## Lab 5

#### Math 241, Week 6

```
# Put all necessary libraries here
library(tidyverse)
library(rnoaa)
library(rvest)
library(httr)
library(lubridate)
library(spotifyr)
library(ggjoy)
library(rvest)
```

### Due: Friday, March 1st at 8:30am

#### Goals of this lab

- 1. Practice grabbing data from the internet.
- 2. Learn to navigate new R packages.
- 3. Grab data from an API (either directly or using an API wrapper).
- 4. Scrape data from the web.

#### Potential API Wrapper Packages

#### Problem 1: Predicting the Unpredictable: Portland Weather

In this problem let's get comfortable with extracting data from the National Oceanic and Atmospheric Administration's (NOAA) API via the R API wrapper package rnoaa.

You can find more information about the datasets and variables here.

```
# Don't forget to install it first!
library(rnoaa)
```

- a. First things first, go to this NOAA website to get a key emailed to you. Then insert your key below:
- b. From the National Climate Data Center (NCDC) data, use the following code to grab the stations in Multnomah County. How many stations are in Multnomah County?

We have 25 stations in Multnomah County.

c. January was not so rainy this year, was it? Let's grab the precipitation data for site GHCND:US10RMT0006 for this past January.

```
# First fill-in and run to following to determine the # datatypeid
```

```
ncdc_datatypes(datasetid = "GHCND",
 stationid = "GHCND:US10RMT0006")
## $meta
##
     offset count limit
## 1
          1
               5
##
## $data
##
       mindate
                   maxdate
                                                             name datacoverage
## 1 1750-02-01 2024-02-27
                                                    Precipitation
                                                                             1
## 2 1840-05-01 2024-02-27
                                                         Snowfall
                                                                             1
## 3 1857-01-18 2024-02-27
                                                       Snow depth
                                                                             1
## 4 1952-07-01 2024-02-27 Water equivalent of snow on the ground
## 5 1998-06-01 2024-02-27
                                     Water equivalent of snowfall
## 1 PRCP
## 2 SNOW
## 3 SNWD
## 4 WESD
## 5 WESF
##
## attr(,"class")
## [1] "ncdc_datatypes"
# Now grab the data using ncdc()
precip_se_pdx <- ncdc(datasetid = "GHCND", stationid = "GHCND:US10RMT0006", datatypeid = "PRCP", startd</pre>
data.frame(precip_se_pdx[2])
##
                data.date data.datatype
                                             data.station data.value data.fl m
## 1 2024-01-01T00:00:00
                                                                   0
                                                                             Т
                           PRCP GHCND:US10RMT0006
## 2 2024-01-02T00:00:00
                                 PRCP GHCND: US10RMT0006
                                                                   0
                                 PRCP GHCND: US10RMT0006
## 3 2024-01-03T00:00:00
                                                                  58
## 4 2024-01-04T00:00:00
                                 PRCP GHCND: US10RMT0006
                                                                 107
## 5 2024-01-05T00:00:00
                                 PRCP GHCND: US10RMT0006
                                                                  28
## 6 2024-01-06T00:00:00
                                 PRCP GHCND: US10RMT0006
                                                                 135
                                 PRCP GHCND:US10RMT0006
## 7 2024-01-07T00:00:00
                                                                  97
## 8 2024-01-08T00:00:00
                                 PRCP GHCND: US10RMT0006
                                                                  56
## 9 2024-01-09T00:00:00
                                 PRCP GHCND: US10RMT0006
                                                                 221
## 10 2024-01-10T00:00:00
                                  PRCP GHCND: US10RMT0006
                                                                 157
## 11 2024-01-11T00:00:00
                                  PRCP GHCND: US10RMT0006
                                                                  25
                                  PRCP GHCND: US10RMT0006
## 12 2024-01-12T00:00:00
                                                                  66
## 13 2024-01-13T00:00:00
                                  PRCP GHCND:US10RMT0006
                                                                   5
## 14 2024-01-14T00:00:00
                                  PRCP GHCND: US10RMT0006
                                                                  94
## 15 2024-01-15T00:00:00
                                  PRCP GHCND: US10RMT0006
                                                                   0
## 16 2024-01-16T00:00:00
                                  PRCP GHCND: US10RMT0006
                                                                   0
## 17 2024-01-17T00:00:00
                                  PRCP GHCND: US10RMT0006
                                                                 107
## 18 2024-01-18T00:00:00
                                  PRCP GHCND: US10RMT0006
                                                                 178
## 19 2024-01-19T00:00:00
                                  PRCP GHCND: US10RMT0006
                                                                 183
## 20 2024-01-20T00:00:00
                                 PRCP GHCND:US10RMT0006
                                                                   0
## 21 2024-01-21T00:00:00
                                 PRCP GHCND:US10RMT0006
                                                                  89
## 22 2024-01-22T00:00:00
                                 PRCP GHCND: US10RMT0006
                                                                 178
```

