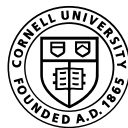




Panel on Reproducibility and Transparency

# Transparency of Software and Code

Lars Vilhuber



Cornell University

# Benefits of Transparency and Reproducibility

- efficiency,
- innovation and progress,
- trust and confidence,
- and the value from the use of the data products

National Academies of Sciences, Engineering, and Medicine. 2022. Transparency in Statistical Information for the National Center for Science and Engineering Statistics and All Federal Statistical Agencies. Washington, DC: The National Academies Press. <https://doi.org/10.17226/26360>.



# Transparency and:

Transparency  
requires

**“the provision of  
sufficiently  
detailed  
documentation”**



# Transparency and:

Transparency  
requires

**“the provision of  
sufficiently  
detailed  
documentation”**

Blaise

LimeSurvey

Qualtrics

R

SAS

PostgreSQL

Python

Oracle



# Transparency and: *Proprietary Software*

Transparency  
requires  
“the provision of  
sufficiently  
detailed  
documentation”

Q: What to do when  
software is  
proprietary?



# Transparency and: *Proprietary Software*

Transparency  
requires  
“the provision of  
sufficiently  
detailed  
documentation”

Q: What to do when  
software is  
proprietary?

A: Clearly describe  
use of software  
(accessibility, price,  
version)



# Transparency and: *Code*

Code is

**instructions to  
make software  
function**

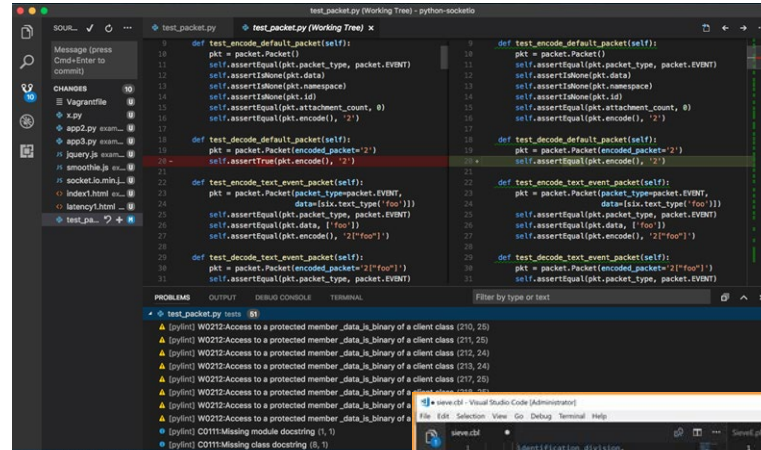
(could also be source code for software)

- functionality of code
- development of code (when, who)
- dependencies

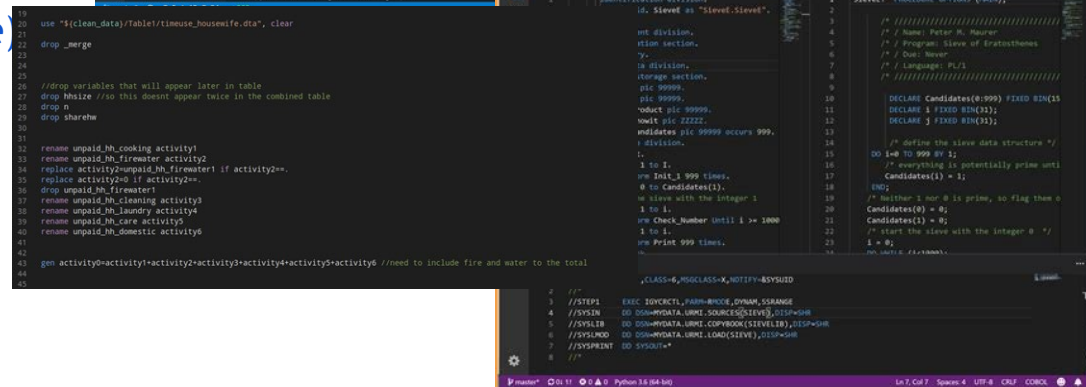


# Transparency and: Code

Code is  
instructions to  
make software  
function  
(could also be source code for software)



The screenshot shows a code editor with two files open: `test_packet.py` and `test_packet2.py`. The `test_packet.py` file contains Python code for encoding and decoding packets. The `test_packet2.py` file contains similar code but with some differences in the `def test_encode_default_packet(self):` and `def test_decode_default_packet(self):` methods. The code includes assertions to verify the correctness of the encoding and decoding process.

