# Statistical Programming and Open Science Methods

Introduction, Development Environment and Project Organization

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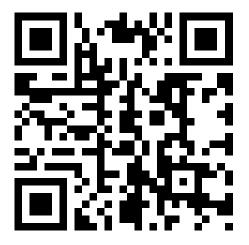




#### Time table October 10

When?	What?
09:00	Welcome and Introduction
09:30	The development environment and project organization
10:30	Coffee
11:00	Using Git and Github
12:30	Lunch
14:00	Statistical programming languages: An overview
15:30	Coffee
16:00	Functional versus object-oriented programming
19:30	Pizza at Due Forni, Schönhauser Allee 12

#### Instead of an introduction round ...



https://trr266.wiwi.hu-berlin.de/shiny/sposm\_survey/

# Let's have a look at your reponse

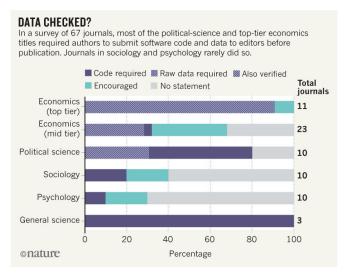


#### Open Science

Open Science is the practice of science in such a way that others can collaborate and contribute, where research data, lab notes and other research processes are freely available, under terms that enable reuse, redistribution and reproduction of the research and its underlying data and methods.

— FOSTER, https://www.fosteropenscience.eu/

#### Data and code repositories are on the rise . . .

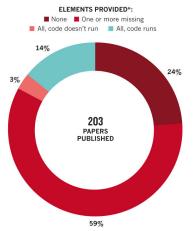


Gertler, Galiani and Romero (Nature, 2018)

#### ... but yet fail to guarantee reproducible results

#### REPLICATION RARELY POSSIBLE

An analysis of 203 economics papers found that fewer than one in seven supplied the materials needed for replication.



\*The elements assessed were raw data, raw code, estimation data and estimation code.

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Gertler, Galiani and Romero (Nature, 2018)

### Why is that? One reason

Those of you who use Stata for research projects will be familiar with code that starts like this

```
clear all
set more off
cd "/Users/joachim/Dropbox/icas/analysis/"
use "stata_dsets/verbal_and_survey_data.dta", clear
drop if !verbal_exp_sample
drop if !re & !fr
drop if subject_code > 11
* ...
```

What is wrong with this code?

#### Basic things to consider when doing open science

- ► Can one build an environment that allows reproducing my analysis with reasonable resources?
- ► If I am using commercially licensed Software: Is this software essential for my analysis? (think about Stata)
- Is the data that I use publicly obtainable and have I documented where to get it from?
- ▶ If the data is not publicly available: Is it essential for my analysis?
- Is the code that I use relying on some idiosyncrasies of my development environment (paths, support software)?
- ► Is my code readable?
- Have I tried to replicate my analysis in different environments?

# Setting up your development environment

#### Things that you need

- ► An operating system (ideally not commercially licensed)
- A shell
- Interpreter and/or compiler for your favorite programming languages
- ► An editor

## Things that are (very) nice to have

- An integrated development environment (IDE) containing an editor, debugger and additional build tools
- A latex environment for producing nicely formatted output
- A version control system

#### Let's start from scratch

- ► Install a linux-type OS
- ► Install R/RStudio and Python
- How does one do that if you like your old computing environment?
- Buy a new computer???
- Not really.

### An IDE Container using Docker



► Take a look at this file: https://github.com/joachim-gassen/sposm/blob/master/docker/Dockerfile

# Project Organization

#### Disclaimer

#### Some of the following is borrowed from:

Gentzkow, Matthew and Code and Jesse M. Shapiro (2014):
Data for the Social Sciences: A Practitioner's Guide,
http://web.stanford.edu/~gentzkow/research/CodeAndData.pdf
(a very good read)

### Run every project like a collaborative project

- You are always collaborating (if only with your future self)
- ▶ Make sure that the structure of your project becomes visible
- ▶ If projects become complex a README\_FIRST document can help
- ▶ Identify the important outputs of your project (a paper?, presentations?) and specify the dependencies to generate them

#### Naming conventions

There are 2 hard problems in computer science: cache invalidation, naming things, and off-by-1 errors. — Leon Bambrick

- Naming is about consistency. Find your style and stick to it
- Two main concepts: CamelCase and snake\_case ...
- ...and a special place in hell for people who use spaces in file or variable names (as it tends to break the tool chain)
- Strive to make names revealing, pronounceable and searchable
- Name functions and code files as verbs or verb phrases
- ► Taste based: datasets singular versus plural (most people say singular)

#### Automation

"Wie het gemak niet zoekt, is lui" ("Those who are not looking for convenience are lazy") — Dutch proverb

- Automate everything that can be automated
- Write and maintain a script that produces all output
- Use a directory structure that separates input from output
- Do not store output permanently

#### **Dependencies**

- Dependencies describe how outputs depend on inputs
- For example:
  - Raw data depends on running scraping routine scrape.py
  - Clean data depends on running cleanup\_data.py with the scraped data
  - The sample depends on running merge\_data.R on clean data
  - tables.tex depends on running analysis.R on sample
  - figures.eps depends on running create\_visuals.R on sample
  - The paper depends on running texi2pdf on paper\_text.tex, tables.tex and figures.eps
- ► The easiest way to maintain and document dependencies is to use GNU Make

# Makefile example (TABS are needed for indentation)

```
data.csv: scrape.py
  python scrape.py
clean data.csv: clean up data.py
  python clean up data.py
sample.RDS: clean data.csv
  Rscript merge data.R
tables.tex: sample.RDS
  Rscript analysis.R
figures.eps: sample.RDS
  Rscript create_visuals.R
paper.pdf: paper_text.tex tables.tex figures.eps
  texi2pdf paper_text.tex
paper: paper.pdf
all: paper
clean:
  rm *.csv *.RDS *.eps tables.tex *.pdf
```

The sad news...

Makefiles and project management do not do all the work for us:

```
$ make paper
make: *** No rule to make target 'paper_text.tex',
needed by 'paper.pdf'. Stop.
```