Project3

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Notes

Dear TA:

Sometimes when I open my html file, the name of Beyoncé can not be presented correctly. And because I also use "Beyoncé" as conditions for filter in my code, if it's not correctly presented, some code can't work well. Please use "File""Reopen with Encoding"-"UTF-8" for the rmd file, it may help. I also submit a pdf file from dropbox in case the code can not present correctly. Thank you for your consideration!

Prepare packages

library("tidytext")
library("wordcloud")

载入需要的程辑包: RColorBrewer

```
library ("tidyverse")
## -- Attaching core tidyverse packages -
                                                                                           — tidyverse 2.
0.0 ——
## dplyr
              1.1.2
                          ✓ readr
                                       2.1.4
## ✓ forcats 1.0.0
                          ✓ stringr
                                       1.5.0
## J ggplot2 3.4.2
                        √ tibble
                                      3. 2. 1
## ✓ lubridate 1.9.2
                          √ tidyr
                                      1.3.0
## √ purrr
## -- Conflicts --
idyverse conflicts() ——
## X dplyr::filter() masks stats::filter()
## X dplyr::lag() masks stats::lag()
## i Use the conflicted package (<a href="http://conflicted.r-lib.org/">http://conflicted.r-lib.org/</a>) to force all conflicts to become errors
library ("here")
## here() starts at D:/JHU/Term 1/Statistical Computing/Sta_com_proj3
library ("lubridate")
library ("ggplot2")
library ("forcats")
library ("stringr")
```

```
library("textdata")
```

```
rds_files <- c("b_lyrics.RDS", "ts_lyrics.RDS", "sales.RDS")
if (!dir.exists(here("data"))) {
    dir.create(here("data"))
## Check whether we have all 3 files
if (any(!file.exists(here("data", rds_files)))) {
    ## If we don't, then download the data
    b_lyrics <- readr::read_csv("https://raw.githubusercontent.com/rfordatascience/tidytuesday/master/da
ta/2020/2020-09-29/beyonce lyrics.csv")
    ts_lyrics <- readr::read_csv("https://raw.githubusercontent.com/rfordatascience/tidytuesday/master/d
ata/2020/2020-09-29/taylor_swift_lyrics.csv")
    sales <- readr::read csv("https://raw.githubusercontent.com/rfordatascience/tidytuesday/master/data/
2020/2020-09-29/sales.csv")
    ## Then save the data objects to RDS files
    saveRDS(b lyrics, file = here("data", "b lyrics.RDS"))
    saveRDS(ts lyrics, file = here("data", "ts lyrics.RDS"))
    saveRDS(sales, file = here("data", "sales.RDS"))
}
b lyrics <- readRDS(here("data", "b lyrics.RDS"))
```

Part 1: Explore album sales

ts_lyrics <- readRDS(here("data", "ts_lyrics.RDS"))</pre>

sales <- readRDS(here("data", "sales.RDS"))</pre>

In this section, the goal is to explore the sales of studio albums from Beyoncé and Taylor Swift.

Notes

• In each of the subsections below that ask you to create a plot, you must create a title, subtitle, x-axis label, and y-axis label with units where applicable. For example, if your axis says "sales" as an axis label, change it to "sales (in millions)".

Part 1A

In this section, we will do some data wrangling.

- 1. Use lubridate to create a column called released that is a Date class. However, to be able to do this, you first need to use stringr to search for pattern that matches things like this "(US)[51]" in a string like this "September 1, 2006 (US)[51]" and removes them. (Note: to get full credit, you must create the regular expression).
- 2. Use forcats to create a factor called country (Note: you may need to collapse some factor levels).
- 3. Transform the sales into a unit that is album sales in millions of dollars.
- 4. Keep only album sales from the UK, the US or the World.
- 5. Auto print your final wrangled tibble data frame.



```
#1
partla <- sales %>%
  mutate(
    released = str_remove_all(released, "\\([A-Z]{2}\\)\\[[0-9]{2}\\]")
    )
partla$released = mdy(partla$released)
#2
country_levels <- c("AUS", "CAN", "FRA", "JPN", "UK", "US", "World", "WW")
partla$country = factor(partla$country, levels = country_levels)
partla$country <- fct_collapse(partla$country, "World" = c("World", "WW"))
#3
partla$sales = partla$sales/1000000
#4
partla <- filter(partla, country == "UK" | country == "US" | country == "World")
#5
partla</pre>
```

```
## # A tibble: 36 \times 8
##
     artist
                 title
                                country sales released re release label formats
                                <fct>
                   <chr>
                                          <dbl> <date>
                                                           <chr>
                                                                        <chr> <chr>
##
      <chr>
## 1 Taylor Swift Taylor Swift US
                                          5.72 2006-10-24 March 18, · · · Big · · · CD, CD · · ·
## 2 Taylor Swift Fearless
                                World 12
                                                2008-11-11 October 27\cdots Big \cdots CD, CD\cdots
                                          7.18 2008-11-11 October 27. Big ... CD, CD.
  3 Taylor Swift Fearless
                                US
## 4 Taylor Swift Fearless
                                          0.609 2008-11-11 October 27. Big ... CD, CD.
                                UK
                                                                        Big ... CD, CD...
## 5 Taylor Swift Speak Now
                                World
                                          5
                                                2010-10-25 <NA>
                                                                       Big ··· CD, CD···
  6 Taylor Swift Speak Now
                                US
                                          4.69 2010-10-25 (NA)
                                                                       Big ... CD, CD...
   7 Taylor Swift Speak Now
                                          0.169 2010-10-25 <NA>
                                UK
   8 Taylor Swift Red
                                                2012-10-22 <NA>
                                                                       Big ... CD, CD...
                                World
                                                                       Big ··· CD, CD…
## 9 Taylor Swift Red
                                US
                                          4.46 2012-10-22 <NA>
                                          0.693 2012-10-22 <NA>
                                                                        Big ... CD, CD...
## 10 Taylor Swift Red
                                UK
## # 1 26 more rows
```