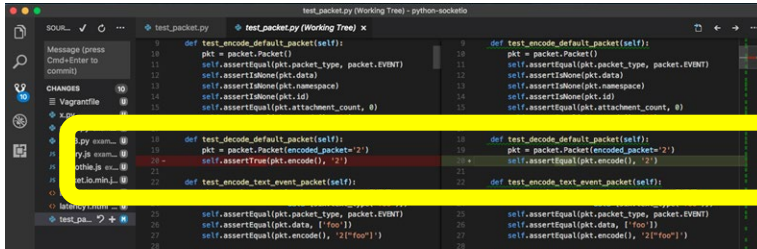


The screenshot shows a code editor with two files open: `test_packet.py` and `test_packet2.py`. The `test_packet.py` file contains Python code for encoding and decoding packets. The `test_packet2.py` file contains similar code but with some differences in the `def test_encode_default_packet(self):` and `def test_decode_default_packet(self):` methods. The code includes assertions to verify the correctness of the encoding and decoding process.



# Transparency and: Code

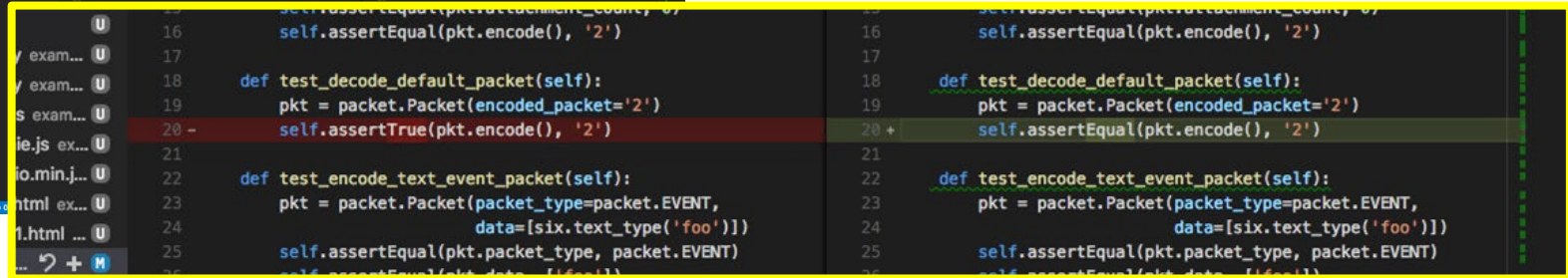
- functionality of code



```
test_packet.py (Working Tree) - python-socketio
def test_encode_default_packet(self):
    pkt = packet.Packet()
    self.assertEqual(pkt.packet_type, packet.EVENT)
    self.assertIsNone(pkt.data)
    self.assertIsNone(pkt.namespace)
    self.assertIsNone(pkt.id)
    self.assertEqual(pkt.attachment_count, 0)

def test_decode_default_packet(self):
    pkt = packet.Packet(encoded_packet='2')
    self.assertEqual(pkt.encode(), '2')

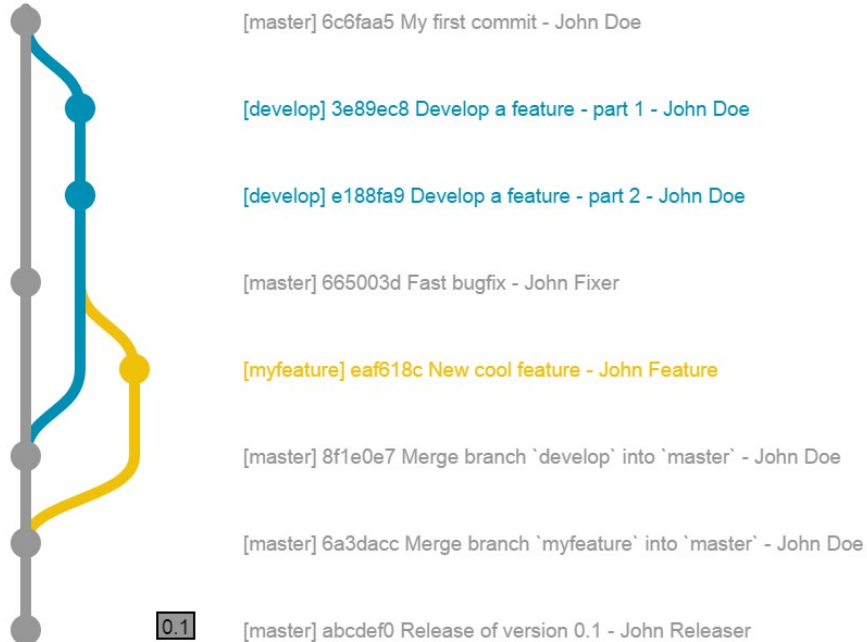
def test_encode_text_event_packet(self):
    pkt = packet.Packet(packet_type=packet.EVENT,
                        data=[six.text_type('foo')])
    self.assertEqual(pkt.packet_type, packet.EVENT)
    self.assertEqual(pkt.data, ['foo'])
```



