Managing Data in R

KEL - Quantitative Methods

Housekeeping

- You need some data for this class (assignment one)
- If you still do not have data, and do not have a plan to acquire data (e.g. chatting with your advisor, surfing dryad, using some from a cool paper you recently read), we need to speak about your options ASAP.
- Please email me klangwig@vt.edu if you are worried about this.
- I need your github username turned in before next class

Assignment Reminder

- Please turn in your GitHub name and the paragraph about your data on canvas.
 - There is a text entry box to do this under the "assignments" tab. (You don't need to send me an email or a canvas message.)

Goals

You should be able to

- · read data into R
- understand and control how R represents those data
 - numbers, characters, factors, missing values
- examine the data visually, numerically, textually, etc.

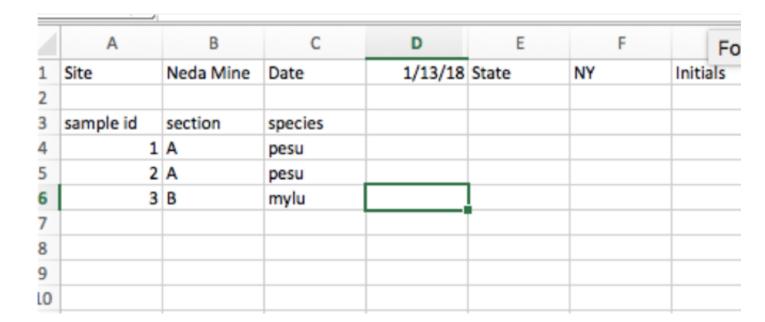
Getting Started with Data

- Save files as .csv
- IMPORTANT saving an excel file as a CSV means that you will lose some data
- For example, if you used excel to calculate a formula, the formula will be gone as R will just store this as plain text
- DON'T USE EXCEL TO DO CALCULATIONS JUST ADD THIS TO YOUR CODE IN R
- Use smart column names. R can't handle spaces in your column names, so get rid of those. Also don't use a bunch of capitals unnecessarily because it slows down your coding. e.g. use "species" not "Species"
- There are packages that allow you to read in .xls files (gdata in JD), but I think using .csv is easier

Making your excel file

- Excel files should have a list of column names at the top only and variable values
- Your excel file should not look like your field data sheet

What is wrong with this entry?



Corrected entry

	Α	В	С	D	E	F	
1	sample id	section	species	site	date	state	ini
2	1	Α	pesu	neda mine	1/13/18	NY	KE
3	2	Α	pesu	neda mine	1/13/18	NY	KE
4	3	В	mylu	neda mine	1/13/18	NY	KE
5							
-							

Representations

Numeric and character types are fairly straightforward, and you rarely have to worry about when and whether R represents things as integers or *floating point*.

You do need to know about **factors**, and to be aware when your variables are being treated as such. See lecture 1 for more about factors.

Dates

Working with dates can be a bit frustrating because as time units get larger, they become more variable. For example, at what day does the 75th percentile of the month fall?

An important note – macs and windows machines often handle dates differently and the default is different in excel.

One a mac the default is mo/day/two digit year – e.g. 01/13/18 is January 13, 2018, but on a PC the default is "01/13/2018". This can result in some frustration between people sharing scripts!

Typically, dates will be loaded in as factors. If you want them to be dates, you need to tell R this.

Missing values

When you input data, you need to be aware of NA ("not available"). Your read function has an option called na.strings which you can use to communicate between R and your CSV files, for example. You need to know that

• use is.na() to test for NA values, na.omit()
to drop them, and the optional na.rm
argument in some functions (mean, sum,
median ...)

Changing representations

 R has a big suite of functions for creating, testing and changing representations.

```
-These have names like factor(), as.numeric() and is.character().
```

Examination

You should think creatively, and early on, about how to check your data. Is it internally consistent? Are there extreme outliers? Are there typos? Are there certain values that really mean something else?

