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# Research Reproducibility - An Opportunity for Software Engineers

Adrian-Tudor Pănescu Lead Integrations Engineer @ Figshare

### Non-reproducibility - anecdotal evidence





#### Non-reproducibility - scientific evidence



#### <u>Scientometrics</u>

.... March 2017, Volume 110, <u>Issue 3</u>, pp 1471–1493 | <u>Cite as</u>

Striking similarities between publications from China describing single gene knockdown experiments in human cancer cell lines

Authors

Authors and affiliations

Jennifer A. Byrne 🖂 , Cyril Labbé 🖂

#### Abstract

Comparing 5 publications from China that described knockdowns of the human TPD52L2 gene in human cancer cell lines identified unexpected similarities between these publications, flaws in experimental design, and mis-matches between some described experiments and the reported results. Following communications with journal editors, two of these TPD52L2 publications have been retracted. One retraction notice stated that while the authors claimed that the data were original, the experiments had been out-sourced to a biotechnology company. Using search engine queries, automatic text-analysis, different similarity measures, and further visual inspection, we identified 48 examples of highly similar papers describing single gene knockdowns in 1–2 human cancer cell lines that were all published by investigators from China. The incorrect use of a particular TPD52L2 shRNA sequence as a negative or non-targeting control was identified in 30/48 (63%) of these publications, using a combination of Google Scholar searches and visual inspection. Overall, these results suggest that some publications describing the effects of single gene knockdowns in human cancer cell lines may include the results of experiments that were not performed by the authors. This has serious implications for the validity of such results, and for their application in future research.

#### Non-reproducibility - scientific evidence

# Cluster failure: Why fMRI inferences for spatial extent have inflated false-positive rates

Anders Eklund, Thomas E. Nichols, and Hans Knutsson

PNAS July 12, 2016 113 (28) 7900-7905; first published June 28, 2016 https://doi.org/10.1073/pnas.1602413113

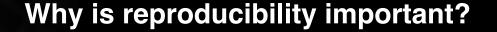
#### Significance

Functional MRI (fMRI) is 25 years old, yet surprisingly its most common statistical methods have not been validated using real data. Here, we used resting-state fMRI data from 499 healthy controls to conduct 3 million task group analyses. Using this null data with different experimental designs, we estimate the incidence of significant results. In theory, we should find 5% false positives (for a significance threshold of 5%), but instead we found that the most common software packages for fMRI analysis (SPM, FSL, AFNI) can result in false-positive rates of up to 70%. These results question the validity of a number of fMRI studies and may have a large impact on the interpretation of weakly significant neuroimaging results.

# What about computer science?

Table 6. Surer	nary of results from	versions studies of	ropostobility and	roproducibility

Reference	What/Who was studied	What was measured	Results
Kovacevic [17]	15 papers published in the IEEE Transactions on Image Processing.	How well algorithms were explained and whether code and data were available.	All algorithms had proofs, 0% had code available, 33% had data available.
Vandewalle et al. [29]	All the 134 papers pub- lished in <i>IEEE Transac-</i> tions on <i>Image Process-</i> ing in 2004.	Reproducibility as measured by 2-3 reviewers.	9% of the papers had code available online and 33% had data.
Stodden [26]	Survey responses from 134 registrants affiliated with American universi- ties at NIPS conference.	Proportion of registrants comfortable with sharing post-publication code on the web vs. proportion publishing some code on their web site.	74% are comfortable with sharing, $30%$ have code on web site.
Table 1 (page 9 of this report)	Artifact evaluation out- comes for the 268 pa- pers that were accepted in the seven conferences for which we have com- plete information.	Submitted and accepted artifacts as a percentage of accepted papers.	43.3% submitted, $29.5%$ accepted.
Klein et al. [15]	Formal modeling and mechanized reasoning of nine papers published in ICFP 2009.	Proportion of papers in which no mistakes were found.	0%.
This study	Examination of 402 Computer Systems papers backed by code.	Proportion of papers with shared code, and the extent to which shared code builds suc- cessfully in 30 minutes, with extra effort, or by the authors.	56.2% shared, 32.3% builds in 30 minutes, 48.3% builds with extra effort, 54.0% builds by author.





Editorial Published: 25 October 2018

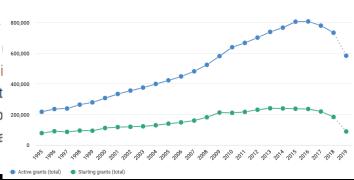
The challenge of the post-truth era

Nature Cell Biology 2 Science by press conference

From Wikipedia, the free encyclopedia 1,000,000

Science denial conclusions ap Science by press conference (or emotion and is practice by which scientists put an world, scientist research in the media. [1] The term i engagement. intended to associate the target wit

of questionable scientific merit who they are unlikely to win the approve community.