|   |  |
|---|--|
| <pre>self.assertEqual(pkt.encode(), '2')  def test_decode_default_packet(self):     pkt = packet.Packet(encoded_packet='2')     self.assertTrue(pkt.encode(), '2')  def test_encode_text_event_packet(self):     pkt = packet.Packet(packet_type=packet.EVENT,                         data=[six.text_type('foo')])     self.assertEqual(pkt.packet_type, packet.EVENT)     self.assertEqual(pkt.data, ['foo'])</pre> | <pre>self.assertEqual(pkt.encode(), '2')  def test_decode_default_packet(self):     pkt = packet.Packet(encoded_packet='2')     self.assertEqual(pkt.encode(), '2')  def test_encode_text_event_packet(self):     pkt = packet.Packet(packet_type=packet.EVENT,                         data=[six.text_type('foo')])     self.assertEqual(pkt.packet_type, packet.EVENT)     self.assertEqual(pkt.data, ['foo'])</pre> |
|---|--|



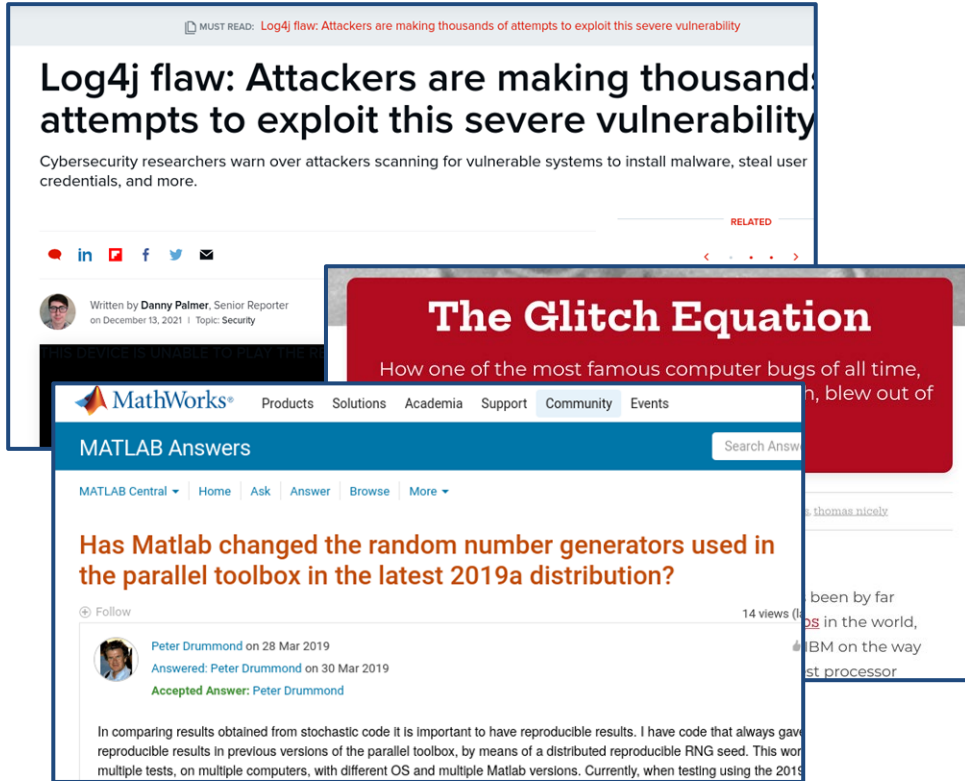
# Transparency and: Code



- functionality of code
- development of code (when, who)
  - Includes release policy



# Transparency and: Code



- functionality of code
- development of code (when, who)
- dependencies



# Transparency and Software

## Recommendation 4.1

Agencies that produce federal statistics [...]

