

Barriers to Reproducible Research (and how to overcome them)



doi: <https://dx.doi.org/10.6084/m9.figshare.7140050>  @kirstie_j



- Research fellow at the Alan Turing Institute for Data Science and Artificial Intelligence
- Senior research associate in the Department of Psychiatry, University of Cambridge
- 2016/17 Mozilla Fellow for Science



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Reproducible vs Replicable



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Code

Same

Different

Data

Same

Different



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Code

Same

Different

Reproducible

Data

Same

Different



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Code

Same

Different

Reproducible

Replicable

Data

Same

Different



github
SOCIAL CODING

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Code

Same

Different

Reproducible

Robust

Data

Same

Different

Replicable



Code

Data

Same

Different

Same

Reproducible

Replicable

Different

Robust

Generalisable



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Barriers to reproducible research



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Barriers to reproducible research

Is not considered for promotion

Requires additional skills

Plead the 5th

Support additional users

Takes time

Held to higher standards than others

Publication bias towards novel findings



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Start small



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Protocols.io



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MELD Project

Protocols

MELD Protocol 1 - Patient and

MELD Protocol 3 - FreeSurfer

+

80%

https://www.protocols.io/researchers/meld-project

Reload URL for off ca... Kirstie's To Do list Issues-WhitakerLabPr... My Meetings | x.ai OHBM OSSIG Links

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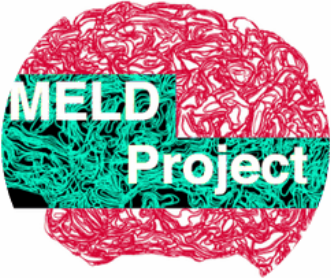
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Researchers > MELD Project



Protocols 5 Groups 1 Posts Following

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MELD Project


University College London, University of London



The MELD project is a multi-centre collaboration for lesion detection involving the incorporation of data and sequences from multiple sites. The main aim is to create open-access, robust and generalisable tools for FCD detection that can be used in the presurgical evaluation of patients with drug-resistant epilepsy. This will involve training classifiers on data from multiple centres and tailoring classifiers according to the needs of the individual epilepsy centres. Each site will be given detailed protocols to follow in order to pre-process the data from their site. The anonymised data matrices along with some clinical information (such as age, age of onset of epilepsy, surgery, histopathology and Engel outcome) will be shared. This will allow classifiers to be trained on the data from all participating centres. Any developed classification tools and/or code will be shared.

RESEARCH INTERESTS

Epilepsy, Neuroimaging, Open-science, Reproducibility, Focal Cortical Dysplasia, Machine Learning


Dear MELD

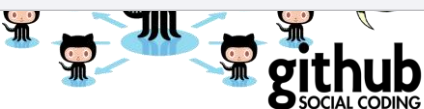
Ask a question or tell them how good a job they're doing!

SEND


All Discussions 0 Protocol comments 0

MELD's Recent Posts



github
SOCIAL CODING

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@kirstie

Coding your analyses



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Comments are your friend!



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```

1  #!/bin/bash
2
3  #=====
4  # Created by Kirstie Whitaker on 13th April 2016
5  #
6  # DESCRIPTION:
7  #   This code conducts a brain and head extraction of the PDw image to which
8  #   the quantitative multiparametric mapping (MPM) images have been aligned.
9  #   It then uses the head mask to set all voxels outside of the head to
10 #   zero for the quantitative MPM images and uses the brain mask to create
11 #   brain extracted versions of the MPM images (where all voxels outside of
12 #   the brain have been set to zero.
13 #
14 # USAGE:
15 #   NSPN_mpm_bet_mask.sh <pdw_file>
16 #
17 # INPUTS:
18 #   pdw_file : Proton density weighted file to which the MPM
19 #               quantitative maps are aligned.
20 #
21 # EXPECTS:
22 #   The following files should be in the same directory as the
23 #   input file:
24 #
25 #       R1.nii.gz      MT.nii.gz
26 #       R1s.nii.gz    A.nii.gz
27 #
28 # OUTPUTS:
29 #   All output are in the same directory as the input file.
30 #   A sub-directory called PDw_bet is created and contains all the
31 #   files created by FSL's bet command
32 #
33 #       R1_head.nii.gz   R1_brain.nii.gz

```