An American Airlines memo about fuel reporting from the 1980s complained of multiple cases of:

- Reported departure fuel greater than aircraft capacity
- Reported departure fuel less than minimum required for trip
- Reported arrival fuel greater than reported departure fuel

You should think about what you can test, and what you can fix if it's broken.

Visualizing data with graphs

Graphical approaches are really useful for data cleaning; we will discuss this more later on.

To get you started here are just a few:

hist: will make a histogram plot

Example

batdat=read.csv("~/Dropbox/teaching/quant grad course/github
head(batdat)

```
##
        swab id gd gdL swab type state
                                                        site
                 1 0.00007560
## 1 KL15WI0002
                                    BAT
                                           WI HORSESHOE BAY
                1 0.47879100
## 2 KL15WI0003
                                    ВАТ
                                           WI HORSESHOE BAY
## 3 KL15WI0004
                                           WI HORSESHOE BAY
                           NA
                                    BAT
## 4 KL15WI0005
                1 0.00000551
                                    BAT
                                           WI HORSESHOE BAY
## 5 KL15WI0006
                1 0.00003560
                                           WI HORSESHOE BAY
                                    BAT
## 6 KL15WI0007
                 1 0.00003160
                                           WI HORSESHOE BAY
                                    BAT
     country count
##
## 1
        u.s.
## 2
             1110
        u.s.
## 3
        u.s. 1110
## 4
        u.s. 1110
## 5
        u.s. 1110
             1110
        u.s.
```

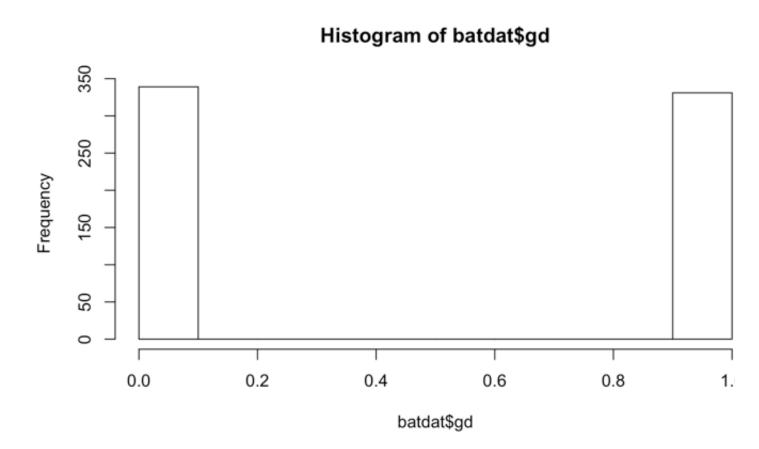
Example Cont.

unique(batdat\$species)

[1] MYSE MYLU PESU EPFU SUBSTRATE
Levels: EPFU MYLU MYSE PESU SUBSTRATE

Example Cont.

hist(batdat\$gd)



Some other useful tools

- dim: gives the dimensions of the dataframe
- str: gives the structure of each variable
- glimpse: a dyplr function, that allows for preview as much of each column as possible
- head: get the first 6 rows
- tail: get the last 6 rows

How do you clean data?

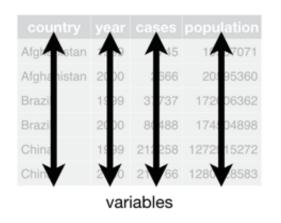
What R functions do you know that are useful for examination? What are your strategies?

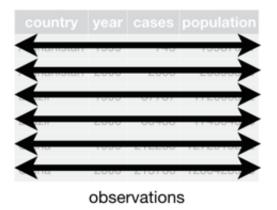
Tidy(ing) data

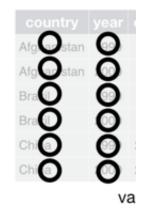
Hadley Wickham has defined a concept of <u>tidy</u> <u>data</u>, and has introduced the <u>tidyverse</u> package.

