607 Week 10

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Citiation: Book "Text Mining with R" by Julia Silge & David Robinson- Chapter 2; https://www. tidytextmining.com/sentiment.html

The first section is the example from the "Text Mining with R" and the second section is the extend using sentiment in R.

Section 1

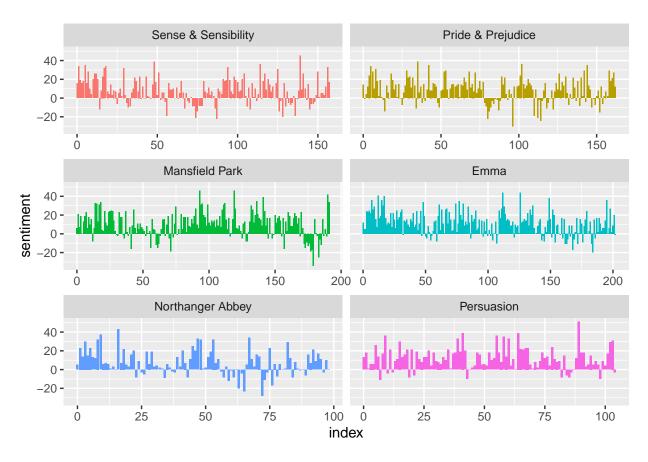
Example in sentiments:

```
library(tidytext)
get_sentiments("afinn")
## # A tibble: 2,477 x 2
##
      word
                 value
##
      <chr>
                 <dbl>
##
   1 abandon
                    -2
##
   2 abandoned
                    -2
   3 abandons
                    -2
##
  4 abducted
                    -2
   5 abduction
                    -2
##
                    -2
##
  6 abductions
                    -3
##
  7 abhor
                    -3
## 8 abhorred
## 9 abhorrent
                    -3
## 10 abhors
                    -3
## # ... with 2,467 more rows
get_sentiments("bing")
```

```
## # A tibble: 6,786 x 2
##
      word
                 sentiment
##
      <chr>
                 <chr>
   1 2-faces
                 negative
   2 abnormal
##
                 negative
##
   3 abolish
                 negative
## 4 abominable negative
## 5 abominably negative
## 6 abominate
                 negative
```

```
## 7 abomination negative
## 8 abort
                 negative
## 9 aborted
                 negative
## 10 aborts
                 negative
## # ... with 6,776 more rows
get_sentiments("nrc")
## # A tibble: 13,875 x 2
##
      word
                 sentiment
##
      <chr>
                 <chr>
##
  1 abacus
                 trust
## 2 abandon
                 fear
## 3 abandon
                 negative
## 4 abandon
                 sadness
## 5 abandoned anger
## 6 abandoned fear
## 7 abandoned negative
## 8 abandoned sadness
## 9 abandonment anger
## 10 abandonment fear
## # ... with 13,865 more rows
library(janeaustenr)
library(dplyr)
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
       intersect, setdiff, setequal, union
##
library(stringr)
tidy_books <- austen_books() %>%
  group_by(book) %>%
  mutate(
    linenumber = row_number(),
    chapter = cumsum(str_detect(text,
                               regex("^chapter [\\divxlc]",
                                      ignore_case = TRUE)))) %>%
  ungroup() %>%
  unnest_tokens(word, text)
```

```
nrc_joy <- get_sentiments("nrc") %>%
 filter(sentiment == "joy")
tidy_books %>%
 filter(book == "Emma") %>%
  inner_join(nrc_joy) %>%
 count(word, sort = TRUE)
## Joining, by = "word"
## # A tibble: 301 x 2
##
     word
                   n
##
      <chr>
               <int>
## 1 good
                 359
## 2 friend
                 166
## 3 hope
                 143
                 125
## 4 happy
## 5 love
                 117
## 6 deal
                 92
## 7 found
                 92
                 89
## 8 present
## 9 kind
                  82
                  76
## 10 happiness
## # ... with 291 more rows
library(tidyr)
jane_austen_sentiment <- tidy_books %>%
  inner_join(get_sentiments("bing")) %>%
  count(book, index = linenumber %/% 80, sentiment) %>%
 pivot_wider(names_from = sentiment, values_from = n, values_fill = 0) %%
 mutate(sentiment = positive - negative)
## Joining, by = "word"
library(ggplot2)
ggplot(jane_austen_sentiment, aes(index, sentiment, fill = book)) +
 geom col(show.legend = FALSE) +
 facet_wrap(~book, ncol = 2, scales = "free_x")
```