```

91
92 # Erode the brain mask by 3mm
93 if [[ ! -f ${mpm_dir}/PDw_brain_ero3.nii.gz ]]; then
94     fslmaths ${bet_dir}/PDw_brain.nii.gz -ero ${bet_dir}/PDw_brain_ero3.nii.gz
95 fi
96
97 #=====
98 # Now make the brain and head files for each of the
99 # calculated MPM files
100 #=====
101 echo -n " Applying masks"
102 for f_name in PDw ${calc_filename_list[@]}; do
103
104     # Don't run if it's already complete!
105     if [[ ! -f ${mpm_dir}/${f_name}_head.nii.gz ]]; then
106         echo -n " - ${f_name}"
107         fslmaths ${bet_dir}/PDw_brain_ero3.nii.gz \
108             -bin \
109             -mul ${mpm_dir}/${f_name}.nii.gz \
110             ${mpm_dir}/${f_name}_brain.nii.gz
111
112         fslmaths ${bet_dir}/PDw_brain_outskin_mask.nii.gz \
113             -bin \
114             -mul ${mpm_dir}/${f_name}.nii.gz \
115             ${mpm_dir}/${f_name}_head.nii.gz
116     fi
117 done # Close the mpm calculated file loop
118 echo ""
119
120 #=====
121 # All done!
122 #=====

```



Aim for 40% comments in your code



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Share your comments with the original author



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(which is almost
always going to be
YOU!)



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Karen Cranston

@kcranstn

 Follow

@mtholder motivating git: You mostly collaborate with yourself, and me-from-two-months-ago never responds to email. @swcarpentry

4:23 PM - Aug 23, 2013



28



19



** It is embarrassing to me how often I forget not just details of experiments, but entire experiments. For example, for the manuscript I am working on now, I forgot that we had done an experiment to test for vertical transmission of the parasite. Fortunately, the undergrad who has been working on the project remembered and had it in his writeup!

<https://dynamicecology.wordpress.com/2015/02/18/the-biggest-benefit-of-my-shift-to-r-reproducibility>

<https://twitter.com/kcranstn/status/370914072511791104>



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Asking for help: StackOverflow & MWEs

<http://stackoverflow.com>



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[https://mrcolley.com/2014/07/01/
talk-to-the-duck-debugging-and-resilience](https://mrcolley.com/2014/07/01/talk-to-the-duck-debugging-and-resilience)



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Version Control



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"FINAL".doc



FINAL.doc!



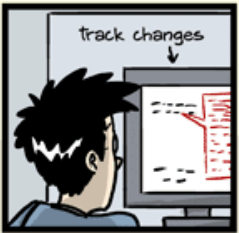
FINAL_rev.2.doc



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corrections.10.##\$%WHYDID
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FINAL.doc!



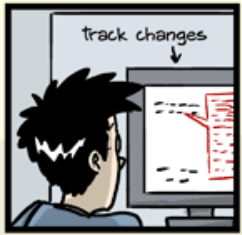
FINAL_rev.2.doc



FINAL_rev.6.COMMENTS.doc



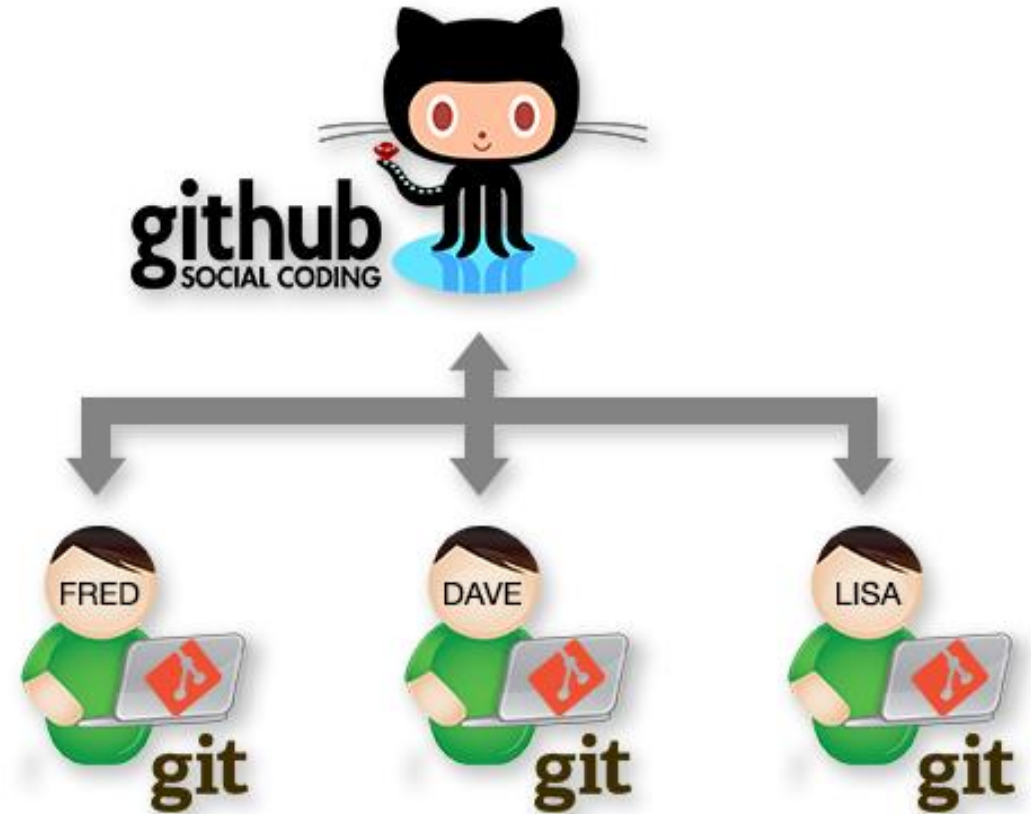
FINAL_rev.8.comments5.
CORRECTIONS.doc



FINAL_rev.18.comments7.
corrections9.MORE.30.doc



FINAL_rev.22.comments49.
corrections.10.##\$%WHYDID
ICOMETOGRADSCHOOL?????.doc



Repository

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Pull request

Branch

Version control

There's lots of jargon

Merge

