Barriers to Open Research (and how to overcome them)





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









Reproducible vs Replicable



| Same | Different |
|------|-----------|
| | |
| | |
| | |
| | |



Different

| Same | Different |
|--------------|-----------|
| Reproducible | |
| | |



Same Different Replicable Reproducible Different



Same Different Reproducible Replicable Different Robust

python &



Same Different Replicable Reproducible Generalisable Robust



Different

Barriers to reproducible research



Requires additional skills

Plead the 5th

Support additional users

Barriers to Takes time

reproducible research



Held to higher standards than others



Requires additional skills

Plead the 5th

Support additional users

Barriers to Takes time

reproducible research



Held to higher standards than others



Requires additional skills

Plead the 5th

Support additional users

Barriers to Takes time

reproducible research



Held to higher standards than others



Requires additional skills

Plead the 5th

Support additional users

Barriers to Takes time

reproducible research



Held to higher standards than others



Requires additional skills

Plead the 5th

Support additional users

Barriers to Takes time reproducible research

Held to higher standards than

others



Requires additional skills

Plead the 5th

Support additional users

Barriers to Takes time

reproducible research



Held to higher standards than others



Requires additional skills

Plead the 5th

Support additional users

Barriers to Takes time

reproducible research



Held to higher standards than others



Requires additional skills

Plead the 5th

Support additional users

Barriers to Takes time

reproducible research



Held to higher standards than others



Aim for 50% comments in your code

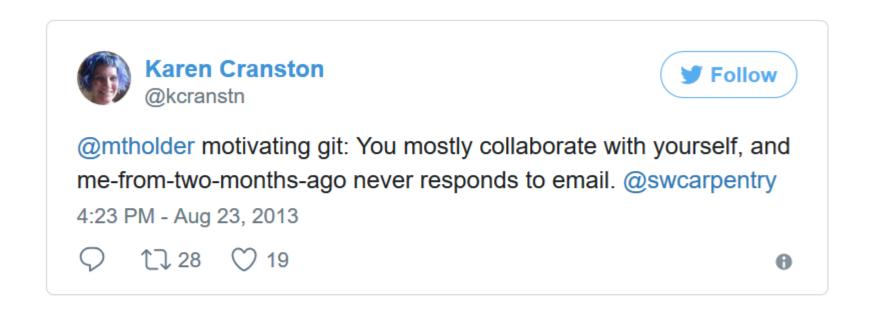


Share your comments with the original author



(which is almost always going to be YOU!)





** 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

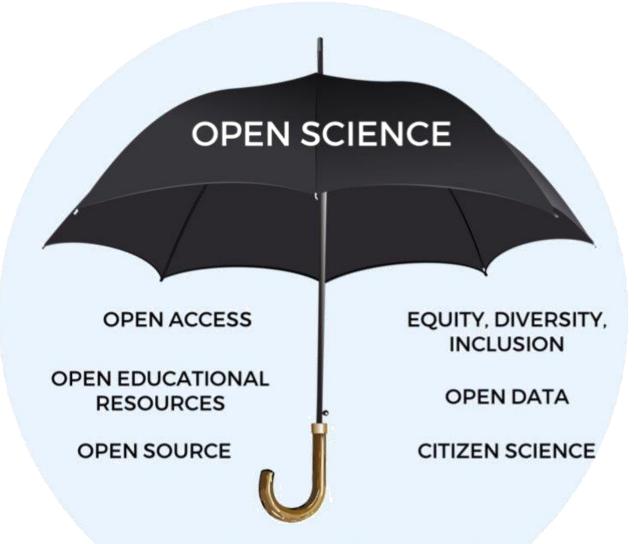
python

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



Reproducible <> Open (and that's fine)







What do we mean when we talk about Open Science?

Image courtesy of Robin Champieux



Reproducible research at the Turing







Pull requests Issues Marketplace Explore







Martin O'Reilly martintoreilly

Research Software Engineer at the UK's national data science institute.

