



BERKELEY INITIATIVE FOR TRANSPARENCY
IN THE SOCIAL SCIENCES

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

Software and Workflow for Reproducible Research

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¹UC Berkeley: Berkeley Initiative for Transparency in the Social Sciences
Berkeley Institute for Data Science

Annual Meeting, December 2015



Outline

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

1 Introduction

2 Problems

- Irreproducible Workflow

3 Solutions

- Workflow
- Literate Programming
- Workflow Suggestions
- Version Control
- Dynamic Documents

4 Conclusion



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BERKELEY INSTITUTE FOR TRANSPARENCY
IN THE SOCIAL SCIENCES

Reproducibility & Transparency

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

- **What are practical tools to implement reproducibility solutions?**



Problems

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

- Data not available
- Code not available/unintelligible
- Code and data cannot reproduce original results



Irreproducible Workflow

BERKELEY INSTITUTE FOR TRANSPARENCY
IN THE SOCIAL SCIENCES

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

- Even with the help of the original author (yourself?), you can't get the data to reproduce the published results. Or you just can't find the data to begin with.
- *Journal of Money, Credit, and Banking* Project. (Dewald et al., AER 1986)
- Martin Feldstein on Social Security and private savings, Reinhart and Rogoff on debt and GDP growth.



Reproducible Workflow

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

- Literate Programing
- Version control
 - Github
 - OSF
- Dynamic Documents
 - R Markdown and R Studio
 - Ketchup in Stata
- Data Sharing
 - Harvard's Dataverse



Literate Programming

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

- First, *programming* is key to reproducibility. Working in Excel is not reproducible.
- See Reinhart and Rogoff “Growth in a Time of Debt” controversy:
 - Original Paper, *AER P & P* 2010
 - Herndon et. al (2013) finding.
 - *New Yorker* summary.
- Random number generation in Excel—set seed with Data Analysis Toolpak.



Literate Programming

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

- If you are using SPSS, use of ‘syntax’ to record all the commands you run is simple. (See UCLA tutorial.) Similarly in Stata, ‘commandlog’.
- Better is to write scripts. R, Stata, SAS, Python, or whatever you please.
- Open source has some advantages (being free, for one) but you’re going to use what everyone in your field uses.



Literate Programming

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IN THE SOCIAL SCIENCES

Software and Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow
**Literate
Programming**
Workflow
Suggestions
Version Control
Dynamic Documents

Conclusion

- Second, *literate programming* is key to reproducibility. Write code to be read by a human being, with the code for the computer secondary.



Literate Programming

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

**Literate
Programming**

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

“I believe that the time is ripe for significantly better documentation of programs, and that we can best achieve this by considering programs to be works of literature. Hence, my title: “Literate Programming.”

Let us change our traditional attitude to the construction of programs: Instead of imagining that our main task is to instruct a computer what to do, let us concentrate rather on explaining to human beings what we want a computer to do.

(cont.)



Literate Programming

BERKELEY INSTITUTE FOR TRANSPARENT
IN THE SOCIAL SCIENCES

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

“The practitioner of literate programming can be regarded as an essayist, whose main concern is with exposition and excellence of style. Such an author, with thesaurus in hand, chooses the names of variables carefully and explains what each variable means. He or she strives for a program that is comprehensible because its concepts have been introduced in an order that is best for human understanding, using a mixture of formal and informal methods that reinforce each other.”

–Donald Knuth *The Computer Journal*, 1984 [Quotes](#) [Original](#)



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Organizing and Recording Workflow

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

*“Reproducibility is just collaboration with people
you don’t know, including yourself next week”*

—Philip Stark, UC Berkeley Statistics

Practical coding and organizational suggestions

- Long (2008) *The Workflow of Data Analysis Using Stata*
- Making any changes to a file that has been posted/shared means it gets a new name.
- Use version commands to ensure others get same results.
- Keep a daily research log.



Version Control

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

- Using version control (AKA revision control) can help to make your work more reproducible.
- What is version control?