Issues

Release

Commit

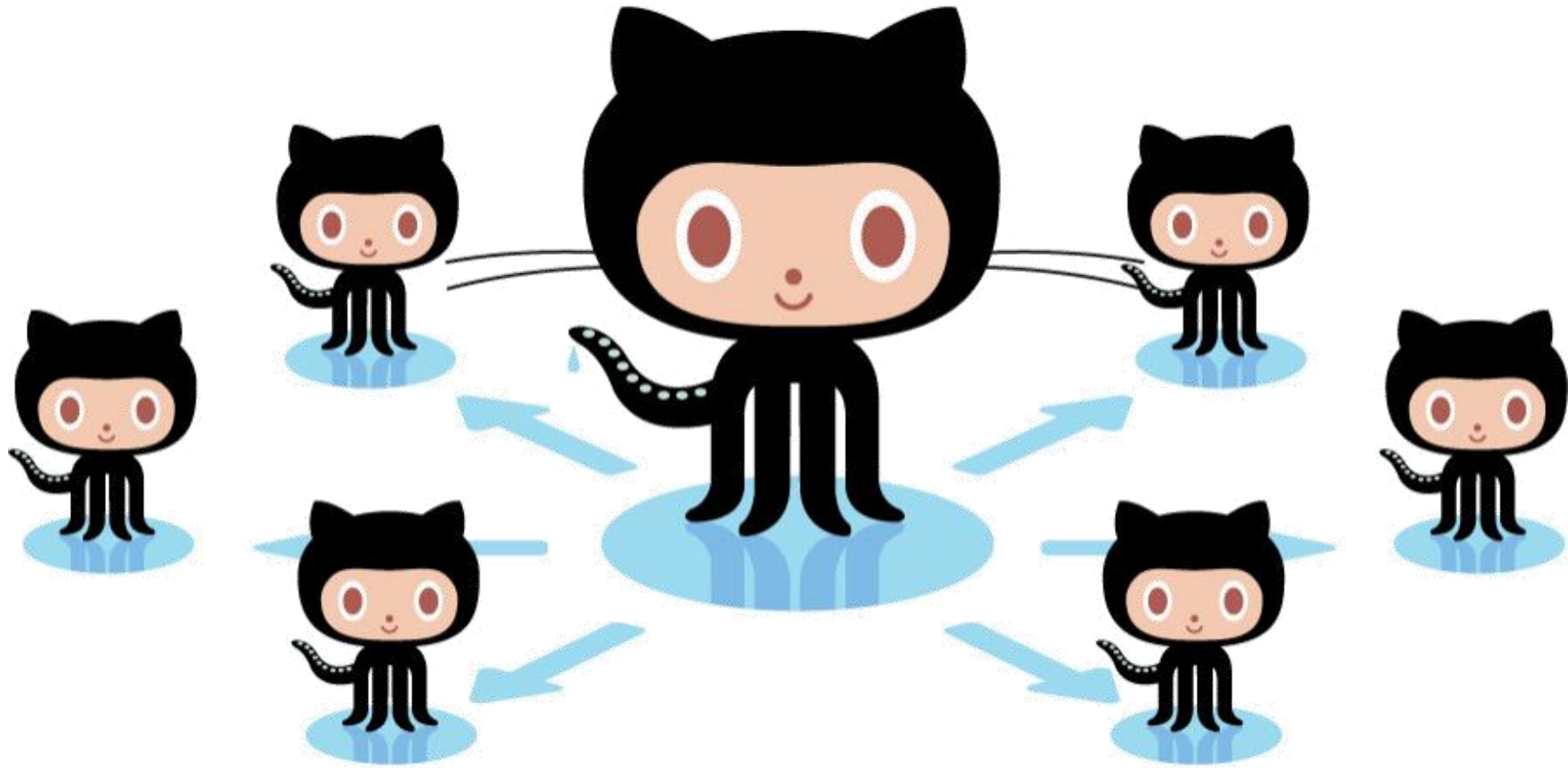
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Markdown



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It's the social part that defines GitHub



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What if I can't share my code until I'm published?



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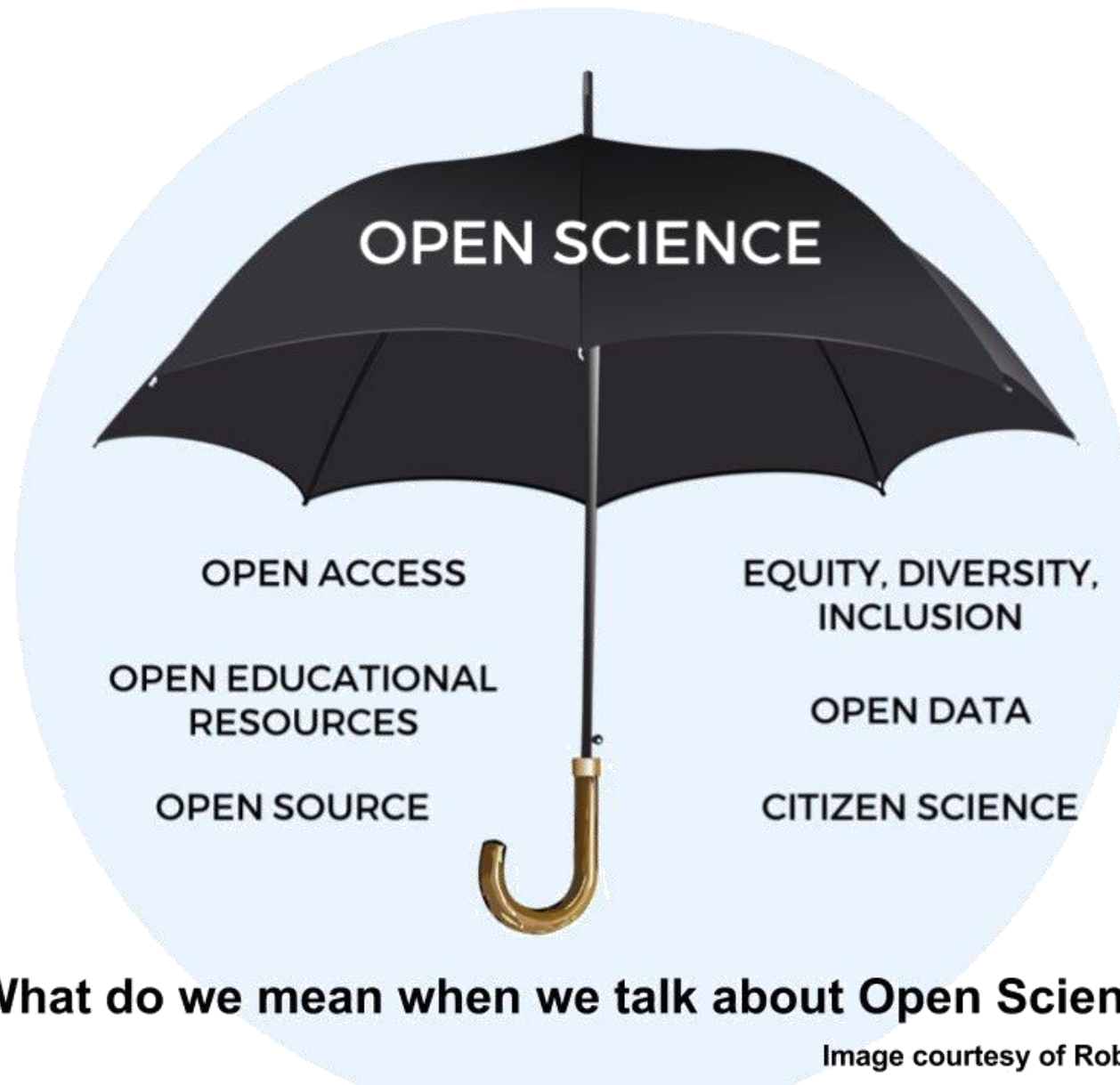
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Reproducible <> Open (and that's fine)




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What do we mean when we talk about Open Science?

Image courtesy of Robin Champieux



 @kirstie_j
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Our sixth cohort of Mozilla Open Leaders starts in September 2018! We're looking for Open Leaders to fuel the Internet Health movement by designing and building projects that empower others to collaborate within inclusive communities.

Applications are closed for Mozilla Open Leaders 6.

Stories from Open Leaders



Alecia Kuhl, StoryEngine



Mark Sta Ana, Rust
Content-o-Tron



Gracielle Higino, IGNITE

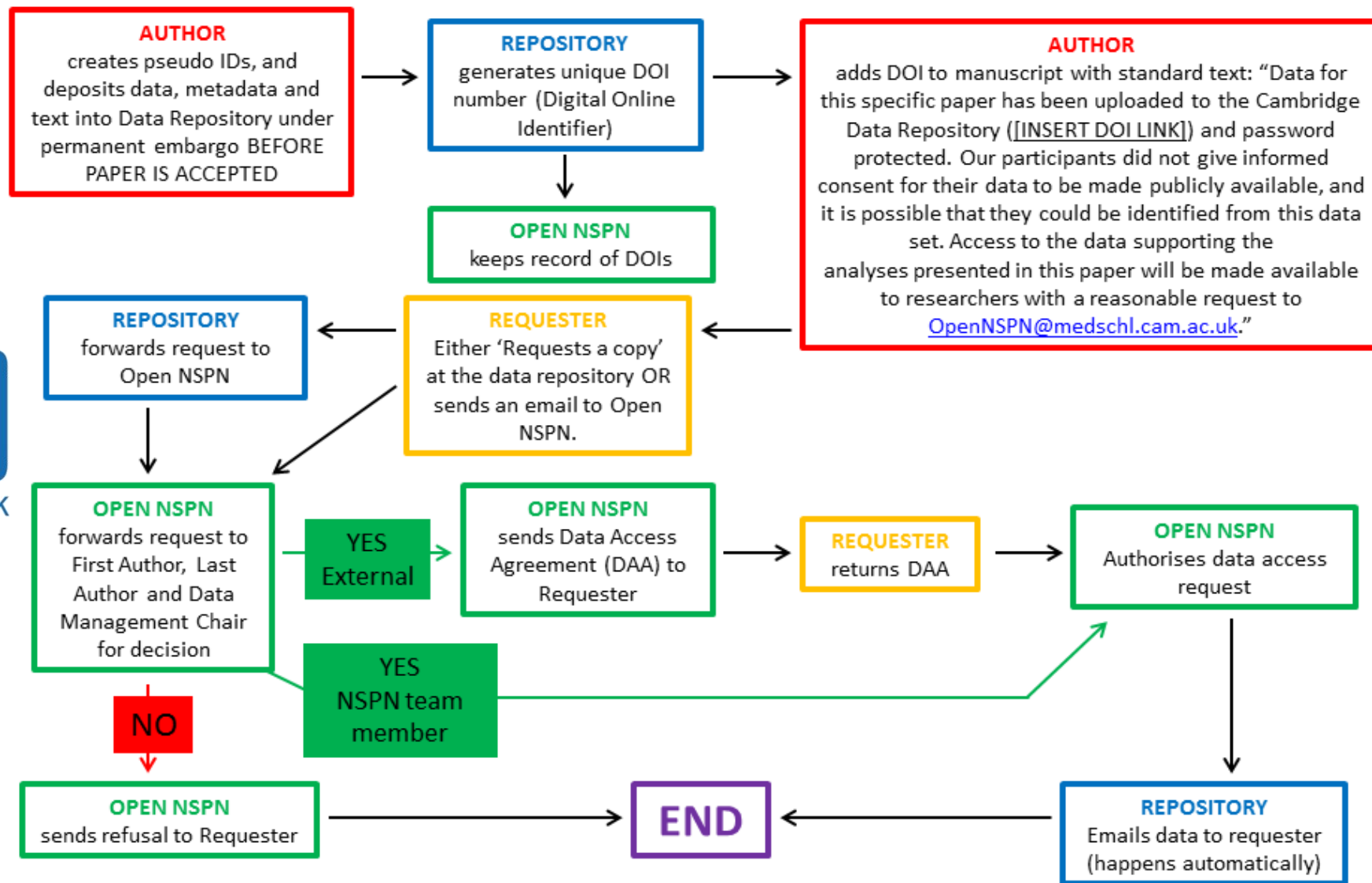


Fiona Cullinan,
Observed.City

What if I can't (ever) share my data?



doi: <https://dx.doi.org/10.6084/m9.figshare.7140050>  @kirstie_j





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Adolescent Tuning Of Association Cortex In Human Structural Brain Networks

František Váša, Jakob Seidlitz, Rafael Romero-Garcia, Kirstie J. Whitaker, Gideon Rosenthal, Petra E. Vértes, Maxwell Shinn, Aaron Alexander-Bloch, Peter Fonagy, Raymond J. Dolan, Peter B. Jones, Ian M. Goodyer, The NSPN Consortium, Olaf Sporns, Edward T. Bullmore

doi: <https://doi.org/10.1101/126920>

This article is a preprint and has not been peer-reviewed [what does this mean?].

Posted September 15, 2017.

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Abstract

How does human brain organization change over the course of adolescence? Motivated by prior data on local cortical shrinkage and intracortical myelination, we predicted age-related changes in topological organisation of cortical structural networks. We estimated the structural correlation matrix from magnetic resonance imaging (MRI) measures of cortical thickness at 308 regions in a sample of N=297 healthy participants, aged 14-24 years (inclusive). We used

Subject Area

Neuroscience

Subject Areas

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Animal Behavior and Cognition

Biochemistry

Availability of data and code

Data for this specific paper has been uploaded to the Cambridge Data Repository (<https://doi.org/10.17863/CAM.8856>) and password protected. Our participants did not give informed consent for their questionnaire measures to be made publicly available, and it is possible that they could be identified from this data set. Access to the data supporting the analyses presented in this paper will be made available to researchers with a reasonable request to NSPNdata@medschl.cam.ac.uk. The code used to conduct analyses is available from FV's github: https://github.com/frantisekvasa/structural_network_development (DOI: 10.5281/zenodo.528674).