Follow

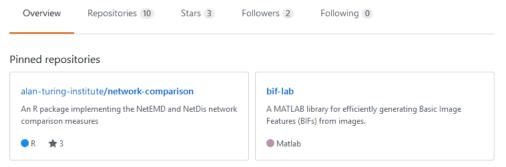
Block or report user

La The Alan Turing Institute

O London

Organizations

The Alan Turing Institute



815 contributions in the last year

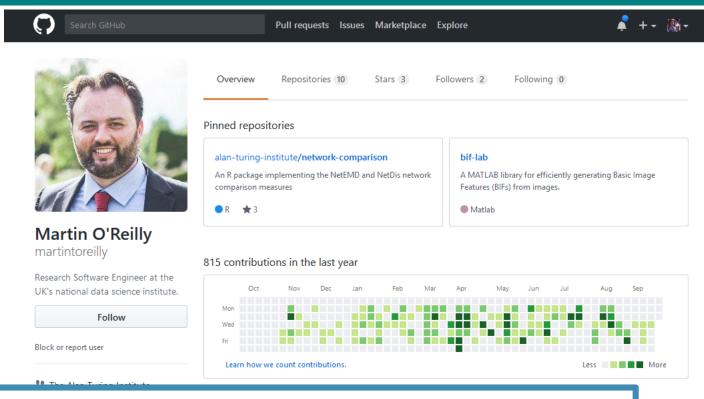








The Alan Turing Institute



My colleagues in the research software engineering team and I **seek to position The Alan Turing Institute as a world leader for reproducible research** by embedding a culture of
"reproducible by default" at the institute and providing training and tools to make reproducible
research "too easy not to do".





Reproducible research at the Turing

- Training & support for incoming students
- Software development support
 - From the beginning if possible
 - Posthoc for now
- Turing Reproducibility Champions
- Institutional buy in



Reproducible research at the Turing

- Training & support for incoming students
- Software development support
 - From the beginning if possible
 - Posthoc for now
- Turing Reproducibility Champions
- Institutional buy in
- "The Turing Way"





Attr: edhiggins, CC BY 3.0, via Wikimedia Commons

Find what works for you



Find what works for you

Every little helps





DATA CARPENTRY UIIII

software carpentry

You can do this!

https://www.mozillascience.org

http://software-carpentry.org

http://data-carpentry.org

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

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





software carpentry

WE can do this!

https://www.mozillascience.org

http://software-carpentry.org

http://data-carpentry.org

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

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



The Alan Turing Institute



Thank you!



