

ETC1010: Introduction to Data Analysis

Week 2, part A

Week of Tidy Data

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16th Mar 2020

What is this song?

(Discuss with your neighbour)

Quick Talk about COVID-19

(Borrowed from Dr. Andrew Heiss)

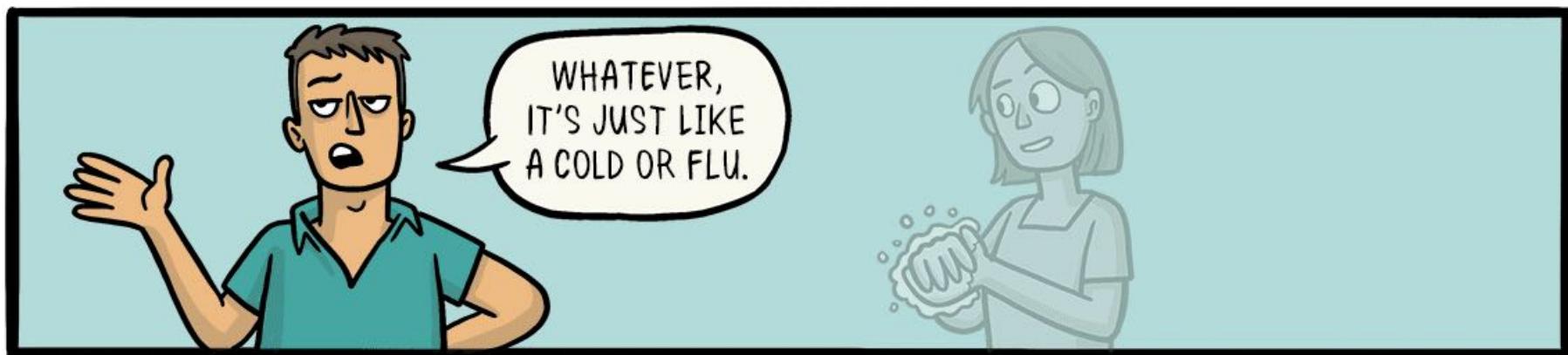
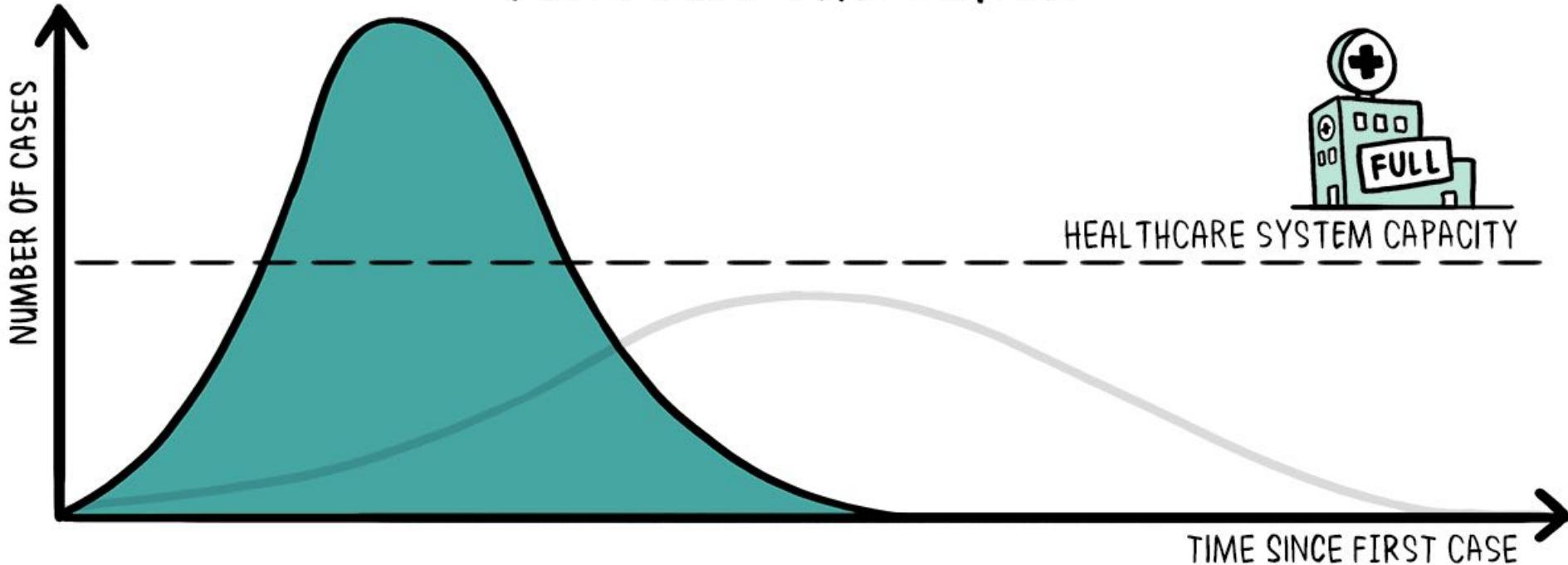
What is all this

- New virus in the coronavirus family
- Officially named "SARS-CoV-2"
- Causes Respiratory disease named COVID-19
- Do not call it "Chinese Coronavirus" or "Kung Flu" or other xenophobic names!