New Results

Adolescent

František Váša
Petra E. Vértes
Peter B. Jones
doi: <https://doi.org/10.1101/2021.04.28.440000>

This article is a

Abstract

Abstract

How does
prior data

changes in topological organisation of cortical structural networks. We estimated the structural correlation matrix from magnetic resonance imaging (MRI) measures of cortical thickness at 308 regions in a sample of N=297 healthy participants, aged 14-24 years (inclusive). We used

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Data supporting NSPN publication "Adolescent tuning of association cortex in human structural brain networks"

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-  [data-processing-and-description.docx](#) (Microsoft Word 2007, 106Kb)

Authors

Vasa, Frantisek

Citation

Vasa, F., Seidlitz, J., Romero Garcia, R., Whitaker, K. J., Rosenthal, G., Vertes, P. E., Shinn, M., et al. *Data supporting NSPN publication "Adolescent tuning of association cortex in human structural brain networks"* [Dataset]. <https://doi.org/10.17863/CAM.8856>

Description

There are two files supporting this publication. The first is an RData file containing all variables necessary to reproduce the main findings of the publication. The second is a Microsoft Word document describing 1) how the data was collected and processed and 2) all the variables stored in the RData file.

Software

Custom scripts written in R, available from Frantisek Vasa's github page: https://github.com/frantisekvasa/structural_network_development (DOI: 10.5281/zenodo.528674)

Keywords

Váša et al, 2017

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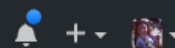
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1 contributor

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README.md	Update name	6 months ago
rp.main.R	initial upload of r code	6 months ago
struct.net.dev.R	Update struct.net.dev.R	13 days ago

README.md


Sliding window analysis of brain network development

The code in this repository reproduces most analyses and figures (with the exception of certain supplementary analyses) conducted in the manuscript "**Adolescent tuning of association cortex in human structural brain networks**" by František Váša et al.

For details regarding the motivation behind analyses and the interpretation of results, see the manuscript.



://dx.doi.org/10.6084/m9.figshare.7140050

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Analysis code for manuscript "Adolescent tuning of association cortex in human structural brain networks" by František Váša et al.

8 commits 1 branch

Branch: master New pull request

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LICENSE>Create LICENSE

README.mdUpdate name

rp.main.Rinitial upload of r co

struct.net.dev.RUpdate struct.net.d

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April 11, 2017

Software Open Access

frantisekvasa/structural_network_development: Initial release

František Váša

Initial release of the code supporting the manuscript "Adolescent tuning of association cortex in human structural brain networks" by František Váša et al.