WhitakerLab



@kirstie_j



doi: 10.6084/m9.figshare.5914444

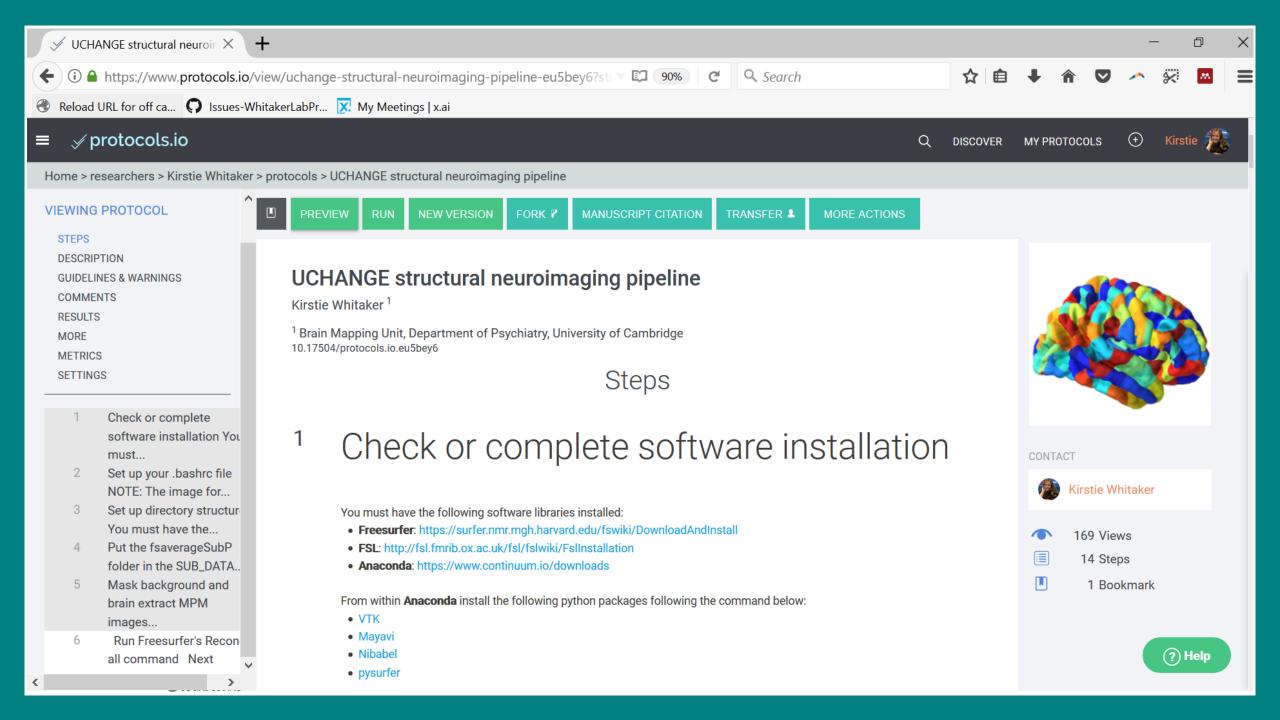


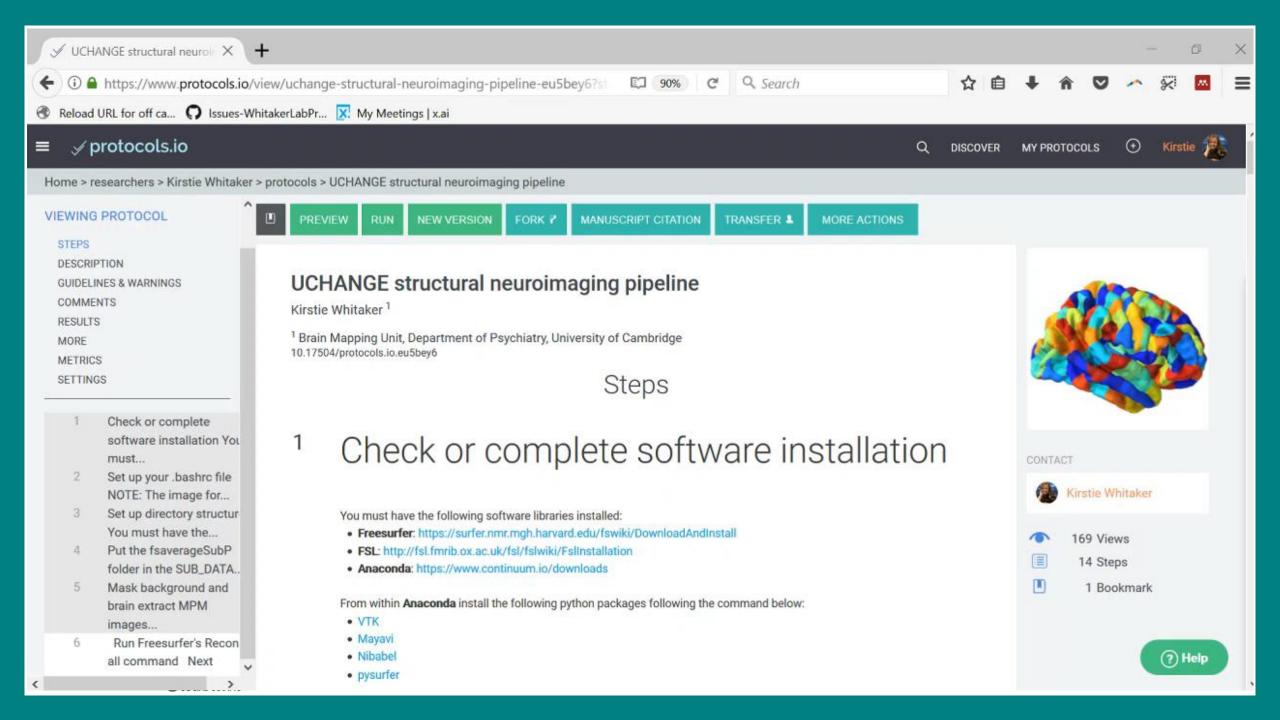
Start small



Protocols.io







Asking for help: StackOverflow & MWEs

http://stackoverflow.com







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

Version Control



"FINAL".doc



^C 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



doi: https://dx.doi.org/10.6084/m9.figshare.5914444

"FINAL".doc



CFINAL.doc!



