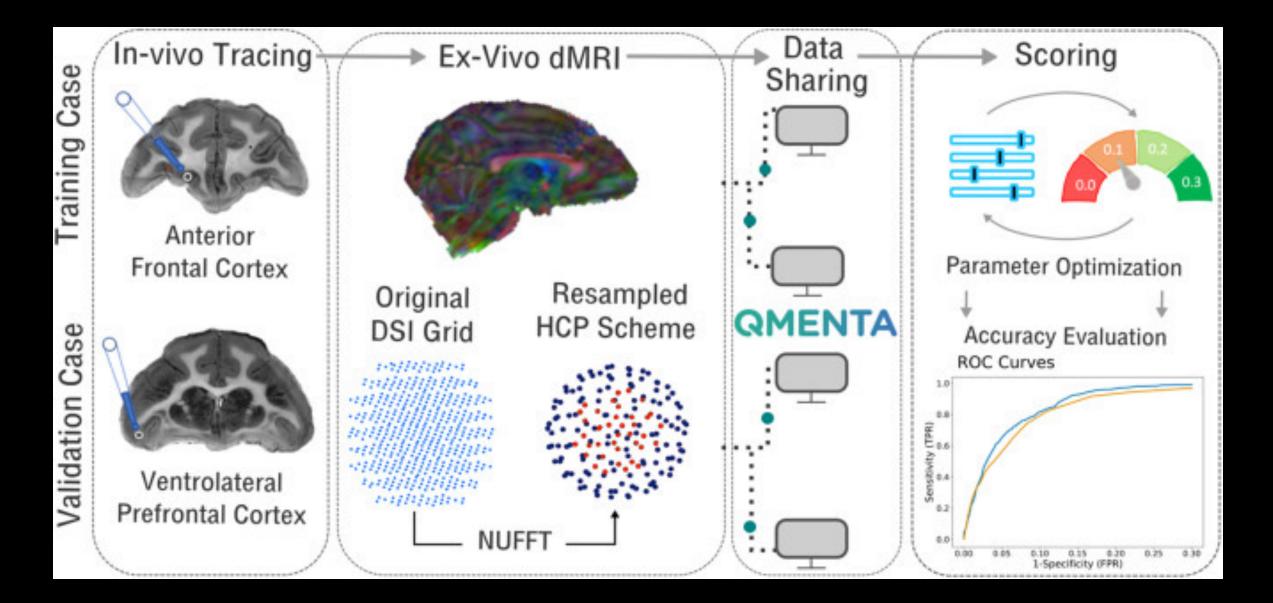
Need for comparing different methods

Background to the IronTract Challenge

Based on data taken from ex vivo primate brains

Anatomic tracer injections show ground truth of the trajectory of brain tracts

This is compared to estimates by diffusion software





Allowed to use analysis methods of choice

Both probabilistic and deterministic tractography were used

Training case: Could repeat analysis any number of times

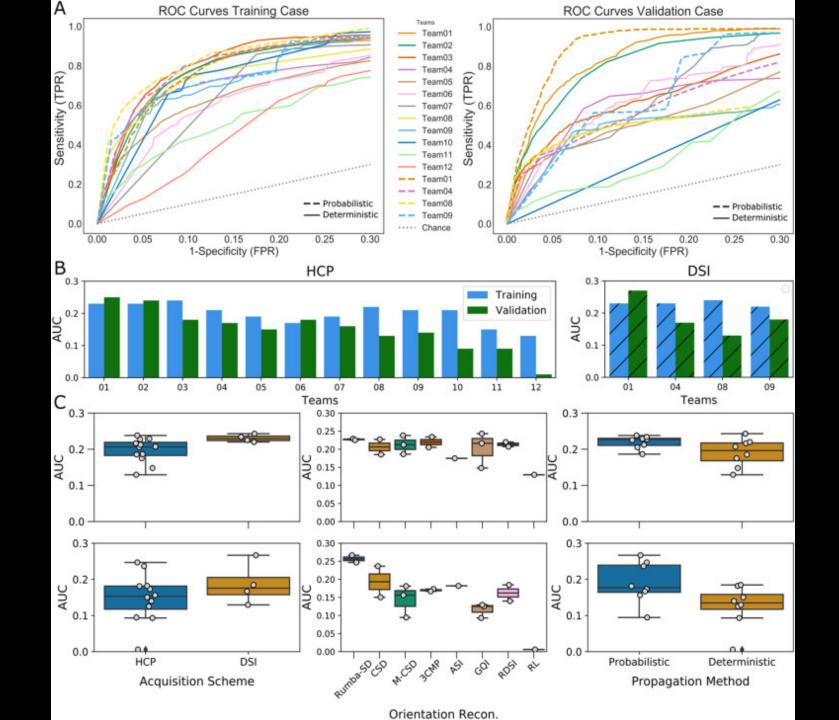
Round 2

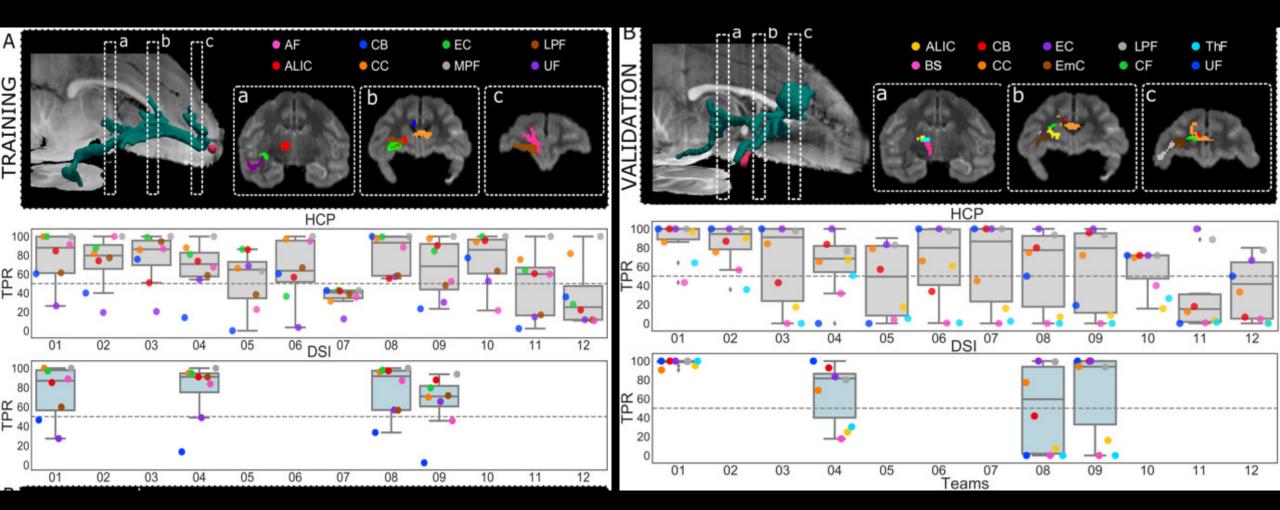
Pre- and post-processing was standardized

Choice of orientation reconstruction and tractography

ROIs analyzed: Cingulum, CC genu, external capsule, internal capsule, and uncinate fasciculus

Resul **uno**





Questions?

Pre-registration

Posit hypotheses before collecting data

Specify parameters such as sample size, analysis options, dependent variables, and exclusion criteria

Pre-registration

Example: Open Science Framework



Improve your research with preregistration. By writing out specific details such as data collection methods, analysis plans, and rules for data exclusion, you can make important decisions early on and have a clear record of these choices. This can help reduce biases that occur once the data are in front of you.

Pre-registration

Alternative: AsPredicted.org

	Creating New AsPredicted						
	□ I am just trying things out. (Check the box and the submission will self destruct within 24 hours)						
	Participating Authors (Up to 5)						
Order	First	Last	email	Affiliation			
1	Andrew	Jahn	ajahn@umich.edu	University of Michigan			
2							
3							
4							
4							
5							
AsPredicted Questions (version 2.00) This <u>blog.post</u> on how to answer pre-registration questions may be a useful resource.							
 1) Data collection. Have any data been collected for this study already? 							
	 O It's complicated. We have already collected some data but explain in Question 8 why readers may consider this a valid <u>pre</u>-registration nevertheless. (Note: "Yes" is not an accepted answer.) 2) Hypothesis. What's the main question being asked or hypothesis being tested in this study? 						