Preview

structural_network_development-v0.1.zip

frantisekvasa-structural_network_development-fcf901d

LICENSE

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rp.main.R

struct.net.dev.R

1.1 kB

422 Bytes

681 Bytes

103.3 kB

Available in

GitHub

Publication date: April 11, 2017

DOI: DOI 10.5281/zenodo.528674

Related identifiers: Supplement to: https://github.com/frantisekvasa/structural_network_development/tree/v0.1

License (for files): Other (Open)

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Find what works for you



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Find what works for you

Every little helps



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<https://www.coursera.org/specializations/jhu-data-science>

<https://www.coursera.org/learn/python/home/info>



 @kirstie_j

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THE
CARPENTRIES

brainhack.org

codecademy

WE can do this!

coursera



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<https://www.coursera.org/specializations/jhu-data-science>

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The Alan Turing Institute



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Thank you!



WhitakerLab



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 @kirstie_j

doi: <https://dx.doi.org/10.6084/m9.figshare.7140050>

Submit your first pull request!

<https://github.com/WhitakerLab/ReproducibleResearch>

Inspired by: <https://yourfirstpr.github.io>



doi: <https://dx.doi.org/10.6084/m9.figshare.7140050>  @kirstie_j

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Some jargon busting

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ReproducibleResearch

This repository supports [Kirstie's](#) presentation on tips and tricks for making your research reproducible.

The goal is to build a directory of useful links, and a jargon busting glossary.

Guide for contributors

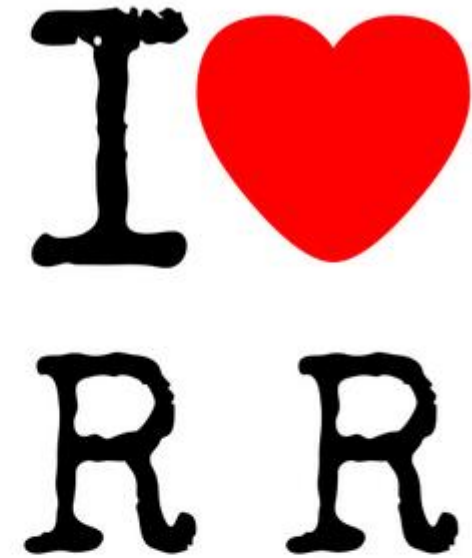
See our [guidelines](#) for how to contribute to the project.

Code of conduct

Everyone is welcome to join this project, particularly people who have not used GitHub before and are feeling unsure of how to begin!



Please follow our [code of conduct](#) in all your on and offline interactions.



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Python vs R

(vs Matlab vs STATA etc...)



doi: <https://dx.doi.org/10.6084/m9.figshare.7140050>  @kirstie_j

RStudio

File Edit Code View Plots Session Build Debug Tools Help

Go to file/function

Project: (None)

Environment History

Files Plots Packages Help Viewer

The R Language Find in Topic

198 observations of 8 variables

	column1	column2	column3	column4	column5
1	training	1	right	leftresponse	incompati
2	training	2	right	rightresponse	compatibl
3	training	2	right	rightresponse	compatibl
4	training	0	left	leftresponse	compatibl
5	training	1	right	leftresponse	incompati
6	training	1	right	leftresponse	incompati
7	training	2	right	rightresponse	compatibl
8	block1	1	right	leftresponse	incompati
9	block1	2	right	rightresponse	compatibl

Console