FINAL_rev.2.doc



FINAL_rev.6.COMMENTS.doc



FINAL_rev.8.comments5. CORRECTIONS.doc

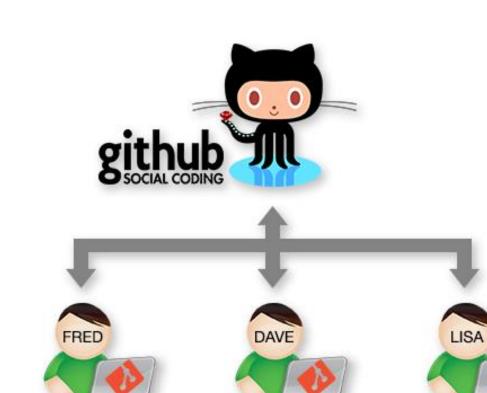


FINAL_rev.18.comments7. corrections9.MORE.30.doc

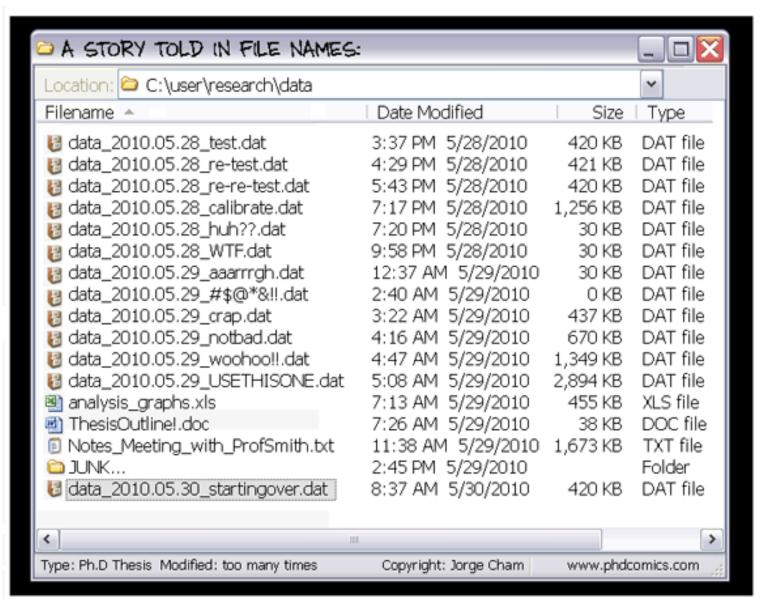


FINAL_rev.22.comments49. corrections.10.#@\$%WHYDID ICOMETOGRADSCHOOL????.doc





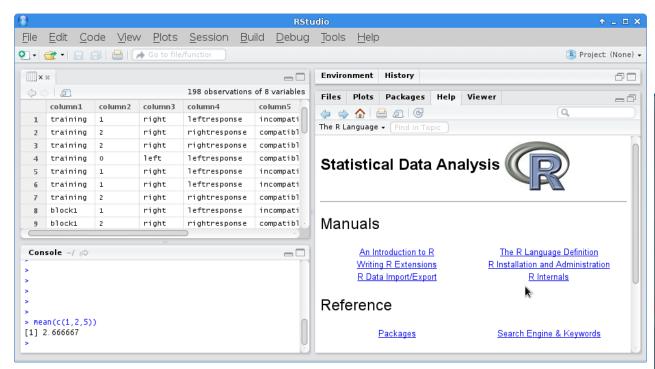




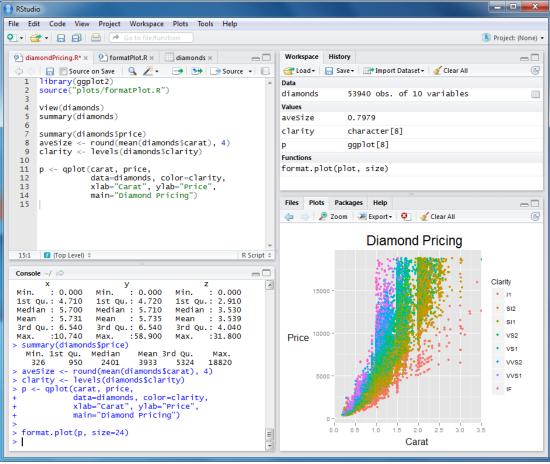


Python vs R (vs Matlab vs STATA etc...)