Version control is a system that records changes to a file or set of files over time so that you can recall specific versions later. For the examples in this book you will use software source code as the files being version controlled, though in reality you can do this with nearly any type of file on a computer.

–Git, About Version Control



Version Control

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

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Version Control

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

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Version Control

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

With version control you can:

- Collaborate
- Track who made every change
- Easily switch between versions of files
- Compare versions of files
- Backup
- Work with the same files on different machines
- Experiment with a new version of code without breaking things

[Link1](#)

[Link2](#)

[Link3](#)



Version Control

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

Places you're already using version control without knowing it:



Revision history



April 17, 10:07 AM

 Eric Eich

March 28, 5:46 PM

 Brian Nosek

March 28, 9:30 AM

 Brian Nosek
 Bobbie Spellman

March 28, 7:24 AM

 Brian Nosek

March 27, 6:33 PM

 Bobbie Spellman

March 27, 5:53 PM

 anonymous

March 27, 1:01 PM

 anonymous

March 27, 5:21 AM

 Arthur Lupia

March 26, 10:22 AM

 Bobbie Spellman

Elephant: Revision history

[View logs for this page](#)

Browse history

From year (and earlier): From month (and earlier): Tag filter:

For any version listed below, click on its date to view it. For more help, see [Help:Page history](#) and [Help:Edit summary](#).

External tools: [Revision history statistics](#) · [Revision history search](#) · [Edits by user](#) · [Number of watchers](#) · [Page view statistics](#)

(cur) = difference from current version, (prev) = difference from preceding version, **m** = **minor edit**, **→** = **section edit**, **←** = **automatic edit summary**

(newest | oldest) View (newer 50 | older 50) (20 | 50 | 100 | 250 | 500)

Compare selected revisions

- [\(cur | prev\)](#) ⓘ **03:57, 1 August 2006** [Stevenj](#) ([talk](#) | [contribs](#)) .. (53,894 bytes) **(-1)** .. *(protected is the correct tag, I believe)*
- [\(cur | prev\)](#) ⓘ **03:55, 1 August 2006** [SlimVirgin](#) ([talk](#) | [contribs](#)) **m** .. (53,895 bytes) **(0)** .. *(Protected Elephant: isn't actually protected, as requested [edit=autoconfirmed.move=autoconfirmed])*
- [\(cur | prev\)](#) ⓘ **03:55, 1 August 2006** [SlimVirgin](#) ([talk](#) | [contribs](#)) **m** .. (53,895 bytes) **(0)** .. *(Protected Elephant: wasn't actually protected, as requested [edit=autoconfirmed.move=autoconfirmed])*
- [\(cur | prev\)](#) ⓘ **03:54, 1 August 2006** [SlimVirgin](#) ([talk](#) | [contribs](#)) **m** .. (53,895 bytes) **(0)** .. *(Protected Elephant: wasn't actually protected, as requested [edit=autoconfirmed.move=autoconfirmed])*
- [\(cur | prev\)](#) ⓘ **03:54, 1 August 2006** [SlimVirgin](#) ([talk](#) | [contribs](#)) **m** .. (53,895 bytes) **(0)** .. *(Protected Elephant: wasn't actually protected, as requested [edit=autoconfirmed.move=autoconfirmed])*
- [\(cur | prev\)](#) ⓘ **03:54, 1 August 2006** [SlimVirgin](#) ([talk](#) | [contribs](#)) **m** .. (53,895 bytes) **(0)** .. *(Protected Elephant: wasn't actually protected, as requested [edit=autoconfirmed.move=autoconfirmed])*
- [\(cur | prev\)](#) ⓘ **03:53, 1 August 2006** [SlimVirgin](#) ([talk](#) | [contribs](#)) **m** .. (53,895 bytes) **(0)** .. *(Protected Elephant: wasn't actually protected, as requested [edit=autoconfirmed.move=autoconfirmed])*
- [\(cur | prev\)](#) ⓘ **03:51, 1 August 2006** [RasputinAXP](#) ([talk](#) | [contribs](#)) .. (53,895 bytes) **(+14)** .. *(protecting from vandalism)*
- [\(cur | prev\)](#) ⓘ **03:47, 1 August 2006** [Stevenj](#) ([talk](#) | [contribs](#)) .. (53,881 bytes) **(-15)** .. *(whoops, unvert; I accidentally re-added the vandalism instead of removing it, sorry)*
- [\(cur | prev\)](#) ⓘ **03:46, 1 August 2006** [Crzrussian](#) ([talk](#) | [contribs](#)) .. (53,896 bytes) **(-46)** .. *{{protected}}*
- [\(cur | prev\)](#) ⓘ **03:41, 1 August 2006** [Stevenj](#) ([talk](#) | [contribs](#)) **m** .. (53,942 bytes) **(+61)** .. *(Reverted edits by [Xaosflux](#) ([talk](#)) to last version by [Fire Star](#))*
- [\(cur | prev\)](#) ⓘ **03:40, 1 August 2006** [Xaosflux](#) ([talk](#) | [contribs](#)) .. (53,881 bytes) **(-61)** .. *(-THE NUMBER OF ELEPHANTS HAS TRIPLED IN THE LAST SIX MONTHS!)*