Symptoms

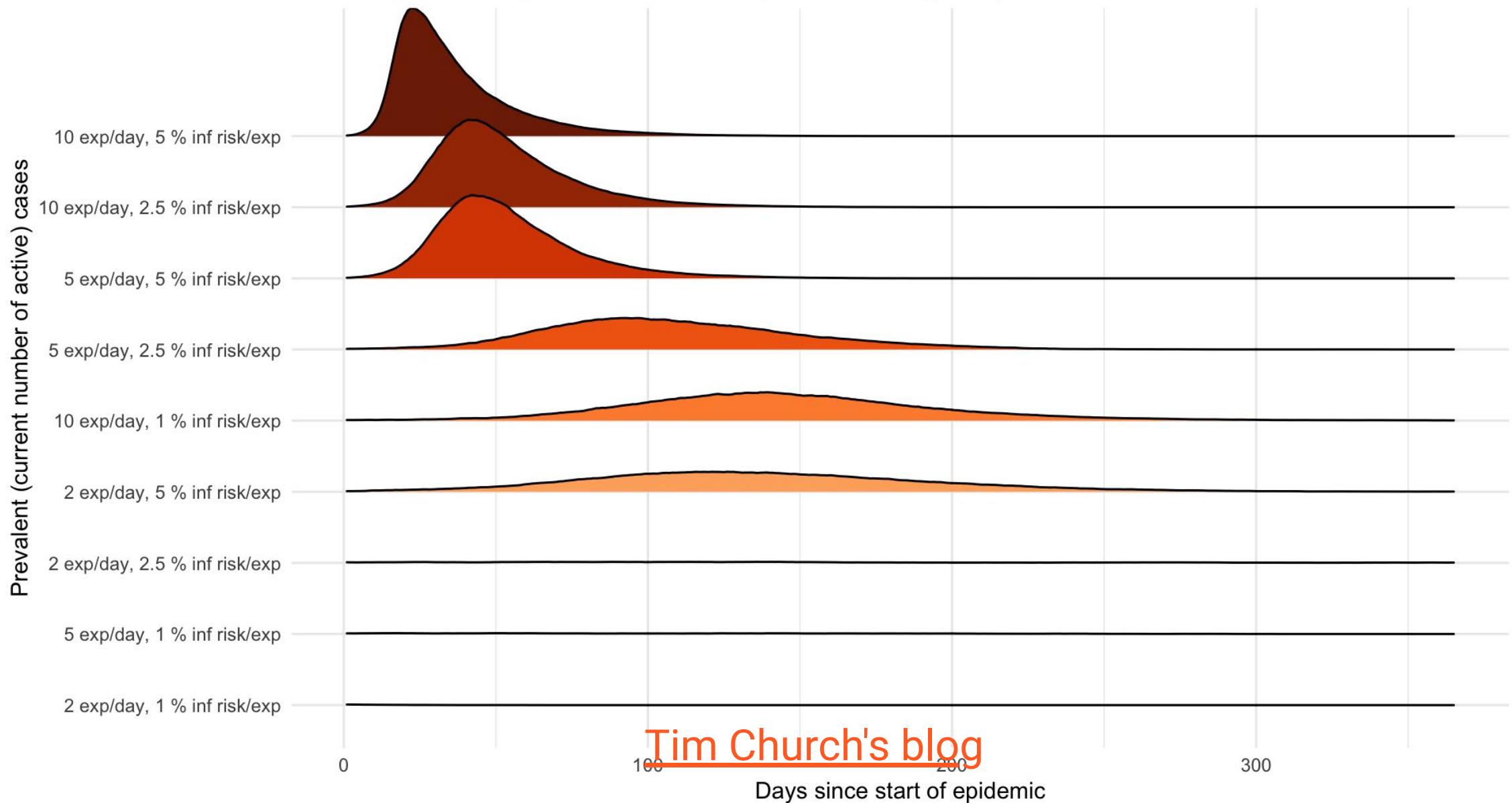
- Fever and dry cough initially; pneumonia-like
- respiratory failure later for vulnerable people
- Up to two weeks can pass between exposure and symptoms

FLATTEN THE CURVE



Modelling of COVID-19 transmission in 1,000 simulated people

with varying levels of social mixing (exposures per day) and risk of infection at each exposure,
ordered by descending maximum number of prevalent cases per day



Tim Church's blog

Days since start of epidemic

What can you do?

- Wash hands for 20 seconds
- Disinfect phone
- Don't touch your face
- Stay home if you're sick
- Practice social distancing
- Limit non-essential travel
- Don't buy masks
- Stock up on essentials but don't hoard

What can we do?

- We **will** get through this
- Humor can be an effective way to assist with reducing anxiety in these types of situations [\(Yovetich et al, 1990\)](#).
- On that note...

https://www.instagram.com/p/B9FFVnigLEE/?utm_source=ig_embed

Singapore's videos on COVID19

- <https://www.youtube.com/watch?v=Hcx0LJJ-hLU>
- <https://www.youtube.com/watch?v=ywOEkz086ms>

Vietnam's awesome pop track

- <https://www.youtube.com/watch?v=V9YirNgAzXI>

What does this mean for our class?