Part 1B

In this section, we will do some more data wrangling followed by summarization using wrangled data from Part 1A.

- 1. Keep only album sales from the US.
- 2. Create a new column called <code>years_since_release</code> corresponding to the number of years since the release of each album from Beyoncé and Taylor Swift. This should be a whole number and you should round down to "14" if you get a non-whole number like "14.12" years. (Hint: you may find the <code>interval()</code> function from <code>lubridate</code> helpful here, but this not the only way to do this.)
- 3. Calculate the most recent, oldest, and the median years since albums were released for both Beyoncé and Taylor Swift.



```
#1
part1b <- filter(part1a, country == "US")
#2
part1b <- part1b %>%
    mutate(
        years_since_release = round(time_length(interval(released, today()), unit = "year"))
    )

#3
part1b %>%
    group_by(artist) %>%
    summarise(
        most_recent = min(years_since_release),
        oldest = max(years_since_release),
        median = median(years_since_release)
    ) -> part1b_table
part1b_table
```

Part 1C

Using the wrangled data from Part 1A:

- 1. Calculate the total album sales for each artist and for each country (only sales from the UK, US, and World).
- 2. Using the total album sales, create a percent stacked barchart (https://r-graph-gallery.com/48-grouped-barplot-with-ggplot2) using <code>ggplot2</code> of the percentage of sales of studio albums (in millions) along the y-axis for the two artists along the x-axis colored by the <code>country</code>.

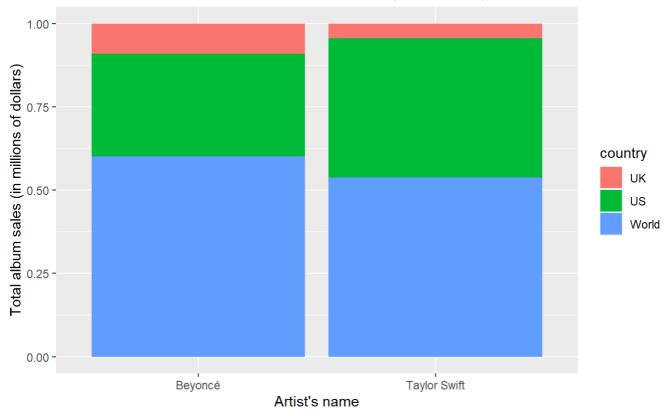
```
#1
part1c <- part1a %>%
  group_by(artist, country) %>%
  summarise(
   total_sales = sum(sales)
)
```

```
## `summarise()` has grouped output by 'artist'. You can override using the
## `.groups` argument.
```

```
#2
ggplot(partlc, aes(fill=country, y=total_sales, x=artist)) +
   geom_bar(position="fill", stat="identity") +
   labs(title = "A percent stacked barchart for album sales of Beyoncé and Taylor Swift", subtitle = "T
most sales were from the worldwide both for Beyoncé and Taylor Swift", x = "Artist's name", y = "Total a
lbum sales (in millions of dollars)", caption = "Made by Li, Z.")
```

A percent stacked barchart for album sales of Beyoncé and Taylor Swift

The most sales were from the worldwide both for Beyoncé and Taylor Swift



Made by Li, Z.

Part 1D

Using the wrangled data from Part 1A, use ggp1ot2 to create a bar plot for the sales of studio albums (in millions) along the x-axis for each of the album titles along the y-axis.

