Welcome!

- Download the slide for today's lab from
 Canvas → CP6025 → Modules → Week 2 Research Design →
 Lab2.zip
- Unzip Lab2.zip → Week2_Lab_DataCleaning.pdf
- When you are done with today's lab activity, save your script and keep it for future references

Quick Recap from Lab 1

Data type and data structure in R

- Data type is the type of a single entry (e.g., 1 is an integer)
- Data structure is how data is organized (c(1,2) is a vector)
- Helps you read the help document and figure out what data type to put in.
- Implies what operations you can do (e.g., you can only add up numbers, such as 1+1, but not strings, such as "1" + "1" or "1" + 1).
- Different data type and structures are useful for different types of data storage / operation

Quick Recap from Lab 1

Data Type

- Number (as.numeric() or as.integer()), e.g., 1.1, 2, 3, 4
- Character (as.character()), e.g., "one", "two", "1", "2", "3"
- Factor, e.g., "one", "two" but "one" < "two", ordinal data
- Logical, e.g., TRUE, FALSE

Data Structure

- Vector, e.g., c(1,2,3,4) or c("one", "two", 1, 2)
- Matrix, e.g., matrix(1:4, ncol=2, nrow=2)
- List, e.g., list(a=1,b=2) or list(1,2)
- Data Frame (or table) (will review in this lab)

[,1] [,2]

[1,] 1 3

[2,] 2 4

\$a [[1]]

[1] 1 [1] 1

\$b [[2]]

[1] 2 [1] 2

Credit: Xiaofan Liang

Adv. Planning Methods

Lab 2: Data Cleaning & Descriptive Statistics

Welcome!

- 1 Lab = 1 document (R markdown or html) + 1 slide
- Document contains the complete material prepared for the lab, mostly by Bonwoo Koo.
- Slide explains parts of the document that I think are important or can be confusing.
- I will go over the slide first. Then, you will have time to read and replicate the document. Once you are done with the document, you can leave!
- Google Doc Queue for Q & A during hands-on
- 3:00-3:30pm is chill time I will sit outside, come chat

Goals for today

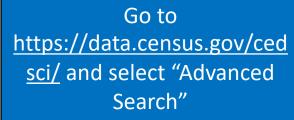
- Download census data
- Working directory
- Reading and examining data in R
- Calculating the descriptive statistics
- Data cleaning with base R
- Data cleaning with tidyverse
- Commenting on script

- We want to download a table called "Ratio of Income to Poverty Level in the Past 12 Months (TableID: C17002)"
- from ACS (American Community Survey, updated every year),
- for all census tracts (a geographic units)
- in the Georgia state.
- This data is already downloaded for you as ACSDT5Y2017.C17002-Data.csv in Lab2 folder. The following process shows where the data come from.



Explore Census Data

The Census Bureau is the leading source of quality data about the nation's people and economy.







Tables

Check out our new table display which allows you to dynamically add geographies, topics, or any applicable filters. You can reorder, pin, and hide columns all with simple drag and drop functionality. Tab through different tables to make sure you found the right one, customize it, and then download multiple vintages of it quickly. If you don't see a functionality you need, find a bug, or have a comment, drop us a line at cedsci.feedback@census.gov.

VIEW TABLES

Send Feedback
cedsci.feedback@census.gov

Census

Q Search

// Search / Advanced Search

Advanced Search

Table ID (e.g., DP05)

Narrow search with filters

FIND A FILTER

e.g. 336111 - Automobile Manufacturing



The selection will add this icon next to **Selected Filters:** to indicate that the filter is successfully placed.

Selected Filters:



Selecting Topics

Sequentially select from the menu

in the order of:

- 1. Topics
- 2. Income and Poverty
- Income and Poverty (check box).

CLEAR

SEARCH



Q

Census Bureau

Q Search

// Search / Advanced Search

Advanced Search

Table ID (e.g., DP05)

Narrow search with filters

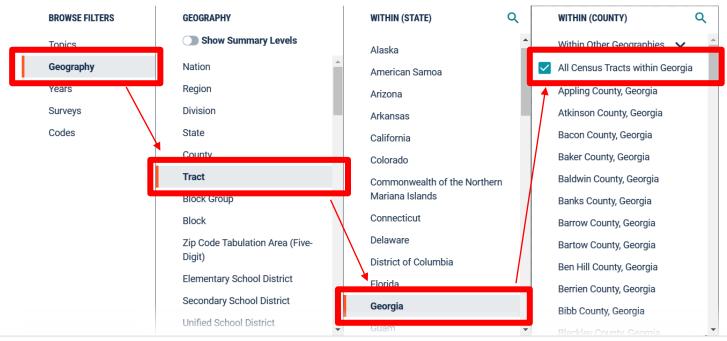
FIND A FILTER

e.g. 336111 - Automobile Manufacturing

Selecting Geography

Then, select the following items in the order of:

- 1. Geography
- 2. Tract
- 3. Georgia
- 4. All Census Tracts within Georgia



Selected Filters:



All Census Tracts within Georgia



Another filter is added



SEARCH





Q Search

// Search / Advanced Search

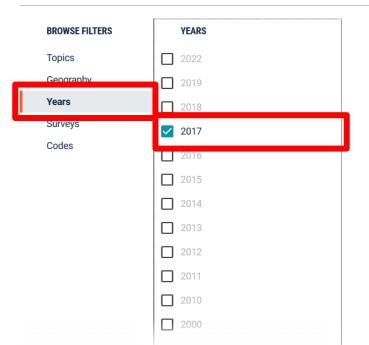
Advanced Search

Table ID (e.g., DP05)

Narrow search with filters

FIND A FILTER

e.g. 336111 - Automobile Manufacturing



Selecting Years

Then, specify what year you want by selecting

- 1. Years
- 2. 2017

Yet another filter is added









CLEAR

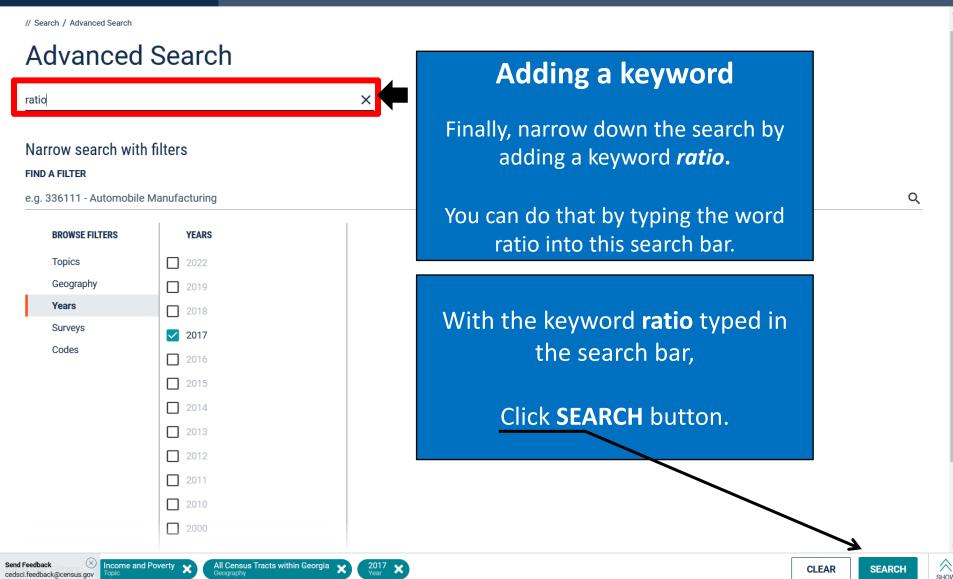
SEARCH

Q





Q Search





Q Search

ALL TABLES

MAPS

PAGES

About 22,340 results | Filter

Tables

RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS

Survey/Program: American Community Survey

Years: 2017 Table: C17002

AGE BY RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS

Survey/Program: American Community Survey

Years: 2017 Table: B17024

RATIO OF INCOME TO POVERTY LEVEL OF FAMILIES IN THE PAST 12 MONTHS

Survey/Program: American Community Survey

Years: 2017 Table: B17026

MORTGAGE STATUS BY RATIO OF VALUE TO HOUSEHOLD INCOME IN THE PAST 12 MONTHS

Survey/Program: American Community Survey

Years: 2017 Table: B25100

RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS BY DISABILITY STATUS

Survey/Program: American Community Survey

Years: 2017 Table: C18131

HEALTH INSURANCE COVERAGE STATUS BY RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS BY AGE

Survey/Program: American Community Survey

Years: 2017 Table: C27016

PRIVATE HEALTH INSURANCE BY RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS BY AGE

Survey/Program: American Community Survey

Years: 2017 Table: C27017

Send Feedback
cedsci.feedback@census.gov

I INSURANCE BY RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS BY AGE

Selecting a table

This is the data table we are looking for. Click it.