Other Tools

Github

Why GitHub? Team Enterprise Explore Marketplace Pricing

Where the world builds software

Millions of developers and companies build, ship, and maintain their software on GitHub—the largest and most advanced development platform in the world.

Sign up for GitHub

Github



Andrew Jahn andrewjahn

Follow

Neuroimaging consultant, working primarily with AFNI, FSL, SPM, FreeSurfer, and MRtrix.

્રર 108 followers · 1 following · ☆ 0

🗓 University of Michigan

O Ann Arbor, MI

Attps://andysbrainbook.readthedocs.io...

Achievements

💭 Overview 📮 Repositories 15 🛄 Projects 🔗 Pa	ackages
Popular repositories	
AndysBrainBook This repository contains the files that generate Andy's Brain Book on ReadTheDocs. ☆ 55 \$ 23	OpenScience_Scripts Scripts to use with Open Science materials such as fMRIPrep ● Shell ☆ 6 ♀ 7
AFNI_Scripts Scripts used for fMRI data analysis in AFNI ● Shell ☆ 5 % 5	FSL_Scripts Scripts for analyzing fMRI data using FSL ● Shell ☆ 4
MRtrix_Analysis_Scripts Scripts for analyzing diffusion data with MRtrix ● Shell ☆ 3 % 3	CONN_Scripts ● MATLAB ☆ 3 양 3
440 contributions in the last year	
Jun Jul Aug Sep Oct Nov Dec Mon Wed Fri	Jan Feb Mar Apr May Jun
Learn how we count contributions	Less 🗌 🔲 🗮 🖬 More



Downloading the "git" command

Installer for Macintosh: https://git-scm.com/download/mac

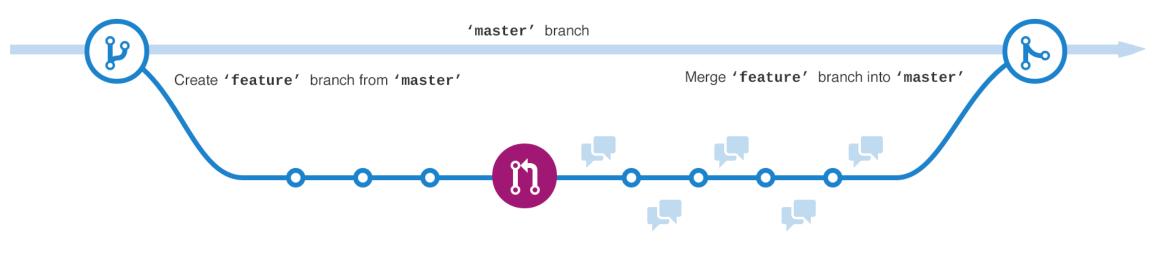
Installer for Windows: https://git-scm.com/download/win

Github has a technical (and sometimes confusing!) vocabulary

Repository: contains all of the project files (including documentation), and stores each file's revision history

Branch: Current copy of the finalized edits

Each repository by default has a "main" branch



Fork: Create a copy of a repository

Any edits made to this copy will not be seen by the public until the changes are merged

Commit: Snapshot of an edit that can be later merged into the main branch

Commits can be labeled with messages describing what the change was

23	
24	figure:: Github_Repositories.png
25	
26	Example of repositories on a Github page.
27	
28	* Clone: Copying a repository to your local machine. For example, if I want to clone the repository ``SPM_Scripts`` from Andy's Github page, I would need to know
	the link to the page (i.e., <u>https://github.com/andrewjahn/SPM_Scripts</u>), and then use it with the ``git`` command:
29	
30	••
31	
32	git clone <u>https://github.com/andrewjahn/SPM_Scripts</u>
33	
34	This will clone the SPM_Scripts repository to my local machine, from where I ran the ``git`` command.
35	
36	* Branching: Each repository has a ``main`` branch, which contains all of the final edits that are seen by the public. A new branch is created to make edits, and
	can be called anything you like; when the edits are approved by whoever owns the repository, they are merged into the main branch.
37	
38	figure:: Github_Branch.png
39	



Commit changes

Add Branching and Clone Definitions

This edit defines what Branching and Cloning mean in Github.