PRCP GHCND: US10RMT0006

PRCP GHCND:US10RMT0006

PRCP GHCND:US10RMT0006

175

91

130

## 23 2024-01-23T00:00:00

## 24 2024-01-24T00:00:00

## 25 2024-01-25T00:00:00

```
##
      data.fl_q data.fl_so data.fl_t
## 1
                                    0747
                            N
## 2
                                    0700
                            N
## 3
                            N
                                    0842
## 4
                            N
                                    0847
## 5
                            N
                                    0835
## 6
                            N
                                    0836
                                    0738
## 7
                            N
## 8
                            N
                                    0840
## 9
                            N
                                    0840
## 10
                            N
                                    0845
## 11
                            N
                                    0820
                                    0841
## 12
                            N
## 13
                                    0830
                            N
## 14
                            N
                                    0847
## 15
                            N
                                    0700
## 16
                            N
                                    0700
## 17
                            N
                                    0818
## 18
                            N
                                    0843
## 19
                            N
                                    0828
## 20
                            N
                                    0835
## 21
                            N
                                    0841
                                    0741
## 22
                            N
## 23
                            N
                                    0830
## 24
                                    0830
                            N
## 25
                                    0735
```

d. What is the class of precip\_se\_dpx? Grab the data frame nested in precip\_se\_dpx and call it precip\_se\_dpx\_data.

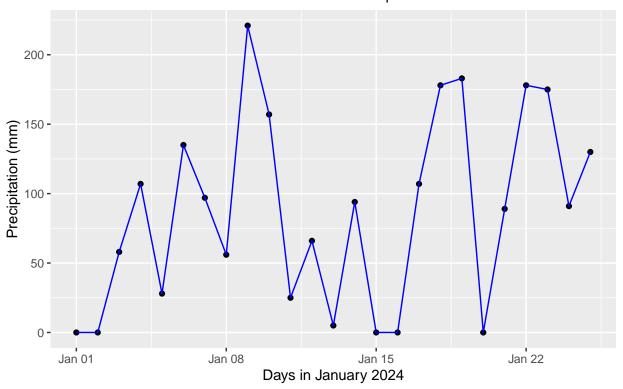
The class of it is ncdc data (which is a list of multiple (2) things).

e. Use ymd\_hms() in the package lubridate to wrangle the date column into the correct format.

```
precip_se_dpx_data$data.date <- ymd_hms(precip_se_dpx_data$data.date)</pre>
```

f. Plot the precipitation data for this site in Portland over time. Rumor has it that we had only one day where it didn't rain. Is that true?