```
>
>
>
>
> mean(c(1,2,5))
[1] 2.666667
>
```

Statistical Data Analysis

Manuals

[An Introduction to R](#) [The R Language Definition](#)

[Writing R Extensions](#) [R Installation and Administration](#)

[R Data Import/Export](#) [R Internals](#)

Reference

[Packages](#) [Search Engine & Keywords](#)

RStudio

File Edit Code View Project Workspace Plots Tools Help

Go to file/function

Project: (None)

Workspace History

Load Save Import Dataset Clear All

Data

diamonds 53940 obs. of 10 variables

Values

aveSize 0.7979

clarity character[8]

p ggplot[8]

Functions

format.plot(plot, size)

Files Plots Packages Help

Zoom Export Clear All

15:1 (Top Level) R Script

```
1 library(ggplot2)
2 source("plots/formatPlot.R")
3
4 View(diamonds)
5 summary(diamonds)
6
7 summary(diamonds$price)
8 aveSize <- round(mean(diamonds$carat), 4)
9 clarity <- levels(diamonds$clarity)
10
11 p <- qplot(carat, price,
12            data=diamonds, color=clarity,
13            xlab="Carat", ylab="Price",
14            main="Diamond Pricing")
15
```

Console

```
Min. x: 0.000 Min. y: 0.000 Min. z: 0.000
1st Qu.: 4.710 1st Qu.: 4.720 1st Qu.: 2.910
Median : 5.700 Median : 5.710 Median : 3.530
Mean : 5.731 Mean : 5.735 Mean : 3.539
3rd Qu.: 6.540 3rd Qu.: 6.540 3rd Qu.: 4.040
Max. :10.740 Max. :58.900 Max. :31.800
> summary(diamonds$price)
Min. 1st Qu. Median Mean 3rd Qu. Max.
326 950 2401 3933 5324 18820
> aveSize <- round(mean(diamonds$carat), 4)
> clarity <- levels(diamonds$clarity)
> p <- qplot(carat, price,
+            data=diamonds, color=clarity,
+            xlab="Carat", ylab="Price",
+            main="Diamond Pricing")
>
> format.plot(p, size=24)
>
```

Diamond Pricing

Price

Carat

Clarity

- I1
- SI2
- SI1
- VS2
- VS1