• --- Commit directly to the master branch.

◎ 1 Create a **new branch** for this commit and start a pull request. Learn more about pull requests.

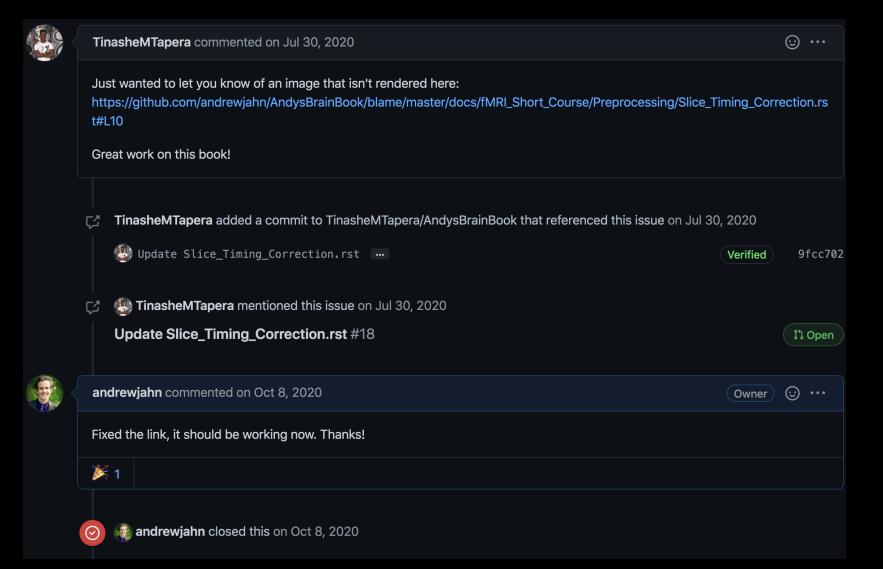
Commit changes Cancel

Push and pull

Push: Send changes to your repository, even if they are created locally (need permissions)

Pull request: Ask for a review of your commits before they are merged into the main branch

Opening an Issue



Closing an Issue

ୟ ଦ	onversation 0	-o- Commits 1	E Checks 0	$ \pm $ Files changed 1		
	TinasheMTape	ra commented on Jul 3	30, 2020		First-time contributor	© ···
	#17					
	-o- 🔮 Update	Slice_Timing_Correc	tion.rst …		Verified	9fcc702
	Add more commits by pushing to the patch-1 branch on TinasheMTapera/AndysBrainBook.					
ഺഀ൦		ious integration has ctions and several other		tomatically catch bugs and enfor	ce style.	
This branch has no conflicts with the base branch Merging can be performed automatically.						
	Merge pull r	equest - You ca	an also open this in GitHu	b Desktop or view command line in:	structions.	

Update Slice_Timing_Correction.rst #18					
Se Merged andrewjahn merged 1 commit into andrewjahn:master from TinasheMTapera:patch-1 🖺 now					
Image: Conversation Image: Object to the state of the stat	+1 -1				
Changes from all commits - File filter - Conversations - Jump to - 🖏 -	0 / 1 files viewed 🛈 Review changes 👻				
<pre>v 2 docs/fMRI_Short_Course/Preprocessing/Slice_Timing_Correction.rst</pre>					
	en in a single moment, an				
8 8 The two most commonly used methods for creating volumes are sequentia	l and interleaved slice acquisition. Sequential slice acquisition acquires each				
adjacent slice consecutively, either bottom-to-top or top-to-bottom. I	nterleaved slice acquisition acquires every other slice, and then fills in the gaps				
on the second pass. Both of these methods are illustrated in the video	below.				
9 9					
<pre>10 figure:: SliceTImingCorrection_Demo.gif</pre>					
<pre>10 + figure:: SliceTimingCorrection_Demo.gif</pre>					
11 11					
12 12 As you'll see later on, when we model the data at each voxel we assum	e that all of the slices were acquired simultaneously. To make this assumption				
valid, the :ref:`time-series <time_series>` for each slice needs to be</time_series>	shifted back in time by the duration it took to acquire that slice. ` <u>Sladky et al.</u>				
<u>(2011) <https: article="" pii="" s10538119110<="" science="" u="" www.sciencedirect.com=""></https:></u>	<u>07245>`</u> also demonstrated that slice-timing correction can lead to significant				
increases in statistical power for studies with longer TRs (e.g., 2s o	r longer), and especially in the dorsal regions of the brain.				
13 13					