Note:

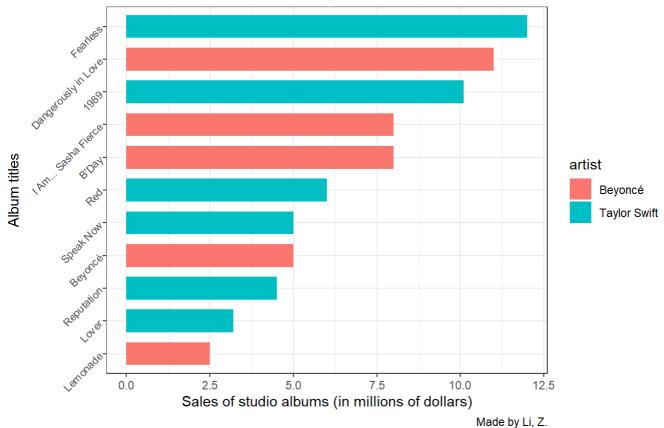
- You only need to consider the global World sales (you can ignore US and UK sales for this part).
- The title of the album must be clearly readable along the y-axis.
- Each bar should be colored by which artist made that album.
- The bars should be ordered from albums with the most sales (top) to the least sales (bottom) (**Note**: you must use functions from forcats for this step).

```
part1d <- subset(part1a, part1a$country == "World")
part1d %>%
    ggplot(aes(sales, fct_reorder(title, sales), fill = artist)) +
    geom_bar(width = 0.7, stat="identity") +
    theme_bw() +
    theme(axis.text.y.left = element_text(size = 8, angle = 45)) +
    labs(title = "World sales of studio albums", subtitle = "Fearless of Taylor Swift had the highest sale
s", x = "Sales of studio albums (in millions of dollars)", y = "Album titles", caption = "Made by Li,
Z.")
```



World sales of studio albums

Fearless of Taylor Swift had the highest sales



Part 1E

Using the wrangled data from Part 1A, use ggp1ot2 to create a scatter plot of sales of studio albums (in millions) along the y-axis by the released date for each album along the x-axis.

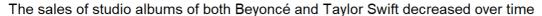
Note:

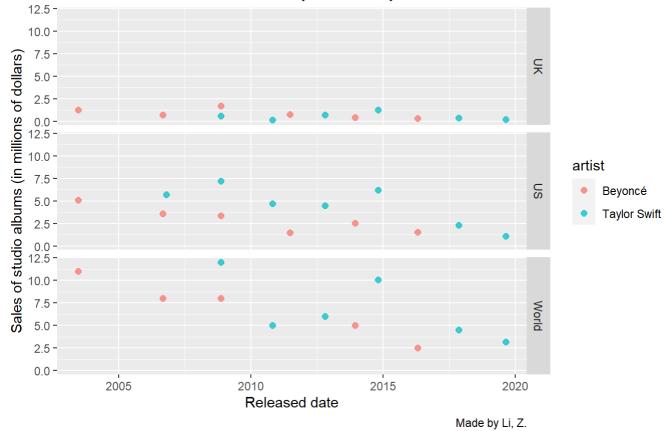
- The points should be colored by the artist.
- There should be three scatter plots (one for UK, US and world sales) faceted by rows.

```
partla %>%
   ggplot(aes(released, sales, color = artist)) +
   geom_point(size = 2, alpha = 0.75) +
   facet_grid(country~.) +
   labs(title = "Sales of studio albums over time", subtitle = "The sales of studio albums of both Beyonc
é and Taylor Swift decreased over time", x = "Released date", y = "Sales of studio albums (in millions o
f dollars)", caption = "Made by Li, Z.")
```



Sales of studio albums over time





Part 2: Exploring sentiment of lyrics

In Part 2, we will explore the lyrics in the $\,b_1yrics\,$ and $\,ts_1yrics\,$ datasets.

Part 2A

Using ts_1yrics , create a new column called line with one line containing the character string for each line of Taylor Swift's songs.