- VVS2
- VVS1
- IF



OVERVIEW

TUTORIAL

ARTICLES

GALLERY

REFERENCE

DEPLOY

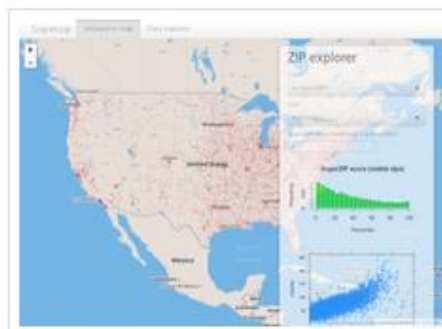
HELP

Gallery

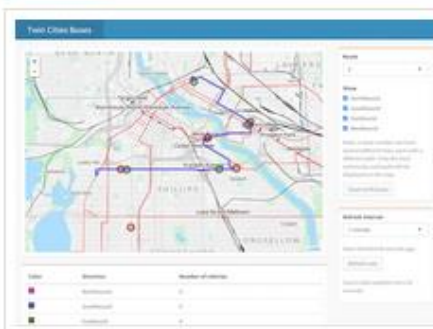
This gallery contains useful examples to learn from. Visit the [Shiny User Showcase](#) to see an inspiring set of sophisticated apps.

Interactive visualizations

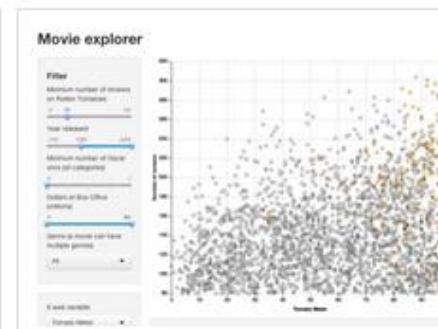
Shiny is designed for fully interactive visualization, using JavaScript libraries like [d3](#), [Leaflet](#), and [Google Charts](#).



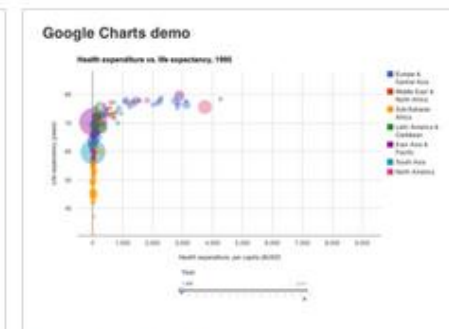
SuperZip example



Bus dashboard



Movie explorer



Google Charts

Shiny gallery



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doi: <https://dx.doi.org/10.6084/m9.figshare.7140050>

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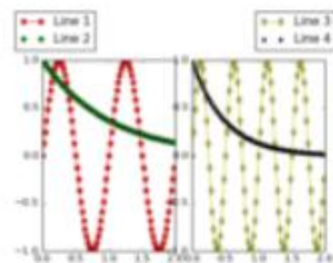


doi: <https://dx.doi.org/10.6084/m9.figshare.7140050>

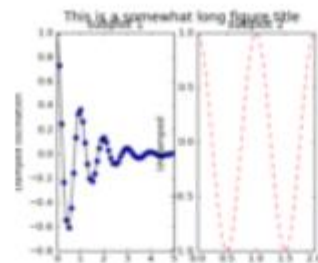
 @kirstie_j

Matplotlib gallery

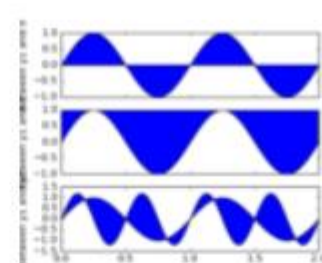
Click each
example to see
source code



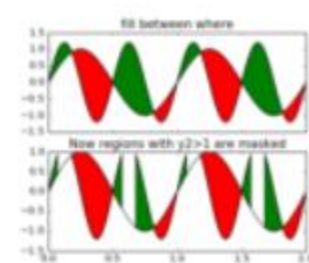
figlegend_demo



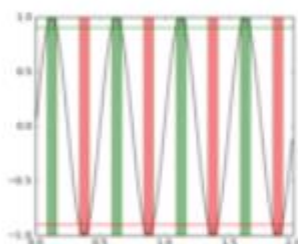
figure_title



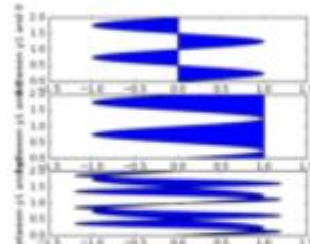
fill_between_demo



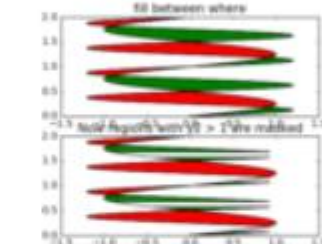
fill_between_demo



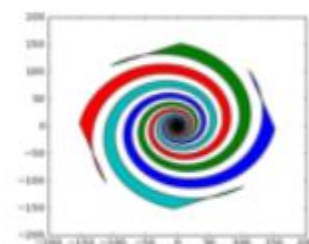
fill_between_demo



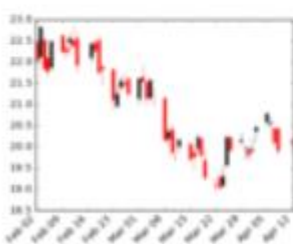
fill_betweenx_demo



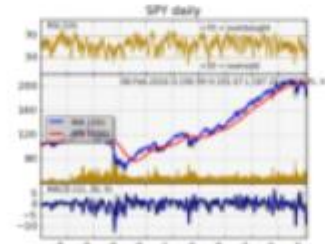
fill_betweenx_demo



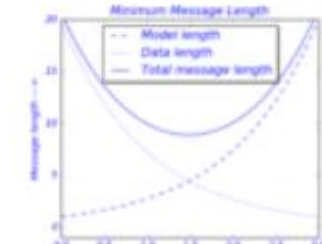
fill_spiral



finance_demo



finance_work2



findobj_demo

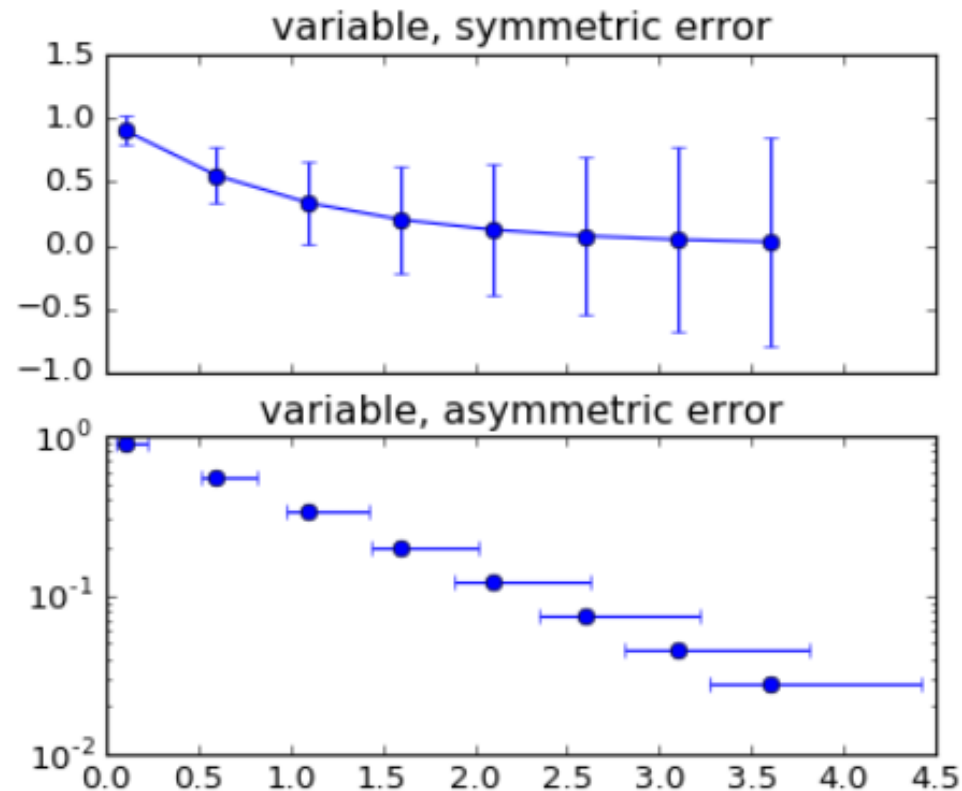


fonts_demo



statistics example code: errorbar_demo_features.py

(Source code, png, hires.png, pdf)