Clone: Copy of a repository that lives on your computer

Sample usage: git clone <repository address>

양 master 👻 양 1 branch 💿 0 tags	Go to file 💆 Code	•		
andrewjahn Update run1stLevelAnalysis	andrewjahn Update run1stLevelAnalysis_job_PM.m		?	
Extract_ROI_Data.m	Update Extract_ROI_Data.m	https://github.com/andrewjahn/SPM_Scri		
B README.md	Initial commit	Use Git or checkout with SVN using the web URL.		
RunPreproc_1stLevel_job.m	Update RunPreproc_1stLevel_job.m	(낮) Open with GitHub Desktop		
ConvertOnsetTimes.m	Update convertOnsetTimes.m			
run1stLevelAnalysis_job_PM.m	Update run1stLevelAnalysis_job_Pf	Download ZIP		

(base) ajahn:~/Desktop\$ git clone https://github.com/andrewjahn/SPM_Scripts.git Cloning into 'SPM_Scripts'... remote: Enumerating objects: 40, done. remote: Counting objects: 100% (40/40), done. remote: Compressing objects: 100% (39/39), done. remote: Total 40 (delta 19), reused 0 (delta 0), pack-reused 0 Unpacking objects: 100% (40/40), done. (base) ajahn:~/Desktop\$ ls Archived Flanker_fMRIPrep SPM_Scripts BTC_preop Gambles ds002422-download CONN_Demo Haxby_Data network_TDA_tutorial FSL_Flanker Haxby_Data_Umich Flanker NeuroNav (base) ajahn:~/Desktop\$ cd SPM_Scripts/ (base) ajahn:~/Desktop/SPM_Scripts\$ ls Extract_ROI_Data.m convertOnsetTimes.m run1stLevelAnalysis_job_PM.m README.md RunPreproc_1stLevel_job.m (base) ajahn:~/Desktop/SPM_Scripts\$

Supercomputing

What is a supercomputer?

Great Lakes is a supercomputing cluster, i.e., a large collection of computers



Supercomputing at the University of Michigan

LSA students can apply for a supercomputing account through Michigan's Advanced Research Computing (ARC) center

Usually requires a shortcode from the PI

Can apply for a Umich Research Computing Package (UMRCP)

80,000 CPU hours and 10TB of storage per year, 100TB archive storage

Supercomputing at the University of Michigan

Uses Batch computing

i.e., you specify the resources for a job or several jobs

Jobs are run by a job manager, which is told when to run by a job scheduler

These are run with a computing language called SLURM

#!/bin/bash

#----- HEADER -----#

#SBATCH --job-name=mri_prep_0000004_01_01_T1

#----- log file
#SBATCH -o /scratch/precisionhealth_project_root/precisionhealth_project1/shared_data/brainmri/slogs/mri_prep_0000004_01_01_T1.log

#----- Cancel job after d-hh:mm:ss
#SBATCH --time=09:00:00

#----- Number of cores
#SBATCH --nodes=1
#SBATCH --ntasks-per-node=1
#SBATCH --cpus-per-task=5

#----- GB Memory #SBATCH --mem=10g

#----- Account will pay job
#SBATCH --account=precisionhealth_project1

```
#----- Partition where job "lives"?
#SBATCH --partition=standard
```

#----- No e-mail notifications of job start/end/error
#SBATCH --mail-type=NONE

echo "Working in dir \${PWD}:"

```
#-----#
module purge
```

module load fsl/6.0.5.1
module load afni/18.0.27
module load freesurfer

EXAMPLE JOBS AND THEIR CHARGES¹

To help illustrate how the job charges work, here are some examples of differently-sized jobs.