- How many lines in Taylor Swift's lyrics contain the word "hello"? For full credit, show all the rows in ts_lyrics that have "hello" in the line column and report how many rows there are in total.
- How many lines in Taylor Swift's lyrics contain the word "goodbye"? For full credit, show all the rows in ts_lyrics that have "goodbye" in the line column and report how many rows there are in total.

```
ts_lines <-
    ts_lyrics %>%
    unnest_tokens(
        output = line,
        input = Lyrics,
        token = "lines"
)

ts_lines_hello <- subset(ts_lines, grepl("hello", tolower(ts_lines$line)) == T)
ts_lines_hello</pre>
```

```
## # A tibble: 6 \times 4
   Artist
                  Album
                           Title
                                                   line
                                                   <chr>
##
    <chr>
                  <chr>
                           <chr>
## 1 Taylor Swift Fearless Love Story
                                                   "and say, \ "hello\""
                                                  "that i can't say \"hello\" to y…
## 2 Taylor Swift Red
                           I Almost Do
## 3 Taylor Swift Red
                           Everything Has Changed "'cause all i know is we said he…
## 4 Taylor Swift Red
                           Everything Has Changed "'cause all i know is we said he…
## 5 Taylor Swift Red
                           Everything Has Changed "all i know is we said hello"
                           Everything Has Changed "all i know is we said hello"
## 6 Taylor Swift Red
nrow(ts_lines_hello)
## [1] 6
#another solution
detect_line <- function(data, word) {</pre>
  a <- subset(data, grepl(word, tolower(data$line)) == T)
  print(a)
  nrow(a)
detect_line(ts_lines, "hello")
## # A tibble: 6 \times 4
##
    Artist
                 Album
                           Title
                                                  line
                  <chr>
                           <chr>
                                                   <chr>
##
    <chr>
## 1 Taylor Swift Fearless Love Story
                                                  "and say, \"hello\""
                                                  "that i can't say \"hello\" to y…
## 2 Taylor Swift Red
                           I Almost Do
## 3 Taylor Swift Red
                           Everything Has Changed "'cause all i know is we said he…
                           Everything Has Changed "'cause all i know is we said he...
## 4 Taylor Swift Red
## 5 Taylor Swift Red
                           Everything Has Changed "all i know is we said hello"
                           Everything Has Changed "all i know is we said hello"
## 6 Taylor Swift Red
## [1] 6
```

```
detect_line(ts_lines, "goodbye")
```



```
## # A tibble: 12 \times 4
##
      Artist
                   Album
                                Title
                                                            line
##
      <chr>
                   <chr>>
                                <chr>
                                                            <chr>
   1 Taylor Swift Taylor Swift Tied Together With A Smile "goodbye, baby"
                                                            "braced myself for the \cdots
   2 Taylor Swift Speak Now
                                Mine
   3 Taylor Swift Speak Now
                                                            "you gave me all your 1…
                                Back to December
   4 Taylor Swift Speak Now
                                                            "and force us into a go…
                                Long Live
   5 Taylor Swift Red
                                I Almost Do
                                                            "and risk another goodb…
   6 Taylor Swift Red
                                Come Back Be Here
                                                            "stumbled through the 1…
   7 Taylor Swift 1989
                                All You Had to Do Was Stay "but people like me are...
## 8 Taylor Swift reputation
                                Getaway Car
                                                            "said goodbye in "
## 9 Taylor Swift reputation
                                                            "said goodbye in "
                                Getaway Car
                                                            "saying goodbye is deat…
## 10 Taylor Swift Lover
                                Death By A Thousand Cuts
## 11 Taylor Swift Lover
                                Death By A Thousand Cuts
                                                            "'cause saying goodbye …
## 12 Taylor Swift Lover
                                Daylight
                                                            "i'll tell you truth, b…
```

[1] 12

Part 2B

Repeat the same analysis for <code>b_lyrics</code> as described in Part 2A.

```
detect_line(b_lyrics, "hello")
```

```
## # A tibble: 91 \times 6
##
     line
                                  song_id song_name artist_id artist_name song_line
      <chr>>
                                    <dbl> <chr>
                                                         <dbl> <chr>
                                                                               <db1>
##
  1 Hello world, well I just b… 2220711 "Dreamgi…
                                                                                     5
                                                            498 Beyoncé
   2 Hello Stevie, How you feel… 1981227 "Fingert…
                                                            498 Beyoncé
                                                                                     6
   3 Fellow great Americans, he… 2715227 "FREEDOM…
                                                                                    52
                                                            498 Beyoncé
   4 You had me at hello (Hello) 80249 "Hello"
                                                           498 Beyoncé
                                                                                  15
   5 Hello (Hello)
                                    80249 "Hello"
                                                           498 Beyoncé
                                                                                  16
   6 Hello (Hello)
                                    80249 "Hello"
                                                                                  17
                                                           498 Beyoncé
   7 You had me at hello (Hello)
                                    80249 "Hello"
                                                           498 Beyoncé
                                                                                  18
   8 Hello (Hello)
                                    80249 "Hello"
                                                                                  19
                                                           498 Beyoncé
   9 Hello (Hello)
                                    80249 "Hello"
                                                           498 Beyoncé
                                                                                  20
## 10 'Cause you had me at hello… 80249 "Hello"
                                                           498 Beyoncé
                                                                                   24
## # i 81 more rows
```

```
## [1] 91
```

```
detect_line(b_lyrics, "goodbye")
```



```
## # A tibble: 12 \times 6
##
      line
                                  song id song name artist id artist name song line
##
      <chr>
                                                        <db1> <chr>
                                                                              <db1>
                                    <dbl> <chr>
   1 We only said goodbye with · · · 139043 Back to · · ·
                                                            498 Beyoncé
                                                                                   12
   2 We only said goodbye with … 139043 Back to …
                                                            498 Beyoncé
                                                                                   21
  3 We only said goodbye with … 139043 Back to …
                                                            498 Beyoncé
                                                                                   24
  4 Thank God, I found the goo... 51492 Best Thi...
                                                            498 Beyoncé
                                                                                   38
##
   5 Thank God, I found the goo... 1946060 Best Thi...
                                                            498 Beyoncé
                                                                                   42
## 6 Thank God, I found the goo. 4241137 Best Thi.
                                                            498 Beyoncé
                                                                                   38
  7 It's so hard to say goodbye 435491 Gift fro…
                                                                                  23
                                                           498 Beyoncé
## 8 I never want to say goodbye 435491 Gift fro…
                                                           498 Beyoncé
                                                                                  24
  9 I never, ever want to say … 435491 Gift fro…
                                                            498 Beyoncé
                                                                                   25
                                  1844620 Hard To …
                                                                                  29
## 10 We've got to say goodbye
                                                           498 Beyoncé
## 11 Don't have to say goodbye
                                  1224115 Slow Love
                                                          498 Beyoncé
                                                                                 42
## 12 Somewhere between hi and g\cdots 141848 Yes
                                                           498 Beyoncé
                                                                                  27
```