- Each variable is in a column
- Each observation is in a row
- "Long" rather than "wide" form
- · Sometimes duplicates data
- Statistical modeling tools and graphical tools (especially the ggplot2 package) in R work best with long form

An example of tidy data







Learning about the tidyverse

https://www.tidyverse.org

Putting your data in tidy format

- Discerning what is a variable can be hard when making data files
- For example, species in my bat dataset is usually a single variable
- I usually also include a "count" column (the number of individuals at a site)
- But what if I wanted to test the effect of the count of one species (e.g.MYSE) on another?
 Now MYSE count is actually a variable.

Example with bat data

What if I wanted to test how the count of MYSE influenced infection in MYLU? I need to MYSE to be a variable

Spread and Gather - "Old"" way

- spread and gather have now been replaced by the more intuitive pivot
- These are in the notes as an example only
- We won't go through them and I encourage you to switch to pivot
- In the R file, go to line 44

Here, we will use spread and gather

library(tidyr)

Warning: package 'tidyr' was built under R version 3.6.2

batdat\$lgdL=log10(batdat\$gdL)#log the amount of fungus
batcounts<-aggregate(count~species+site+date,data=batdat, FU
#make a df of bat counts</pre>

batcounts.wide<-spread(batcounts, species,count,convert=T)
#spread that dataframe</pre>

What do these look like?

##	species		site	(date	count	
## 1	MYLU	S	ST. JOHN	11/20)/15	87	
## 2	MYLU	HORSES	SHOE BAY	11/7	7/15	646	
## 3	MYSE	HORSES	SHOE BAY	11/7	7/15	1	
## 4	MYLU	BEA	AR CREEK	11/9	9/15	116	
## 5	MYSE	BEA	AR CREEK	11/9	9/15	7	
## 6	PESU	BEA	AR CREEK	11/9	9/15	50	
##		site	date	EPFU	MYLU	MYSE	PESU
## 1	BEAR	CREEK	11/9/15	NA	116	7	50
## 2	BEAR	CREEK	3/10/17	NA	38	NA	22
## 3	BEAR	CREEK	3/4/15	9	97	0	55
## 4	BEAR	CREEK	3/7/16	5	122	16	50
## 5	HORSESHO	DE BAY	11/7/15	NA	646	1	NA
## 6	HORSESHO	DE BAY	2/27/15	NA	1110	3	2

We can make identical dataframes for loads

```
##
      species
                        site
                                 date
                                           lqdL
## 1
         MYLU
                    ST. JOHN 11/20/15 -3.702218
## 2
                             11/7/15 -3.181897
         MYLU HORSESHOE BAY
                             11/7/15 -2.568128
         MYSE HORSESHOE BAY
## 4
                             2/27/15 -3.629430
         MYLU HORSESHOE BAY
## 5
         MYSE HORSESHOE BAY
                             2/27/15 -4.021487
## 6 SUBSTRATE HORSESHOE BAY 2/27/15 -4.406571
```

```
site
##
                     date
                               EPFU
                                         MYLU
                                                   MYSE
## 1
       BEAR CREEK 3/10/17
                                 NA -1.404181
                                                     NA -1.
## 2
       BEAR CREEK
                   3/7/16 -4.434528 -3.484241 -4.142065 -5.
  3 HORSESHOE BAY 11/7/15 NA -3.181897 -2.568128
  4 HORSESHOE BAY 2/27/15
                                NA -3.629430 -4.021487
## 5 HORSESHOE BAY
                   3/1/17
                                 NA - 1.338297
                                                     NA - 1
## 6 HORSESHOE BAY 3/3/16 -1.854368 -1.172071
                                                     NA
```