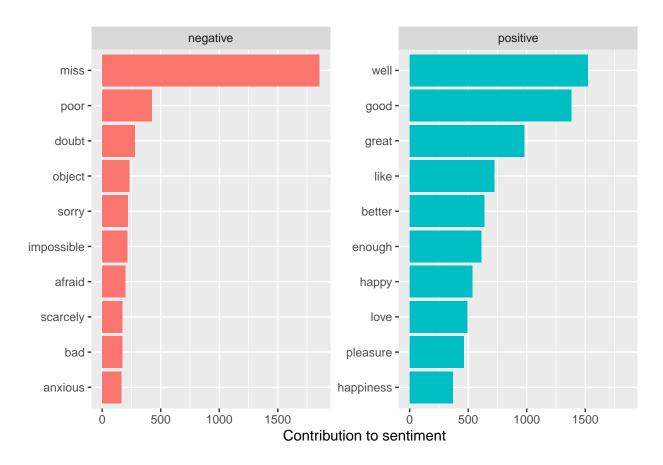
```
pride_prejudice <- tidy_books %>%
  filter(book == "Pride & Prejudice")
pride_prejudice
```

```
## # A tibble: 122,204 x 4
      book
##
                         linenumber chapter word
##
      <fct>
                                       <int> <chr>
                              <int>
##
    1 Pride & Prejudice
                                  1
                                           0 pride
##
    2 Pride & Prejudice
                                  1
                                           0 and
    3 Pride & Prejudice
                                  1
                                           0 prejudice
##
                                  3
                                           0 by
##
    4 Pride & Prejudice
    5 Pride & Prejudice
                                  3
##
                                           0 jane
    6 Pride & Prejudice
                                  3
                                           0 austen
##
##
   7 Pride & Prejudice
                                  7
                                           1 chapter
    8 Pride & Prejudice
                                  7
                                           1 1
    9 Pride & Prejudice
                                 10
                                           1 it
## 10 Pride & Prejudice
                                           1 is
                                 10
## # ... with 122,194 more rows
```

```
afinn <- pride_prejudice %>%
  inner_join(get_sentiments("afinn")) %>%
  group_by(index = linenumber %/% 80) %>%
  summarise(sentiment = sum(value)) %>%
  mutate(method = "AFINN")
```

```
## Joining, by = "word"
bing_and_nrc <- bind_rows(</pre>
  pride_prejudice %>%
    inner_join(get_sentiments("bing")) %>%
    mutate(method = "Bing et al."),
  pride_prejudice %>%
    inner_join(get_sentiments("nrc") %>%
                  filter(sentiment %in% c("positive",
                                           "negative"))
    ) %>%
    mutate(method = "NRC")) %>%
  count(method, index = linenumber %/% 80, sentiment) %>%
  pivot_wider(names_from = sentiment,
               values_from = n,
               values fill = 0) %>%
  mutate(sentiment = positive - negative)
## Joining, by = "word"
## Joining, by = "word"
bind_rows(afinn,
          bing_and_nrc) %>%
  ggplot(aes(index, sentiment, fill = method)) +
  geom_col(show.legend = FALSE) +
  facet_wrap(~method, ncol = 1, scales = "free_y")
                                                AFINN
     50 -
     0 -
                                               Bing et al.
     40 -
sentiment
     20 -
     0 -
   -20 ·
                                                 NRC
     40 -
     20 -
     0 -
                                                                                   150
                                   50
                                                           100
                                                index
```

```
get_sentiments("nrc") %>%
  filter(sentiment %in% c("positive", "negative")) %>%
  count(sentiment)
## # A tibble: 2 x 2
    sentiment n
##
     <chr>
           <int>
## 1 negative 3318
              2308
## 2 positive
get_sentiments("bing") %>%
 count(sentiment)
## # A tibble: 2 x 2
##
   sentiment n
    <chr> <int>
## 1 negative 4781
## 2 positive 2005
bing_word_counts <- tidy_books %>%
  inner_join(get_sentiments("bing")) %>%
  count(word, sentiment, sort = TRUE) %>%
  ungroup()
## Joining, by = "word"
bing_word_counts
## # A tibble: 2,585 x 3
##
     word sentiment
                            n
##
      <chr> <chr> <int>
## 1 miss negative 1855
## 2 well positive 1523
## 3 good positive 1380
## 4 great positive
                        981
## 5 like
              positive
                          725
## 6 better
                          639
              positive
## 7 enough
                          613
             positive
## 8 happy
              positive
                          534
## 9 love
              positive
                          495
## 10 pleasure positive
                          462
## # ... with 2,575 more rows
bing_word_counts %>%
  group_by(sentiment) %>%
  slice_max(n, n = 10) %>%
  ungroup() %>%
  mutate(word = reorder(word, n)) %>%
  ggplot(aes(n, word, fill = sentiment)) +
  geom_col(show.legend = FALSE) +
 facet_wrap(~sentiment, scales = "free_y") +
  labs(x = "Contribution to sentiment",
      y = NULL
```



```
## # A tibble: 1,150 x 2
##
      word
                   lexicon
##
      <chr>
                   <chr>>
##
    1 miss
                   custom
                   SMART
##
    2 a
##
    3 a's
                   SMART
##
    4 able
                   SMART
##
    5 about
                   SMART
    6 above
                   SMART
##
    7 according
                   {\tt SMART}
##
    8 accordingly SMART
##
   9 across
                   SMART
##
## 10 actually
                   SMART
## # ... with 1,140 more rows
```