# Precipitation in Portland, Oregon on January 2024 Data sourced from the National Oceanic and Atmospheric Administration

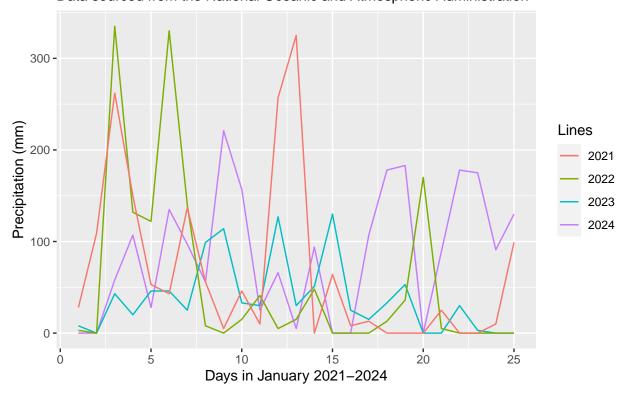


g. (Bonus) Adapt the code to create a visualization that compares the precipitation data for January over the the last four years. Do you notice any trend over time?

```
precip_se_pdx2023 <- data.frame(ncdc(datasetid = "GHCND", stationid = "GHCND:US10RMT0006", datatypeid =</pre>
precip_se_pdx2022 <- data.frame(ncdc(datasetid = "GHCND", stationid = "GHCND:US10RMT0006", datatypeid =</pre>
precip_se_pdx2021 <- data.frame(ncdc(datasetid = "GHCND", stationid = "GHCND:US10RMT0006", datatypeid =</pre>
precip_se_pdx2023$data.date <- ymd_hms(precip_se_pdx2023$data.date)</pre>
precip_se_pdx2022$data.date <- ymd_hms(precip_se_pdx2022$data.date)</pre>
precip_se_pdx2021$data.date <- ymd_hms(precip_se_pdx2021$data.date)</pre>
precip_se_pdx2024 <- precip_se_dpx_data</pre>
precip_se_pdx2024$data.date <- day(precip_se_pdx2024$data.date)</pre>
precip_se_pdx2023$data.date <- day(precip_se_pdx2023$data.date)</pre>
precip_se_pdx2022$data.date <- day(precip_se_pdx2022$data.date)</pre>
precip_se_pdx2021$data.date <- day(precip_se_pdx2021$data.date)</pre>
precip_se_pdx2024$year <- "2024"</pre>
precip se pdx2023$year <- "2023"</pre>
precip_se_pdx2022$year <- "2022"</pre>
precip_se_pdx2021$year <- "2021"</pre>
ggplot(data = precip_se_pdx2024, mapping = aes(x = data.date, y = data.value, color = year)) +
  geom_line() +
  geom_line(data = precip_se_pdx2023) +
  geom_line(data = precip_se_pdx2022) +
  geom_line(data = precip_se_pdx2021) +
```

```
labs(x = "Days in January 2021-2024",
    y = "Precipitation (mm)",
    title = "Precipitation in Portland, Oregon on January 2021-2024",
    subtitle = "Data sourced from the National Oceanic and Atmospheric Administration",
    color = "Lines")
```

# Precipitation in Portland, Oregon on January 2021–2024 Data sourced from the National Oceanic and Atmospheric Administration



We can see that outliers have generally decreased, but also a high level of variance from year to year. In terms of average precipitation, it's a little hard to discern a trend from this data.

#### Problem 2: From API to R

For this problem I want you to grab web data by either talking to an API directly with httr or using an API wrapper. It must be an API that we have NOT used in class or in Problem 1.

Once you have grabbed the data, do any necessary wrangling to graph it and/or produce some summary statistics. Draw some conclusions from your graph and summary statistics.

#### API Wrapper Suggestions for Problem 2

Here are some potential API wrapper packages. Feel free to use one not included in this list for Problem 2.

