## R Notebook

This is an R Markdown Notebook. When you execute code within the notebook, the results appear beneath the code.

Try executing this chunk by clicking the Run button within the chunk or by placing your cursor inside it and pressing Ctrl+Shift+Enter.

Add a new chunk by clicking the *Insert Chunk* button on the toolbar or by pressing Ctrl+Alt+I.

When you save the notebook, an HTML file containing the code and output will be saved alongside it (click the Preview button or press Ctrl+Shift+K to preview the HTML file).

The preview shows you a rendered HTML copy of the contents of the editor. Consequently, unlike *Knit*, *Preview* does not run any R code chunks. Instead, the output of the chunk when it was last run in the editor is displayed.

```
library(tidyverse) # metapackage of all tidyverse packages
## -- Attaching packages ------ tidyverse 1.3.0 --
## v ggplot2 3.3.2
                     v purrr
                              0.3.4
## v tibble 3.0.4
                     v dplyr
                              1.0.3
## v tidyr
          1.1.2
                     v stringr 1.4.0
## v readr
           1.4.0
                     v forcats 0.5.0
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
library(tokenizers)
library(stopwords)
library(tm)
## Loading required package: NLP
##
## Attaching package: 'NLP'
## The following object is masked from 'package:ggplot2':
##
##
      annotate
##
## Attaching package: 'tm'
## The following object is masked from 'package:stopwords':
##
##
      stopwords
library(text2vec)
library(NbClust)
library(cluster)
```

library(factoextra)

```
## Welcome! Want to learn more? See two factoextra-related books at https://goo.gl/ve3WBa
library(dbscan)
```

## Wczytanie i przetworzenie danych

```
data = read.csv("mbti_1.csv")
n <- 1000 #sample from data
data <- data[sample(nrow(data), n), ]</pre>
INTJ <- data[data$type=="INTJ",]</pre>
INTP <- data[data$type=="INTP",]</pre>
ENTJ <- data[data$type=="ENTJ",]</pre>
ENTP <- data[data$type=="ENTP",]</pre>
INFJ <- data[data$type=="INFJ",]</pre>
INFP <- data[data$type=="INFP",]</pre>
ENFJ <- data[data$type=="ENFJ",]</pre>
ENFP <- data[data$type=="ENFP",]</pre>
ISTJ <- data[data$type=="ISTJ",]</pre>
ISFJ <- data[data$type=="ISFJ",]</pre>
ESTJ <- data[data$type=="ESTJ",]</pre>
ESFJ <- data[data$type=="ESFJ",]</pre>
ISTP <- data[data$type=="ISTP",]</pre>
ISFP <- data[data$type=="ISFP",]</pre>
ESTP <- data[data$type=="ESTP",]</pre>
ESFP <- data[data$type=="ESFP",]</pre>
#replaces URLs with word "link"
#removes all noise from text
data$posts <- gsub('[^a-zA-Z]', " ", data$posts)</pre>
#removes more than 1 space
data$posts <- gsub('[]{2,}', " ", data$posts)</pre>
#word tokenization and stemming
data$posts <- tokenize_word_stems(data$posts, stopwords = stopwords::stopwords("en"))</pre>
#create dictionary
iterator = itoken(data$posts)
vocab = create_vocabulary(iterator)
pruned_vocab = prune_vocabulary(vocab,
                                 term_count_min = 5,
                                 doc_proportion_max = 0.7,
                                 doc_proportion_min = 0.1)
pruned_vocab
## Number of docs: 1000
## 0 stopwords: ...
## ngram_min = 1; ngram_max = 1
## Vocabulary:
```

```
##
           term term_count doc_count
##
                       106
         spent
                                  100
     1:
##
     2:
        plus
                       108
                                  100
                       109
                                  100
##
    3:
           warm
##
    4:
           upon
                        110
                                  100
##
    5: brought
                       111
                                  101
## ---
## 831:
                                  640
          thank
                      1625
## 832:
           intj
                      1750
                                  489
## 833:
                                  500
           infp
                      1847
## 834:
           infj
                      1857
                                  466
## 835:
                                  678
           link
                      3527
```