library(wordcloud)

Loading required package: RColorBrewer

```
tidy_books %>%
  anti_join(stop_words) %>%
  count(word) %>%
  with(wordcloud(word, n, max.words = 100))
```

Joining, by = "word"

```
sister crawford worldimmediately woman walk morning poor
manner obliged hope
    friends catherine
  darcy lady speak love suppose
                 hour
   aunt brought nour marianne
                            anne chapter ത്ര
 return harriet elinor family party
             rest coming answer eyes character word
           doubt
    feel minutes subject woodhouse comfortcaptain passedleave perfectly
         II toung elton oheard bennet people house deallife john t
 þ
       'knightley elizabeth || letter
 thomas colonel
                  ⊇opinion weston
   acquaintance 5
                      hear feelings
       attention
                    heart
       replied happiness
                             o edmund
                                         mother
            happy jane
```

```
library(reshape2)
```

Joining, by = "word"

```
ashamed regret vanity
       mistaken distress dangermisch, trouble worse temper absence disappointment lost bad afraid cold pity anxious indifference impossible strange
      vain poor angry
                                          Sorry wrong fear
               <sub>pain</sub> doubt
                                          object spite difficulty
    excuse
                                                              anxiety
worth praise pleased better
                                                  affection sensible
                                                comfort, instantly
                      enoughhappy
   respect best
excellent wonde
     pleasant pleasure
                                happiness satisfied delightful
          greatest perfectly
```

```
p_and_p_sentences <- tibble(text = prideprejudice) %>%
  unnest_tokens(sentence, text, token = "sentences")
p_and_p_sentences$sentence[2]
## [1] "by jane austen"
austen_chapters <- austen_books() %>%
  group_by(book) %>%
  unnest_tokens(chapter, text, token = "regex",
                pattern = "Chapter|CHAPTER [\\dIVXLC]") %>%
  ungroup()
austen_chapters %>%
  group_by(book) %>%
  summarise(chapters = n())
## # A tibble: 6 x 2
     book
                         chapters
##
     <fct>
                            <int>
## 1 Sense & Sensibility
                               51
```

62

49

56

2 Pride & Prejudice
3 Mansfield Park

4 Emma

```
## 5 Northanger Abbey
## 6 Persuasion
bingnegative <- get_sentiments("bing") %>%
  filter(sentiment == "negative")
wordcounts <- tidy_books %>%
  group_by(book, chapter) %>%
  summarize(words = n())
## 'summarise()' has grouped output by 'book'. You can override using the '.groups' argument.
tidy books %>%
  semi_join(bingnegative) %>%
  group_by(book, chapter) %>%
  summarize(negativewords = n()) %>%
  left_join(wordcounts, by = c("book", "chapter")) %>%
  mutate(ratio = negativewords/words) %>%
  filter(chapter != 0) %>%
  slice_max(ratio, n = 1) %>%
  ungroup()
## Joining, by = "word"
## 'summarise()' has grouped output by 'book'. You can override using the '.groups' argument.
## # A tibble: 6 x 5
##
    book
                        chapter negativewords words ratio
##
     <fct>
                          <int> <int> <int> <dbl>
## 1 Sense & Sensibility
                           43
                                        161 3405 0.0473
                                         111 2104 0.0528
## 2 Pride & Prejudice
                            34
## 3 Mansfield Park
                            46
                                         173 3685 0.0469
## 4 Emma
                            15
                                         151 3340 0.0452
## 5 Northanger Abbey
                           21
                                        149 2982 0.0500
## 6 Persuasion
                                         62 1807 0.0343
```