Census Bureau

Q Search

ALL TABLES MAPS PAGES

14 Results Filter | Download

RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS

Survey/Program: American Community Survey Product: 2017: ACS 5-Year Estimates Detailed Tables

TableID: C17002 Universe: Population for whom poverty status is determined

CUSTOMIZE TABLE

RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS

Survey/Program: American Community Survey

Years: 2017 Table: C17002

AGE BY RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS

Survey/Program: American Community Survey

Years: 2017 Table: B17024

RATIO OF INCOME TO POVERTY LEVEL OF FAMILIES IN THE PAST 12 MONTHS

Survey/Program: American Community Survey

Years: 2017 Table: B17026

MORTGAGE STATUS BY RATIO OF VALUE TO HOUSEHOLD INCOME IN THE PAST 12 MONTHS

Survey/Program: American Community Survey

Years: 2017 Table: B25100

RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS BY DISABILITY STATUS

Survey/Program: American Community Survey

Years: 2017 Table: C18131

Send Feedback

cedsci.feedback@census.gov

COVERAGE STATUS

Sorry, that table is too large to display.

DOWNLOAD TABLE

Verifying & downloading

Double-check that the following information are correctly listed in the top panel and click

DOWNLOAD TABLE:

- Name of the table
- Table ID
- Survey/Program
- Product
- Pay extra attention and make sure it is ACS 5-Year Estimates



Q Search



MORTGAGE STATUS BY RATIO OF VALUE TO HOUSEHOLD INCOME IN THE PAST 12

Survey/Program: American Community Survey

Years: 2017 Table: B25100

MONTHS

RATIO OF INCOME TO POVERTY LEVEL IN THE PAST 12 MONTHS BY DISABILITY STATUS

Survey/Program: American Community Survey

Years: 2017 Table: C18131

Send Feedback cedsci.feedback@census.gov COVERAGE STATUS

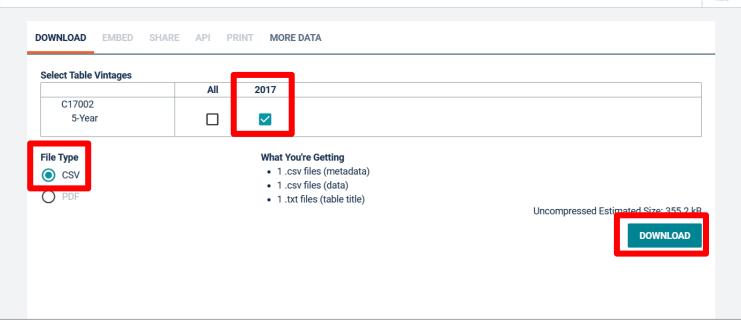


Verifying & downloading

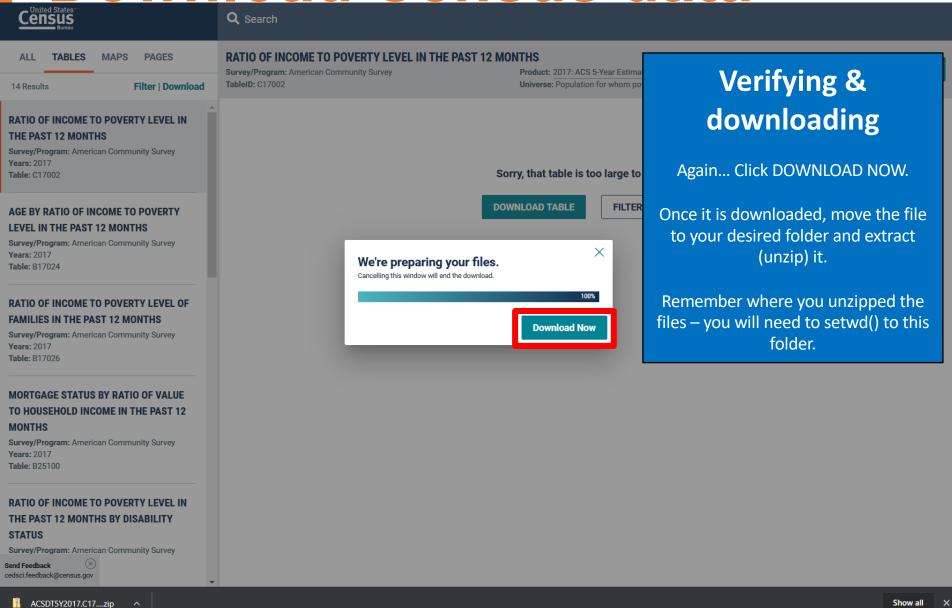
Make sure that 2017 is selected and that File Type is CSV.

Finally, Click DOWNLOAD.

