Intelligent Systems - NLP Deliverable

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The goal of this document is to analyze the book *Harry Potter and the Order of the Phoenix* which was published on June 21, 2003.

Indeed, it is the Harry Potter book with the highest number of words. We will try to look to the words which are used (total number of words, total number of unique words, characters, word frequency etc.) and find patterns in the text.

Thanks to this analysis, we will see that is possible to know who are the most important characters of the book and answer some interesting questions such as:

- Who is Harry's closest friend?
- Is this book a negative or positive book?

Preparation

Check working directory

Attaching package: 'ggplot2'

In this project, we don't have to check the working directory. Indeed, the corpus is hosted online and we'll only need to import it using its link.

Load libraries

```
library(reshape2)
library(NLP)
library(stringr)
library(tm)
library(SnowballC)
library(wordcloud)

## Loading required package: RColorBrewer

library(RColorBrewer)
library(syuzhet)
library(ggplot2)
```

```
## The following object is masked from 'package:NLP':
##
## annotate

library(rJava)
.jinit(parameters="-Xmx4g")
library(openNLP)
library(openNLPmodels.en)
```

Load corpus

The text file is hosted online on my GithHub repository.

```
file = "https://github.com/racilk/Harry-Potter-NLP/blob/main/hp.txt?raw=true"
text = readLines(file)
corpus = Corpus(VectorSource(text))
```

We can check the length of the corpus:

```
length(corpus)
```

```
## [1] 9296
```

Create a default term document matrix

```
tdm = TermDocumentMatrix(corpus)

tdm

## <<TermDocumentMatrix (terms: 24207, documents: 9296)>>
## Non-/sparse entries: 193250/224835022
## Sparsity : 100%
## Maximal term length: 95
## Weighting : term frequency (tf)

length(dimnames(tdm)$Terms)
```

```
## [1] 24207
```

There are 24207 words in this book. Let's sum the content of all terms (i.e., rows) and see the frequency of the terms just shown.

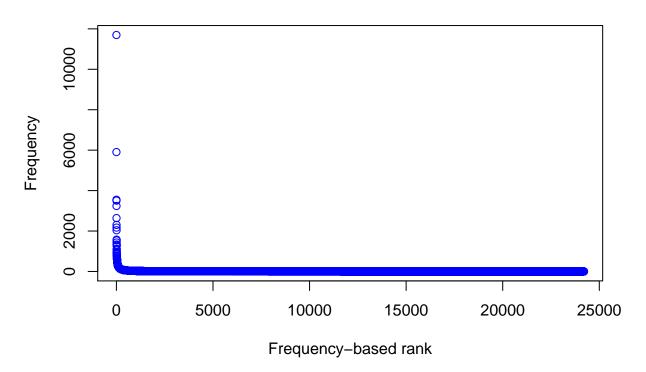
```
freq=rowSums(as.matrix(tdm))
head(freq,10)
```

```
##
        and
                        order phoenix
                                          potter
                                                      the rowling chapter
               harry
##
       5905
                2640
                           65
                                     21
                                              62
                                                    11696
                                                                  1
                                                                          43
##
        one demented
##
        412
                   1
```

If we plot those frequencies ordered, we can see how the corpus behaves following Zipf's law.

plot(sort(freq, decreasing = T),col="blue",main="Word frequencies", xlab="Frequency-based rank", ylab =

Word frequencies



We can now print the ten most frequent terms. Given that we haven't done any transformation on the text file yet, it will mostly be stopwords.

```
tail(sort(freq),n=10)
                         had harry
                                           said
                                                                the
    with
          that
                                      his
                                                         and
                  you
                                                   was
          2038
                 2170
                              2640
                                     3239
                                           3504
                                                  3549
                                                        5905 11696
```

An other measure of the vocabulary richness of the book will be the number of words which appear once:

```
sum(freq == 1)
```

[1] 12600

We can check that 12600 terms out of 24207 only appear once in our corpus.