Partition	Total CPU Cores Used	Total Memory Used	Total GPUs Used	Cost Per Minute
standard	1	1 GB	N/A	\$0.000250
standard	1	10 GB	N/A	\$0.000500
standard	36	5 GB	N/A	\$0.009000
standard	1	50 GB	N/A	\$0.002000
largemem	1	180 GB	N/A	\$0.003852
gpu	1	20 GB	1	\$0.002739

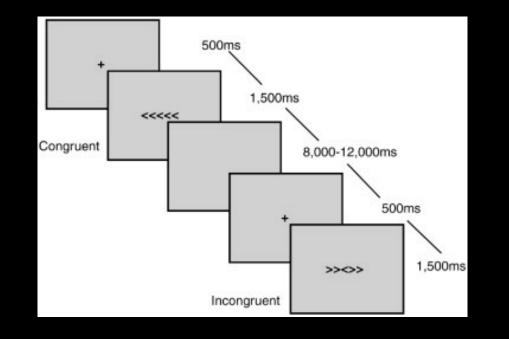
Example: Analyzing a dataset from openneuro.org

The Dataset

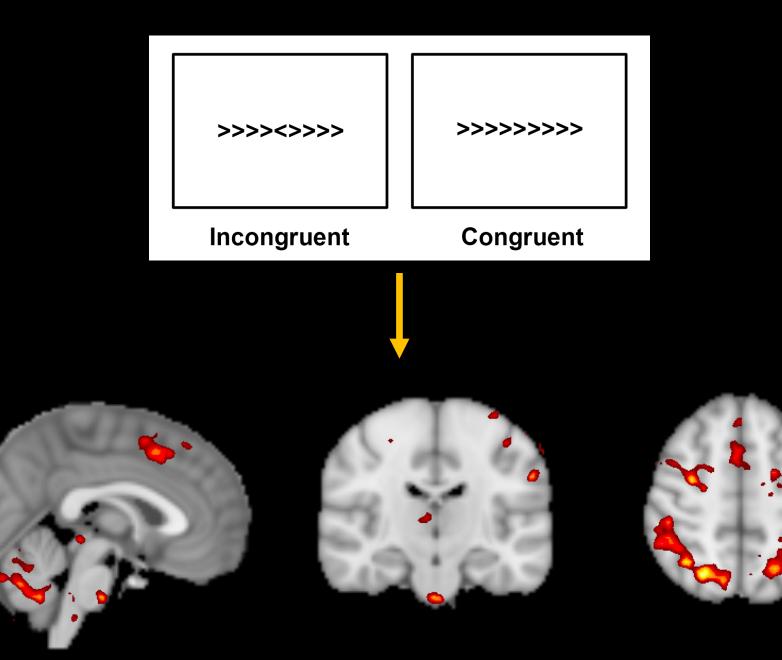
Flanker Task (Kelly et al., 2008)

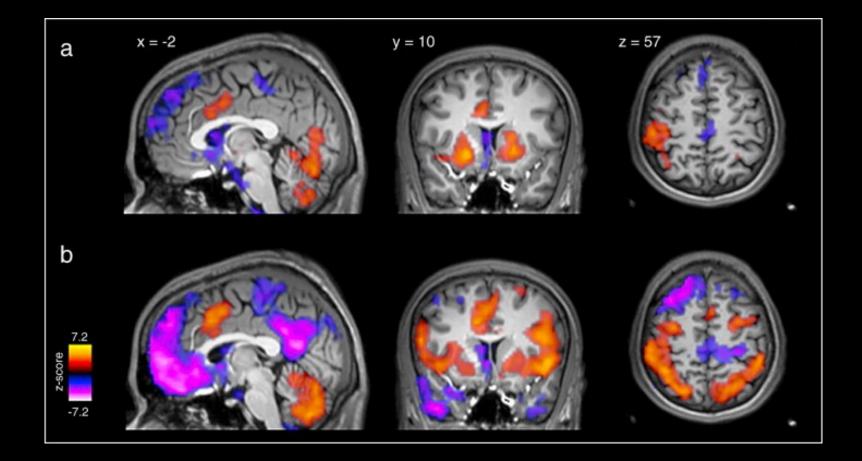
Cognitive Control

Filtering out irrelevant stimuli to perform a task



Kelly et al., 2008





Demonstration: Download the data and analyze it

General Q & A Session

Any questions about the material covered since last Friday?

Future trends in neuroimaging analysis

Difficult to predict

What I think will happen:

Greater emphasis on standardized pipelines, software

More labs using large open-access datasets

Wider use of supercomputers

Concluding Remarks