```
"""
Demo of errorbar function with different ways of specifying error bars.

Errors can be specified as a constant value (as shown in `errorbar_demo.py`),
or as demonstrated in this example, they can be specified by an  $N \times 1$  or  $2 \times N$ ,
where  $N$  is the number of data points.
```

```
 $N \times 1$ :
    Error varies for each point, but the error values are symmetric (i.e. the
    lower and upper values are equal).

 $2 \times N$ :
    Error varies for each point, and the lower and upper limits (in that order)
    are different (asymmetric case)
```

```
In addition, this example demonstrates how to use Log scale with errorbar.
```

```
"""
import numpy as np
import matplotlib.pyplot as plt

# example data
x = np.arange(0.1, 4, 0.5)
y = np.exp(-x)
# example error bar values that vary with x-position
error = 0.1 + 0.2 * x
# error bar values w/ different +/- errors
lower_error = 0.4 * error
upper_error = error
asymmetric_error = [lower_error, upper_error]

fig, (ax0, ax1) = plt.subplots(nrows=2, sharex=True)
ax0.errorbar(x, y, yerr=error, fmt='o')
ax0.set_title('variable, symmetric error')

ax1.errorbar(x, y, xerr=asymmetric_error, fmt='o')
ax1.set_title('variable, asymmetric error')
ax1.set_yscale('log')
plt.show()
```



http://matplotlib.org/examples/statistics/errorbar_demo_features.html

doi: <https://dx.doi.org/10.6084/m9.figshare.7140050>

@kirstie_j

Jupyter Notebook



<http://jupyter.org>



doi: <https://dx.doi.org/10.6084/m9.figshare.7140050>  @kirstie_j

SIGNAL PROCESSING WITH GW150914 OPEN DATA

Welcome! This ipython notebook (or associated python script GW150914_tutorial.py) will go through some typical signal processing tasks on strain time-series data associated with the LIGO GW150914 data release from the LIGO Open Science Center (LOSC):

- <https://losc.ligo.org/events/GW150914/>
- View the tutorial as a web page - https://losc.ligo.org/s/events/GW150914/GW150914_tutorial.html
- Download the tutorial as a python script - https://losc.ligo.org/s/events/GW150914/GW150914_tutorial.py
- Download the tutorial as iPython Notebook - https://losc.ligo.org/s/events/GW150914/GW150914_tutorial.ipynb

To begin, download the ipython notebook, readligo.py, and the data files listed below. You can run the python script GW150914_tutorial.py. You will need the python packages:

On Windows, or if you prefer, you can use a python development environment such as Anaconda (<https://www.anaconda.com/>) or Enthought Canopy (<https://www.enthought.com/products/canopy/>)

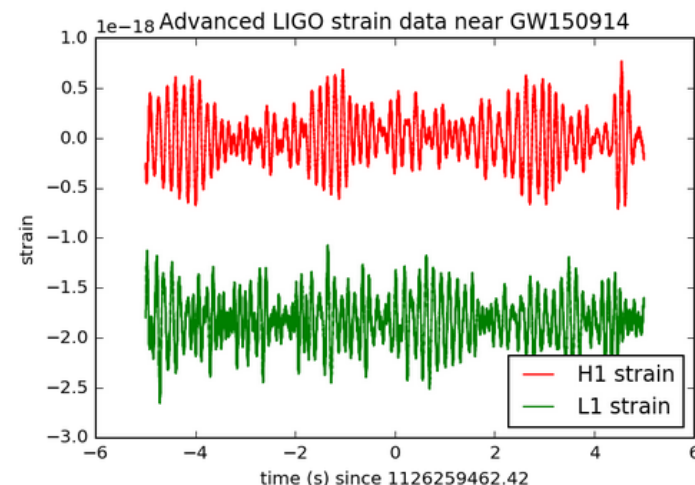
Questions, comments, suggestions, corrections, etc: email losc@ligo.org


v20160208b

https://losc.ligo.org/s/events/GW150914/GW150914_tutorial.html

```
In [6]: # plot +/- 5 seconds around the event:
tevent = 1126259462.422      # Mon Sep 14 09:50:45 GMT 2015
deltat = 5.                  # seconds around the event
# index into the strain time series for this time interval:
indxt = np.where((time_H1 >= tevent-deltat) & (time_H1 < tevent+deltat))

plt.figure()
plt.plot(time_H1[indxt]-tevent, strain_H1[indxt], 'r', label='H1 strain')
plt.plot(time_L1[indxt]-tevent, strain_L1[indxt], 'g', label='L1 strain')
plt.xlabel('time (s) since ' + str(tevent))
plt.ylabel('strain')
plt.legend(loc='lower right')
plt.title('Advanced LIGO strain data near GW150914')
plt.savefig('GW150914_strain.png')
```




Observation of Gravitational Waves from a Binary Black Hole Merger

B. P. Abbott *et al.**
(LIGO Scientific Collaboration and Virgo Collaboration)
(Received 21 January 2016; published 11 February 2016)

