# Fairly sharing the costs of reproducibility

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# What's my point?

We talk about reproducibility

Progress and precedent

But still a long way to go.

There's something in the way:

**Cost (not monetary)** 

Authors are unfairly burdened

# What's my point?

Assess costs w/ open eyes and mind

Let's find a fair way to share costs

Or, we can keep talking about reproducibility just like we talk about global warming, reducing air pollution, protecting wildlife, preserving rain forests, ...

## Nature of modern scholarship forces the issue

We come here to publish and share our research results from Latin *publicare* "make public," from *publicus*10 page PDF + suppl. materials (static, archived)

Except for theory/model papers, we don't have solely handdrawn figures: claims supported by **computational** results

"An article about computational science in a scientific publication is not the scholarship itself, it is merely advertising of the scholarship. The actual scholarship is the complete software development environment and the complete set of instructions which generated the figures." --David Donoho on WaveLab

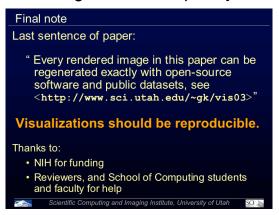
To actually transmit the ideas and results of visualization research, we must "make public" something beyond a static 10 page PDF w/ supplementary materials

Within Visualization: reviewers (correctly) criticize insufficient comparison with previous methods

Doing that well requires access to other's implementations

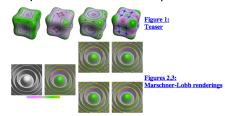
# High or unfair costs on authors

- (before publication) Reimplement all previous methods for meaningful comparison (beyond lit. review)
  - Also pay interest: shifting technology (e.g. GPUs), increasing software
    + algorithmic complexity



From presentation of: G Kindlmann, R Whitaker, T Tasdizen, T Möller. "Curvature-Based Transfer Functions for Direct Volume Rendering: Methods and Applications" Proc. 14th IEEE Visualization 2003, pp 513–520

Figures still reproducible w/ Teem http://teem.sf.net



- (after publication) Release, maintain, document, support software
- Publish and archive (or even update) reproducibility information

## More costs and risks

## For authors:

Not getting acknowledged when software is used (c.f. citation) Scooped on own future work

## For Research Community:

Loss of credibility and impact Incredible diversity of methods, applications, and platforms: no single solution for everyone

### Amongst which players can costs be shared fairly?

- Author
- Author's advisor
- Author's institution and its support staff
  - (Institutions vary widely in this capacity!)
- Research (sub)community
- Reviewers
  - SIGMOD Reproducibility Panel
- VisWeek
- IEEE TVCG

# Essential complicating tensions

Self-contained ↔ Status update on long-running systems

Basic ideas (longevity) ↔ hardware-dependent (cutting-edge)

Reproduce right now (SIGMOD)

↔ Reproduce now, and in 10 years, 20 years, etc.

Reproducibility for whom? Nearest academic peers in same area (with access to same kinds of resources)

↔ non-academic citizen scientists (w/out same resources)

Last-minute hacking prior to deadline (more like biologists)

Basic methods independent of specific datasets

→ requiring data as much as code (but data is capital)

## Will happen at the decade time-scale

NSF and NIH have long encouraged sharing

2011: NSF Data Management Plan

1980 Bayh-Dole → Tech-Transfer Offices

Grasped open source licensing within last decade

Journal of the American Statistical Association (JASA)

(from Victoria Stodden http://www.stanford.edu/~vcs/talks/RRJuly152011-STODDEN.pdf)

articles using computation: 1996 <50% → 2011 100%

articles w/ code available: 1996 0% → 2011 21%

"Visualization + Info Vis" → "Visualization + Info Vis + VAST"

→ "SciVis + InfoVis + VAST + LDAV + BioVis @ VisWeek"

World is changing, and moving towards reproducibility. We are changing. Let's move towards reproducibility.

## How VisWeek requests reproducibility

http://visweek.org/visweek/2012/info/call-participation/paper-submission-guidelines



#### SUPPLEMENTAL MATERIAL AND FORMATTING GUIDELINES

... Submission of code or other supplemental material in order to increase the reproducibility of the work is also encouraged. Those submitting to the conference are urged to make available salient parameter settings of pertinent algorithms and ideally obtain results using open source data. In case specific data sets are employed, we ask that a version of these be made available where possible.

## Resources

# (who's going to manage a living version of this for Vis?)

#### http://www.stodden.net/AMP2011/

Reproducible Research: Tools and Strategies for Scientific Computing; A workshop in association with Applied Mathematics Perspectives 2011, University of British Columbia, July 13-16, 2011, e.g. http://www.youtube.com/watch?v=UDOFjGsokxw&feature=relmfu with PDF of slides at http://www.stanford.edu/~vcs/talks/RRJuly152011-STODDEN.pdf

#### http://www.stanford.edu/~vcs/AAAS2011/

The Digitization of Science: Reproducibility and Interdisciplinary Knowledge Transfer; A symposium at the AAAS Annual Meeting at the Washington Convention Center, Washington, DC, Feb 19, 2011

#### http://www.eurorvvv.org

EuroRVVV: EuroVis 2012 Workshop on Reproducibility, Verification, and Validation in Visualization (Paul Rosenthal, Britta Weber)

#### http://www.reproducibleresearch.net/blog/

Reproducible Research web page, links to scientific fraud examples

#### http://www.executablepapers.com/index.html

The Executable Paper Grand Challenge from Elsevier

http://www-stat.stanford.edu/~donoho/Reports/2008/15YrsReproResch-20080426.pdf

Donoho et al: 15 Years of Reproducible Research in Computational Harmonic Analysis (2008)

http://www-stat.stanford.edu/~wavelab/Wavelab\_850/wavelab.pdf

Buckheit and Donoho: WaveLab and Reproducible Research (1998)

# My point, again

Sure, let's keep talking about reproducibility, but

Let's find fair ways of sharing its costs, and then

# Let's walk our talk!

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