- Stay home if you are feeling unwell
- Lectorials are now being recorded
- Monash is advising everyone to proceed as normal, unless you are feeling unwell
- **if you are feeling unwell in any way do not come to university**
- I am committed to help you all succeed and keep learning!
- [Monash's COVID19 Updates](#)
- [Monash's COVID19 Fact sheet](#)

Recap

- packages are installed with _ ?
- packages are loaded with _ ?
- Why do we care about Reproducibility?
- Output + input of rmarkdown

About your instructors

Nick

- 🎓 Bachelor of Psychological Sciences UQ
- 🎓 PhD in Statistics at QUT.
- Research: missing data, data visualisation, statistical computing
- R 📦: `naniar`, `visdat`,
- #rstats 🎤: Credibly Curious w Saskia Freytag
- ❤️ outdoors, especially: 🏔, 🚻, and 🏔.



Steph

- 🎓 Bachelor of Economics and Bachelor of Commerce from Monash
- Studying a Masters of Statistics at QUT, based at Monash.
- Loves to read 📖, any and all recommendations are welcome.
- Has an R package called [taipan](#), and another called [sugarbag](#).



Sarah

- 🎓 MPhil student in Applied Mathematics and Statistics at Monash University. Research predicts mosquito behaviour (ask me for mosquito facts!)
- Commenced in 2017, moved from Adelaide
- Loves figure skating 

- 🎓 Bachelor of Bioinformatics
- 🎓 Master of Bioinformatics
- Current: PhD Student in the Faculty of Medicine Nursing and Health Sciences
- Data Officer with [Monash Data Fluency](#).
- Research: Bioinformatics analysis with RNA seq data
- ❤️ Travel, Food, Anime, D&D.

Sherry

- 🎓 Bachelor of Commerce 2018
- Honours in Econometrics 2019 with Di Cook
- Commenced PhD programme 2020
- Created her first ever R package, quickdraw
- Loves puzzles games like jigsaws 🧩.



- Professor at Monash University in Melbourne Australia, doing research in statistics, data science, visualisation, and statistical computing.
- Created the current version of the course
- Likes to play all sorts of sports, tennis, soccer, hockey, cricket, and go boogie boarding.



Your Turn: Making the groups

We are going to set up the groups for doing assignment work.

1. Find your name from the list at [this link](#)
2. Find the other people in the class with the same group as you (feel free to wander around the class!)
3. Grab your gear and claim a table to work together at
4. Email the group to work out how to best stay in touch

Your Turn: Ask your team mates these questions:

1. What is one food you'd never want to taste again?
2. If you were a comic strip character, who would you be and why?

LASTLY, come up with a name for your team (we have provided a suggested name, but you are free to change it!) and tell this to a tutor, along with the names of members of the team.

05 : 00

Traffic Light System



Traffic Light System

Red Post-it

- I need a hand
- Slow down

Green Post-it

- I am up to speed
- I have completed the thing

Today: Outline

- Tidy Data
- Terminology of data
- Different examples of data
- Steps in making data tidy
- Lots of examples

A note on difficulty

- This is not a programming course - it is a course about **data, modelling, and computing**.
- At the moment, you might be sitting there, feeling a bit confused about where we are, what are are doing, what R is, and how it even works.
- That is OK!
- The theory of this class will only get you so far
- The real learning happens from doing the data analysis - the **pressure of a deadline can also help**.
- I want to take a moment to run through RStudio, what it is, and how it works again. (demo)

Tidy Data



You're ready to sit down with a newly-obtained dataset, excited about how it will open a world of insight and understanding, and then find you can't use it. You'll first have to spend a significant amount of time to restructure the data to even begin to produce a set of basic descriptive statistics or link it to other data you've been using.

--John Spencer ([Measure Evaluation](#))

Tidy Data



"Tidy data" is a term meant to provide a framework for producing data that conform to standards that make data easier to use. Tidy data may still require some cleaning for analysis, but the job will be much easier.

--John Spencer ([Measure Evaluation](#))

Example: US graduate programs

- Data from a study on US grad programs.
- Originally came in an excel file containing rankings of many different programs.
- Contains information on four programs:
 1. Astronomy
 2. Economics
 3. Entomology, and
 4. Psychology

Example: US graduate programs

```
library(tidyverse)
grad <- read_csv(here::here("slides/data/graduate-programs.csv"))
grad
## # A tibble: 412 x 16
##   subject Inst AvNumPubs AvNumCits PctFacGrants PctCompletion MedianTimetoDeg...
##   <chr>    <chr>     <dbl>      <dbl>        <dbl>          <dbl>            <dbl>
## 1 econom... ARIZ...     0.9       1.57       31.3         31.7           5.6
## 2 econom... AUBU...     0.79      0.64       77.6        44.4           3.84
## 3 econom... BOST...     0.51      1.03       43.5        46.8           5
## 4 econom... BOST...     0.49      2.66       36.9        34.2           5.5
## 5 econom... BRAN...     0.3       3.03       36.8        48.7           5.29
## 6 econom... BROW...     0.84      2.31       27.1        54.6           6
## 7 econom... CALI...     0.99      2.31       56.4        83.3           4
## 8 econom... CARN...     0.43      1.67       35.2        45.6           5.05
## 9 econom... CITY...     0.35      1.06       38.1        27.9           5.2
## 10 econom... CLAR...    0.47      0.7        24.7        37.7           5.17
## # ... with 402 more rows, and 9 more variables: PctMinorityFac <dbl>,
## #   PctFemaleFac <dbl>, PctFemaleStud <dbl>, PctIntlStud <dbl>, AvNumPhDs <dbl>,
## #   AvGREs <dbl>, TotFac <dbl>, PctAsstProf <dbl>, NumStud <dbl>
```