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.

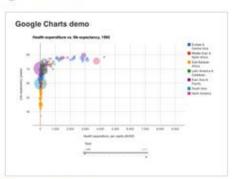
Interactive visualizations

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

PYTHON THE FASTEST GROWING OPEN DATA SCIENCE PLATFORM



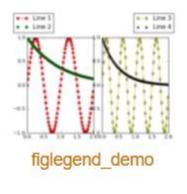
Leading Open Data Science Platform
Powered by Python

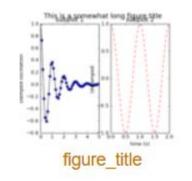
DOWNLOAD FOR FREE

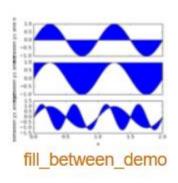


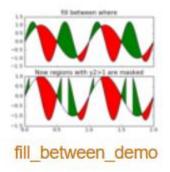
Matplotlib gallery

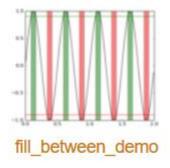
Click each example to see source code

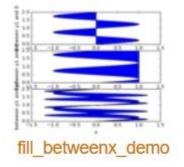


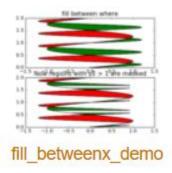


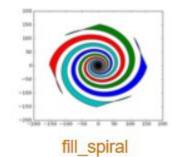




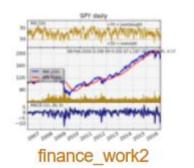


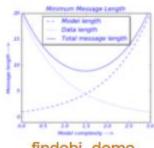












| - 1 | Surely style varient | | |
|-----|----------------------|-----------|---------|
| 0.8 | set need send | Agre. | *** |
| -) | around his making | n mermal | 100 |
| 200 | arm altique | medium | - |
| | forhely | semilooki | resilve |
| | emopers . | belie | berge |
| - 1 | bold italic | beary | x-larg |
| | ducted studies | March X | x-lan |
| | destrict deaths | | |
| - 1 | | | |

findobj_demo fonts_demo





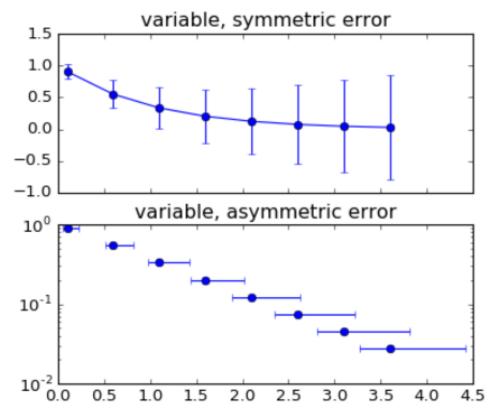






statistics example code: errorbar_demo_features.py

(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 x 1 or 2 x N,
where N is the number of data points.
N x 1:
    Error varies for each point, but the error values are symmetric (i.e. the
    Lower and upper values are equal).
2 x 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)
# 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



Jupyter Notebook





http://jupyter.org

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/(In [6]:
- Download the tutorial as a python script https://losc.ligo.org/s/events/GW1
- Download the tutorial as iPython Notebook https://losc.ligo.org/s/events/G

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

On Windows, or if you prefer, you can use a python development environment s /why-anaconda) or Enthought Canopy (https://www.enthought.com/products/cai

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

v20160208b

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



Observation of Gravitational Waves from a Binary Black Hole Merger

B. P. Abbott *et al.**

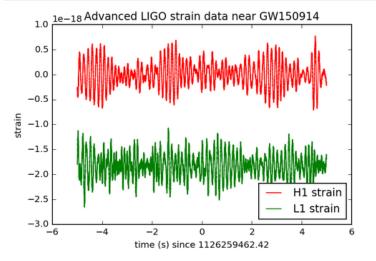
(LIGO Scientific Collaboration and Virgo Collaboration)

(Received 21 January 2016; published 11 February 2016)



```
# 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')</pre>
```



Repository

Clone

Branch

Pull request

Version control

Some jargon busting

Merge

Issues

Release

Commit

Fork



Markdown



Submit your first pull request!

