#### data

adam okulicz-kozaryn
adam.okulicz.kozaryn@gmail.com

this version: Tuesday 24<sup>th</sup> January, 2023 09:15

replication

data basics

merge

tips

replication

data basics

merge

tips

replication

#### replication, replication

- replication=write computer code that will do \*everything\*
- o from raw data (eg FED, IMF) to vis
- necessary for science
- otherwise we don't know what happened
- how was it calculated? is there a mistake? who knows?
- IT perspective http://journals.plos.org/plosbiology/article?id=10.1371/journal.pbio.1001745
- pol sci perspective

http://gking.harvard.edu/files/gking/files/replication.pdf

replication 4/2

## rules for everyday practice [revisit/stress later!!]

- once you have coded everything, double/triple-check it
- o leave it aside and check again
- o show it to other people, post on your website
- cross-check end output with raw data—e.g. are there the same numbers for randomly chosen data points— does it make sense?
- check with alt data? they tell the same story?
- o i always google tables/graphs of what i study
- everything has been already studied by others

• like lit rev, its data rev

replication 5/23

#### get code from others!

- the easiest way to do research in 21st century
- start with code others wrote, and build on their work
- this is the fastest, most efficient way to do research
- any research very close to yours, just email author and ask her to share code with you
- even if it sas or spss etc—you'll be able to figure it out quickly what is going on there and then implement something similar in stata
- don't reinvent the wheel: almost as if you were to start research without reading literature and had to come up with all theories and ideas on your own!

replication 6/23

replication

data basics

merge

tips

data basics 7/23

#### data basics

- dataset is a matrix
- cols are variables (var), rows are observations (obs; U/As)
- vars are characteristics of obs
- eg 'edu, 'age', and 'inc are vars and persons are obs
- o each row is a separate person
- have data clean! eg only one top row for var names
- (xls is typically mess with unusable var names)

data basics 8/23

### be super careful and clear

- define each var used in as much detail as possible
- eg instead of "income" "median household income in current dollars"
- think about limitations, shortcomings
- o eg sampling error, missing data, etc
- always try to triangulate, ie measure the concept with multiple vars

data basics 9/23

#### data types

- there are dozens of data types/formats/files
- a basic distinction:
- o software-specific binary files (.dta, .sas7bdat, .sav)
- o generic text files (.txt, .dat, .csv, .tab)
- just google it! eg 'pandas read csv', 'pandas export spss' etc

data basics 10/23

#### **APIs/databases**

- but wait, we have databases and internet
- outside of academia, in the real world
- all data are in databases
- Oracle, MySQL, NoSQL, MsSQL, or even MsAccess
- o usually can use Python to pull directly from databases
- just google it, eg "Python World Bank API"
- but first check maybe Pandas has an interface
- o see notebook sec "API"

data basics 11/23

#### **API=Application Programming Interface**

- basically an interface to get internet data
- most major websites have API
- you can connect to API and get data
- websites run on top of databases, eg google, twitter
- API is a way to access that database
- pretty much any company and organization has a database, is online, and has API

data basics 12/23

### API v web scraping

- web scrping is getting data from internet by hand
- o flexible-can do any website
- but has to write the code to extract information
- time consuming, better use API
- we'll just do API
- if you want data from website without API
- email them first! they probably have API! say research only, otherwhise need to pay
- and if that doesnt work, let me know and we'll try to scrap it

data basics 13/23

replication

data basics

merge

tips

nerge 14/23

### the power of merge

- merging is one of the most useful things you'll learn here
- great value comes from simple fact of merging data
- recall from intro: there's a ton data of (and growing!)
- but these data are mostly useless unless in one file!
- somehow orgs (and researchers) in this persistent habit of having data chopped up in tiny multiple files
- hungry for knowledge want to use the data— this is where you come in! make \$ just merging!
- o (and then fun: vis/graphs in 2wk, but merge first!)

merge 15/23

### easy to merge; difficult to do it right

- it depends on what kind of data (and luck) you have
- the challenge is to check what happened after the merge
- almost always it merges with issues
- thats where the work begins
- always investigate carefully non-merges
- make sure that \*ALL\* nonmerges are as expected
- even matches can be wrong
- o use a lot of des sta to investigate
- o always be skeptical, ask yourself whether it makes sense

merge 16/23

#### after merge

- typically some obs did not merge due to diff coding
- say "Poland≠ "Republic of Poland"
- "CAMDEN" ≠" Camden" etc
- then go back and fix it before merge:
- replace ctry="Poland" if ctry=="Republic of Poland"
- in many cases it wasn't supposed to merge
- o eg data A: 1995-2000, but B: 1990-1998
- have to be 100% sure that nonmerges are correct!

merge 17/23

#### merging investigation

- very useful!!:
- investigate, eg tabulate time and geography
- say year and state
- may also want to list part of datafile
- o especially if it is small
- can also sort on key vars
- it does take time to find out what happened

merge 18/23

### be clear about merging

- want to be clear about nonmerges in paper!
- say how many nonmerges and what you did about it

o eg dropped, fixed, etc

merge 19/23

#### what to merge on?

- geography! usually have some!
- and can always aggregate up! say have city and state, so can merge m:1 on state
- time! say with weather-usually weather matters!
- occupation! there are occ codes eg https:

//www.onetonline.org/find/descriptor/result/4.A.2.b.2

merge 20/23

replication

data basics

merge

tips

tips 21/23

#### datasets of the day

- climate/weather, down to county (easy access!)
- o https://wonder.cdc.gov/EnvironmentalClimateData.html
- religion!
- O http://www.thearda.com/Archive/Files/Descriptions/RCMSCY10.asp
- O http://www.thearda.com/Archive/Files/Descriptions/CMS90CNT.asp
- state level policy https://www.statepolicyindex.com/data/

tips 22/23

#### make lots of comments in your code

- make comments in notebook in code cells, important!
- explain to yourself what command does, what to look for, etc
- and use plenty of text cells
- if you do not make comments, you will forget...
- use very handy keywords like "TODO", "KLUDGE", "BUG", "LATER", "FIXME"
- then can ctrl-f for them :)

tips 23/23