Example: US graduate programs

Good things about the format:

```
## # A tibble: 6 x 16
##   subject Inst AvNumPubs AvNumCits PctFacGrants PctCompletion MedianTimetoDeg...
##   <chr>    <chr>     <dbl>      <dbl>        <dbl>          <dbl>            <dbl>
## 1 econom... ARIZ...     0.9       1.57       31.3         31.7           5.6
## 2 econom... AUBU...     0.79      0.64       77.6         44.4           3.84
## 3 econom... BOST...     0.51      1.03       43.5         46.8           5
## 4 econom... BOST...     0.49      2.66       36.9         34.2           5.5
## 5 econom... BRAN...     0.3       3.03       36.8         48.7           5.29
## 6 econom... BROW...     0.84      2.31       27.1         54.6           6
## # ... with 9 more variables: PctMinorityFac <dbl>, PctFemaleFac <dbl>,
## #   PctFemaleStud <dbl>, PctIntlStud <dbl>, AvNumPhDs <dbl>, AvGREs <dbl>,
## #   TotFac <dbl>, PctAsstProf <dbl>, NumStud <dbl>
```

- **Rows** contain information about the institution
- **Columns** contain types of information, like average number of publications, average number of citations, % completion,

Example: US graduate programs

Easy to make summaries:

```
grad %>% count(subject)
## # A tibble: 4 x 2
##   subject      n
##   <chr>     <int>
## 1 astronomy     32
## 2 economics    117
## 3 entomology    27
## 4 psychology   236
```

Example: US graduate programs

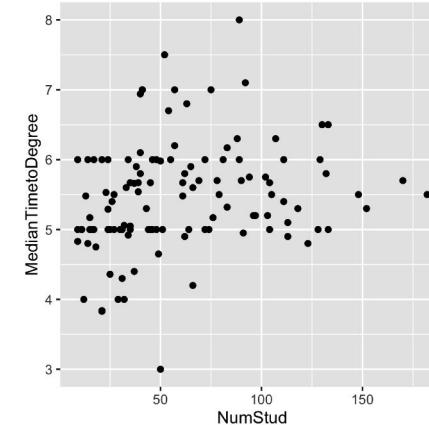
Easy to make summaries:

```
grad %>%
  filter(subject == "economics") %>%
  summarise(mean = mean(NumStud),
            s = sd(NumStud))
## # A tibble: 1 x 2
##       mean      s
##     <dbl> <dbl>
## 1    60.7   39.4
```

Example: US graduate programs

Easy to make a plot

```
grad %>%
  filter(subject == "economics") %>%
  ggplot(aes(x = NumStud,
             y = MedianTimetoDegree))
  geom_point() +
  theme(aspect.ratio = 1)
```



Your Turn: Open Lecture

2A in rstudio cloud

- Notice the data/ directory with many datasets!
- Open graduate-programs.Rmd
- Answer these questions:
 - "What is the average number of graduate students per economics program?"
 - "What is the best description of the relationship between number of students and median time to degree?"
- Use the traffic light system if you need a hand.



What could this image say about R?



03 : 00

Terminology of data: Variable

- A quantity, quality, or property that you can measure.
- For the grad programs, these would be all the column headers.

```
## # A tibble: 6 x 16
##   subject Inst AvNumPubs AvNumCits PctFacGrants PctCompletion MedianTimetoDeg...
##   <chr>    <chr>     <dbl>      <dbl>        <dbl>          <dbl>            <dbl>
## 1 econom... ARIZ...     0.9       1.57        31.3         31.7             5.6
## 2 econom... AUBU...     0.79      0.64        77.6         44.4            3.84
## 3 econom... BOST...     0.51      1.03        43.5         46.8             5
## 4 econom... BOST...     0.49      2.66        36.9         34.2            5.5
## 5 econom... BRAN...     0.3       3.03        36.8         48.7            5.29
## 6 econom... BROW...     0.84      2.31        27.1         54.6             6
## # ... with 9 more variables: PctMinorityFac <dbl>, PctFemaleFac <dbl>,
## #   PctFemaleStud <dbl>, PctIntlStud <dbl>, AvNumPhDs <dbl>, AvGREs <dbl>,
## #   TotFac <dbl>, PctAsstProf <dbl>, NumStud <dbl>
```

Terminology of data: Observation

- A set of measurements made under similar conditions
- Contains several values, each associated with a different variable.
- For the grad programs, this is institution, and program, uniquely define the observation.

```
## # A tibble: 6 x 16
##   subject Inst AvNumPubs AvNumCits PctFacGrants PctCompletion MedianTimetoDeg...
##   <chr>    <chr>     <dbl>      <dbl>        <dbl>          <dbl>            <dbl>
## 1 econom... ARIZ...     0.9       1.57       31.3         31.7           5.6
## 2 econom... AUBU...     0.79      0.64       77.6        44.4           3.84
## 3 econom... BOST...     0.51      1.03       43.5        46.8            5
## 4 econom... BOST...     0.49      2.66       36.9        34.2           5.5
## 5 econom... BRAN...     0.3       3.03       36.8        48.7           5.29
## 6 econom... BROW...     0.84      2.31       27.1        54.6            6
## # ... with 9 more variables: PctMinorityFac <dbl>, PctFemaleFac <dbl>,
## #   PctFemaleStud <dbl>, PctIntlStud <dbl>, AvNumPhDs <dbl>, AvGREs <dbl>,
## #   TotFac <dbl>, PctAsstProf <dbl>, NumStud <dbl>
```