[1] 12

Part 2C

Using the b_lyrics dataset,

- 1. Tokenize each lyrical line by words.
- 2. Remove the "stopwords".
- 3. Calculate the total number for each word in the lyrics.
- 4. Using the "bing" sentiment lexicon, add a column to the summarized data frame adding the "bing" sentiment lexicon.
- 5. Sort the rows from most frequent to least frequent words.
- 6. Only keep the top 25 most frequent words.
- 7. Auto print the wrangled tibble data frame.
- 8. Use ggplot2 to create a bar plot with the top words on the y-axis and the frequency of each word on the x-axis. Color each bar by the sentiment of each word from the "bing" sentiment lexicon. Bars should be ordered from most frequent on the top to least frequent on the bottom of the plot.
- 9. Create a word cloud of the top 25 most frequent words.

```
#1,2
b_words <- b_lyrics %>%
unnest_tokens(
  output = word,
  input = line,
  token = "words"
) %>%
anti_join(stop_words)
```

```
## Joining with `by = join_by(word)`
```



```
#3,5
b_wordnew <- b_words %>%
  count(word, sort = TRUE)
#4
b_wordnew <- inner_join(b_wordnew, get_sentiments("bing"), by = "word")
#6
b_wordnew25 <- b_wordnew[1:25,]
#7
print(b_wordnew25)</pre>
```

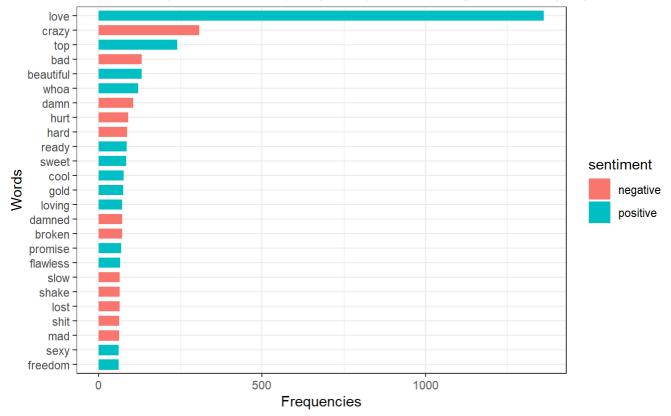
```
## # A tibble: 25 \times 3
##
     word
                    n sentiment
      <chr>
                <int> <chr>
##
##
   1 love
                1362 positive
##
  2 crazy
                  308 negative
                  241 positive
##
  3 top
##
   4 bad
                  132 negative
   5 beautiful 131 positive
##
##
   6 whoa
                  121 positive
##
   7 damn
                  106 negative
##
   8 hurt
                  90 negative
  9 hard
                   87 negative
## 10 ready
                  85 positive
## # i 15 more rows
```

```
#8
b_wordnew25 %>%
    ggplot(aes(n, fct_reorder(word, n), fill = sentiment)) +
    geom_bar(width = 0.7, stat="identity") +
    theme_bw() +
    labs(title = "Word frequencies and sentiments in lyrics of Beyoncé", subtitle = "Love and crazy are the most frequently used positive and negative words by Beyoncé", x = "Frequencies", y = "Words", caption = "Made by Li, Z.")
```



Word frequencies and sentiments in lyrics of Beyoncé

Love and crazy are the most frequently used positive and negative words by Beyoncé



Made by Li, Z.

#9
b_wordnew25 %>%
 with(wordcloud(word, n, max.words = 25))





Part 2D

Repeat the same analysis as above in Part 2C, but for $\t ts_lyrics$.

```
#1,2
ts_words <- ts_lyrics %>%
unnest_tokens(
  output = word,
  input = Lyrics,
  token = "words"
) %>%
anti_join(stop_words)
```

```
## Joining with `by = join_by(word)`
```

```
#3,5
ts_wordnew <- ts_words %>%
   count(word, sort = TRUE)
#4
ts_wordnew <- inner_join(ts_wordnew, get_sentiments("bing"), by = "word")
#6
ts_wordnew25 <- ts_wordnew[1:25,]
#7
print(ts_wordnew25)</pre>
```

```
## # A tibble: 25 \times 3
##
      word
                    n sentiment
##
      <chr>
                <int> <chr>
   1 love
                 248 positive
   2 bad
                   80 negative
   3 shake
                   73 negative
##
   4 break
                  59 negative
   5 mad
                   48 negative
   6 beautiful
                   46 positive
   7 smile
                   45 positive
   8 hate
                   44 negative
  9 fall
                   43 negative
## 10 whoa
                   36 positive
## # i 15 more rows
```

```
#8

ts_wordnew25 %>%

ggplot(aes(n, fct_reorder(word, n), fill = sentiment)) +

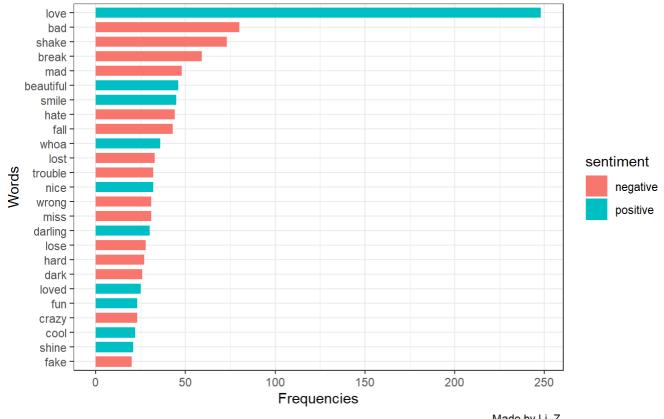
geom_bar(width = 0.7, stat="identity") +

theme_bw() +

labs(title = "Word frequencies and sentiments in lyrics of Taylor Swift", subtitle = "Love and bad a
the most frequently used positive and negative words by Taylor Swift", x = "Frequencies", y = "Words",
aption = "Made by Li, Z.")
```