Download / Print / Share



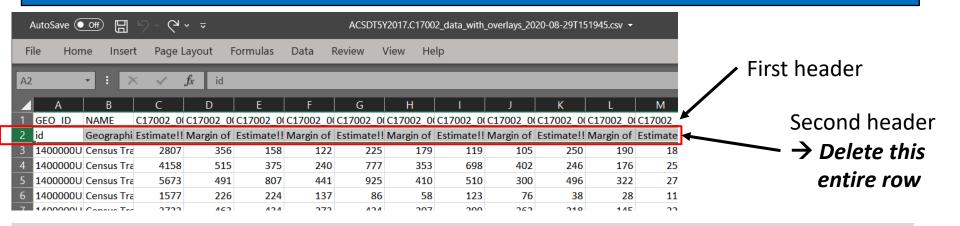
TABLE



Deleting the second header

Open the file named *ACSDT5Y2017.C17002_data_with_overlays_2020-08-29T151945.csv*. The exact name may be slightly different due to the date component in the file name. There will be two different headers (i.e., variable names).

Delete the entire second row so that there will be only one row of header remaining. Then, save and close Excel.



Why are we deleting one of the headers?

The Census Bureau (and sometime other entities too) often provides their data with two rows of header.

The first type of the header is more code-like, not human-readable (e.g., `C17002_001E`), and the second type is often more intuitive to human (e.g., `Margin of Error!!Total!!Under .50`).

R users **usually prefer the first type**. It is because (1) the second type of header often contain spaces and special characters which can cause errors and other difficulties, (2) the second type can be very lengthy (and you will have to type them), and (3) when you join the data with ArcGIS, the long variable names are automatically coerced into shorter but somewhat confusing names.

Download via Census API in R

- API (Application Programming Interface) is like a chat bot for the database: you tell the API what you want in a specific way, and the API will automatically return you the data.
- No more click and find! But usually requires an API Key.
- Package tidycensus helps you with Census API in R, e.g.,

We want a 2017 table called "Ratio of Income to Poverty Level in the Past 12 Months (TableID: C17002)" from ACS (American Community Survey, updated every year), for all census tracts (a geographic units) in the Georgia state.



Table <- get_acs(year = 2017, table = "C17002", geography = "tract", state = "GA")

Tidycensus documentation: https://walker-data.com/tidycensus/articles/basic-usage.html

- We will read in a data file into R for the lab activities to examine Ratio of Income to Poverty Level in the Past 12 Months for all census tracts in Georgia state.
- This file is located in:

Canvas → CP6025 → Modules → Lab2 → ACSDT5Y2017.C17002-Data.csv

Keep the Lab2 folder open - we will need it soon.

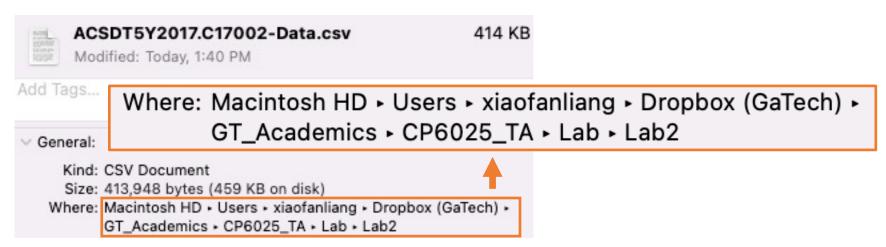
- When you open R-studio, your R session is <u>in</u> one of the folders in your computer (usually the Documents folder).
- The following function returns the folder your R session is currently in.

getwd()

- Is R in the folder where you saved the ACSDT5Y2017.C17002-Data.csv data file?
- Type read.csv('ACSDT5Y2017.C17002-Data.csv") in your R script window, what does the error say?

- R cannot find <u>ACSDT5Y2017.C17002-Data.csv</u> file because R is in a different folder.
- You need to tell R to navigate to the folder you save the CSV file using setwd()
- Setting directory/path is like pointing directions for R: a path (e.g., C:/Users/xiaofanliang/Dropbox (GaTech)/) tells R to first go to C drive, go to Users folder, then xiaofanliang folder, then Dropbox (GaTech) folder.

- How do I find the path to a file?
 - Mac: Right click on the file -> get info (No need to include Macintosh HD in the path).
 - Window: Right click on the file -> Properties (or Copy as Path) or double click on folder directory. Change \ to / in the path.