Terminology of data: Value

- Is the state of a variable when you measure it.
- The value of a variable typically changes from observation to observation.
- For the grad programs, this is the value in each cell

```
## # A tibble: 6 x 16
##   subject Inst AvNumPubs AvNumCits PctFacGrants PctCompletion MedianTimetoDeg...
##   <chr>    <chr>     <dbl>      <dbl>        <dbl>          <dbl>            <dbl>
## 1 econom... ARIZ...     0.9       1.57       31.3         31.7           5.6
## 2 econom... AUBU...     0.79      0.64       77.6        44.4           3.84
## 3 econom... BOST...     0.51      1.03       43.5        46.8            5
## 4 econom... BOST...     0.49      2.66       36.9        34.2           5.5
## 5 econom... BRAN...     0.3       3.03       36.8        48.7           5.29
## 6 econom... BROW...     0.84      2.31       27.1        54.6            6
## # ... with 9 more variables: PctMinorityFac <dbl>, PctFemaleFac <dbl>,
## #   PctFemaleStud <dbl>, PctIntlStud <dbl>, AvNumPhDs <dbl>, AvGREs <dbl>,
## #   TotFac <dbl>, PctAsstProf <dbl>, NumStud <dbl>
```

Tidy tabular form

Tabular data is a set of values, each associated with a variable and an observation. Tabular data is **tidy** iff (if and only if):

- Each variable in its own column,
- Each observation in its own row,
- Each value is placed in its own cell.

country	year	cases	population
Afghanistan	1959	745	15357071
Afghanistan	2000	2666	20595360
Brazil	1999	37737	172006362
Brazil	2000	80488	174504898
China	1999	212258	1272915272
China	2000	213766	128042583

variables

country	year	cases	population
Afghanistan	1959	745	15357071
Afghanistan	2000	2666	20595360
Brazil	1999	37737	172006362
Brazil	2000	80488	174504898
China	1999	212258	1272915272
China	2000	213766	128042583

observations

country	year	cases	population
Afghanistan	1999	745	15357071
Afghanistan	2000	2666	20595360
Brazil	1999	37737	172006362
Brazil	2000	80488	174504898
China	1999	212258	1272915272
China	2000	213766	128042583

values

Different examples of data

For each of these data examples, **let's try together to identify the variables and the observations** - some are HARD!

The grad program

Is in **tidy** tabular form.

```
## # A tibble: 412 x 16
##   subject Inst AvNumPubs AvNumCits PctFacGrants PctCompletion MedianTimetoDeg...
##   <chr>    <chr>     <dbl>      <dbl>        <dbl>          <dbl>            <dbl>
## 1 econom... ARIZ...     0.9       1.57       31.3         31.7           5.6
## 2 econom... AUBU...     0.79      0.64       77.6         44.4           3.84
## 3 econom... BOST...     0.51      1.03       43.5         46.8            5
## 4 econom... BOST...     0.49      2.66       36.9         34.2           5.5
## 5 econom... BRAN...     0.3       3.03       36.8         48.7           5.29
## 6 econom... BROW...     0.84      2.31       27.1         54.6            6
## 7 econom... CALI...     0.99      2.31       56.4         83.3            4
## 8 econom... CARN...     0.43      1.67       35.2         45.6           5.05
## 9 econom... CITY...     0.35      1.06       38.1         27.9           5.2
## 10 econom... CLAR...    0.47      0.7        24.7         37.7           5.17
## # ... with 402 more rows, and 9 more variables: PctMinorityFac <dbl>,
## #   PctFemaleFac <dbl>, PctFemaleStud <dbl>, PctIntlStud <dbl>, AvNumPhDs <dbl>,
## #   AvGREs <dbl>, TotFac <dbl>, PctAsstProf <dbl>, NumStud <dbl>
```

Your Turn: Genes experiment



```
## # A tibble: 3 x 12
##   id    `WI-6.R1` `WI-6.R2` `WI-6.R4` `WM-6.R1` `WM-6.R2` `WI-12.R1` `WI-12.R2` 
##   <chr>     <dbl>     <dbl>     <dbl>     <dbl>     <dbl>     <dbl>     <dbl>
## 1 Gene...     2.18      2.20      4.20      2.63      5.06      4.54      5.53
## 2 Gene...     1.46      0.585     1.86      0.515     2.88      1.36      2.96
## 3 Gene...     2.03      0.870     3.28      0.533     4.63      2.18      5.56
## # ... with 4 more variables: `WI-12.R4` <dbl>, `WM-12.R1` <dbl>, `WM-12.R2` <dbl>,
## #   `WM-12.R4` <dbl>
```