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



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.



● 2016 iLoveHeartStudio.com

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.



Aim for 40% comments in your code



Share your comments with the original author



(which is almost always going to be YOU!)



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



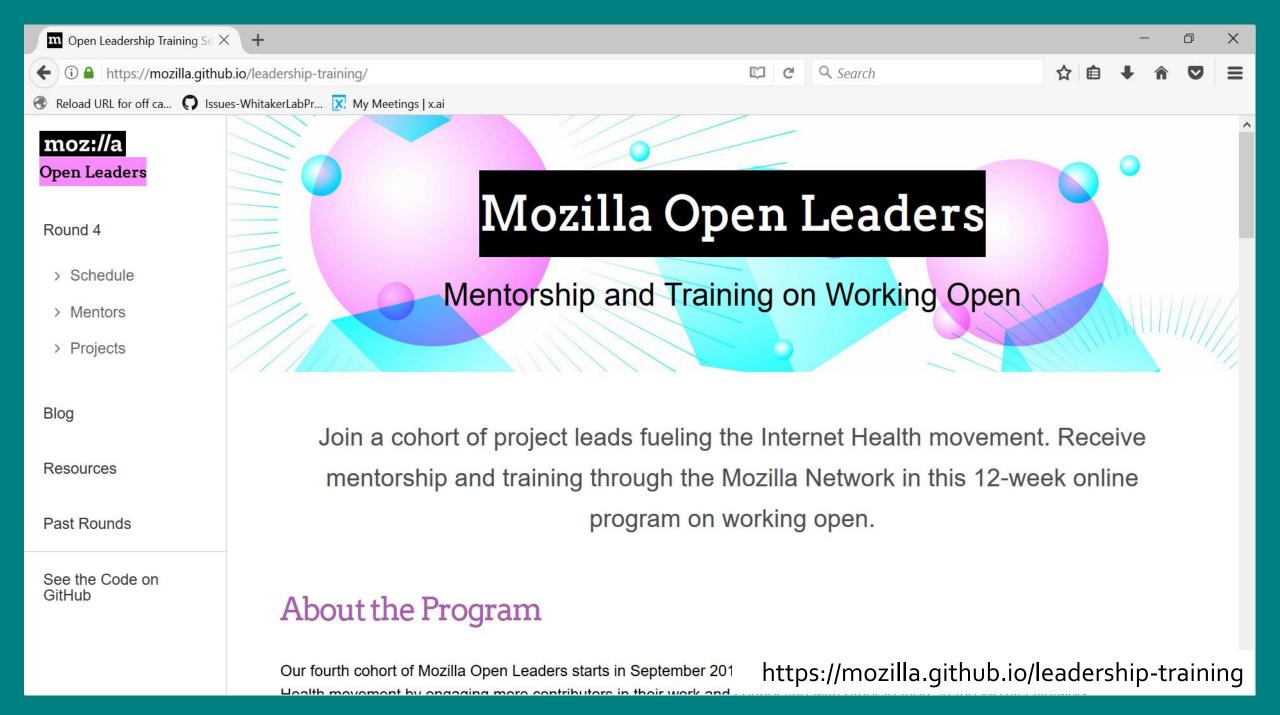






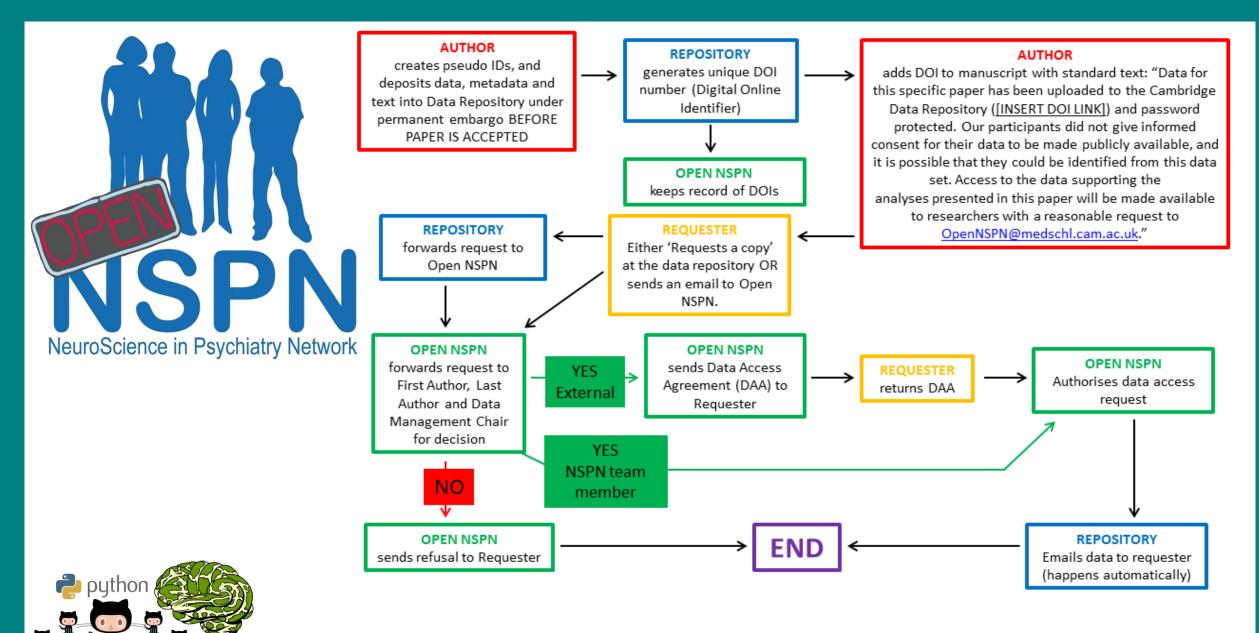
Reproducible <> Open (and that's fine)





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









HOME | ABOUT | SUBMIT | ALERTS/RSS | CHANNELS

Subject Areas

Biochemistry

All Articles

Search Q
Advanced Search

New Results

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?].

Abstract

Info/History

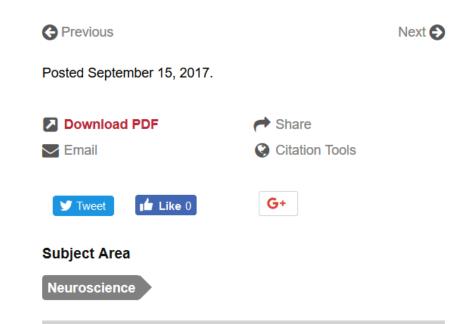
Metrics

Supplementary material

Preview PDF

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



Animal Behavior and Cognition





| HOME | 1 | ABOUT | SUBMIT | ALERTS / RSS |
|------|----|-------|--------|--------------|
| I CH | ΑN | INELS | | |

| Search | Q |
|--------|---|
|--------|---|

Advanced Search

tion Tools

Next 😜

Availability of data and code

10.5281/zenodo.528674).

New Results

Adolescent

František Váša Petra E. Vérte Peter B. Jones doi: https://do

This article is a

Abstract

Abstract

How does prior data

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:

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

All Allicles

Animal Behavior and Cognition
Biochemistry



↑ Apollo Home / School of Clinical Medicine / Department of Psychiatry / NSPN (NeuroScience in Psychiatry Network) / Research Data - NSPN (NeuroScience in Psychiatry Network) / View Item



Search Apollo

Advanced search

Q.

Browse

All of Apollo

- > Communities & Collections
- > Authors
- > Titles
- > Keywords
- Type

This Collection

- Authors
- > Titles
- > Keywords
- Type

Statistics

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



View / Open Files

- atr.net.dev.data.RData (Unknown, 7Mb)
- data-processing-and-description.docx (M icrosoft 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)

Váša et al, 2017



↑ Apollo Home / School of Clinical Medicine / Department of Psychiatry / NSPN (NeuroScience in Psychiatry Network) / Research Data - NSPN (NeuroScience in Psychiatry Network) / View Item



Search Apollo

Advanced search

Q.

Browse

All of Apollo

- > Communities & Collections
- > Authors
- > Titles
- > Keywords
- Type

This Collection

- Authors
- > Titles
- > Keywords
- Type

Statistics

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



View / Open Files

- atr.net.dev.data.RData (Unknown, 7Mb)
- data-processing-and-description.docx (M icrosoft 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)

Váša et al, 2017