Word frequencies and sentiments in lyrics of Taylor Swift

Love and bad are the most frequently used positive and negative words by Taylor Swift



Made by Li, Z.

```
#9
ts_wordnew25 %>%
with(wordcloud(word, n, max.words = 25))
```





Part 2E

Using the ts_lyrics dataset,

- 1. Tokenize each lyrical line by words.
- 2. Remove the "stopwords".
- 3. Calculate the total number for each word in the lyrics for each Album.
- 4. Using the "afinn" sentiment lexicon, add a column to the summarized data frame adding the "afinn" sentiment lexicon.
- 5. Calculate the average sentiment score for each Album.
- 6. Auto print the wrangled tibble data frame.
- 7. Join the wrangled data frame from Part 1A (album sales in millions) with the wrangled data frame from #6 above (average sentiment score for each album).
- 8. Using ggplot2, create a scatter plot of the average sentiment score for each album (y-axis) and the album release data along the x-axis. Make the size of each point the album sales in millions.
- 9. Add a horizontal line at y-intercept=0.
- 10. Write 2-3 sentences interpreting the plot answering the question "How has the sentiment of Taylor Swift's albums have changed over time?". Add a title, subtitle, and useful axis labels.

```
#1, 2
ts_words <- ts_lyrics %>%
unnest_tokens(
   output = word,
   input = Lyrics,
   token = "words"
) %>%
anti_join(stop_words)
```

```
## Joining with `by = join_by(word)`
```

```
#3
ts_words_num <- ts_words %>%
group_by(Album, word) %>%
summarise(
    n_eachalbum = n()
)
```

```
## `summarise()` has grouped output by 'Album'. You can override using the
## `.groups` argument.
```

```
#4
ts_words_num <- inner_join(ts_words_num, get_sentiments("afinn"), by = "word")
#5
ts_words_senti <- ts_words_num %>%
  group_by(Album) %>%
  summarise(
   mean_senti = mean(value, na.rm = T)
  )
#6
print(ts_words_senti)
```

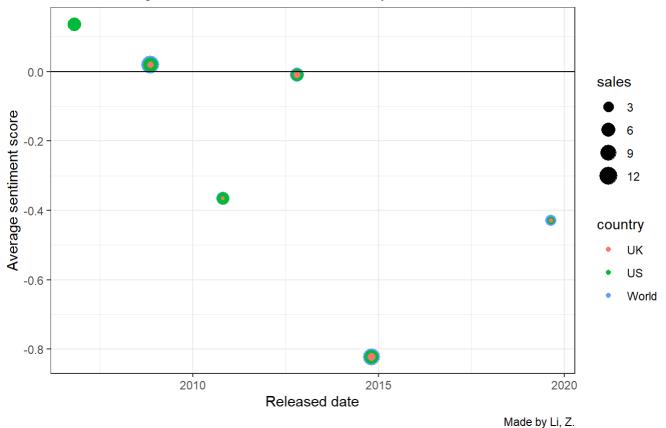


```
## # A tibble: 8 \times 2
##
     Album
                   mean senti
     <chr>
                        <db1>
## 1 1989
                     -0.822
                      0.0192
## 2 Fearless
                     -0.429
## 3 Lover
                     -0.00870
## 4 Red
## 5 Speak Now
                     -0.365
## 6 Taylor Swift
                      0.137
## 7 folklore
                     -0.613
                     -0.495
## 8 reputation
```

```
#7-9
colnames(ts_words_senti) <- c("title", "mean_senti")
ts_join <- inner_join(partla, ts_words_senti, by = "title")
ts_join %>%
    ggplot(aes(released, mean_senti)) +
    geom_point(aes(size = sales, color = country)) +
    geom_hline(aes(yintercept = 0)) +
    theme_bw() +
    labs(title = "The sentiments of Taylor Swift's albums have changed over time", subtitle = "Words with negative sentiment became more in Taylor Swift's albums over time", x = "Released date", y = "Average se ntiment score", caption = "Made by Li, Z.")
```

The sentiments of Taylor Swift's albums have changed over time

Words with negative sentiment became more in Taylor Swift's albums over time





The average sentiment scores of Taylor Swift's albums were greater than 0 before 2010, indicating more positive words than negative words. The average sentiment scores were always lower than 0 after 2010 with fluctuations. The album "1989", which was released in 2014, presented the lowest sentiment score of -0.82.