Create a TDM after applying transformations to the corpus

We will now apply transformations to the text in order to delete the stopwords, the numbers, the punctuation etc. First, we can print the different transformations and the stopwords.

getTransformations()

```
## [1] "removeNumbers" "removePunctuation" "removeWords"
## [4] "stemDocument" "stripWhitespace"
```

stopwords()

```
[1] "i"
                        "me"
                                                                   "we"
##
                                      "my"
                                                     "myself"
##
     [6] "our"
                        "ours"
                                      "ourselves"
                                                     "you"
                                                                   "your"
                                                    "he"
                        "yourself"
                                                                   "him"
##
    [11] "yours"
                                      "yourselves"
##
    [16] "his"
                        "himself"
                                      "she"
                                                     "her"
                                                                   "hers"
    [21] "herself"
                        "it"
                                      "its"
                                                    "itself"
##
                                                                   "they"
                                                                   "what"
##
   [26] "them"
                        "their"
                                      "theirs"
                                                     "themselves"
                        "who"
                                                    "this"
##
    [31] "which"
                                      "whom"
                                                                   "that"
##
    [36] "these"
                        "those"
                                      "am"
                                                     "is"
                                                                   "are"
                        "were"
                                      "be"
                                                                   "being"
##
    [41] "was"
                                                    "been"
   [46] "have"
                        "has"
                                      "had"
                                                     "having"
                                                                   "do"
##
                                                                   "should"
##
    [51] "does"
                        "did"
                                      "doing"
                                                     "would"
                        "ought"
##
   [56] "could"
                                      "i'm"
                                                    "you're"
                                                                   "he's"
    [61] "she's"
                        "it's"
                                      "we're"
                                                    "they're"
                                                                   "i've"
##
                                                    "i'd"
    [66] "you've"
                        "we've"
                                      "they've"
                                                                   "you'd"
##
    [71] "he'd"
                        "she'd"
                                      "we'd"
                                                     "they'd"
                                                                   "i'11"
##
                                                    "we'11"
                        "he'11"
                                      "she'11"
                                                                   "they'll"
##
    [76] "you'll"
   [81] "isn't"
                        "aren't"
                                      "wasn't"
                                                    "weren't"
                                                                   "hasn't"
##
   [86] "haven't"
                        "hadn't"
                                      "doesn't"
                                                    "don't"
                                                                   "didn't"
    [91] "won't"
                        "wouldn't"
                                      "shan't"
                                                                   "can't"
##
                                                    "shouldn't"
                                                    "let's"
  [96] "cannot"
                        "couldn't"
                                      "mustn't"
                                                                   "that's"
##
                        "what's"
                                      "here's"
## [101] "who's"
                                                    "there's"
                                                                   "when's"
## [106] "where's"
                        "why's"
                                      "how's"
                                                    "a"
                                                                   "an"
## [111] "the"
                        "and"
                                      "but"
                                                    "if"
                                                                   "or"
## [116] "because"
                        "as"
                                      "until"
                                                    "while"
                                                                   "of"
                                      "for"
## [121] "at"
                        "by"
                                                    "with"
                                                                   "about"
                                      "into"
                                                     "through"
                                                                   "during"
## [126] "against"
                        "between"
## [131] "before"
                                                                   "to"
                        "after"
                                      "above"
                                                    "below"
## [136] "from"
                        "up"
                                      "down"
                                                    "in"
                                                                   "out"
## [141] "on"
                        "off"
                                      "over"
                                                    "under"
                                                                   "again"
## [146] "further"
                        "then"
                                      "once"
                                                     "here"
                                                                   "there"
                                                    "how"
                                                                   "all"
## [151] "when"
                        "where"
                                      "why"
## [156] "any"
                        "both"
                                      "each"
                                                    "few"
                                                                   "more"
                                                                   "no"
## [161] "most"
                        "other"
                                      "some"
                                                     "such"
## [166] "nor"
                        "not"
                                      "only"
                                                     "own"
                                                                   "same"
## [171] "so"
                        "than"
                                      "too"
                                                    "very"
```