/Users/xiaofanliang/Dropbox (GaTech)/GT_Academics/CP6025_TA/Lab/Lab2

 The folder that your R session is currently in is called

Working Directory

getwd()

setwd()

"show me the current working directory"

"Change the working directory to a different folder"

Working Environment

- R searches for files and saves outputs in the working directory.
- Let's change your working directory to a folder where you saved the data for today's lab.
- Write the following in your script window and run (hit control + enter):

setwd("path-to-your-folder")

e.g., setwd("C:/Users/bkoo34/Dropbox (GaTech)/CP6025")

To verify that you are in the folder where our data is located:

dir()

Do you see the CSV you saved (i.e., ACSDT5Y2017.C17002-Data.csv)?

Reading data in R

- We are now in the right folder. R can now read the data.
- Before using R, let's first take a look at the data in Excel. Double click "ACSDT5Y2017.C17002-Data.csv" to open it in Excel.

A	В	С	D	E	F
GEO_ID	NAME	C17002_001E	C17002_001EA	C17002_001M	C17002_001MA
1400000US13001950100	Census Tract 9501, Appling County, Georgia	2807	null	356	null
1400000US13001950200	Census Tract 9502, Appling County, Georgia	4158	null	515	null
1400000US13001950300	Census Tract 9503, Appling County, Georgia	5673	null	491	null
1400000US13001950400	Census Tract 9504, Appling County, Georgia	1577	null	226	null
1400000US13001950500	Census Tract 9505, Appling County, Georgia	3722	null	463	null
1400000US13003960100	Census Tract 9601, Atkinson County, Georgia	2106	null	255	null
1400000US13003960200	Census Tract 9602, Atkinson County, Georgia	4698	null	281	null
1400000US13003960300	Census Tract 9603, Atkinson County, Georgia	1460	null	212	null

- Each row is one Census tract (similar to a neighborhood)
- Each column is one variable. C17002 is the table. 001 is variable #1 (total population) in the table. E represents estimate, EA is estimate annotation, M is margin of error, and MA is margin of error annotation.
- For example, this cell shows that "the first neighborhood has a total population estimate of 2807"

Reading data in R

 In R script window, write the following and run it (control + enter)

pov.data <- read.csv("ACSDT5Y2017.C17002-Data.csv")

and then,

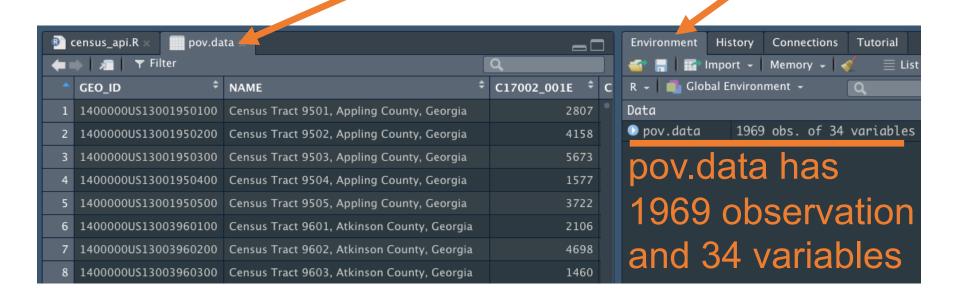
head(pov.data)

Notice that this is a relative path, relative to the path that you set in the setwd(). Alternatively, without using the setwd(), you can do read.csv("Users/xiaofanliang/Dropbox (GaTech)/GT_Academics/Lab/Lab2/ACSDT5Y2017.C 17002-Data.csv")

head() shows the first six rows of the data.
Useful when you want to take a quick glance of your data

Examining data in R

After read.csv, pov.data shows up in R environment.
 Click on pov.data, an Excel-like table pops up



Calculating the descriptive statistics

 Today, we are interested in the mean value of total population, which is the variable named 'C17002_001E' in pov.data.