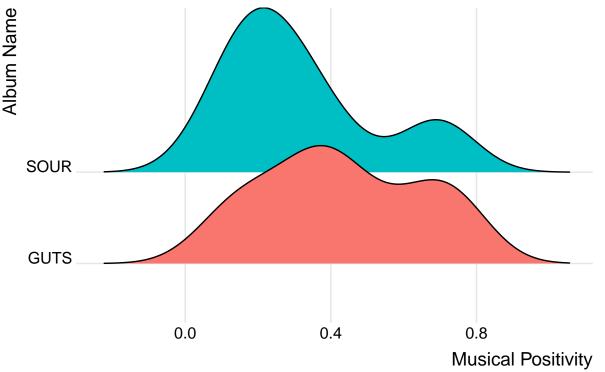
- gtrendsR: "An interface for retrieving and displaying the information returned online by Google Trends is provided. Trends (number of hits) over the time as well as geographic representation of the results can be displayed."
- rfishbase: For the fish lovers
- darksky: For global historical and current weather conditions

This is hidden for my own privacy reasons, but above is code using the spotifyr API wrapped and setting up keys and so.

```
sza_valence <- get_artist_audio_features('sza') %>%
    arrange(-valence) %>%
    select(track_name, valence, album_name) %>%
    filter(album_name != "Dear Evan Hansen (Original Motion Picture Soundtrack)" &
           album_name != "Black Panther The Album Music From And Inspired By" &
           album_name != "Ctrl (Deluxe)")
olivia_valence <- get_artist_audio_features('olivia rodrigo') %>%
    arrange(-valence) %>%
    select(track_name, valence, album_name) %>%
    filter(album_name != "The Hunger Games: The Ballad of Songbirds & Snakes (Music From & Inspired By)
ggplot(olivia_valence, aes(x= valence, y = album_name, fill = album_name)) +
  geom_joy() +
  theme_joy() +
  labs(title = "Density plot of musical happiness for Olivia Rodrigo's albums",
       subtitle = "Musical happiness measured by valence pulled through Spotify's API",
       x = "Musical Positivity",
      y = "Album Name") +
  theme(legend.position = "none")
```

## Density plot of musical happiness for Olivia Rodrigo's albun

Musical happiness measured by valence pulled through Spotify's API

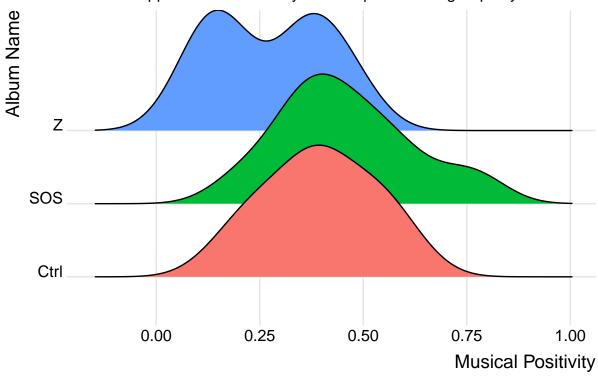


```
ggplot(sza_valence, aes(x= valence, y = album_name, fill = album_name, show.legend = F)) +
  geom_joy() +
  theme_joy() +
  labs(title = "Density plot of musical happiness for SZA's albums",
      subtitle = "Musical happiness measured by valence pulled through Spotify's API",
      x = "Musical Positivity",
      y = "Album Name") +
```

theme(legend.position = "none")

## Density plot of musical happiness for SZA's albums

Musical happiness measured by valence pulled through Spotify's API



I've created two graphs of two hugely popular artists and measured the positivity in their music (instrumentally). It seems that both artists have variance between their albums, which implies personal growth and development in their styles. Olivia's music also generally seems happier than SZA's music. It is interesting how both Olivia's albums are bimodal and SZA's Z album is also that, while the other two SZA albums are nearly a normal distribution in terms of happiness across songs in the album.

