#### Professional development workshop

Research workflow: https://github.com/irudik/dyson-workflow

Ivan Rudik

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- Efficiency
- Total research production
- Enjoyability
- Mental expenditures
- Research quality
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"You need to protect yourself from previous you." -Alex Hollingsworth

Research is a marathon

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Paper	Initial Work	Submitting	R&R	Accepted	Published	Total Time (Years)	Time to Submit (Years)
Climate Inertia	Feb-2012	Jun-2014	Dec-2015	Apr-2017	Oct-2017	5.67	2.33
RPS Theory	Feb-2013	Jan-2016	Dec-2017	Feb-2018	Jun-2018	5.33	2.92
RPS Empirics	Feb-2013	Nov-2015	Jan-2017	Feb-2018	Jan-2019	5.92	2.75
Climate Damage Risk	Feb-2014	Jan-2016	Apr-2017	Aug-2019	May-2020	6.25	1.92
Gas Flaring	Dec-2015	Dec-2017	Dec-2019	Apr-2020	Jul-2020	4.59	2
Parks Air Pollution	Jan-2016	Jan-2018	Apr-2018	Jun-2018	Jul-2018	2.5	2
Lead Mortality	Jan-2018	Jul-2019	Dec-2019	Jun-2020	Aug-2021	3.58	1.5
Lead Test Scores	Jan-2018	Dec-2020					2.92
Climate Adaptation	Sep-2018						
Birds and Pollution	Jan-2019	Jun-2020	Jul-2020	Oct-2020	Dec-2020	1.92	1.42
Valuing Forecasts	Jan-2019						
Growth and Biodiversity	Apr-2020						
Geography of Regulation	Apr-2020						
Social Cost of Carbon	Sep-2020						
Climate Networks	Jun-2021						

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- 3 working papers
- 2 late stage projects
- 2 early stage projects

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- 2 late stage projects
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Good workflow is a way to manage this work and get stuff done in a sustainable and efficient way

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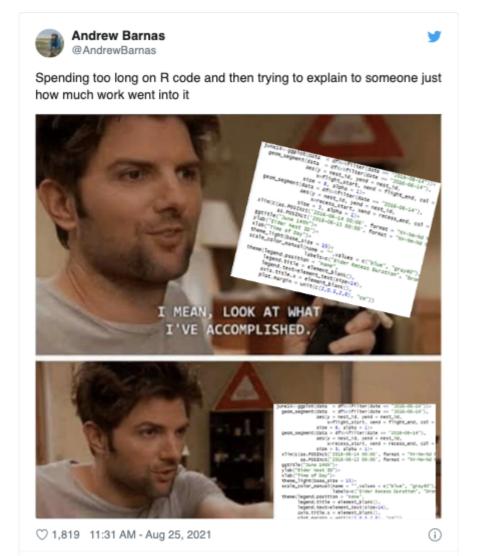
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Good sources: EconTwitter, Hidden Curriculum Podcast, Shapiro and Gentzkow notes, Grant McDermott, Alex Hollingsworth, Patrick Baylis, Stack Exchange

#### (Some) key components

- Programming
- Version control
- Code/data management and project organization
- Time management

# Programming





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What you settle on should depend on at least the following things:

• Your previous programming experience

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- The field you work in
- How much you care about co-authoring
- How much you're into open science and reproducibility

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MATLAB's package ecosystem is bad but it has first-mover advantage

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Both are open source: free, but generally things aren't quite as polished

Major tradeoffs:

R/Julia have a smaller userbase in econ, by a lot

- Every AEJ: App paper last year had Stata code
- Rudik (2020) is the second(?) AEA journal paper using Julia

But the R/Julia share of economists working on cutting-edge stuff with big data, ML, quant models is larger (e.g. Grant McDermott, Jonathan Dingel, Milena Almagro, Alex Hollingsworth, Ariel Ortiz-Bobea, me)

These network externalities matter

Trade off of your actual time vs computer time

Some large-scale problems are unsolvable with Stata/MATLAB, you might need to learn another language anyway

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There's many different method to versioning, all have different levels of fixed and variable costs you need to incur to use them

## Choose your level of control



One way to do version control is to just keep different versions of files on your local hard drive: file-03-01-2021, file-03-02-2021, file-final\_FINAL2, file-myname, file-myname-yourname