 We need to extract only the needed variable from the data.frame

\$ operator

pov.data

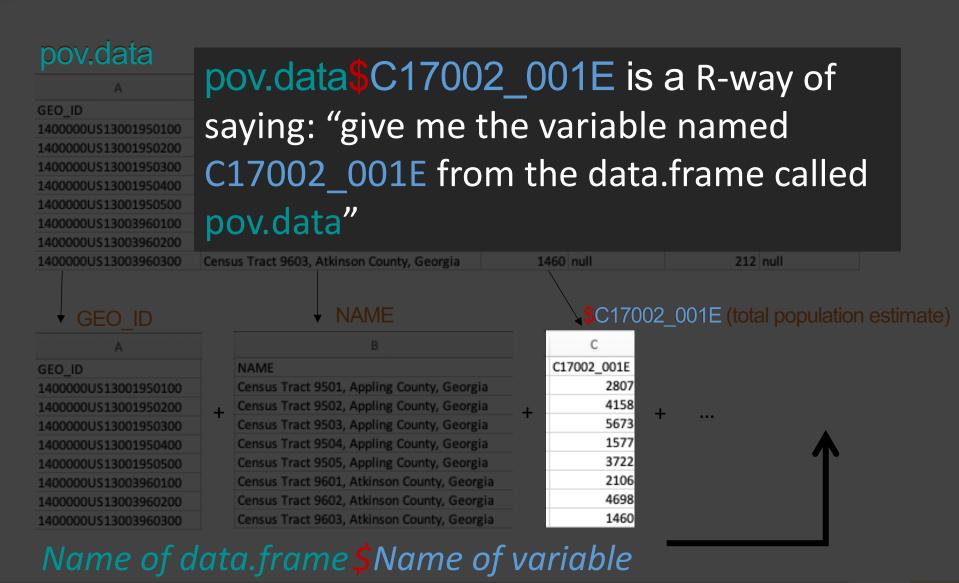
A		В	C		D	E	F
GEO_ID	NAM	E	C17002_0	01E	C17002_001EA	C17002_001M	C17002_001MA
1400000US13001950100	Censu	us Tract 9501, Appling County, Georgia	2	807	null	356	null
1400000US13001950200	Censu	us Tract 9502, Appling County, Georgia	4	158	null	515	null
1400000US13001950300	Censu	us Tract 9503, Appling County, Georgia		673	null	491	null
1400000US13001950400	Censu	us Tract 9504, Appling County, Georgia	1	577	null	226	null
1400000US13001950500	Censu	us Tract 9505, Appling County, Georgia	3	3722	null	463	null
1400000US13003960100	Censu	us Tract 9601, Atkinson County, Georgia	2	106	null	255	null
1400000US13003960200	Censu	us Tract 9602, Atkinson County, Georgia	4	698	null	281	null
1400000US13003960300	Censu	us Tract 9603, Atkinson County, Georgia	1	460	null	212	null
050 15		NIANAE			C17000	0015 (404	
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А				C17		2_001E (tota	al populatio
A GEO_ID		В	rgia	C1	С	2_001E (tota	al populatio
		NAME	rain	C17	C 7002_001E	_ `	al populatio
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A GEO_ID 1400000US13001950100 1400000US13001950200	+	NAME Census Tract 9501, Appling County, Geo Census Tract 9502, Appling County, Geo	rgia + rgia	C1	C 7002_001E 2807 4158	_ `	al populatio
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A EO_ID 100000US13001950100 100000US13001950200 100000US13001950400 100000US13001950500	+	NAME Census Tract 9501, Appling County, Geo Census Tract 9502, Appling County, Geo Census Tract 9503, Appling County, Geo Census Tract 9504, Appling County, Geo Census Tract 9505, Appling County, Geo	rgia + rgia rgia rgia orgia	C17	C 7002_001E 2807 4158 5673 1577 3722	_ `	al populatio

1460

Census Tract 9603, Atkinson County, Georgia

1400000US13003960300

\$ operator



Descriptive Stats in R

- mean(pov.data\$C17002_001E)
- median(pov.data\$C17002_001E)
- min(pov.data\$C17002_001E)
- max(pov.data\$C17002_001E)

What is the data type of pov.data\$C17002_001E?

Will the function still work if the column has NAs?

Tips: mean(pov.data\$C17002_001E, na.rm=T)

Data Cleaning with Base R

- In a real project or a study, data NEVER come in a neatly cleaned form.
- More than 50~60% of my time as a researcher is put into cleaning data.
- All the statistical knowledge does not mean much if you don't know how to clean your data.

Common Operations in Data Cleaning

- 1. Subsetting row/column
 - Index by position
 - Index by condition
 - Index by name
- 2. Changing variable names
- 3. Create new variables based on existing ones (see lab)

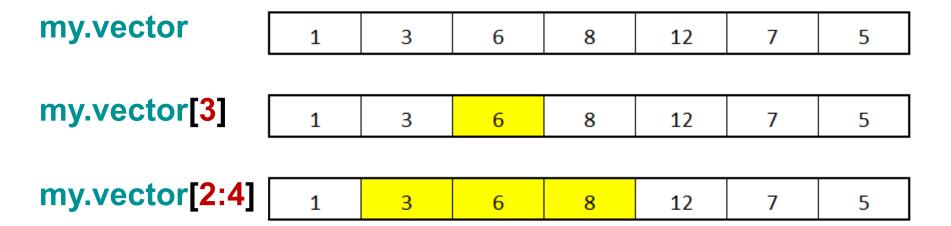
Common Operations

- Square brackets [] after a vector or data.frame mean you want to subset it or access some parts of it.
- If it is a vector (i.e., 1-dimensional), you need one index

vector[index]