Part 2E: Another solution

The wrangled data frame from Part 1A has three countries for sales, so the scatter plot didn't combine them to a whole sale(namely, the plot use three points that overlapped with each other instead of a large point to represent the total sale). The step was not mentioned in the instructions. But I think it's more reasonable to combine them, so I do as follows:

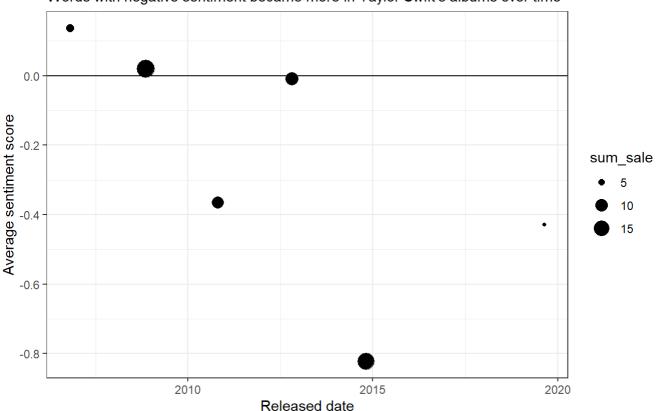
```
partla_new <- partla %>%
  group_by(title, released) %>%
  summarise(
   sum_sale = sum(sales)
)
```

```
## `summarise()` has grouped output by 'title'. You can override using the
## `.groups` argument.
```

```
ts_join_new <- inner_join(partla_new, ts_words_senti, by = "title")
ts_join_new %>%
    ggplot(aes(released, mean_senti)) +
    geom_point(aes(size = sum_sale)) +
    geom_hline(aes(yintercept = 0)) +
    theme_bw() +
    labs(title = "The sentiments of Taylor Swift's albums have changed over time", subtitle = "Words with negative sentiment became more in Taylor Swift's albums over time", x = "Released date", y = "Average se ntiment score", caption = "Made by Li, Z.")
```

The sentiments of Taylor Swift's albums have changed over time

Words with negative sentiment became more in Taylor Swift's albums over time





Made by Li, Z.

R session information

options (width = 120)

sessioninfo::session_info()



```
## — Session info
    setting value
##
    version
             R version 4.3.0 (2023-04-21 ucrt)
             Windows 10 x64 (build 19045)
##
             x86 64, mingw32
##
    system
             RTerm
##
    ui
    language (EN)
##
    collate
             Chinese (Simplified)_China.utf8
##
             Chinese (Simplified)_China.utf8
##
    ctype
##
             America/New_York
    tz
             2023-10-22
##
    date
             3.1.1 @ D:/安装/RStudio/resources/app/bin/quarto/bin/tools/ (via rmarkdown)
##
    pandoc
##
##
  — Packages -
##
    package
                  * version date (UTC) lib source
##
    bslib
                    0.5.0
                            2023-06-09 [1] CRAN (R 4.3.1)
                    1.0.8
                            2023-05-01 [1] CRAN (R 4.3.1)
##
    cachem
##
    cli
                    3. 6. 1
                            2023-03-23 [1] CRAN (R 4.3.0)
                    2.1-0
                            2023-01-23 [1] CRAN (R 4.3.0)
##
    colorspace
##
    digest
                    0.6.31
                            2022-12-11 [1] CRAN (R 4.3.1)
                            2023-04-20 [1] CRAN (R 4.3.0)
##
    dplyr
                  * 1.1.2
##
    evaluate
                    0.21
                            2023-05-05 [1] CRAN (R 4.3.1)
                    1.0.4
                            2023-01-22 [1] CRAN (R 4.3.0)
##
    fansi
##
    farver
                    2.1.1
                            2022-07-06 [1] CRAN (R 4.3.0)
##
                    1.1.1
                            2023-02-24 [1] CRAN (R 4.3.1)
    fastmap
                            2023-01-29 [1] CRAN (R 4.3.1)
##
    forcats
                  * 1.0.0
                    1.6.2
                            2023-04-25 [1] CRAN (R 4.3.1)
##
                    0.1.3
                            2022-07-05 [1] CRAN (R 4.3.0)
##
    generics
##
    ggplot2
                  * 3.4.2
                            2023-04-03 [1] CRAN (R 4.3.0)
                    1.6.2
                            2022-02-24 [1] CRAN (R 4.3.0)
##
    glue
                    0.3.3
                            2023-03-21 [1] CRAN (R 4.3.0)
##
    gtable
##
                  * 1.0.1
                            2020-12-13 [1] CRAN (R 4.3.1)
    here
##
                    0.10
                            2022-12-22 [1] CRAN (R 4.3.1)
    highr
##
                    1.1.3
                            2023-03-21 [1] CRAN (R 4.3.1)
    hms
##
                    0.5.5
                            2023-03-23 [1] CRAN (R 4.3.1)
    htmltools
##
    janeaustenr
                    1.0.0
                            2022-08-26 [1] CRAN (R 4.3.1)
                    0.1.4
##
                            2021-04-26 [1] CRAN (R 4.3.1)
    jquerylib
##
                    1.8.5
                            2023-06-05 [1] CRAN (R 4.3.1)
    jsonlite
##
                    1.43
                            2023-05-25 [1] CRAN (R 4.3.1)
    knitr
##
                    0.4.2
                            2020-10-20 [1] CRAN (R 4.3.0)
    labeling
                            2023-04-05 [2] CRAN (R 4.3.0)
##
                    0.21 - 8
    lattice
##
    lifecycle
                    1.0.3
                            2022-10-07 [1] CRAN (R 4.3.0)
##
    lubridate
                  * 1.9.2
                            2023-02-10 [1] CRAN (R 4.3.1)
                    2.0.3
##
    magrittr
                            2022-03-30 [1] CRAN (R 4.3.0)
##
    Matrix
                    1.6-1
                            2023-08-14 [1] CRAN (R 4.3.1)
##
    munse11
                    0.5.0
                            2018-06-12 [1] CRAN (R 4.3.0)
```