Version Control

Software and Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

Places you're already using version control without knowing it:

- Google Docs
- Wikipedia
- Every piece of software you use.



Isn't this just a complicated version of the “date and initial” method?

- regressions2015.08.24.do
- regressions2015.08.25.do
- regressions2015.08.25GC.do
- Hassle
- Confusion

Here is a good rule of thumb: If you are trying to solve a problem, and there are multi-billion dollar firms whose entire business model depends on solving the same problem, and there are whole courses at your university devoted to how to solve that problem, you might want to figure out what the experts do and see if you can't learn something from it.

...

Not one piece of commercial software you have on your PC, your phone, your tablet, your car, or any other modern computing device was written with the “date and initial” method.

–Matthew Gentzkow and Jesse M. Shapiro “Code and Data for the Social Sciences: A Practitioner’s Guide”

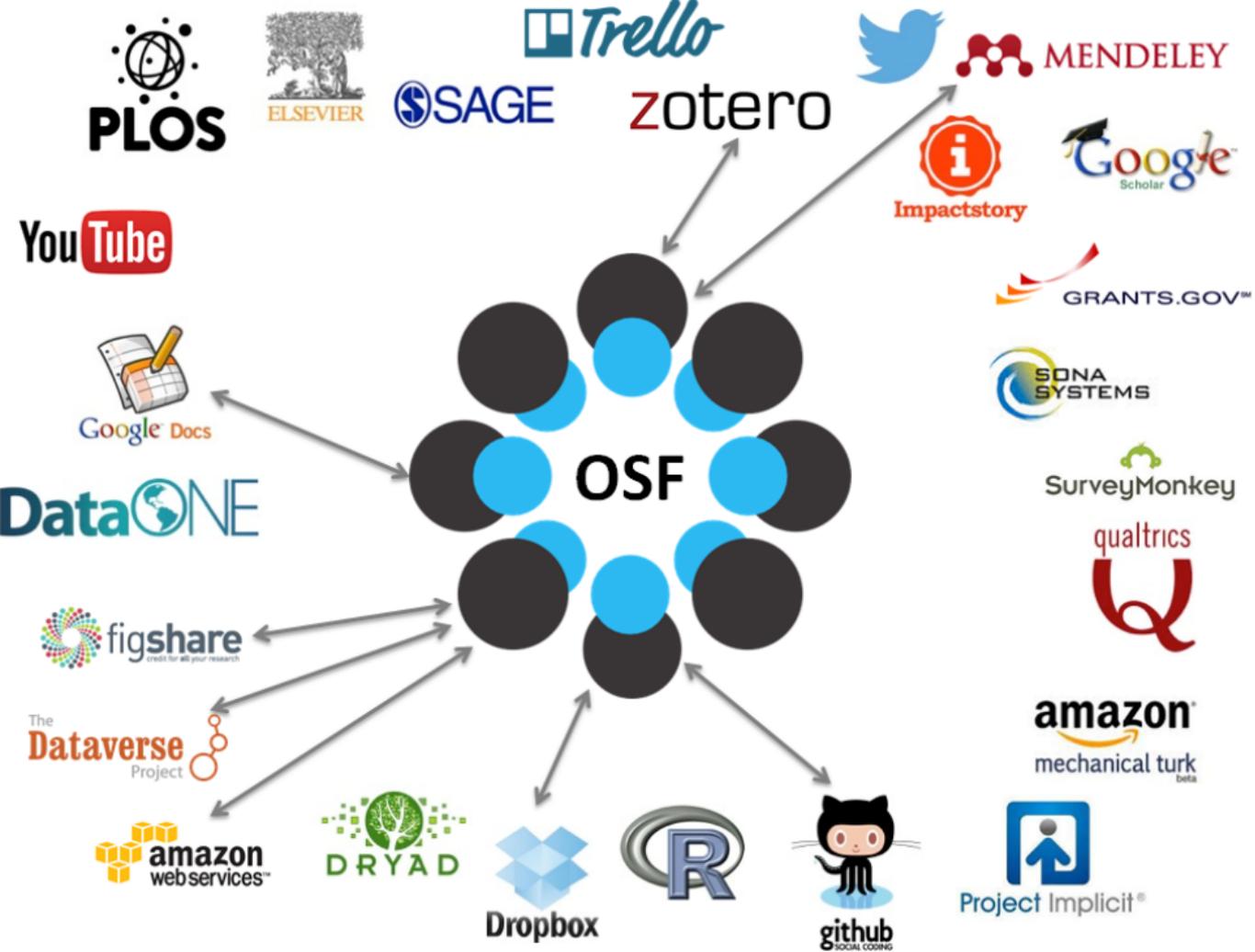


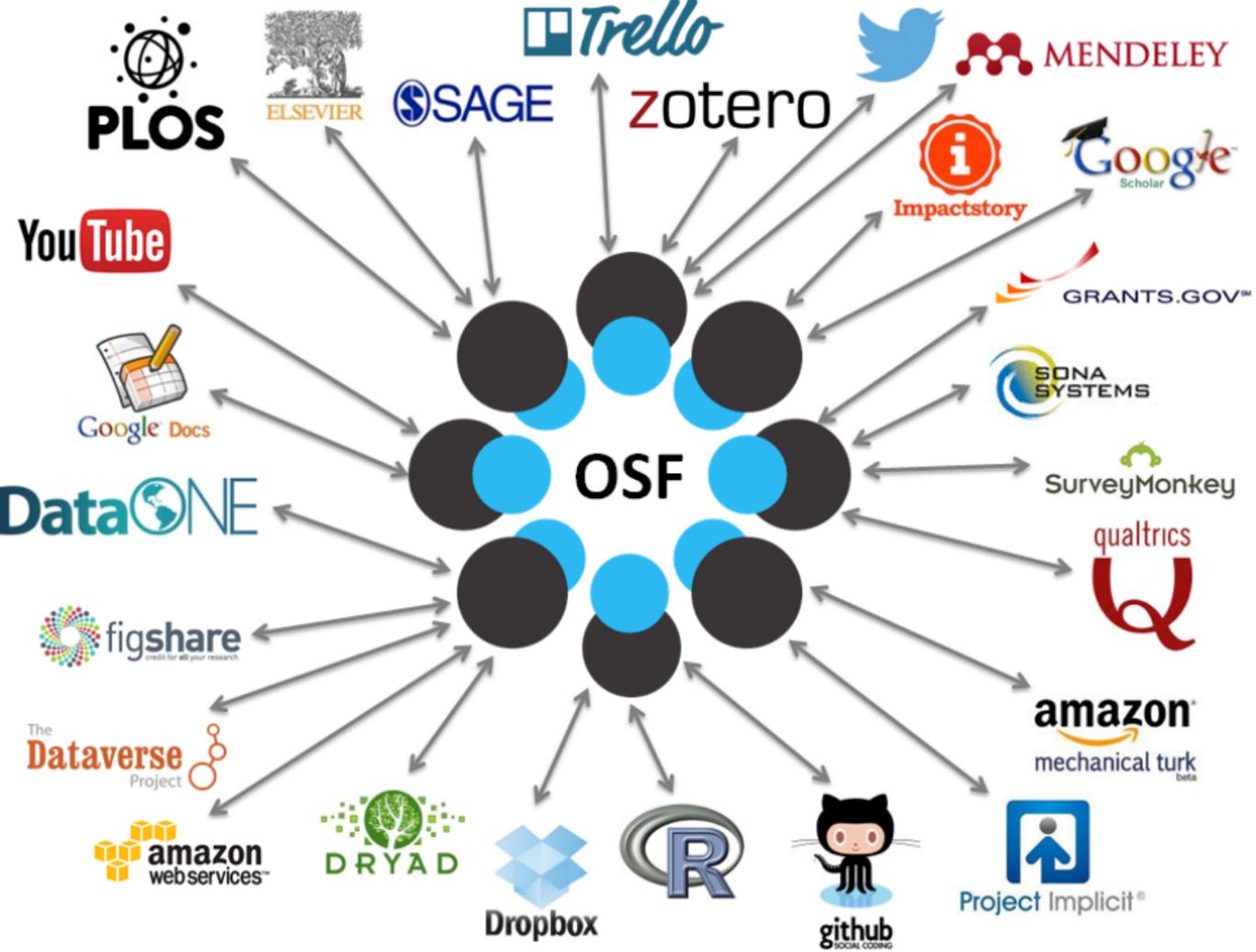
THIS IS GIT. IT TRACKS COLLABORATIVE WORK