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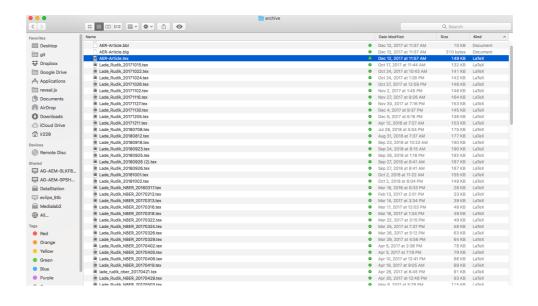
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If you pay for the fancier versions you can also rewind to previous versions up to X days agos

A third way to do this is to combine 1 and 2: use a cloud provider but then use some sort of file naming system to keep track of different versions



The problem is then you have lots of files, little understanding of changes made between versions

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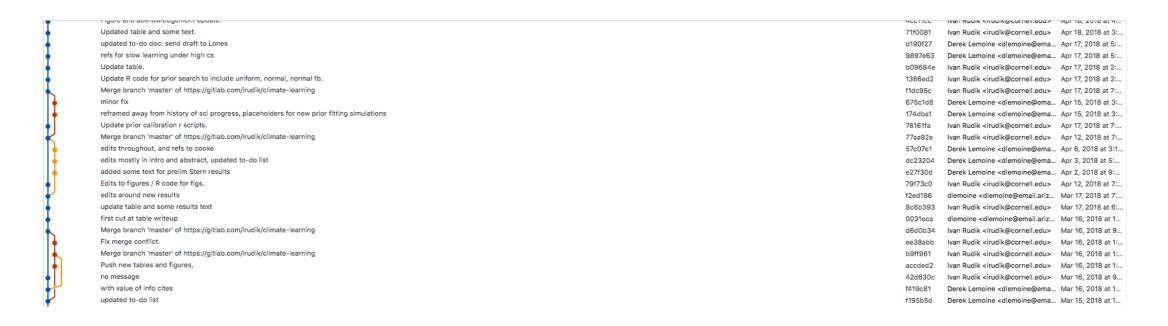
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This makes it very easy to find who made changes and when and to see exactly what changes were made

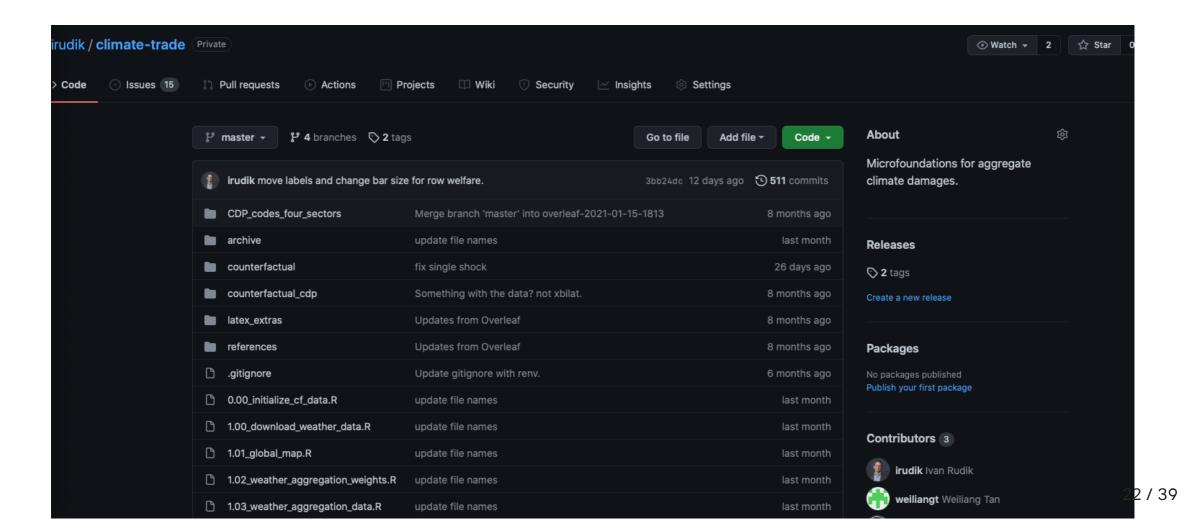
#### Versioning level 4: Git

Quick example of one of the programs (SourceTree) you can use to implement Git/GitHub workflow:



## Versioning level 4: Git

Quick example of a GitHub repo:



# Code/data management and project organization

How does data/code organization improve workflow?