# **Opportunities for software engineers**

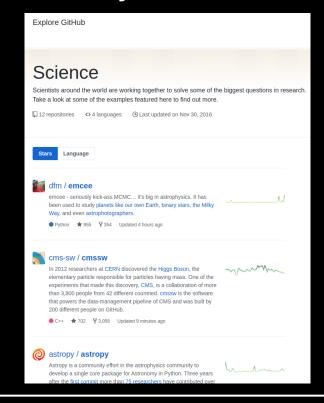
 Develop (or retrofit) the technologies required for achieving reproducibility



# **Opportunities for software engineers**

- Develop (or retrofit) the technologies required for achieving reproducibility; examples:
  - Repositories
  - Compute environments
  - Preservation

### **Repositories - today**





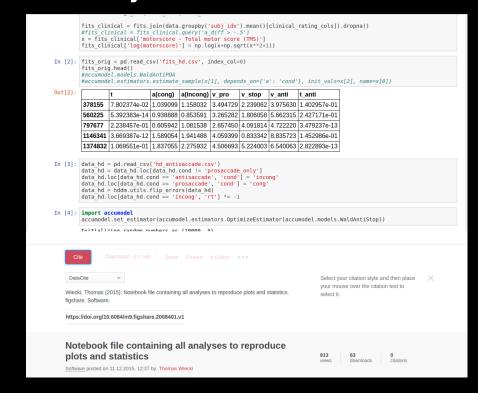
# Repositories - challenges

- Ease of use not all users in the scientific community have the required technical skills, how do we cater to them?
- Applicability research outputs are diverse (data figshare.com, preprints - arxiv.org, MRIs openfmri.org etc.); repositories should handle all, and link between the sources.
- Discovery how do we find all the above outputs (i.e. Google Scholar for all research)?



- Reproducibility same code, same data, different analyst
- Replicability same code, different data

#### Reproducibility - code









#### Reproducibility - paper

This is a Reproducible document. See the original article or source.

# Replication Study: Transcriptional amplification in tumor cells with elevated c-Myc

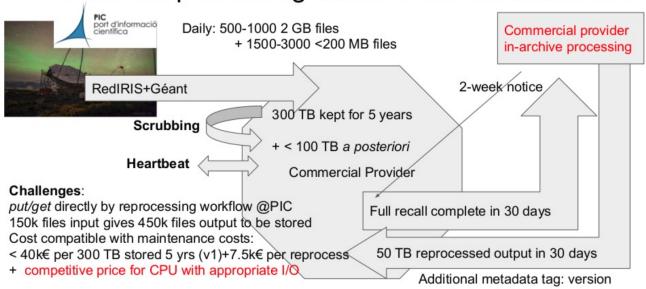
L Michelle Lewis, Meredith C Edwards, Zachary R Meyers, C Conover Talbot Jr, Haiping Hao, David Blum, Reproducibility Project: Cancer Biology

As part of the Reproducibility Project: Cancer Biology, we published a Registered Report (Blum et al., 2015), that described how we intended to replicate selected experiments from the paper Transcriptional amplification in tumor cells with elevated c-Myc.' (Lin et al., 2012). Here we report he results. We found overexpression of c-Myc increased total levels of RNA in P493-6 Burkitt's lymphoma cells; however, while the effect was in the same direction as the original study (Figure 3E; Lin et al., 2012), statistical significance and the size of the effect varied between the original study and he two different lots of serum tested in this replication. Digital gene expression analysis for a set of genes was also performed on P493-6 cells before and after c-Myc overexpression. Transcripts from genes that were active before c-Myc induction increased in expression following c-Myc overexpression, similar to the original study (Figure 3F; Lin et al., 2012). Transcripts from genes that were silent before c-Myc induction also increased in expression following c-Myc overexpression, while the original study concluded elevated c-Myc had no effect on silent genes (Figure 3F; Lin et al., 2012). Treating the data as paired, we found a statistically significant increase in gene expression for oth active and silent genes upon c-Myc induction, with the change in gene expression greater for active genes compared to silent genes. Finally, we report meta-analyses for each result.

NOTE: This is a demonstration of a reproducible view of an existing eLife article. You can inspect the code that was used to generate the figures, make changes and re-run the code. For technical reasons the article differs slightly from the <u>original article</u>. The reference list is missing, references are external links and figure supplements are missing.

## **Preservation and continuity**

+ In-archive processing scenario workflow/scenario



#### **Preservation and continuity**

#### We are building the universal software archive



Collect Preserve Share We **collect** and **preserve** software in source code form, because software embodies our technical and scientific knowledge and humanity cannot afford the risk of losing it.

Software is a precious part of our cultural heritage. We curate and make accessible all the software we collect, because only by **sharing** it we can guarantee its preservation in the very long term.