ON PROJECTS THROUGH A BEAUTIFUL
DISTRIBUTED GRAPH THEORY TREE MODEL.

COOL. HOW DO WE USE IT?

NO IDEA. JUST MEMORIZE THESE SHELL
COMMANDS AND TYPE THEM TO SYNC UP.
IF YOU GET ERRORS, SAVE YOUR WORK
ELSEWHERE, DELETE THE PROJECT,
AND DOWNLOAD A FRESH COPY.









Examples

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

GitHub and OSF Examples:

- Slides for this workshop on Github.com
- <http://www.github.com/bitss/annual2015>
- Slides also available on the Open Science Framework
- <https://osf.io/7pbm5/>



Dynamic Documents

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

- Even if you write perfect (version controlled) code, you can still run into problems going from your code to paper. This is where *dynamic documents* come in.
- A dynamic document includes your data, code, analysis, and output all in one place. Fully automated, you can guarantee no mistakes from copying and pasting.
- Do this with R Markdown in R Studio or Markdoc in Stata.



Dynamic Documents

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

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Dynamic Documents

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

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Dynamic Documents

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

- Include tables by linking to a file, instead of a static image.
- Include number by linking to a value calculated by an analysis file, instead of a static number typed manually.
- Automatically update tables and numbers.
- Produce entire paper with one or two clicks.



Examples

Software and Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow
Literate
Programming
Workflow
Suggestions
Version Control
Dynamic Documents

Conclusion

- R Studio Example
- Stata Example



Conclusion

Software and
Workflow

Christensen

Introduction

Problems

Irreproducible
Workflow

Solutions

Workflow

Literate
Programming

Workflow
Suggestions

Version Control

Dynamic Documents

Conclusion

Simple tools exist to help you transparently and reproducibly take your research from beginning to end.

- Version Control
- Open Science Framework
- Dynamic Documents
- Trusted Public Data Archive

Read more in my *Manual of Best Practices in Transparent Social Science Research* on GitHub.