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Makes life easier to use best practices like relative file paths, here::here, etc

#### One way to organize data and code

- Parent folder
  - Code folder
    - Data cleaning code
    - Analysis code
  - Data folder
    - Raw data
    - Clean data
  - Output folder
  - LaTeX folder

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When working with other people (or your future self), it's smart to order your files:

- 01.first-file-to-run
- 02.second-file-to-run
- ...
- 000.project-functions
- 000.RUN-ALL-SCRIPTS.sh

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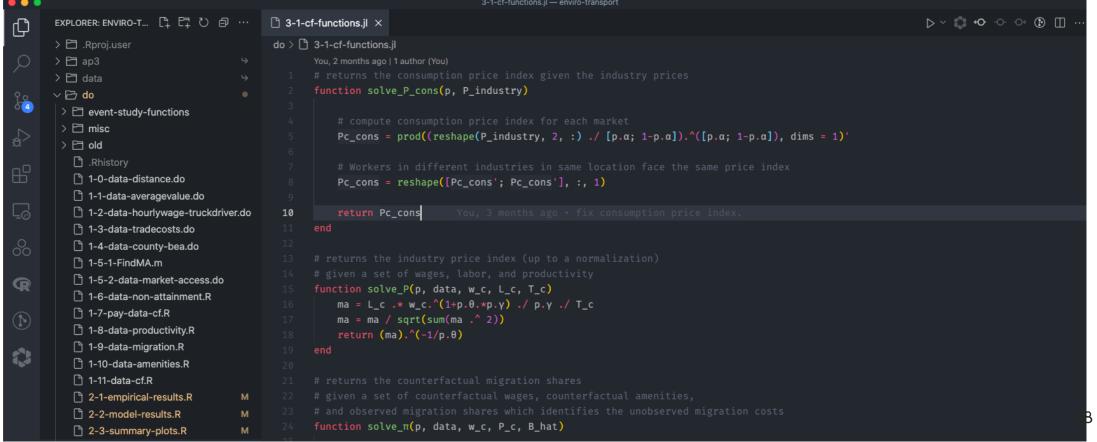
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There's a lot of options (Atom, emacs, Vim, Sublime Text) but I'll tell you about Visual Studio Code

Visual Studio Code (VSCode) is probably the most widely used development environment



How does using VSCode (or Atom/Sublime/etc) improve workflow?

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- 4. Fully integrated with Git
- 5. Lots of useful and customizable hot keys for mass editing

Organizing tasks and project communication is important for actually getting things done

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Here's a few suggestions:

- 1. GitHub Issues
- 2. Slack
- 3. Other task management providers: Asana, Wrike, etc (possibly with Slack)

If you're a Git user I recommend using GitHub Issues:

- 1. Everything's on GitHub
- 2. Commits/pull requests etc can be referenced in task-specific issues so changes are easy to find
- 3. GitHub has a Projects feature that is similar to Asana/Wrike

# Writing

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Solo projects: probably use Dropbox or Git+GitHub

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The key idea is that the framework for your code, writing, etc should all be the same and easy to implement

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Easy way to set up the initial framework:

- Create a GitHub template repo
  - https://github.com/cornell-seere/repo-template
- Create a GitHub repo for your Dropbox folder for non-versioned files
  - https://github.com/cornell-seere/dropbox-template

If you do this you can spin up a full, clean project in ~1 minute

#### Cross-project reproducibility

You're going to use the same functions a lot of the time across projects, e.g. here's my base plotting template:

```
main theme \leftarrow
theme minimal() +
theme(
  legend.position = "none",
  title = element text(size = 24),
  axis.text.x = element_text(size = 24), axis.text.y = element_text(size = 24),
  axis.title.x = element text(size = 24), axis.title.y = element text(size = 24),
  panel.grid.minor.x = element blank(), panel.grid.major.y = element blank(),
  panel.grid.minor.y = element_blank(), panel.grid.major.x = element_blank(),
  panel.background = element rect(fill = "#ffffff", colour = NA),
  plot.background = element rect(fill = "#ffffff", colour = NA),
  axis.line = element line(colour = "black")
```

# Time management and organization

"Work expands so as to fill the time available for its completion"

Parkinson's Law

DO WHAT YOU LOVE AND YOU'LL NEVER WARK A BAY TOUR LITE WORK SUPER FUCKING HARD ALL THE TIME WITH NO SEPARATION OR ANY BOUNDARIES AND ALSO TAKE EVERYTHING EXTREMELY PERSONALLY GADAMIK

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Second-order thing for me: I typically have some task in mind that I want to complete in the next 2-3 hours (e.g. get half my presentation slides done, finishing writing the code to aggregate the CPS to state-level, etc)