- should review and make a priority of
- adopting modern information technology tools that assist in
- **collaborative software development and documentation of workflow and methodology.**



# Transparency and Software

## Recommendation 4.1

- Use versioning systems
  - Use them broadly (not just selectively)
- Create and use style guides
  - Not just for “developers”



### Pinned



### Repositories

## styleguide

### Company X Python Style Guide

#### Table of Contents

- 1 Background
- 2 Python Language Rules
  - 2.1 Lint

#### 2 Python Language Rules

##### 2.1 Lint

Run `pylint` over your code using this `pylintrc`.

##### 2.1.1 Definition

`pylint` is a tool for finding bugs and style problems in Python source code. It finds problems that less dynamic languages like C and C++. Because of the dynamic nature of Python, some warning warnings should be fairly infrequent.

##### 2.1.2 Pros

Catches easy-to-miss errors like typos, using-vars-before-assignment, etc.

##### 2.1.3 Cons

`pylint` isn't perfect. To take advantage of it, sometimes we'll need to write around it, suppress it:

##### 2.1.4 Decision

Make sure you run `pylint` on your code.



# Some particular notes

# Transparency and: *Surveys*

Agencies have  
exemplary tradition  
of publishing  
questionnaires

- Most often not in re-usable formats (such as DDI, Blaise)
- Transparency of “code” would allow greater reuse/consistency



# Example: Survey of Earned Doctorates

*“Data collection. In 2020, for the first time, the SED data collection did not use the self-administered paper questionnaire. The SED was completed primarily by self-administered Web survey with a small number of nonrespondents contacted to complete computer-assisted telephone interviewing (CATI).”*

<https://nces.nsf.gov/pubs/nsf22300/technical-notes#survey-design>



The screenshot shows the SED website with a purple navigation bar. The 'Downloads' tab is selected. Below the navigation bar, the 'Downloads' section is titled in purple. A table lists various resources available for download, categorized by format (PDF, EXCEL, PNG, ALL).

| DESCRIPTION                 | PDF                 | EXCEL                | PNG                 | ALL                 |
|-----------------------------|---------------------|----------------------|---------------------|---------------------|
| Report                      | ↓ PDF (674 KB)      |                      |                     |                     |
| Report (figures and tables) | ↓ PDF (.zip 3.1 MB) | ↓ XLSX (.zip 205 KB) | ↓ PNG (.zip 3.7 MB) | ↓ All (.zip 7.0 MB) |
| Data Tables and Resources   | ↓ PDF (4.2 MB)      |                      |                     |                     |
| Data Tables                 | ↓ PDF (.zip 5.8 MB) | ↓ XLSX (.zip 871 KB) |                     | ↓ All (.zip 6.7 MB) |
| Technical Notes             | ↓ PDF (350 KB)      |                      |                     |                     |
| Technical Tables            | ↓ PDF (.zip 440 KB) | ↓ XLSX (.zip 58 KB)  |                     | ↓ All (.zip 498 KB) |
| Additional Resources        | ↓ PDF (70 KB)       |                      |                     |                     |

Blaise

LimeSurvey

Qualtrics



# Transparency and: *Processing*

All data cleaning  
and preparation is  
(*or should be*)  
done by code

- Can such code be made available?
- The processed data is probably still confidential (PII)



# Analogy: Code for academic articles

All data cleaning and preparation code  
(*and instructions*)  
MUST be provided.



Office of the AEA Data Editor

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Talks

Projects



## AEA Data Editor

The AEA Data Editor's mission is to design and oversee the AEA journals' strategy for archiving and curating research data and promoting reproducible research.

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## Some remarks on coding when data are confidential

6 minute read

Published: April 13, 2022

Back in the fall, I made a few notes regarding how to prepare replication packages when data are confidential ([here](#)). What I did not address, and what comes up regularly, is how to **write code** when some code and/or data are confidential.

