# combining (and reshaping) data 

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## outline

intuition

merge
[*] fancy merging (skip, you may do it at home for extra credit)

append, reshape, xpose

[*] joinby (skip)

## let's pull up your code

- let's start by discussing your code


## outline

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## append, reshape, xpose



## merge, append, reshape, xpose, joinby

- merge is most important
- perhaps the most important command for dat man
- reshape is useful and difficult
- append, xpose, joinby are rare


## merge v append

- draw a picture
- and https://www.stata.com/manuals/u22.pdf
- also https://www.ssc.wisc.edu/sscc/pubs/sfr-combine.htm


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## 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 is a ton data of (and growing!)
- but these data are useless unless in one file!
- somehow organizations are in this persistent habit of having their data chopped up in tiny multiple files
- they are hungry for knowledge and want to make use of the data
- this is where you come in! can make \$ by just merging!


## 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
- sometimes it all merges smoothly without any issues
- but almost always it doesn't
- and then the work begins
- always investigate carefully non-merges
- make sure that *ALL* nonmerges are as expected
- even matches can be wrong
- use a lot of des sta to investigate
- always be skeptical, ask yourself whether it makes sense


## after merge

- typically some obs did not merge due to diff coding
- say "Poland $\neq$ "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 was not supposed to merge, say
o there was country in $A$, but not in $B$
o data in A was for 1995-2000, in B 1990-1998
o etc
- but you have to be $100 \%$ sure that nonmerges were correct to happen!


## to be honest

- to confess, what I sometimes do:
- I simply make a note to myself that I do not care now $\circ$ and I will investigate it later, that is
- I just put in there a '*LATER:' comment
- but I only do that if problem is small say around $5 \%$ of obs


## dirty data

$\diamond$ the other challenge is to deal with dirty data $\diamond$ most data are dirty:

- weird chars, mistakes, inconsistent names/codes, missing vals
- weird chars: $\%, \$, \#$, etc or non-english letters
- mistakes: should be 9 , but it is 5 , etc
- inconsistent names/codes: 'Camden' $=$ 'CAMDEN'


## merge

combines variables (same obs)
let's generate some data first

## use gss.dta, clear

gen id=_n
keep id region
save gss1.dta, replace (using) has region
use gss.dta, clear
gen id=_n
keep id inc (master) has inc
merge 1:1 id using gss1.dta (combine with (using)

## merge contn'd

after merging always think about output:

## tab _merge

variable _merge takes on 3 values:
3 obs in both datasets
1 obs in master only
2 obs in using only

## dofile

## merging investigation

- from my experience, I have found particularly useful:
- tab _merge with time and geography
- say year and state
- may also want to list or edit part of datafile o especially if it is small
- can also sort on _merge and other key vars
- it does take time to find out what happened


## merge 1:m

- often you merge 1:m
- very useful command indeed
- but people often make a mistake of specifying merge m:m
- and I have never seen, cannot even think of situation when this would be applicable


## sometimes need to collpase!

- sometimes may have many (non-unique) obs in one dataset
- and so the same in the other dataset
- say multiple animal abuses per zip in one
- and multiple shelters per zip in the other one
- cannot merge it!! need to collapse less important one
- say you're primarly interested in abuse, then collapse shelters
- say count them by zip
- and merge that $1: m$ with multiple abuses by zip


## be clear about merging

- want to be clear about nonmergers in paper!
- say how many nonmerges and waht you did about it o eg dropped, fixed, etc


## merging multiple files

- can merge at once
- merge $1: 1$ id using A B C D
o avoid at once, too messy
- better in some steps, eg $A+B, C+D, A B+C D$
o or perhaps best $A+B, A B+C, A B C+D$, etc
- perhaps best first do easy and clean merges


## 1:1 merge on 2 vars

- ofen need to merge 1:1 on 2 vars
- when 2 vars uniqely define obs
o eg country-year, state-county
- merge 1:1 countryID year using $B$


## what to merge on?

- geography! usually have some!
- 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


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## merging non-matching ids

- http://stats.stackexchange.com/questions/32830/
suggestions-on-how-to-merge-multiple-datasets-with-an-imperfect-i
(1) The Catcher and the Rye, $7 / 16 / 51$
(2) The Catcher \& the Rye, $7 / 16 / 51$
(3) Catcher and the Rye, 1951
(4) The Catcher and the Rye (1951), [missin


## merging non-matching ids

- ssc install strgroup
ouses Levenshtein distances to do string matching - reclink
- probabilistic matching scheme
- http://github.com/OpenRefine


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## Append

$\diamond$ Combines Observations (Same Var)
$\diamond$ Let's generate some data first

## use gss.dta, clear

keep in $1 / 50$
save gss1.dta, replace (using)
use gss.dta, clear
keep in 51/100 (master)
append using gss1.dta (combine with (using)
dofile
append is easy in practice as compared to merge

## we are about to look at reshape

- reshape is a very peculiar command
- incredibly powerful, and difficult to understand
- i thought i have mastered stata
- but whenever i reshape, i always scratch my head
- yet reshape is the only way out in many situations
- we will try to use it often


## xpose, reshape

xpose interchanges Vars and Obs
reshape converts wide-to-long/long-to-wide
help reshape (very useful diagram-i always use it!)
reshape long var, i(id) j(year)
var is a common part of var that repeats, i.e. prefix, id is always unique (eg made by gen id=_n )
year is a new variable that takes unique part from variable that repeats, i.e. suffix

## reshape example

## use gss.dta, clear

## ren inc inc1

gen inc2=2*inc1
gen id=_n
reshape long inc, i(id) j(period)
edit
dofile
and lets go over output of reshape-it tells you how it changed!

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[*] joinby (skip)

## joinby

- https://www.stata.com/manuals/u22.pdf
- https://www.stata.com/manuals14/djoinby.pdf
- https://stats.idre.ucla.edu/stata/faq/
how-can-i-create-all-pairs-within-groups