Now, merge dataframes together for wide format

batwide=merge(batloads.wide,batcounts.wide,by=c("site","date
#merge df together by site and date
head(batwide)

```
##
              site date
                              EPFU.x
                                        MYLU.x
                                                  MYSE.x
## 1
        BEAR CREEK 3/10/17
                                  NA -1.404181
                                                      NA - 1.
## 2
       BEAR CREEK 3/7/16 -4.434528 -3.484241 -4.142065 -5.
## 3 HORSESHOE BAY 11/7/15
                                 NA -3.181897 -2.568128
## 4 HORSESHOE BAY 2/27/15
                                  NA -3.629430 -4.021487
## 5 HORSESHOE BAY 3/1/17
                                  NA - 1.338297
                                                      NA -1.
## 6 HORSESHOE BAY 3/3/16 -1.854368 -1.172071
                                                      NA
##
     EPFU.y MYLU.y MYSE.y PESU.y
## 1
                38
                              22
         NA
                       NA
## 2
          5
               122
                       16
                              50
## 3
            646
         NA
                        1
                              NA
                               2
## 4
              1110
                        3
        NA
## 5
                10
                              10
         NA
                       NA
## 6
               188
                       NA
                              NA
```

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Or "match" and keep in long format

batloads\$unique.row.id = paste(batloads\$species,batloads\$sit
batcounts\$unique.row.id = paste(batcounts\$species,batcounts\$
#dataframe you are bringing to first, and the one you matchi
batloads\$count = batcounts\$count[match(batloads\$unique.row.i
head(batloads)

##		species	site	date	lgdL	
##	1	MYLU	ST. JOHN	11/20/15	-3.702218	MYL
##	2	MYLU	HORSESHOE BAY	11/7/15	-3.181897	MYLU HO
##	3	MYSE	HORSESHOE BAY	11/7/15	-2.568128	MYSE HO
##	4	MYLU	HORSESHOE BAY	2/27/15	-3.629430	MYLU HO
##	5	MYSE	HORSESHOE BAY	2/27/15	-4.021487	MYSE HO
##	6	SUBSTRATE	HORSESHOE BAY	2/27/15	-4.406571	SUBSTRATE HO
##		count				
##	1	87				
##	2	646				
##	3	1				
##	4	1110				
##	5	3				
##	6	NA				

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Here's another example using the newer and more intuitive "pivot"

Look at some example data that comes with the tidyr package:

fish encounters

```
## # A tibble: 114 x 3
## fish station
                    seen
   <fct> <fct> <int>
##
##
   1 4842 Release
                       1
##
   2 4842 I80 1
                       1
##
   3 4842 Lisbon
                       1
##
   4 4842 Rstr
                       1
## 5 4842 Base_TD
                       1
## 6 4842 BCE
                       1
## 7 4842 BCW
                       1
## 8 4842 BCE2
                       1
## 9 4842 BCW2
                       1
## 10 4842
          MAE
                       1
## # ... with 104 more rows
```

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Here is a link to vignette

- https://tidyr.tidyverse.org/articles/pivot.html
- It seems SO much better than 'spread()' and 'gather()'

Pivot_wider

Using pivot_wider() we can specify how the metadata stored become data variables

```
fish_encounters %>%
  pivot_wider(names_from = station, values_from = seen)
```

```
## # A tibble: 19 x 12
##
       fish
              Release I80 1 Lisbon Rstr Base TD
                                                            BCE
                                                                   BCW
                 <int> <int>
##
                                 <int> <int>
                                                  <int> <int> <
       <fct>
##
     1 4842
                      1
                             1
                                      1
                                             1
                                                       1
                                                               1
                                                                      1
##
    2 4843
                      1
                             1
                                      1
                                             1
                                                       1
                                                               1
                                                                      1
##
    3 4844
                      1
                             1
                                      1
                                             1
                                                       1
                                                               1
                                                                      1
##
    4 4845
                      1
                             1
                                      1
                                             1
                                                       1
                                                             NA
                                                                     NA
##
    5 4847
                      1
                             1
                                      1
                                            NA
                                                      NA
                                                             NA
                                                                     NA
##
    6 4848
                      1
                             1
                                      1
                                             1
                                                      NA
                                                                     NA
                                                             NA
##
    7 4849
                      1
                             1
                                    NA
                                            NA
                                                      NA
                                                             NA
                                                                     NA
##
                                             1
                                                               1
    8 4850
                      1
                             1
                                                       1
                                                                      1
                                    NA
     9 4851
                      1
                             1
                                    NA
                                            NA
                                                      NA
                                                             NA
                                                                     NA
## 10 4854
                                                                     NA
                      1
                             1
                                    NA
                                            NA
                                                      NA
                                                             NA
## 11 4855
                      1
                             1
                                      1
                                             1
                                                       1
                                                             NA
                                                                     NA
## 12 4857
                      1
                             1
                                      1
                                                       1
                                                               1
                                                                      1
                                             1
## 13 4858
                                                       1
                                                               1
                                                                      1
                      1
                             1
                                      1
                                             1
## 14 4859
                      1
                                      1
                                             1
                                                                     NA
                             1
                                                       1
                                                             NA
## 15 4861
                      1
                             1
                                      1
                                             1
                                                                      1
```