### Problem 3: Scraping Reedie Data

Let's see what lovely data we can pull from Reed's own website.

a. Go to https://www.reed.edu/ir/success.html and scrape the two tables.

html\_table(read\_html("https://www.reed.edu/ir/success.html"))

```
## [[1]]
## # A tibble: 10 x 2
##
      Х1
                            Х2
##
      <chr>
                             <chr>
##
    1 Business & Industry
                            28%
##
    2 Education
                            25%
                            19%
##
    3 Self-Employed
##
    4 Students
                            7%
    5 Government Service
                            5%
    6 Health Care
##
                            5%
##
    7 Law
                            4%
##
    8 Miscellaneous
    9 Arts & Communication 2%
```

```
## 10 Community Service
                            1%
##
## [[2]]
## # A tibble: 11 x 4
##
      MBAs
                          JDs
                                                     PhDs
                                                                                MDs
      <chr>
                          <chr>
                                                                                <chr>
##
                                                     <chr>>
    1 U. of Chicago
                          Lewis & Clark Law School U.C., Berkeley
##
                                                                                Oregon~
    2 Portland State U.
                          U.C., Berkeley
                                                     U. of Washington
##
                                                                                U. of ~
##
    3 Harvard U.
                          U. of Oregon
                                                     U. of Chicago
                                                                                Washin~
##
                          U. of Washington
                                                                                UC., S~
    4 U. of Washington
                                                     Stanford U.
    5 Columbia U.
                          New York U.
                                                     U. of Oregon
                                                                                Stanfo~
##
   6 U of Pennsylvania. U. of Chicago
                                                     Harvard U.
                                                                                Harvar~
##
   7 Stanford U.
                          Yale U.
                                                     Cornell U.
                                                                                Case W~
   8 Yale U.
##
                          Harvard U.
                                                     Columbia U.
                                                                                Cornel~
   9 U.C., Berkeley
                          U.C. Hastings Law School U.C., Los Angeles
                                                                                Johns ~
## 10 U. of Oregon
                          Cornell U.
                                                     Yale U.
                                                                                U. of ~
## 11 UC., Los Angeles.
                          Georgetown U.
                                                     U. of Wisconsin, Madison U. of ~
##
## [[3]]
## # A tibble: 5 x 2
##
    X 1
                                                                                X2
##
     <chr>
                                                                             <int>
## 1 National Science Foundation Fellowships
                                                                               191
## 2 Fulbright Students
                                                                               117
## 3 Thomas J. Watson Fellows
                                                                                72
## 4 Guggenheim Fellowships
                                                                                61
## 5 Rhodes Scholars (second highest number from a liberal arts college)
                                                                                32
```

b. Grab and print out the table that is entitled "GRADUATE SCHOOLS MOST FREQUENTLY ATTENDED BY REED ALUMNI". Why is this data frame not in a tidy format?

This data does not seem in a tidy format at all. An example of this would be that rows are not observations in this format. We also notice that columns are not necessarily variables? (or at least not in a tidy way).

alumni\_school <- data.frame(html\_table(read\_html("https://www.reed.edu/ir/success.html"))[2])
alumni\_school</pre>