### What is confidential code, you say?

- In the United States, some variables on IRS databases are considered super-top-secret. So you can't name that-variable-that-you-filled-out-on-your-Form-1040 in your analysis code of same data. (They are often referred to in jargon as "Title 26 variables"). Not sure why that continues to be perceived as a problem, but until the law changes, that's one possible constraint.
- Your code contains the random seed you used to anonymize the sensitive identifiers. This might allow to reverse-engineer the anonymization, and is not a good idea to publish.
- You used a look-up table hard-coded in your Stata code to anonymize



# Do's and don't's

```
set seed 12345  
use q2f q3e county using "/data/economic/cmf2012/extract.dta", clear  
gen logprofit = log(q2f)  
by county: collapse (count) n=q3e (mean) logprofit  
drop if n<10  
graph twoway n logprofit
```



# Do's and don't's

```
set seed NNNNN  
use <removed vars> county using "<removed path>", clear  
gen logprofit = log(XXXX)  
by county: collapse (count) n=XXXX (mean) logprofit  
drop if n<XXXX  
graph twoway n logprofit
```



# Do's and don't's

Auxiliary file `include/confparms.do` (not released)

```
//===== confidential parameters =====  
global confseed      12345  
global confpath      "/data/economic/cmf2012"  
global confprofit    q2f  
global confemploy    q3e  
global confmincell   10  
//===== end confidential parameters =====
```



# Do's and don't's

Main file `main.do`:

```
//===== confidential parameters =====  
capture confirm file "include/confparms.do"  
if _rc == 0 {  
    // Confirmed  
    include "include/confparms.do"  
} else {  
    di in red "No confidential parameters found"  
}  
//===== end confidential parameters =====  
  
//===== non-confidential parameters =====  
global safepath "releasable"  
cap mkdir "$safepath"  
  
//===== end parameters =====
```



# Do's and don't's

## Creating reproducible packages when data are confidential

Lars Vilhuber  
2022-10-17

[lars.vilhuber.com/p/fsrdc2022/](https://lars.vilhuber.com/p/fsrdc2022/)



# Transparency and: *Processing*

Tracing of code  
execution is hard  
(logging)

- **Already occurs for security purposes**
- May not need to be at the finest level for transparency
- May not need to be publicly available (but auditable)





# Transparency and: *Processing*

Tracing of code  
execution is hard  
(logging)

- Already occurs for security purposes
- May not need to be at the finest level for



# Transparency and: *Manual steps*

Some manual steps  
in processing may  
be unavoidable

Transparency implies

- that it be identified
- documented (instructions, training manuals)
- ideally publicly



# Transparency and: *Manual steps*

Some manual steps  
in processing may  
be unavoidable

Can include:

- Rules for manual edits
- Human edits



# Transparency and: *Consequences*

Transparency can  
be hard

- 1,000 of people looking “over your shoulder”
- Errors will be found



# Transparency and: *Consequences*

Transparency can  
be hard  
... but valuable

- Self-disciplining device
- Possible crowd-sourcing of solutions



# Transparency and: *Policies*

## Transparency needs frameworks

- Internal policies on how to respond to (legitimate) criticism
- Support for the process



# Transparency and: *Policies*

## Transparency needs frameworks

- Coding guides
- Continuous review process
  - For quality
  - For security
- Training!



[doi.org/10.17226/26360](https://doi.org/10.17226/26360)

Consensus Study Report



[VIEW LARGER COVER](#)

## Transparency in Statistical Information for the National Center for Science and Engineering Statistics and All Federal Statistical Agencies

(2022)

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Widely available, trustworthy government statistics are essential for policy makers and program administrators at all levels of government, for private sector decision makers, for researchers, and for the media and the public. In the United States, principal statistical agencies as well as units and programs in many other agencies produce various key statistics in areas ranging from the science and engineering enterprise to education and economic welfare. Official statistics are often the result of complex data collection, processing, and estimation methods. These methods can be challenging for agencies to document and for users to understand.

[\[read full description\]](#)

**Contributor(s):** National Academies of Sciences, Engineering, and Medicine; [Division of Behavioral and Social Sciences and Education](#); [Committee on National Statistics](#); [Panel on Transparency and Reproducibility of Federal Statistics for the National Center for Science and Engineering Statistics](#)