Section 2

We extend our code by import new sentiments "loughran" an joining into the chapter 2 example from Text Mining with R.

```
get_sentiments("loughran")

## # A tibble: 4,150 x 2

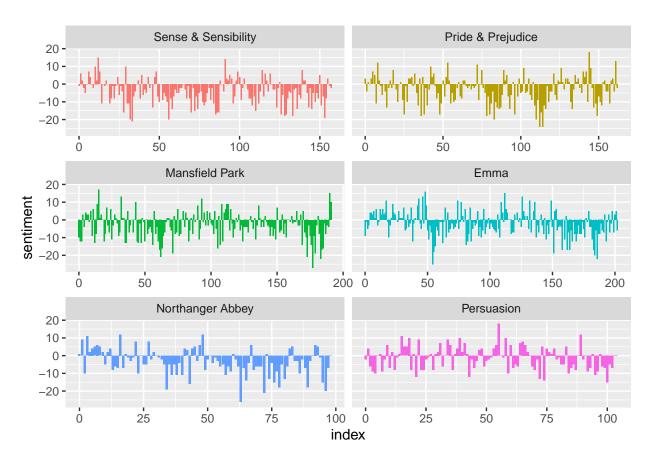
## word sentiment

## <chr> <chr>
## 1 abandon negative
```

4 abandonment negative
5 abandonments negative
6 abandons negative

2 abandoned negative
3 abandoning negative

```
## 7 abdicated
                  negative
## 8 abdicates negative
## 9 abdicating negative
## 10 abdication
                 negative
## # ... with 4,140 more rows
loughran_negative <- get_sentiments("loughran") %>%
  filter(sentiment == "negative")
tidy_books %>%
  filter(book == "Sense & Sensibility") %>%
  inner_join(loughran_negative) %>%
  count(word, sort = TRUE)
## Joining, by = "word"
## # A tibble: 433 x 2
##
     word
##
      <chr>
                <int>
## 1 miss
                 210
## 2 poor
                   71
## 3 against
                   65
## 4 ill
                   50
## 5 doubt
                  46
## 6 impossible
                   36
                   28
## 7 concern
## 8 question
                   28
## 9 suffered
                   27
## 10 distress
                   26
## # ... with 423 more rows
loughran_sentiment <- tidy_books %>%
  inner_join(get_sentiments("loughran")) %>%
  count(book, index = linenumber %/% 80, sentiment) %>%
 pivot_wider(names_from = sentiment, values_from = n, values_fill = 0) %>%
 mutate(sentiment = positive - negative)
## Joining, by = "word"
ggplot(loughran_sentiment, aes(index, sentiment, fill = book)) +
 geom_col(show.legend = FALSE) +
 facet_wrap(~book, ncol = 2, scales = "free_x")
```



```
get_sentiments("loughran") %>%
filter(sentiment %in% c("positive", "negative", "uncertainty", "litigious")) %>%
count(sentiment)
```

```
## # A tibble: 4 x 2
## sentiment n
## <chr> <int>
## 1 litigious 904
## 2 negative 2355
## 3 positive 354
## 4 uncertainty 297
```

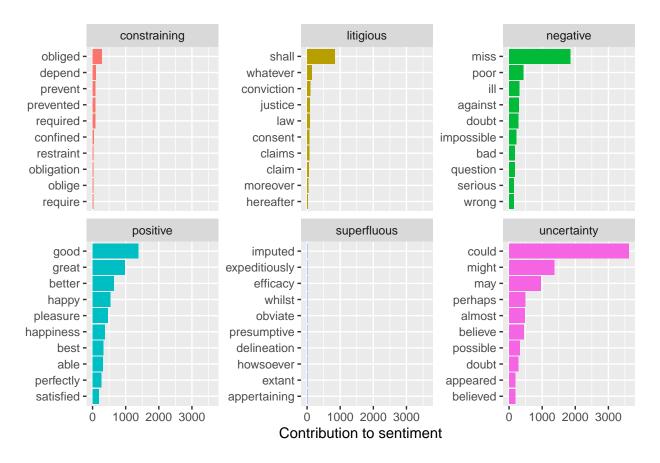
```
loughran_word_counts <- tidy_books %>%
  inner_join(get_sentiments("loughran")) %>%
  count(word, sentiment, sort = TRUE) %>%
  ungroup()
```