Fill in 0's

fish encounters %>%

```
pivot wider(
     names from = station,
    values from = seen,
    values fill = list(seen = 0)
  )
## # A tibble: 19 x 12
##
       fish
               Release I80 1 Lisbon Rstr Base TD
                                                              BCE
                                                                     BCW
                 <int> <int>
                                  <int> <int>
##
       <fct>
                                                    <int> <int> <
##
     1 4842
                       1
                              1
                                       1
                                               1
                                                         1
                                                                 1
                                                                        1
##
     2 4843
                       1
                              1
                                       1
                                               1
                                                         1
                                                                 1
                                                                        1
##
     3 4844
                       1
                              1
                                       1
                                               1
                                                         1
                                                                 1
                                                                        1
##
     4 4845
                       1
                                       1
                                                         1
                                                                 0
                                                                        0
                              1
                                               1
##
     5 4847
                       1
                              1
                                       1
                                               0
                                                         0
                                                                 0
                                                                        0
##
     6 4848
                       1
                              1
                                       1
                                               1
                                                         0
                                                                 0
                                                                        0
##
     7 4849
                       1
                              1
                                       0
                                               0
                                                         0
                                                                 0
                                                                        0
##
     8 4850
                       1
                              1
                                       0
                                               1
                                                         1
                                                                 1
                                                                        1
##
     9 4851
                       1
                              1
                                       ()
                                               ()
                                                         ()
                                                                 0
                                                                        0
## 10 4854
                       1
                              1
                                       ()
                                               ()
                                                         ()
                                                                 0
                                                                        ()
   11 4855
                       1
                              1
                                       1
                                               1
                                                         1
                                                                 0
                                                                        0
## 12 4857
                       1
                              1
                                       1
                                               1
                                                         1
                                                                 1
                                                                        1
## 13 4858
                       1
                              1
                                       1
                                                         1
                                                                        1
                                               1
                                                                 1
                                                                34/59
## 14 4859
                                               1
                                                         1
                                                                        ()
                       1
                              1
                                       1
```

Making a dataframe long (e.g. tidy)

Let's look at an example of an untidy dataframe.

head(relig_income)

```
## # A tibble: 6 x 11
## religion `<$10k` `$10-20k` `$20-30k` `$30-40k` `$40-50k
## <chr>
              <dbl>
                         <dbl>
                                  <dbl>
                                             <dbl>
                                                        <dbl
## 1 Agnostic
                   27
                                                           7
                             34
                                       60
                                                 81
## 2 Atheist
                   12
                             27
                                       37
                                                 52
                                                           3
## 3 Buddhist
                 27
                                                           3
                             21
                                       30
                                                 34
## 4 Catholic 418
                            617
                                     732
                                                670
                                                          63
## 5 Don't k...
                 15
                                       15
                                                 11
                             14
                                                           1
## 6 Evangel...
                  575
                                     1064
                            869
                                                982
                                                          88
## # ... with 3 more variables: `$100-150k` <dbl>, `>150k` <db
## # know/refused` <dbl>
```