02 : 00

41/67

Melbourne weather 😞

```
## # A tibble: 1,593 x 12
##   X1           X2  X3    X4           X5  X9  X13  X17  X21  X25  X29  X33
##   <chr>        <dbl> <chr> <chr>        <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
## 1 ASN00086282 1970 07 TMAX      141  124  113  123  148  149  139  153
## 2 ASN00086282 1970 07 TMIN      80   63   36   57   69   47   84   78
## 3 ASN00086282 1970 07 PRCP      3    30   0    0    36   3   0    0
## 4 ASN00086282 1970 08 TMAX      145  128  150  122  109  112  116  142
## 5 ASN00086282 1970 08 TMIN      50   61   75   67   41   51   48   -7
## 6 ASN00086282 1970 08 PRCP      0    66   0    53   13   3    8    0
## 7 ASN00086282 1970 09 TMAX      168  168  162  162  162  150  184  179
## 8 ASN00086282 1970 09 TMIN      19   29   62   81   81   55   73   97
## 9 ASN00086282 1970 09 PRCP      0    0    0    0    3    5    0    38
## 10 ASN00086282 1970 10 TMAX     189  194  204  267  256  228  237  144
## # ... with 1,583 more rows
```

02 : 00
42/67

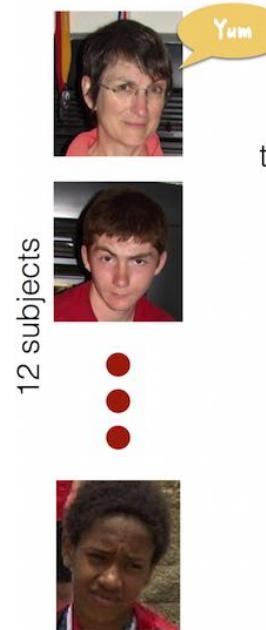
Tuberculosis notifications data taken from WHO 😷

```
## # A tibble: 3,202 x 22
##   country year new_sp_m04 new_sp_m514 new_sp_m014 new_sp_m1524 new_sp_m2534
##   <chr>    <dbl>     <dbl>     <dbl>     <dbl>     <dbl>     <dbl>
## 1 Afghan... 1997       NA        NA        0        10        6
## 2 Afghan... 1998       NA        NA        30       129       128
## 3 Afghan... 1999       NA        NA        8        55        55
## 4 Afghan... 2000       NA        NA        52       228       183
## 5 Afghan... 2001       NA        NA       129       379       349
## 6 Afghan... 2002       NA        NA        90       476       481
## 7 Afghan... 2003       NA        NA       127       511       436
## 8 Afghan... 2004       NA        NA       139       537       568
## 9 Afghan... 2005       NA        NA       151       606       560
## 10 Afghan... 2006      NA        NA       193       837       791
## # ... with 3,192 more rows, and 15 more variables: new_sp_m3544 <dbl>,
## #   new_sp_m4554 <dbl>, new_sp_m5564 <dbl>, new_sp_m65 <dbl>, new_sp_mu <dbl>,
## #   new_sp_f04 <dbl>, new_sp_f514 <dbl>, new_sp_f014 <dbl>, new_sp_f1524 <dbl>,
## #   new_sp_f2534 <dbl>, new_sp_f3544 <dbl>, new_sp_f4554 <dbl>, new_sp_f
## #   new_sp_f65 <dbl>, new_sp_fu <dbl>
```

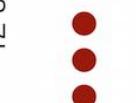
02 : 00

French fries

- 10 week sensory experiment
- 12 individuals assessed taste of french fries on several scales (how potato-y, buttery, grassy, rancid, paint-y do they taste?)
- fried in one of 3 different oils, replicated twice.



Three oils,
two batches



Five scales



For 10 weeks

S	M	T	W	T	F	S
29	30	1	2	3	4	5
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21	22	23	24	25	26
27	28	29	30	31	1	2
3	4	5	6	7	8	9
10	11	12	13	14	15	16
17	18	19	20	21	22	23
24	25	26	27	28	29	30
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31	1	2	3	4
-	-	-	-	-	-	-

French fries: Variables? Observations?

```
## # A tibble: 696 x 9
##   time treatment subject rep potato buttery grassy rancid painty
##   <dbl>     <dbl>    <dbl> <dbl>    <dbl>    <dbl>    <dbl>    <dbl>    <dbl>
## 1 1         1         1     3      1     2.9      0      0      0     5.5
## 2 1         1         1     3      2     14       0      0     1.1     0
## 3 1         1         1    10      1     11      6.4      0      0     0
## 4 1         1         1    10      2     9.9      5.9      2.9     2.2     0
## 5 1         1         1    15      1     1.2      0.1      0     1.1     5.1
## 6 1         1         1    15      2     8.8      3      3.6     1.5     2.3
## 7 1         1         1    16      1     9       2.6      0.4     0.1     0.2
## 8 1         1         1    16      2     8.2      4.4      0.3     1.4      4
## 9 1         1         1    19      1     7       3.2      0     4.9     3.2
## 10 1        1         1    19      2     13       0      3.1     4.3    10.3
## # ... with 686 more rows
```

Rude Recliners data

- data is collated from this story: [41% Of Fliers Think You're Rude If You Recline Your Seat](#)
- What are the variables?

```
## # A tibble: 3 x 6
##   V1           `V2:Always` `V2:Usually` `V2:About half the... `V2:Once in a wh... `V2:Nev
##   <chr>          <dbl>        <dbl>          <dbl>          <dbl>          <dbl>        <d
## 1 No, not r...     124         145            82          116
## 2 Yes, some...      9          27            35          129
## 3 Yes, very...     3            3            NA            11
```

Messy vs tidy

Messy data is messy in its own way. You can make unique solutions, but then another data set comes along, and you have to again make a unique solution.