1.9.0

2.0.3

2.5.1

0.3.3

1.0.10

* 1.0.1

##

##

##

##

##

##

##

pillar

purrr

R6

Rcpp

pkgconfig

rappdirs

RColorBrewer * 1.1-3

2023-03-22 [1] CRAN (R 4.3.0)

2019-09-22 [1] CRAN (R 4.3.0)

2023-01-10 [1] CRAN (R 4.3.0)

2021-08-19 [1] CRAN (R 4.3.0)

2021-01-31 [1] CRAN (R 4.3.1)

2022-04-03 [1] CRAN (R 4.3.0)

2023-01-22 [1] CRAN (R 4.3.1)



```
##
                   1.1.1
                           2023-04-28 [1] CRAN (R 4.3.0)
   rlang
##
   rmarkdown
                   2.22
                           2023-06-01 [1] CRAN (R 4.3.1)
                   2.0.3
                           2022-04-02 [1] CRAN (R 4.3.1)
##
   rprojroot
##
   rstudioapi
                   0.14
                           2022-08-22 [1] CRAN (R 4.3.1)
                           2023-05-03 [1] CRAN (R 4.3.1)
##
    sass
                   0.4.6
                   1.2.1
                           2022-08-20 [1] CRAN (R 4.3.0)
##
   scales
   sessioninfo
                   1.2.2
                           2021-12-06 [1] CRAN (R 4.3.1)
##
                   0.7.1
                           2023-04-25 [1] CRAN (R 4.3.0)
##
   SnowballC
##
    stringi
                   1.7.12 2023-01-11 [1] CRAN (R 4.3.0)
   stringr
                 * 1.5.0
                           2022-12-02 [1] CRAN (R 4.3.1)
##
                 * 0.4.4
                           2022-09-02 [1] CRAN (R 4.3.1)
##
    textdata
                           2023-03-20 [1] CRAN (R 4.3.0)
##
   tibble
                 * 3.2.1
                           2023-01-24 [1] CRAN (R 4.3.0)
##
   tidyr
                 * 1.3.0
   tidyselect
                  1.2.0
                           2022-10-10 [1] CRAN (R 4.3.0)
##
                           2023-01-07 [1] CRAN (R 4.3.1)
##
   tidytext
                 * 0.4.1
   tidyverse
                 * 2.0.0
                           2023-02-22 [1] CRAN (R 4.3.1)
##
                           2023-01-11 [1] CRAN (R 4.3.1)
   timechange
                  0.2.0
##
                   0.3.0
                           2022-12-22 [1] CRAN (R 4.3.1)
##
    tokenizers
                   0.4.0
                           2023-05-12 [1] CRAN (R 4.3.1)
##
    tzdb
                           2023-01-31 [1] CRAN (R 4.3.0)
##
   utf8
                   1. 2. 3
                           2023-04-19 [1] CRAN (R 4.3.0)
                   0.6.2
##
   vctrs
                   2.5.0
                           2022-03-03 [1] CRAN (R 4.3.0)
##
   withr
   wordcloud \\
                 * 2.6
                           2018-08-24 [1] CRAN (R 4.3.1)
##
                   0.39
                           2023-04-20 [1] CRAN (R 4.3.1)
##
   xfun
                   2.3.7
                           2023-01-23 [1] CRAN (R 4.3.0)
##
   yam1
##
##
   [1] C:/Users/13392/AppData/Local/R/win-library/4.3
    [2] D:/安装/R-4.3.0/library
##
##
##
```

2023-02-10 [1] CRAN (R 4.3.1)

readr

***** 2.1.4