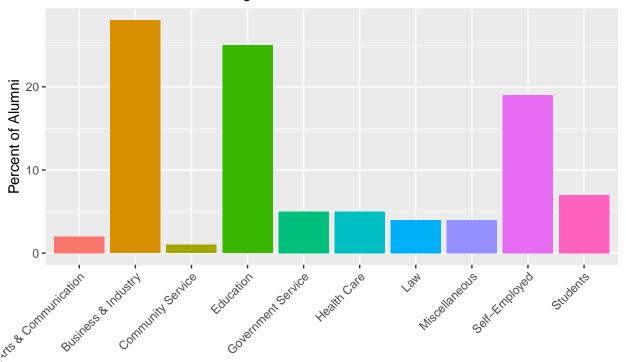
```
##
                     MBAs
                                                  JDs
                                                                           PhDs
           U. of Chicago Lewis & Clark Law School
                                                                U.C., Berkeley
## 1
## 2
       Portland State U.
                                      U.C., Berkeley
                                                              U. of Washington
## 3
              Harvard U.
                                        U. of Oregon
                                                                 U. of Chicago
## 4
        U. of Washington
                                    U. of Washington
                                                                   Stanford U.
             Columbia U.
                                         New York U.
                                                                  U. of Oregon
## 5
      U of Pennsylvania.
                                                                     Harvard U.
## 6
                                       U. of Chicago
## 7
             Stanford U.
                                             Yale U.
                                                                     Cornell U.
                                          Harvard U.
## 8
                  Yale U.
                                                                   Columbia U.
          U.C., Berkeley
                           U.C. Hastings Law School
## 9
                                                             U.C., Los Angeles
## 10
            U. of Oregon
                                          Cornell U.
                                                                        Yale U.
## 11
       UC., Los Angeles.
                                       Georgetown U. U. of Wisconsin, Madison
##
                                MDs
## 1
         Oregon Health & Sci Univ.
## 2
                   U. of Washington
         Washington U. (St. Louis)
## 3
## 4
                 UC., San Fransisco
## 5
                        Stanford U.
## 6
                        Harvard U..
```

```
## 7
           Case Western Reserve U.
## 8
                        Cornell U.
## 9
                  Johns Hopkins U.
## 10 U. of Minnesota, Twin Cities
         U. of Southern California
  c. Wrangle the data into a tidy format. Glimpse the resulting data frame.
temp <- alumni_school %>% gather(key = "variable", value = "value")
tidy alumni school <- data.frame(school = unique(temp$value))
tidy alumni school %% mutate(MBA = ifelse(school %in% alumni school$MBAs, "Yes", "No"),
                              JD = ifelse(school %in% alumni_school$JDs, "Yes", "No"),
                              PhD = ifelse(school %in% alumni_school$PhDs, "Yes", "No"),
                              MD = ifelse(school %in% alumni_school$MDs, "Yes", "No"))
##
                            school MBA JD PhD
## 1
                     U. of Chicago Yes Yes Yes
## 2
                 Portland State U. Yes No No
                        Harvard U. Yes Yes Yes
## 3
## 4
                  U. of Washington Yes Yes Yes
## 5
                       Columbia U. Yes
                                        No Yes
## 6
                U of Pennsylvania. Yes
                                        No
                                           No
## 7
                       Stanford U. Yes
                                        No Yes Yes
## 8
                           Yale U. Yes Yes Yes
                    U.C., Berkeley Yes Yes Yes
## 9
## 10
                      U. of Oregon Yes Yes Yes
## 11
                 UC., Los Angeles. Yes
                                        No
## 12
         Lewis & Clark Law School
                                    No Yes
                                             No
                                                 No
## 13
                       New York U.
                                    No Yes
## 14
          U.C. Hastings Law School No Yes No
                                                No
## 15
                        Cornell U.
                                    No Yes Yes Yes
## 16
                     Georgetown U.
                                    No Yes No
## 17
                 U.C., Los Angeles
                                    No
                                        No Yes
## 18
          U. of Wisconsin, Madison
                                        No Yes No
                                    No
## 19
         Oregon Health & Sci Univ.
                                    No
                                        No
                                             No Yes
## 20
         Washington U. (St. Louis)
                                    No
                                        No
                                             No Yes
## 21
                UC., San Fransisco
                                    No
                                        No
                                             No Yes
## 22
                       Harvard U..
                                             No Yes
                                    No
                                        No
## 23
           Case Western Reserve U.
                                    No
                                        No
                                             No Yes
## 24
                  Johns Hopkins U.
                                    No
                                        No
                                             No Yes
## 25 U. of Minnesota, Twin Cities
                                             No Yes
                                    No
                                        No
## 26
         U. of Southern California
                                    No
                                        No
                                             No Yes
rm(temp)
glimpse(tidy_alumni_school)
## Rows: 26
## Columns: 1
## $ school <chr> "U. of Chicago", "Portland State U.", "Harvard U.", "U. of Wash~
  d. Now grab the "OCCUPATIONAL DISTRIBUTION OF ALUMNI" table and turn it into an appropriate
    graph. What conclusions can we draw from the graph?
# Hint: Use `parse_number()` within `mutate()` to fix one of the columns
alumni_occupation <- data.frame(html_table(read_html("https://www.reed.edu/ir/success.html"))[1])
alumni_occupation <- alumni_occupation %>% mutate(percent = parse_number(alumni_occupation$X2)) %>% sel
```

```
ggplot(data = alumni_occupation, mapping = aes(x = X1, y = percent, fill = X1)) +
  geom_col() +
  labs(x = "Alumni Occupations",
        y = "Percent of Alumni",
        title = "Distribution of Reed College's alumni occupations",
        subtitle = "Data sourced from Reed College 2014 Alumni Database") +
  theme(legend.position = "none",
        axis.text.x = element_text(angle = 45, hjust = 1))
```