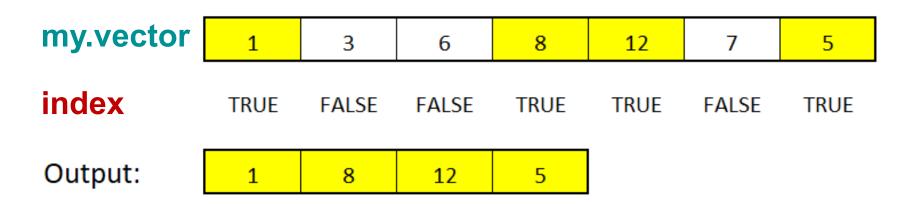
Subsetting

my.vector <- c(1,3,6,8,12,7,5)



Subsetting

my.vector[c(TRUE, FALSE, FALSE, TRUE, TRUE, FALSE, TRUE)]



Only those elements in my.vector that are at the same position as TRUE in the index can go through.

A vector of TRUEs and FALSEs are very useful because ..

>, < , <=, =>, ==, and %in% are questions.

R answers with TRUEs and FALSEs

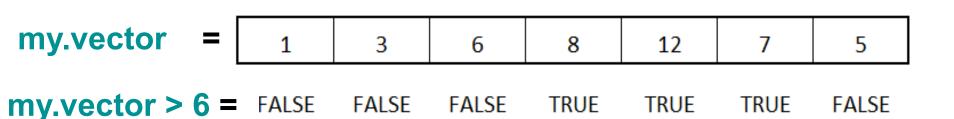
E.g., my.vector > 6 is the same as asking, "are elements in my.vector larger than 6?"

A vector of TRUEs and FALSEs are very useful because ..

>, < , <=, =>, ==, and %in% are questions.

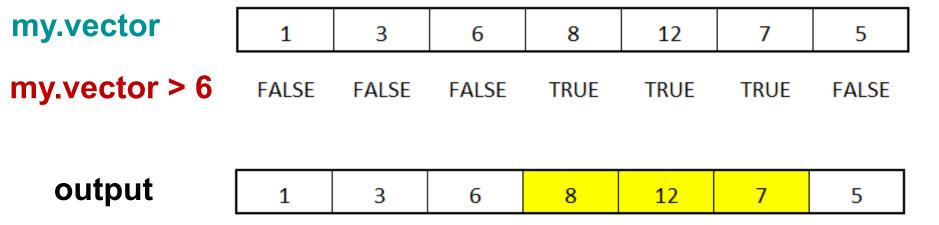
R answers with TRUEs and FALSEs

E.g., my.vector > 6 is the same as asking, "are elements in my.vector larger than 6?"



Only those elements in my.vector that are at the same position as TRUE can go through.

my.vector[my.vector > 6]



If it is a data.frame, you need two indices.

data.frame[index for rows, index for columns]

m	y	d	f	,]

	a	b	Avengers
Row 1	а	1	Peter
Row 2	b	2	Natasha
Row 3	С	3	Hulk
Row 4	d	4	Thor

my.df[2:3, 1]

	a	b	Avengers
Row 1	а	1	Peter
Row 2	b	2	Natasha
Row 3	С	3	Hulk
Row 4	d	4	Thor

my.df[, "Avengers"]

	a	b	Avengers
Row 1	а	1	Peter
Row 2	b	2	Natasha
Row 3	С	3	Hulk
Row 4	d	4	Thor

my.df[c(TRUE, FALSE, TRUE, FALSE) ,]

	a	b	Avengers
Row 1	а	1	Peter
Row 2	b	2	Natasha
Row 3	С	3	Hulk
Row 4	d	4	Thor

Credit: Bonwoo Koo

Subsetting + Filtering

 Subset dataframe so that it only returns rows when column b <= 2.

data.frame[index for rows, index for columns]

mydf[mydf\$b <= 2,]

	a	b	Avengers
Row 1	а	1	Peter
Row 2	b	2	Natasha

Returns a vector of c(TRUE, FALSE ...)