Tidy data can be thought of as legos. Once you have this form, you can put it together in so many different ways, to make different analyses.



Data Tidying verbs

- `pivot_longer`: Specify the **names_to** (identifiers) and the **values_to** (measures) to make longer form data.
- `pivot_wider`: Variables split out in columns
- `separate`: Split one column into many

one more time: pivot_longer

```
pivot_longer(<DATA>,  
            <COLS>,  
            <NAMES_TO>  
            <VALUES_TO>)
```

- **Cols** to select are those that represent values, not variables.
- **names_to** variable name for current column names.
- **values_to** variable name whose values are spread over the cells.

pivot_longer: example

```
table4a
```

```
## # A tibble: 3 x 3
##   country    `1999` `2000`
## * <chr>      <int>   <int>
## 1 Afghanistan    745    2666
## 2 Brazil        37737   80488
## 3 China         212258  213766
```

```
table4a %>%
```

```
  pivot_longer(cols = c("1999", "2000"),
                names_to = "year",
                values_to = "cases")
```

```
## # A tibble: 6 x 3
```

```
##   country     year   cases
## * <chr>       <chr>  <int>
## 1 Afghanistan 1999      745
## 2 Afghanistan 2000     2666
## 3 Brazil       1999    37737
## 4 Brazil       2000    80488
## 5 China        1999   212258
## 6 China        2000   213766
```

Tidying genes data

Tell me what to put in the following?

- **cols** are the columns that represent values, not variables.
- **names_to** is the name of new variable whose values for the column names.
- **values_to** is the name of the new variable whose values are spread over the cells.

```
## # A tibble: 3 x 12
##   id    `WI-6.R1` `WI-6.R2` `WI-6.R4` `WM-6.R1` `WM-6.R2` `WI-12.R1` `WI-12.R2` 
##   <chr>     <dbl>     <dbl>     <dbl>     <dbl>     <dbl>     <dbl>     <dbl>    
## 1 Gene...     2.18      2.20      4.20      2.63      5.06      4.54      5.53  
## 2 Gene...     1.46      0.585     1.86      0.515     2.88      1.36      2.96  
## 3 Gene...     2.03      0.870     3.28      0.533     4.63      2.18      5.56  
## # ... with 4 more variables: `WI-12.R4` <dbl>, `WM-12.R1` <dbl>, `WM-12.R2` <dbl>,
## #     `WM-12.R4` <dbl>
```

Tidy genes data

```
genes
```

```
## # A tibble: 3 x 12
##   id    `WI-6.R1` `WI-6.R2` ...
##   <chr>    <dbl>    <dbl>
## 1 Gene...     2.18     2.20
## 2 Gene...     1.46     0.585
## 3 Gene...     2.03     0.870
## # ... with 4 more variables: `W...
## #   `WM-12.R4` <dbl>
```

```
genes_long <- genes %>%
  pivot_longer(cols = -id,
               names_to = "variable",
               values_to = "expr")
```

```
genes_long
```

```
## # A tibble: 33 x 3
##   id      variable  expr
##   <chr>    <chr>    <dbl>
## 1 Gene 1 WI-6.R1  2.18
## 2 Gene 1 WI-6.R2  2.20
## 3 Gene 1 WI-6.R4  4.20
## 4 Gene 1 WM-6.R1  2.63
## 5 Gene 1 WM-6.R2  5.06
## 6 Gene 1 WI-12.R1 4.54
## 7 Gene 1 WI-12.R2  5.53
## 8 Gene 1 WI-12.R4  4.41
## 9 Gene 1 WM-12.R1  3.85
## 10 Gene 1 WM-12.R2  4.18
## # ... with 23 more rows
```

Separate columns

```
genes_long  
## # A tibble: 33 x 3  
##   id     variable  expr  
##   <chr>   <chr>    <dbl>  
## 1 Gene 1 WI-6.R1  2.18  
## 2 Gene 1 WI-6.R2  2.20  
## 3 Gene 1 WI-6.R4  4.20  
## 4 Gene 1 WM-6.R1  2.63  
## 5 Gene 1 WM-6.R2  5.06  
## 6 Gene 1 WI-12.R1 4.54  
## 7 Gene 1 WI-12.R2 5.53  
## 8 Gene 1 WI-12.R4 4.41  
## 9 Gene 1 WM-12.R1 3.85  
## 10 Gene 1 WM-12.R2 4.18  
## # ... with 23 more rows
```

```
genes_long %>%  
  separate(col = variable,  
           into = c("trt", "leftover"),  
           sep = "-")  
## # A tibble: 33 x 4  
##   id     trt    leftover  expr  
##   <chr>  <chr>  <chr>    <dbl>  
## 1 Gene 1 WI     6.R1     2.18  
## 2 Gene 1 WI     6.R2     2.20  
## 3 Gene 1 WI     6.R4     4.20  
## 4 Gene 1 WM     6.R1     2.63  
## 5 Gene 1 WM     6.R2     5.06  
## 6 Gene 1 WI     12.R1    4.54  
## 7 Gene 1 WI     12.R2    5.53  
## 8 Gene 1 WI     12.R4    4.41  
## 9 Gene 1 WM     12.R1    3.85  
## 10 Gene 1 WM    12.R2    4.18  
## # ... with 23 more rows
```