Make a row for the number of individuals for each religion by income category

```
relig income %>%
  pivot longer(-religion, names to = "income", values to = "
## # A tibble: 180 x 3
      religion income
##
                                   count
      <chr>
##
               <chr>
                                   <dbl>
    1 Agnostic <$10k
##
                                      27
    2 Agnostic $10-20k
##
                                      34
##
   3 Agnostic $20-30k
                                      60
   4 Agnostic $30-40k
##
                                      81
   5 Agnostic $40-50k
##
                                     76
   6 Agnostic $50-75k
##
                                     137
##
   7 Agnostic $75-100k
                                     122
    8 Agnostic $100-150k
##
                                     109
    9 Agnostic >150k
##
                                      84
## 10 Agnostic Don't know/refused
                                     96
## # ... with 170 more rows
```

#the minus sign says don't include the column religion

Another example using temporal data:

The billboard dataset has a row for every week and the rank of that song

billboard

```
## # A tibble: 317 \times 79
##
      artist track date.entered
                                     wk1
                                            wk2
                                                  wk3
                                                         wk4
                                                                wk
##
      <chr> <chr> <date>
                                  <dbl> <dbl> <dbl> <dbl> <dbl</pre>
    1 2 Pac Baby... 2000-02-26
##
                                             82
                                                    72
                                                          77
                                       87
                                                                 8
##
    2 2Ge+h... The ... 2000-09-02
                                             87
                                                    92
                                      91
                                                          NA
                                                                 N
    3 3 Doo... Kryp... 2000-04-08
##
                                             70
                                                          67
                                      81
                                                 68
                                                                 6
##
    4 3 Doo... Loser 2000-10-21
                                             76
                                                   72
                                                          69
                                       76
    5 504 B... Wobb... 2000-04-15
##
                                      57
                                             34
                                                    25
                                                          17
                                                                 1
##
    6 98<sup>0</sup> Give... 2000-08-19
                                      51
                                             39
                                                    34
                                                          26
    7 A*Tee... Danc... 2000-07-08
##
                                      97
                                             97
                                                    96
                                                          95
                                                                10
##
    8 Aaliy... I Do... 2000-01-29
                                      84
                                             62
                                                    51
                                                          41
##
    9 Aaliy... Try ... 2000-03-18
                                      59
                                             53
                                                    38
                                                          28
## 10 Adams... Open... 2000-08-26
                                       76
                                             76
                                                    74
                                                          69
   # ... with 307 more rows, and 68 more variables: wk9 <dbl>,
       wk11 <dbl>, wk12 <dbl>, wk13 <dbl>, wk14 <dbl>, wk15
      wk17 <dbl>, wk18 <dbl>, wk19 <dbl>, wk20 <dbl>
       wk23 <dbl>, wk24 <dbl>, wk25 <dbl>, wk26 <dbl>, wk27
```

We want week to be temporal data, but it has letters in it

- We want names to be a variable called "week" and the values to be a variable called "rank"
- We want to remove NAs because not all songs stay on the charts for 76 weeks

Billboard

```
billboard %>%
 pivot longer(
    cols = starts with("wk"),
    names to = "week",
    names prefix = "wk",
    values to = "rank",
   values drop na = TRUE
  )
## # A tibble: 5,307 x 5
##
      artist track
                                      date.entered week
                                                          ra
   <chr> <chr>
##
                                                   <chr> <db
                                      <date>
##
   1 2 Pac Baby Don't Cry (Keep... 2000-02-26
                                                   1
   2 2 Pac Baby Don't Cry (Keep... 2000-02-26
##
                                                   2
   3 2 Pac Baby Don't Cry (Keep... 2000-02-26
##
                                                   3
##
   4 2 Pac Baby Don't Cry (Keep... 2000-02-26
   5 2 Pac Baby Don't Cry (Keep... 2000-02-26
##
                                                   5
##
   6 2 Pac Baby Don't Cry (Keep... 2000-02-26
   7 2 Pac Baby Don't Cry (Keep... 2000-02-26
                                                   7
##
##
    8 2Ge+her The Hardest Part Of ... 2000-09-02
                                                   1
##
    9 2Ge+her The Hardest Part Of ... 2000-09-02
                                                   2
## 10 2Ge+her The Hardest Part Of ... 2000-09-02
                                                   3
## # ... with 5,297 more rows
                                                   39/59
```

