A Universal Identifier for Computational Results AAAS 2011

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March 4, 2011

Credibility Crisis in Scientific Communication

Jon Claerbout, 1990 (paraphrase Donoho and Buckheit, 1995)

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.

- "Most published scientific research is false".
 (John loannidis, with apologies)
- "Most published scientific research is not reproducible".
 (John loannidis et al., Keith Baggerly et al.)

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- Write scientific paper [1660?]
- Publish a pidgin algorithm and describe simulation datasets [1950?]
- Sell magtape of code and data [1970?]
- Place idiosyncratic software at website.
 Place idiosyncratic dataset at Website [1991?]
- Write R Package, of software, place at CRAN.
 Publish datasets and scripts at Website [2000?]
- Use Sweave to integrate code and data [??]

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- Biostatistics has a reproducibility editor (Roger Peng), standard process for certification (using R)
- Growing literature on reproducibility (Special issues, workshops like this one, ...).

- Very few researchers follow even minimal reproducibility standards.
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Psychological Obstacles to Reproducibility

- Publication is the real goal
- Publication is informal description of work we do in private
- We use files and personal coding idioms no-one else will ever see
- Reproducibility involves cleaning up post-facto.
 It's a pretentious waste of time.

- The endgame. Release of code and results to the internet
- Commit to the endgame before you start your project
- Work consistently to a discipline shaped by the endgame

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Claerbout's motto, again

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- Running a computational experiment necessarily ends in publication of the computational process and its results in a public repository.
- Writing explanations related to computational results (e.g a scientic article advertizing it) is done afterwards, or not at all.
- Figures in article are renderings of the already published computational results

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Claerbout's motto - Operational meaning

An article about computational science is not the scholarship itself, it is advertisement captions written around renderings of previously published Verifiable Computational Results (VCRs). The actual scholarship is the complete VCR record on a public repository, containing a complete account of the computational process which generated the figures.

- Every computation for a scientific project, at instant of creation, is publicly registered (+timestamped, documented) at external server.
- URI generated by registration makes result eternally and universally accessible *.
- Scientific Publication is post-facto creation of humanly-readable hypertext document explaining pre-existing, already 'public' results
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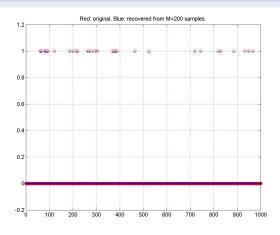
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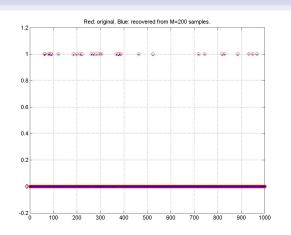
1. How exactly did I create this nice figure two years ago?

My own paper



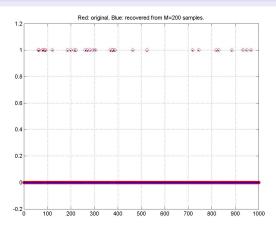
2. My student Bob graduated. My new student Alice can't reproduce his thesis results.

Bob's thesis



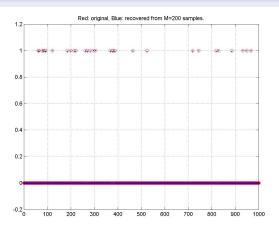
3. I don't believe the figure in this published paper.

A published paper



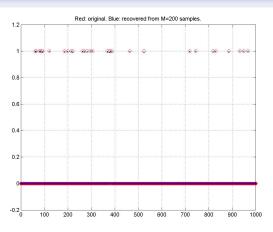
4. I don't believe the figure in your lecture slide.

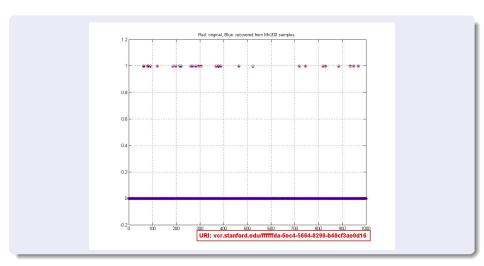
Lecture slides

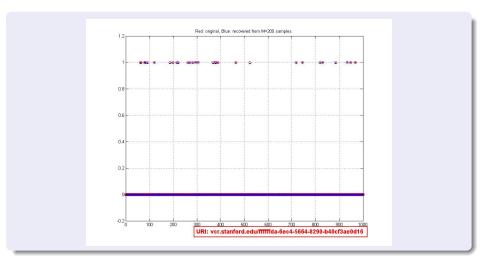


5. I cannot honestly referee this paper without the computation details.

A Submitted paper







(Try clicking on the figure...)

vcr.stanford.edu/ffffffda-6ec4-5664-8290-b40cf3ae0d16 is a URI: Universal Result Identifier

URI is a *universal* and *permanent* connection to a computational result (and its generating environment)

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The computational science workflow

Program Code

```
x = read_data('C:/result_of_previous_computation.txt')
figure1 = plot(x)
save(figure1,'figure1.eps')
```

Document processor

\includegraphics{C:/figure1}

Publication: Paper or slides



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- > experiment > "C:/figure1.eps saved"

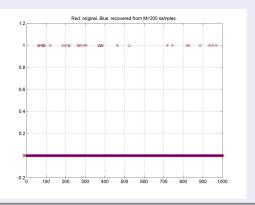
Document processor

...Our results are summarized in Figure 1.

\includegraphics{C:/figure1}

Publication: Paper or slides

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verifiable figure1 = plot(x)
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```
> experiment
```

> "URI of figure1 is ffaaffb1-48d7"
> "Receipt sent to gavish@stanford.edu"

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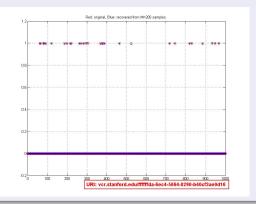
> experiment
> "vcr.science.com replied:"
```

Document processor

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\include_result{vcr.science.com/ffaaffb1-48d7}
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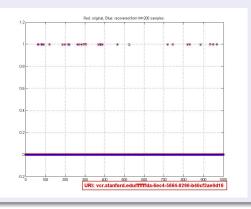
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(Try clicking on the figure...)

Eventual system components

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- Publishers to make subtle changes in article appearance
- Authors to make simple changes in a few lines of programs and word processors

- Universal, permanent and secure identifier for each citable computational result
 - A single, citable copy of each published result
 - A single, citable and reusable copy of each published dataset
- Immediate publication * of result upon issuance of URI
- VCR server protocol serves up not only result but various views and metadata about result Code
 - Dataset values, summariess
- Potentially, operators on result (eg. bootstrap)

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Web Services Standards

- URI Universal Resource Identifier
- RESTful web service (eg Amazon S3)

Implications

- Instead of files, objects in the cloud.
- Server responds to object/method pairs
- URI: http://www.stanford.edu/ gavish/vcr/371aee2f-0d1f-405b-f1dd-7d4446363324
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Existing implementation

Beta version in use in the Stanford Statistics Department.

http://vcr.stanford.edu

Acknowledgements

Alon Shalita (Facebook) Balasubramanian Narasimhan (Stanford)



Written in the Stanford Hospital Delivery Unit