Joining, by = "word"

loughran_word_counts

```
## # A tibble: 1,374 x 3
## word sentiment n
## <chr> <chr> <chr> <int>
```

```
##
    1 could
               uncertainty
                             3613
##
    2 miss
                             1855
               negative
##
    3 good
               positive
                             1380
##
    4 might
               uncertainty
                             1369
##
    5 great
               positive
                              981
##
               uncertainty
                              956
    6 may
    7 shall
               litigious
                              834
##
                              639
##
    8 better
               positive
##
    9 happy
               positive
                              534
                              491
## 10 perhaps uncertainty
## # ... with 1,364 more rows
```



```
stop_words)
custom_stop_words
## # A tibble: 1,150 x 2
##
      word
                  lexicon
##
      <chr>
                   <chr>
##
    1 miss
                   custom
    2 a
                   SMART
##
                   SMART
##
    3 a's
                   SMART
##
    4 able
                   SMART
    5 about
##
    6 above
                   SMART
##
    7 according
                   SMART
##
    8 accordingly SMART
                   SMART
    9 across
## 10 actually
                   SMART
## # ... with 1,140 more rows
tidy_books %>%
  anti_join(stop_words) %>%
  count(word) %>%
  with(wordcloud(word, n, max.words = 100))
```

Joining, by = "word"



```
tidy_books %>%
  inner_join(get_sentiments("loughran")) %>%
  count(word, sentiment, sort = TRUE) %>%
  acast(word ~ sentiment, value.var = "n", fill = 0) %>%
  comparison.cloud(colors = c("gray20", "gray80"),
                  max.words = 100)
## Joining, by = "word"
## Warning in comparison.cloud(., colors = c("gray20", "gray80"), max.words = 100):
## imputed could not be fit on page. It will not be plotted.
## Warning in comparison.cloud(., colors = c("gray20", "gray80"), max.words = 100):
## delineation could not be fit on page. It will not be plotted.
## Warning in comparison.cloud(., colors = c("gray20", "gray80"), max.words = 100):
## appertaining could not be fit on page. It will not be plotted.
## Warning in comparison.cloud(., colors = c("gray20", "gray80"), max.words = 100):
## howsoever could not be fit on page. It will not be plotted.
## Warning in comparison.cloud(., colors = c("gray20", "gray80"), max.words = 100):
## hereafter could not be fit on page. It will not be plotted.
## Warning in comparison.cloud(., colors = c("gray20", "gray80"), max.words = 100):
## opportunity could not be fit on page. It will not be plotted.
## Warning in comparison.cloud(., colors = c("gray20", "gray80"), max.words = 100):
## enjoyment could not be fit on page. It will not be plotted.
```



```
filter(sentiment == "negative")
wordcounts <- tidy_books %>%
  group_by(book, chapter) %>%
  summarize(words = n())
## 'summarise()' has grouped output by 'book'. You can override using the '.groups' argument.
tidy_books %>%
  semi_join(loughran_negative) %>%
  group_by(book, chapter) %>%
  summarize(negativewords = n()) %>%
  left_join(wordcounts, by = c("book", "chapter")) %>%
  mutate(ratio = negativewords/words) %>%
  filter(chapter != 0) %>%
  slice max(ratio, n = 1) %>%
  ungroup()
## Joining, by = "word"
## 'summarise()' has grouped output by 'book'. You can override using the '.groups' argument.
## # A tibble: 6 x 5
```

loughran_negative <- get_sentiments("loughran") %>%

| ## | | book | chapter | ${\tt negativewords}$ | words | ratio |
|----|---|---------------------|-------------|-----------------------|-------------|-------------|
| ## | | <fct></fct> | <int></int> | <int></int> | <int></int> | <dbl></dbl> |
| ## | 1 | Sense & Sensibility | 15 | 82 | 2524 | 0.0325 |
| ## | 2 | Pride & Prejudice | 11 | 52 | 1606 | 0.0324 |
| ## | 3 | Mansfield Park | 11 | 73 | 2417 | 0.0302 |
| ## | 4 | Emma | 51 | 74 | 2370 | 0.0312 |
| ## | 5 | Northanger Abbey | 13 | 83 | 3117 | 0.0266 |
| ## | 6 | Persuasion | 24 | 42 | 1587 | 0.0265 |

Summary

Sentiment analysis provides a way to understand the attitudes and opinions expressed in texts. When we did chapter 2's sample, we found it exciting and able to help us search for the book we love in a second. Then we decided to use a sentiment with more attributes to understand better the attitudes and opinions expressed in texts from the books.