Changing something to an integer

 We want to turn week into an integer so we can easily determine how long a song was on the charts

```
billboard %>%
  pivot longer (
    cols = starts with("wk"),
    names to = "week",
    names prefix = "wk",
    values to = "rank",
   values drop na = TRUE
)
## # A tibble: 5,307 x 5
##
     artist track
                                      date entered week
                                                          ra
## <chr> <chr>
                                                   <chr> <db
                                      <date>
## 1 2 Pac Baby Don't Cry (Keep... 2000-02-26
                                                   1
## 2 2 Pac Baby Don't Cry (Keep... 2000-02-26
                                                   2
## 3 2 Pac Baby Don't Cry (Keep... 2000-02-26
                                                   3
             Baby Don't Cry (Keep... 2000-02-26
## 4 2 Pac
             Baby Don't Cry (Keep... 2000-02-26
## 5 2 Pac
                                                   \frac{45}{159}
```

So how do we create tidy datasets?

- Make your data as tidy as possible
- Learn to manipulate data in R and hardcode these changes into your scripts
- There is no perfect method each dataset is unique
- Manipulating data in R is hard, sometimes harder than excel. But learning to do it SO worth it because you will save hours of time for each project you do.

Tools

base R

- reshape: wide-to-long and vice versa
- merge: join data frames
- ave: compute averages by group
- subset, [-indexing: select obs and vars
- transform: modify variables and create new ones
- · aggregate: split-apply-summarize
- split, lapply, do.call(rbind()): splitapply-combine
- · sort

The tidyverse

- tidyr package: pivot_longer, pivot_wider
- · dplyr package:
 - mutate
 - select
 - filter
 - group_by
 - summarise
 - arrange

Group by, Mutate, and Summarise

- group_by is my favorite tidyverse command which has cut my need to write loops in half
- group_by allows you to do calculations on groups of things, for example, by species or year

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First load the package

Managing Data in R

library(tidyverse) ## — Attaching packages — ## **✓** ggplot2 3.2.1 **✓** dplyr 1.0.2 ## **✓** tibble 3.0.4 **✓** stringr 1.4.0 ## **✓** readr 1.3.1 **✓** forcats 0.4.0 ## **/** purrr 0.3.3 ## Warning: package 'tibble' was built under R version 3.6.2 ## Warning: package 'dplyr' was built under R version 3.6.2 ## — Conflicts —— ## * dplyr::filter() masks stats::filter() ## * dplyr::lag() masks stats::lag()

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Group by species

```
batdat %>%
  group by(species) %>%
    summarise(mean.fungal.loads=mean(lgdL,na.rm=TRUE))
## `summarise()` ungrouping output (override with `.groups`
## # A tibble: 5 x 2
## species mean.fungal.loads
## <fct>
                           <dbl>
## 1 EPFU
                           -3.64
## 2 MYLU
                           -3.03
## 3 MYSE
                           -3.69
## 4 PESU
                           -2.04
                           -4.11
## 5 SUBSTRATE
```

Summarise versus Mutate

- summarise creates a new dataframe
- mutate does a calculation where it add a new column to your existing dataframe

```
batdat_with_sample_size = batdat %>%
  #create a new dataframe called batdat_with_sample_size
  group_by(site,species,date) %>%
  #you can group_by multiple things
  mutate(sample.size=n())
#this adds a column to the dataframe
```

What does our dataframe look like now?

head(batdat_with_sample_size[c(1,6,7,8,12)])

```
## # A tibble: 6 x 5
## # Groups: site, species, date [2]
## swab id site
                           date species lgdL
## <fct> <fct>
                           <fct> <fct> <dbl>
## 1 KL15WI0002 HORSESHOE BAY 2/27/15 MYSE
                                           -4.12
                                           -0.320
## 2 KL15WI0003 HORSESHOE BAY 2/27/15 MYLU
## 3 KL15WI0004 HORSESHOE BAY 2/27/15 MYLU
                                          NA
## 4 KL15WI0005 HORSESHOE BAY 2/27/15 MYLU
                                         -5.26
## 5 KL15WI0006 HORSESHOE BAY 2/27/15 MYLU
                                          -4.45
## 6 KL15WI0007 HORSESHOE BAY 2/27/15 MYLU
                                          -4.50
```