Discover our mission

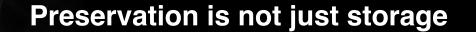
#### Do we already have your code?

We harvest publicly available source code from many software projects and keep up with development happening there. As of today our archive already contains and keeps safe for you:

Source files 6,034,792,688

Commits 1,343,174,362

Projects 89,421,958





# Preservation is not just storage



off t nextchunk=[fh offsetInFile]+((chunklen+3)&~3); // At this point, I'd like to take a moment to speak to you about the Adobe PSD format.

uint32 t chunklen=[fh readUInt32BE1:

// PSD is not a good format. PSD is not even a bad format. Calling it such would be an

// insult to other bad formats, such as PCX or JPEG. No, PSD is an abysmal format. Having // worked on this code for several weeks now, my hate for PSD has grown to a raging fire

// that burns with the fierce passion of a million suns.

// If there are two different ways of doing something, PSD will do both, in different

// places. It will then make up three more ways no sane human would think of, and do those

// too. PSD makes inconsistency an art form. Why, for instance, did it suddenly decide // that \*these\* particular chunks should be aligned to four bytes, and that this alignement

// should \*not\* be included in the size? Other chunks in other places are either unaligned.

// or aligned with the alignment included in the size. Here, though, it is not included.

// Either one of these three behaviours would be fine. A sane format would pick one. PSD.

// of course, uses all three, and more. // Trying to get data out of a PSD file is like trying to find something in the attic of

// your eccentric old uncle who died in a freak freshwater shark attack on his 58th

// birthday. That last detail may not be important for the purposes of the simile, but

// at this point I am spending a lot of time imagining amusing fates for the people

// responsible for this Rube Goldberg of a file format.

// Earlier, I tried to get a hold of the latest specs for the PSD file format. To do this,

if some document or

this process so

s abomination, I

e, but if I had done

t them all on fire.

specs, and launch

Find the Wayback Machine useful?

















BROWSE HISTORY





# **Opportunities for software engineers**

- Develop (or retrofit) the technologies required for achieving reproducibility
- Lead by example



## Lead by example, please.

Comment | Open Access | Published: 23 August 2016

# Gene name errors are widespread in the scientific literature

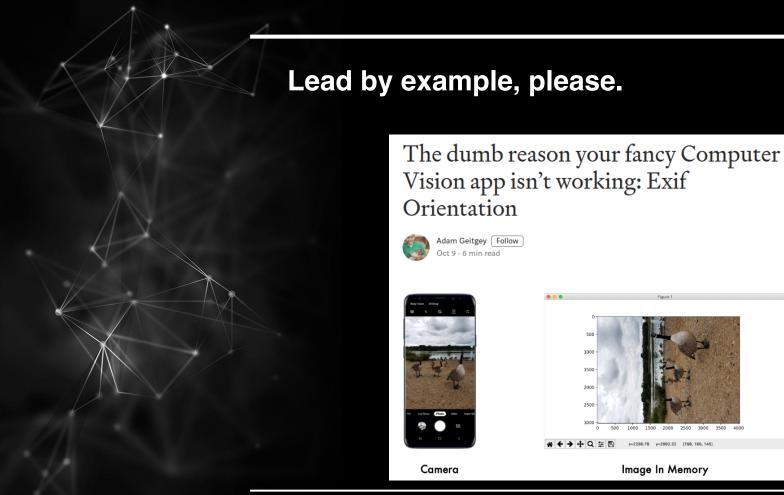
```
Mark Ziemann, Yotam Eren & Assam El-Osta

Genome Biology. 17, Article number: 177 (2016) | Download Citation 

102k Accesses | 34 Citations | 1828 Altmetric | Metrics >>
```

#### Abstract

The spreadsheet software Microsoft Excel, when used with default settings, is known to convert gene names to dates and floating-point numbers. A programmatic scan of leading genomics journals reveals that approximately one-fifth of papers with supplementary Excel gene lists contain erroneous gene name conversions.





#### Lead by example

- Ensure that CS research is reproducible!
- Have more software engineers specialize in scientific computing, emphasize the reproducibility aspect
  - Should we take the lead on teaching reproducibility? See software-carpentry.org
  - Transfer engineering principles to scientific software: testing, versioning, etc.
- Apply new trends to reproducibility distributed systems, microservices, blockchain, linked data



## Lead by example

Programming as a profession is only moderately interesting. It can be a good job, but you could make about the same money and be happier running a fast food joint. You're much better off using code as your secret weapon in another profession.

People who can code in the world of technology companies are a dime a dozen and get no respect. People who can code in biology, medicine, government, sociology, physics, history, and mathematics are respected and can do amazing things to advance those disciplines.