Let's apply the different transformations:

```
corpus = tm_map(corpus, content_transformer(tolower))
```

```
## Warning in tm_map.SimpleCorpus(corpus, content_transformer(tolower)):
## transformation drops documents
```

```
corpus = tm_map(corpus,removeWords,stopwords())
## Warning in tm_map.SimpleCorpus(corpus, removeWords, stopwords()): transformation
## drops documents
corpus = tm_map(corpus,removePunctuation)
## Warning in tm_map.SimpleCorpus(corpus, removePunctuation): transformation drops
## documents
corpus = tm_map(corpus,removeNumbers)
## Warning in tm_map.SimpleCorpus(corpus, removeNumbers): transformation drops
## documents
corpus = tm_map(corpus,stripWhitespace)
## Warning in tm_map.SimpleCorpus(corpus, stripWhitespace): transformation drops
## documents
Let's inspect the beginning of the book to be sure that the transformations have correctly been applied.
inspect(corpus[1:50])
## <<SimpleCorpus>>
## Metadata: corpus specific: 1, document level (indexed): 0
## Content: documents: 50
## [1] harry potter order phoenix
## [2] j k rowling
## [3]
## [4] chapter one
## [5] dudley demented
## [6] hottest day summer far drawing close drowsy silence lay large square houses privet drive cars
## [7]
        skinny blackhaired bespectacled boy pinched slightly unhealthy look someone grown lot short sp
##
   [8]
        whole harry thought congratulated idea hiding perhaps comfortable lying hot hard earth hand no
## [9]
        almost though thought fluttered open window vernon dursley harrys uncle suddenly spoke
## [10]
        glad see boys stopped trying butt anyway
## [11] know said aunt petunia unconcerned house
## [12] uncle vernon grunted
## [13] watching news said scathingly like know really normal boy cares news dudley got clue going dou
## [14] vernon shh said aunt petunia windows open
## [15]
        oh yes sorry dear
## [16]
        dursleys fell silent harry listened jingle fruit n bran breakfast cereal watched mrs figg batt
## [17]
        dudders tea
## [18] polkisses said aunt petunia fondly got many little friends popular
## [19] harry suppressed snort difficulty dursleys really astonishingly stupid son dudley swallowed di
```

opening notes music heralded seven oclock news reached harrys ears stomach turned perhaps toni,

[21] record numbers stranded holidaymakers fill airports spanish baggagehandlers strike reaches sec ## [22] give em lifelong siesta snarled uncle vernon end newsreaders sentence matter outside flowerbed

[20]

```
let long slow breath stared brilliant blue sky every day summer tension expectation temporary
        kept listening just case small clue recognised really muggles unexplained disappearance perhap
## [24]
        harry closed eyes now blazing evening sky newsreader said finally bungy budgie found novel way
## [25]
        harry opened eyes reached waterskiing budgerigars nothing else worth hearing rolled cautiously
## [26]
        moved two inches several things happened quick succession
## [27]
## [28]
         loud echoing crack broke sleepy silence like gunshot cat streaked parked car flew sight shriek
## [29]
         harry felt though head split two eyes streaming swayed trying focus street spot source noise b
         put away uncle vernon snarled harrys ear now anyone sees
## [30]
## [31]
         get harry gasped seconds struggled harry pulling uncles sausagelike fingers left hand right ma
## [32]
        panting harry fell forwards hydrangea bush straightened stared around sign caused loud cracking
## [33]
        lovely evening shouted uncle vernon waving mrs number seven opposite glaring behind net curtain
         continued grin horrible manic way curious neighbours disappeared various windows grin became g
## [34]
        harry moved steps closer taking care stop just short point uncle vernons outstretched hands re
## [35]
         devil mean boy asked uncle vernon croaky voice trembled fury
## [36]
## [37]
         mean said harry coldly kept looking left right street still hoping see person made cracking no
## [38]
         making racket like starting pistol right outside
## [39]
         make noise said harry firmly
         aunt petunias thin horsy face now appeared beside uncle vernons wide purple one looked livid
## [40]
## [41]
         lurking window
## [42]
         yes yes good point petunia window boy
## [43]
        listening news said harry resigned voice
## [44]
         aunt uncle exchanged looks outrage
## [45]
         listening news
## [46]
        well changes every day see said harry
        clever boy want know really give listening news tosh know perfectly well lot
## [47]
## [48]
         careful vernon breathed aunt petunia uncle vernon lowered voice harry barely hear lot get news
```

dursleys goggled seconds aunt petunia said nasty little liar lowered voice harry lipread next