Separate columns

```
genes_long_tidy <- genes_long %>%  
  separate(variable,  
           into = c("trt", "leftover")  
           sep = "-") %>%  
  separate(leftover,  
           into = c("time", "rep"),  
           sep = "\\.")
```

```
genes_long_tidy  
## # A tibble: 33 x 5  
##   id     trt    time  rep    expr  
##   <chr>  <chr>  <chr> <chr> <dbl>  
## 1 Gene 1 WI     6     R1    2.18  
## 2 Gene 1 WI     6     R2    2.20  
## 3 Gene 1 WI     6     R4    4.20  
## 4 Gene 1 WM     6     R1    2.63  
## 5 Gene 1 WM     6     R2    5.06  
## 6 Gene 1 WI    12    R1    4.54  
## 7 Gene 1 WI    12    R2    5.53  
## 8 Gene 1 WI    12    R4    4.41  
## 9 Gene 1 WM    12    R1    3.85  
## 10 Gene 1 WM   12    R2    4.18  
## # ... with 23 more rows
```

Demo: koala bilby data

Here is a little data to practice `pivot_longer`, `pivot_wider` and `separate` on.

```
## # A tibble: 5 x 5
##   ID    koala_NSW koala_VIC bilby_NSW bilby_VIC
##   <chr>    <dbl>     <dbl>    <dbl>     <dbl>
## 1 grey      23       43       11        8
## 2 cream     56       89       22       17
## 3 white     35       72       13        6
## 4 black     28       44       19       16
## 5 taupe     25       37       21       12
```

Exercise: koala bilby data

- Read over koala-bilby.Rmd
- `pivot_longer` the data into long form, naming the two new variables, `label` and `count`
- Separate the labels into two new variables, `animal`, `state`
- `pivot_wider` the long form data into wide form, where the columns are the states.
- `pivot_wider` the long form data into wide form, where the columns are the animals.

Exercise 1: Rude Recliners

- Open `rude-recliners.Rmd`
- This contains data from the article [41% Of Fliers Think You're Rude If You Recline Your Seat.](#)
- V1 is the response to question: "Is it rude to recline your seat on a plane?"
- V2 is the response to question: "Do you ever recline your seat when you fly?".

```
## # A tibble: 3 x 6
##   V1          `V2:Always` `V2:Usually` `V2:About half the... `V2:Once in a wh... `V2:Nev
##   <chr>        <dbl>       <dbl>           <dbl>           <dbl>           <dbl>       <d
## 1 No, not r...     124        145            82            116            116
## 2 Yes, some...      9         27             35            129            129
## 3 Yes, very...     3          3             NA             11             11
```

Exercise 1: Rude Recliners (15 minutes)

Answer the following questions in the `rude-recliners.Rmd` markdown document.

- A) What are the variables and observations in this data?
- 1B) Put the data in tidy long form (using the names V2 as the key variable, and count as the value).
- 1C) Use the rename function to make the variable names a little shorter.

Exercise 1: Answers

Your Turn: Turn to the people next to you and ask 2 questions:

- Are you more of a dog or a cat person?
- What languages do you know how to speak?

03 : 00

Exercise 2: Tuberculosis Incidence data (15 minutes)

Open: tb-incidence.Rmd

Tidy the TB incidence data, using the Rmd to prompt questions.

Exercise 3: Currency rates (15 minutes)

- open currency-rates.Rmd
- read in rates.csv
- Answer the following questions:
 1. What are the variables and observations?
 2. pivot_longer the five currencies, AUD, GBP, JPY, CNY, CAD, make it into tidy long form.
 3. Make line plots of the currencies, describe the similarities and differences between the currencies.

Exercise 4: Australian Airport Passengers (optional!)

- Open oz-airport.Rmd
- Contains data from the web site [Department of Infrastructure, Regional Development and Cities](#), containing data on Airport Traffic Data 1985–86 to 2017–18.
- Read the dataset, into R, naming it passengers
- Tidy the data, to produce a data set with these columns
 - airport: all of the airports.
 - year
 - type_of_flight: DOMESTIC, INTERNATIONAL
 - bound: IN or OUT

Recap

- Traffic Light System: Green = "good!" ; Red = "Help!"
- R + Rstudio
- Functions are _
- columns in data frames are accessed with _ ? If you have questions, place a red sticky note on your laptop.

If you are done, place a green sticky on your laptop

Lab quiz

Time to take the lab quiz.

A note on `pivot_wider` and `pivot_longer`, `gather` and `spread`

(Not needed to know for the course, but nice to know)

- Naming things is hard
- There are many ways to do the same thing in R
- You might have come across `pivot_` functions as `spread` or `gather`. These are still valid, but have been improved upon in the latest version of the `tidyverse` package.
- You can read more about this change here:
 - `tidyverse` blog post
 - `tidyverse` vignette

That's it!

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