# Distribution of Reed College's alumni occupations

Data sourced from Reed College 2014 Alumni Database



#### **Alumni Occupations**

We can draw pretty good conclusions from this graph. It seems like a noticeably high majority of Reedies work in Business & Industry or Education or are self-employed. Almost every other field is under 5%, which tells us that there is also a noticeable portion of Reedies in various fields, but it is most likely going to be difficult to connect with others there due to the small percentage.

e. Let's now grab the Reed graduation rates over time. Grab the data from here.

Do the following to clean up the data:

```
reed_grad <- data.frame(html_table(read_html("https://www.reed.edu/ir/gradrateshist.html"))[1])</pre>
```

• Rename the column names.

```
# Hint
colnames(reed_grad) <- c("enter_year", "cohort_count", "grad_4yr", "grad_5yr", "grad_6yr")</pre>
```

• Remove any extraneous rows.

```
# Hint
reed_grad <- reed_grad %>% slice(2:39)
reed_grad$grad_4yr <- parse_number(reed_grad$grad_4yr, na = c("", "NA"))</pre>
```

```
reed_grad$grad_5yr <- parse_number(reed_grad$grad_5yr, na = c("", "NA"))
reed_grad$grad_6yr <- parse_number(reed_grad$grad_6yr, na = c("", "NA"))</pre>
```

- Reshape the data so that there are columns for
  - Entering class year
  - Cohort size
  - Years to graduation
  - Graduation rate

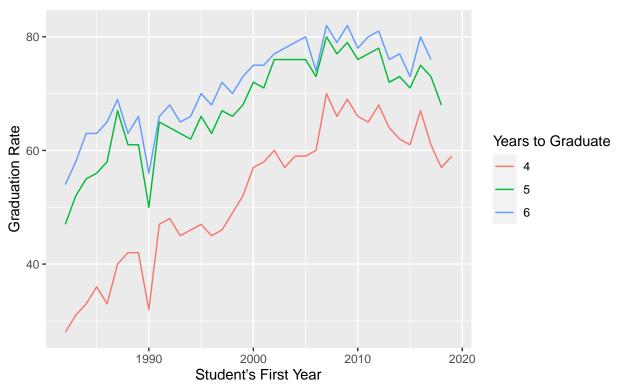
• Make sure each column has the correct class.

They do in this case for the purpose of the analysis in the following graph.

f. Create a graph comparing the graduation rates over time and draw some conclusions.

## How long does it take Reedies to graduate?

Data collected from Reed's Institutional Research



It seems like there generally is always a huge similarity between the ones who graduate in 5 years and in 6 years. It also is interesting how the ones who graduate in 4 years always have a gap between the other 2 regardless of what year it was. The overall graduation rate seems incredibly low, which is not surprising knowing how Reed likes to set its academic support and rigor, but also is very indicative of the college as an education. There seems to be a glaring issue with graduation rates, and it seems like there was work that was done to improve this over time.