Then, we build the TDM of the transformed corpus in order to display the ten most frequent words (it shouldn't be stopwords now).

```
corpus_dtm = TermDocumentMatrix(corpus)
dtm_m = as.matrix(corpus_dtm)
dtm_v = sort(rowSums(dtm_m),decreasing=TRUE)
dtm_d = data.frame(word = names(dtm_v),freq=dtm_v)
head(dtm_d, 10)
```

```
##
                word freq
## said
                said 3917
## harry
               harry 3750
## hermione hermione 1223
## ron
                ron 1191
## back
                back 783
## now
                 now
                      659
                      644
## just
                just
## well
                well
                      638
                know
                      602
## know
                      590
## sirius
              sirius
```

know said harry

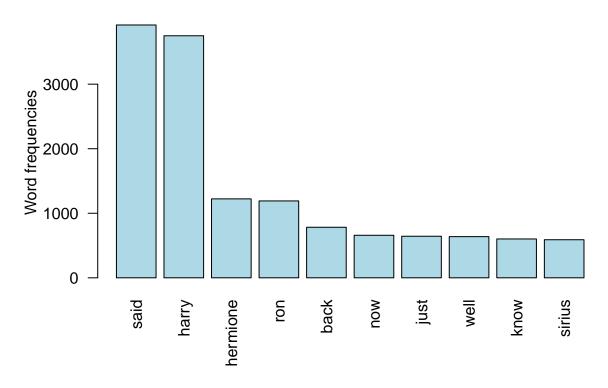
[49]

[50]

Given that there is a lot of dialogues in this book, the most frequent word is the verb "said".

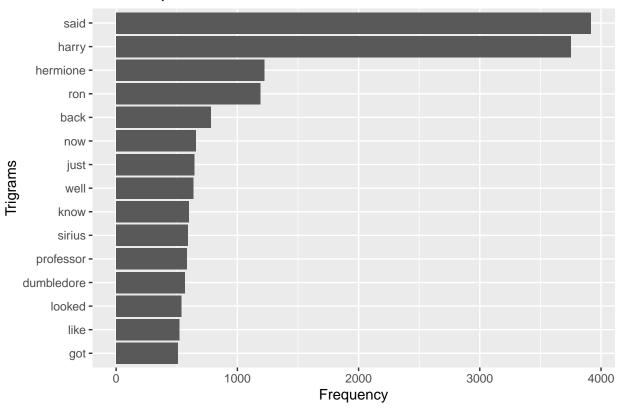
It is also possible to plot the most frequent words in another way:

Most frequent words

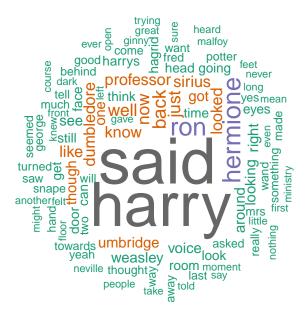


```
ggplot(head(dtm_d,15), aes(reorder(word,freq), freq)) +
  geom_bar(stat="identity") + coord_flip() +
  xlab("Trigrams") + ylab("Frequency") +
  ggtitle("Most frequent words")
```

Most frequent words



We can also generate a word cloud of the book:



We can see that Ron and Hermione are Harry's best friends. Finally, it is also clear that Sirius and Dumbledore are also close to Harry.

Words with a frequency >= 5

```
corpus_bag = findFreqTerms(corpus_dtm, lowfreq = 5)
class(corpus_bag)

## [1] "character"

#We can print some of the words that are in our bag of words
corpus_bag[1:50]
```

```
"phoenix"
                                                    "potter"
                                                                   "chapter"
##
    [1] "harry"
                       "order"
##
    [6]
        "one"
                       "dudley"
                                      "back"
                                                    "banned"
                                                                   "boy"
##
                       "cars"
                                                    "cool"
   [11] "breeze"
                                      "close"
                                                                   "day"
   [16] "drawing"
                       "drive"
                                                    "dusty"
                                      "due"
                                                                   "emerald"
                                      "flowerbed"
                                                    "four"
                                                                   "gleaming"
   [21]
        "far"
                       "flat"
                                      "houses"
                                                    "large"
                                                                   "lawns"
##
   [26]
        "green"
                       "hope"
                                                                   "outside"
   [31]
        "lay"
                       "left"
                                      "lying"
                                                    "number"
   [36]
        "person"
                       "privet"
                                      "retreated"
                                                    "shade"
                                                                   "silence"
        "square"
                       "stood"
                                      "summer"
                                                    "thrown"
                                                                   "use"
   [41]
                                      "wide"
## [46] "usual"
                       "usually"
                                                    "windows"
                                                                   "appearance"
```