Returns rows where row indices are TRUE

Change column names

 colnames() allows you to access column names of a matrix or a data.frame

colnames(my.df)

а	b	Avengers

colnames(my.df)[2]

а	b	Avengers
а	1	Peter
		Thor

colnames(my.df)[2] <- "Defenders"



Inserting a new name, "Defenders", to the 2nd position of my.df's variable names

Data cleaning with Tidyverse

- tidyverse is a series of packages that agree to use %>% (pipe syntax) to do data wrangling and cleaning.
- install.packages("tidyverse") and Library("tidyverse") will install and load all affiliated packages
- tidyverse packages have other names for base R functions that are more intuitive (e.g., filter).
- What is %>% (pipe syntax)?

filter(mydf, b<=2) is equivalent of mydf %>% filter(b<=2)

%>% assumes the first input in the function is in front of the %>%

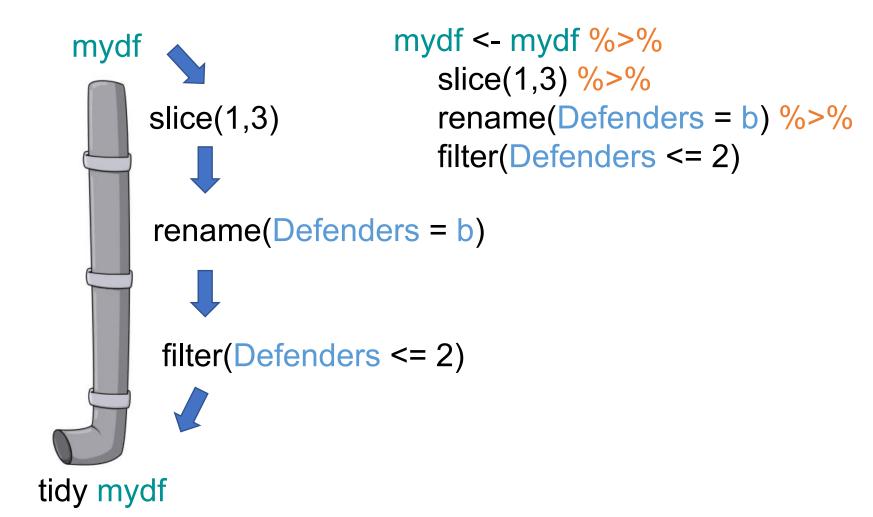
Data cleaning with Tidyverse

Why do people use Tidyverse or %>% (pipe syntax)?

	Base R	Tidyverse
Subset 1st and 3rd row rows	mydf[c(1,3),]	mydf %>% slice(1,3)
Rename columns	colnames(mydf)[2] <- "Defenders"	mydf %>% rename(Defenders = b)
Subset and filter by condition	mydf[mydf\$b <= 2,]	mydf %>% filter(Defenders <= 2)
All at once	<pre>mydf <- mydf[c(1,3),] mydf <- mydf[mydf\$b <= 2,] colnames(mydf)[2] <- "Defenders"</pre>	mydf <- mydf %>% slice(1,3) %>% rename(Defenders = b) %>% filter(Defenders <= 2)

Tips: you don't have to remember all the syntax at once!! Go to R cheatsheet: https://www.rstudio.com/resources/cheatsheets/ (e.g., Base R, Advanced R, Data Transformation with dplyr and tidyr (both are included in Tidyverse))

Data cleaning with Tidyverse



Commenting on script

- # is used for documentation.
- # makes anything written after it invisible to R.
- R will not run anything that is written after #.

```
#############################
   ### Date: Aug 21, 2019
   ### Title: CP6025 Lab 2 material ###
    ### Author: Bonwoo Koo
    # This code is prepared as an example of
   # commenting on your R script.
   # Load required libraries
   library(swirl)
   library(sf)
   library(tidyverse)
14
   # Set the working directory
   setwd("C:/Users/Bonwoo Koo/Dropbox/School/CP6025/Labs/Lab2")
17
18
   # Check what is in the new working directory
19
20
   # Read the data file into R
   testdata <- read.csv("testdata.csv")
23
   # Examine the data
   head(testdata)
26
   str(testdata)
27
28 # Print descriptive statistics to check the distribution
29 # and whether there are any missing values
   summary(testdata)
```

Submit assignment R code

 When you save your script, it will create a file with .R extension.

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- In the assignments, you will be asked to submit your code. Submit this .R file.
- In the assignments, you will also be asked to submit plots (export or screenshot) in the future. Don't submit .R file instead.

Start working!

Download Modules/Week 2/Lab2.zip → unzip Lab2.zip → open lab2.html

Start reading through the document and try to replicate each step in your R-Studio

You don't need to submit your replication. The lab familiarizes you with basic functions for assignment 1.

Let me know if you have questions