#this is just showing a few columns for effect

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Managing Pipelines in R

- Pipelines are ways of carefully recording and systematizing the steps you take to work with your data
- The idea is that you should be able to delete any results of computer calculations and be able to quickly re-do them
- Ideally your project will depend on:
- Some data files
- · Some scripts
- Something that tells you how these things go together (RMarkdown is helpful for this), at minimum a README file

Advantages of this approach

- Clarity: we aren't confused about the 600 pages of information stored with our projects
- Reproducibility: we can always re-do something we did
- Flexibility: we can use different data and recreate the same thing

Spreadsheets

- Spreadsheets are a useful (and obvious) tool for working with R
- read.csv and write.csv are very useful commands for working with spreadsheets
- when using write.csv use row.names=F to avoid line numbers
- Importantly, spreadsheets are for storing data, NOT FOR MANIPULATING DATA
- Your goal should be to take data from a spreadsheet and manipulate it entirely using scripts.
- Avoid spreadsheet addiction:
 http://www.burns-stat.com/documents/tutorials/spreadsheet-addiction/
- The jist is: friends don't let friends use excel for statistics.

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Database

 Your spreadsheet is a database (just because it isn't stored in microsoft access doesn't mean it isn't!)

- "small" databases are usually considered to be fewer than 1000 observations of 10-20 vars
- "medium" databases are about 1000 to 100,000 observations of about 10-50 vars. These are most helpful with data handling packages.
- "large" means millions of observations and potentially 1000s of variables. These may need to be stored in an external application.

Working in Github

- Git is version control system, with the original purpose of allowing groups to work collaboratively on software projects
- Git manages the evolution of a set of files called a repository
- A repository is essentially a folder where you store your stuff
- Version control works a bit like "Track Changes" in word, Git will track the changes we make to our code so we can return to previous versions
- It also allows collaboration so I can look at your code and make changes - a bit like a more complicated version of Google Docs

Will this hurt?

- Maybe!
- But, I think this important enough that we NEED exposure to this. This is the future!

But I only code alone!

- You need to carefully document your steps if the only person you are sharing code with is the future version of yourself
- In addition, most journals require publicly available data and code open code is the norm, not the exception.
- Using Git has gotten easier. We used to have to use command line to communicate with Git, but now we can just use RStudio!

Terminology

- repository: A directory or storage space where your projects can live. Sometimes GitHub users shorten this to "repo." (If you're cool like that.) It is usually a local folder on your computer. You can keep code files, text files, image files, you name it, inside a repository.
- commit: This is the command that gives Git its power. When you commit, you are taking a "snapshot" of your repository at that point in time, giving you a checkpoint to which you can reevaluate or restore your project to any previous state. When you first start "commiting", it is important to remember this is taking the picture, not SENDING the picture. (Sending is called "pushing")

Terminology cont.

- branch: How do multiple people work on a project at the same time without Git getting them confused? Usually, they "branch off" of the main project with their own versions full of changes they themselves have made. After they're done, it's time to "merge" that branch back with the "master," the main directory of the project. Because we'll be working within our own repos, we don't need to worry too much about branching but is good to know for future.
- push: This is how you upload your file to GitHub. Remember, you need to both commit and push for your file to be sent to GitHub.

Sending your files to our class repository

- We have an "organization" account for our class
- Normally, we would have to pay for private repositories, but I emailed github and they are giving us UNLIMITED private repositories. That's pretty awesome.
- Why should we want things open-source? Why not?

Installing Git

- Please try to start this before our next class.
- Here is a link: http://happygitwithr.com/install-git.html#install-git
- Please follow instructions to get started with git.
- Try to install git in the most scientific way possible - if one way doesn't work, try the next, and google your mistakes!