Sentiment Analysis

In this part, we are going to discover if the overall sentiment of this book is positive or negative. First, we'll need a list of positive and negative words.

```
pos_file = "http://ptrckprry.com/course/ssd/data/positive-words.txt"
poswords = scan(pos_file, what='character', comment.char=';')
poswords[1:50]
##
    [1] "a+"
                           "abound"
                                               "abounds"
                                                                  "abundance"
       "abundant"
                           "accessable"
                                               "accessible"
                                                                  "acclaim"
##
    [5]
        "acclaimed"
                           "acclamation"
                                               "accolade"
                                                                  "accolades"
    [9]
##
  [13]
        "accommodative"
                           "accomodative"
                                               "accomplish"
                                                                  "accomplished"
  [17] "accomplishment"
                           "accomplishments"
                                              "accurate"
                                                                  "accurately"
  [21] "achievable"
                           "achievement"
                                               "achievements"
                                                                  "achievible"
  [25] "acumen"
                           "adaptable"
                                               "adaptive"
                                                                  "adequate"
##
  [29]
        "adjustable"
                           "admirable"
                                               "admirably"
                                                                  "admiration"
## [33] "admire"
                           "admirer"
                                                                  "admiringly"
                                               "admiring"
## [37]
        "adorable"
                           "adore"
                                               "adored"
                                                                  "adorer"
## [41]
        "adoring"
                           "adoringly"
                                               "adroit"
                                                                  "adroitly"
  [45]
       "adulate"
                           "adulation"
                                               "adulatory"
                                                                  "advanced"
##
  [49] "advantage"
                           "advantageous"
neg_file = "http://ptrckprry.com/course/ssd/data/negative-words.txt"
negwords = scan(neg_file, what='character', comment.char=';')
negwords[1:50]
##
    [1] "2-faced"
                         "2-faces"
                                          "abnormal"
                                                           "abolish"
##
    [5] "abominable"
                         "abominably"
                                          "abominate"
                                                           "abomination"
##
    [9] "abort"
                         "aborted"
                                          "aborts"
                                                           "abrade"
## [13] "abrasive"
                         "abrupt"
                                          "abruptly"
                                                           "abscond"
  [17] "absence"
                         "absent-minded" "absentee"
                                                           "absurd"
##
## [21] "absurdity"
                         "absurdly"
                                          "absurdness"
                                                           "abuse"
## [25]
                         "abuses"
                                          "abusive"
                                                           "abysmal"
        "abused"
  [29]
        "abysmally"
                         "abyss"
                                          "accidental"
                                                           "accost"
##
##
  [33] "accursed"
                         "accusation"
                                          "accusations"
                                                           "accuse"
   [37] "accuses"
                         "accusing"
                                          "accusingly"
                                                           "acerbate"
  [41] "acerbic"
                         "acerbically"
                                          "ache"
                                                           "ached"
   [45]
        "aches"
                         "achev"
                                          "aching"
                                                           "acrid"
   [49] "acridly"
                         "acridness"
```

After that, based on these lists, we can find how many positive and negative words there are in our bag.

```
match_pos = match(corpus_bag, poswords)
match_pos[1:200]
##
     [1]
            NA
                   NA
                               NA
                                    NA
                                          NA
                                                NA
                                                      NΑ
                                                            NA
                                                                  NA
                                                                       234
                                                                              NA
                                                                                    NΑ
                                                                                         360
                                                                                                NA
                        NΑ
##
    [16]
            NA
                   NA
                         NA
                               NA
                                     NA
                                          NA
                                                NA
                                                      NA
                                                            NA
                                                                  NA
                                                                        NA
                                                                              NA
                                                                                    NA
                                                                                          NA
                                                                                                NA
##
    [31]
                  NA
                              NA
                                          NA
                                                NA
                                                                              NA
                                                                                          NA
                                                                                                NA
            NA
                         NA
                                    NA
                                                      NA
                                                            NA
                                                                  NA
                                                                        NA
                                                                                    NA
##
    [46]
            NA
                  NA
                         NA
                              NA
                                     NA
                                          NA
                                                NA
                                                      NA
                                                            NA
                                                                  NA
                                                                        NA
                                                                              NA
                                                                                    NA
                                                                                          NA
                                                                                                NA
    [61]
            NA
                  NA
                              NA
                                    NA
                                          NA
                                                NA
                                                      NA
                                                            NA
                                                                  NA
                                                                        NA
                                                                              NA
                                                                                    NA
                                                                                          NA
                                                                                                NA
##
                        NA
```

```
[76]
                                                                                  309
            NA
                  NA
                        NA
                              NA
                                    NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                 NA
                                                                       NA
                                                                             NA
                                                                                         NA
                                                                                               NA
    [91]
##
            NA
                  NA
                        NA
                              NA
                                    NA
                                          NA
                                              927
                                                     NA
                                                           NA
                                                                 NA
                                                                       NA
                                                                             NA
                                                                                   NA
                                                                                         NA
                                                                                              NA
## [106]
            NA
                  NA
                        NA
                              NA
                                    NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                 NA
                                                                       NA
                                                                             NA
                                                                                   NA
                                                                                         NA
                                                                                               NA
## [121]
            NA
                  NA
                        NA
                             805
                                    NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                 NA
                                                                       NA
                                                                             NA
                                                                                   NA
                                                                                         NA
                                                                                              NA
## [136]
            NA
                  NA
                        NA
                              NA 1088
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                 NA
                                                                       NA
                                                                             NA
                                                                                   NA
                                                                                         NA
                                                                                              NA
## [151]
                              NA
                                                NA
                                                                             NA
                                                                                              NA
            NA
                  NA
                        NA
                                    NA
                                          NA
                                                      NA
                                                           NA
                                                                 NA
                                                                       NA
                                                                                   NA
                                                                                         NA
## [166] 1300
                  NA
                        NA
                              NA 1604
                                          NA
                                                NA
                                                                       NA
                                                                             NA
                                                                                   NA
                                                                                         NA
                                                                                               NA
                                                     NA
                                                           NA
                                                                 NA
## [181]
            NA
                  NA
                       751
                              NA
                                    NA
                                          NA 1319
                                                      NA
                                                           NA
                                                                 NA
                                                                       NA
                                                                             NA
                                                                                   NA
                                                                                         NA
                                                                                               NA
## [196]
            NA
                  NA
                        NA
                              NA
                                    NA
```

```
match_pos_bool = !is.na(match(corpus_bag, poswords))
match_pos_bool[1:200]
```

```
##
                            [1] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE
##
                      [13] FALSE TRUE FALSE FA
##
                      [25] FALSE F
                     [37] FALSE FALSE
##
                    [49] FALSE FALSE
                    [61] FALSE FALSE
##
                      [73] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
##
                     [85] FALSE FALSE FALSE
                                                                                                                                                   TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
                                                 TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
## [109] FALSE FALSE
               [121] FALSE FALSE FALSE
                                                                                                                                                      TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
              [133] FALSE 
              [145] FALSE FALSE
## [157] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
                                                                                                                                                                                                                                                                                                                                                           TRUE FALSE FALSE
## [169] FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
## [181] FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
## [193] FALSE FALSE FALSE FALSE FALSE FALSE FALSE
```

```
sum(!is.na(match(corpus_bag, poswords)))
```

[1] 220

There are 220 positive words in our bag (positive words which appear at list five times in the book).

```
sum(!is.na(match(corpus_bag, negwords)))
```

[1] 417

There are 417 negative words in our bag (negative words which appear at list five times in the book).

We can calculate the overall score of the book Harry Potter and the Order of the Phoenix:

```
score = sum(!is.na(match(corpus_bag, poswords))) - sum(!is.na(match(corpus_bag, negwords)))
score
```

```
## [1] -197
```

We can conclude that this book is a negative book which is the case because there many wars in this story.

Conclusions

Let's sum up all the facts that we found by analyzing the text of this book:

- Ron and Hermione are Harry's best friends
- Sirius and Dumbledore are also close to Harry
- There are many dialogues in the book (said is the most frequent word of the book)
- There are about twice as many negative words as positive words in the book: this is a negative book, bad things happen in this story

12