### Wektoryzacja

```
#document term matrix
vectorizer = vocab vectorizer(pruned vocab)
dtm = create_dtm(iterator, vectorizer)
#(Term Co-occurrence Matrix)
tcm = create_tcm(iterator, vectorizer, skip_grams_window = 5L)
#tf_idf
tf_idf = TfIdf$new()
\# fit tf-idf to training data
dt_tfidf = fit_transform(dtm, tf_idf)
# apply pre-trained tf-idf transformation to testing data
#doc_term_test_tfidf = transform(doc_term_test, tf_idf)
vectors.dtm <- dtm</pre>
vectors.tfidf <- dt_tfidf</pre>
dim(dtm)
## [1] 1000 835
##########
# glove #
##########
glove = GlobalVectors$new(rank = 50, x_max = 10)
wv_main = glove$fit_transform(tcm, n_iter = 100, convergence_tol = 0.01, n_threads = 8)
## INFO [20:47:49.654] epoch 1, loss 0.1706
## INFO [20:47:49.852] epoch 2, loss 0.1066
## INFO [20:47:50.048] epoch 3, loss 0.0942
## INFO [20:47:50.219] epoch 4, loss 0.0877
## INFO [20:47:50.363] epoch 5, loss 0.0837
## INFO [20:47:50.514] epoch 6, loss 0.0809
## INFO [20:47:50.654] epoch 7, loss 0.0788
## INFO [20:47:50.797] epoch 8, loss 0.0772
## INFO [20:47:50.939] epoch 9, loss 0.0758
## INFO [20:47:51.084] epoch 10, loss 0.0748
## INFO [20:47:51.234] epoch 11, loss 0.0739
## INFO [20:47:51.366] epoch 12, loss 0.0732
```

```
## INFO [20:47:51.510] epoch 13, loss 0.0726
## INFO [20:47:51.511] Success: early stopping. Improvement at iterartion 13 is less then convergence_
wv_context = glove$components
word_vectors = wv_main + t(wv_context)
#wv = glove$get_word_vectors()
#dim(wv)
#wv
\#If your goal is to classify documents - I doubt any doc2vec approach will beat bag-of-words/ngrams.
#If you still want to try - common simple strategy short documents (< 20 words) is to represent documen
#test= word_vectors["link", , drop=F]
\#\cos sim \ rom = sim2(x = word \ vectors, \ y = test, \ method = "cosine", \ norm = "l2")
#head(sort(cos_sim_rom[,1], decreasing = T), 10)
common_terms = intersect(colnames(dtm), rownames(word_vectors) )
dtm_averaged = normalize(dtm[, common_terms], "l1")
# you can re-weight dtm above with tf-idf instead of "l1" norm
sentence_vectors = dtm_averaged %*% word_vectors[common_terms, ]
vectors.glove <- sentence_vectors</pre>
#split rows into single post not 50
library(tidyr)
library(dplyr)
data2 = read.csv("mbti 1.csv")
data2 <- data2[sample(nrow(data2), 50), ]# do 200 jakoś idzie
#replaces URLs with word "link"
data2 <-data2 %>%
   mutate(posts = strsplit(as.character(posts), "\\|\\|")) %>%
   unnest(posts)
data2$posts <- gsub('[^a-zA-Z]', " ", data2$posts)</pre>
#removes more than 1 space
data2$posts <- gsub('[]{2,}', " ", data2$posts)</pre>
data2<-subset(data2, sapply(strsplit(posts, " "), length) >=8)
#word tokenization and stemming
data2$posts <- tokenize_word_stems(data2$posts, stopwords = stopwords::stopwords("en"))</pre>
#create dictionary
iterator2 = itoken(data2$posts)
vocab2 = create_vocabulary(iterator2)
pruned_vocab2 = prune_vocabulary(vocab2,
                                term_count_min = 5,
                                doc_proportion_max = 0.8,
                                doc_proportion_min = 0.001)
```

```
#document term matrix
vectorizer2 = vocab_vectorizer(pruned_vocab2)
dtm2 = create dtm(iterator2, vectorizer2)
#(Term Co-occurrence Matrix)
tcm2 = create tcm(iterator2, vectorizer2, skip grams window = 5L)
glove2 = GlobalVectors$new(rank = 50, x max = 10)
wv_main2 = glove2$fit_transform(tcm2, n_iter = 100, convergence_tol = 0.01, n_threads = 8)
## INFO
        [20:47:52.800] epoch 1, loss 0.1302
## INFO
        [20:47:52.833] epoch 2, loss 0.0738
## INFO
        [20:47:52.868] epoch 3, loss 0.0596
## INFO
        [20:47:52.904] epoch 4, loss 0.0516
## INFO
         [20:47:52.941] epoch 5, loss 0.0462
## INFO
         [20:47:52.974] epoch 6, loss 0.0420
## INFO
         [20:47:53.019] epoch 7, loss 0.0386
## INFO
        [20:47:53.052] epoch 8, loss 0.0358
## INFO
        [20:47:53.087] epoch 9, loss 0.0334
## INFO
         [20:47:53.127] epoch 10, loss 0.0313
         [20:47:53.162] epoch 11, loss 0.0295
## INFO
## INFO
        [20:47:53.202] epoch 12, loss 0.0280
## INFO
         [20:47:53.239] epoch 13, loss 0.0266
## INFO
        [20:47:53.272] epoch 14, loss 0.0254
## INFO
         [20:47:53.306] epoch 15, loss 0.0242
## INFO
        [20:47:53.344] epoch 16, loss 0.0232
## INFO
         [20:47:53.378] epoch 17, loss 0.0223
## INFO
         [20:47:53.417] epoch 18, loss 0.0215
## INFO
         [20:47:53.458] epoch 19, loss 0.0208
         [20:47:53.503] epoch 20, loss 0.0201
## INFO
         [20:47:53.542] epoch 21, loss 0.0194
## INFO
## INFO
         [20:47:53.579] epoch 22, loss 0.0188
## INFO
        [20:47:53.614] epoch 23, loss 0.0183
## INFO
        [20:47:53.656] epoch 24, loss 0.0178
## INFO
         [20:47:53.691] epoch 25, loss 0.0173
## INFO
         [20:47:53.727] epoch 26, loss 0.0169
## INFO
         [20:47:53.780] epoch 27, loss 0.0165
## INFO
         [20:47:53.823] epoch 28, loss 0.0161
## INFO
         [20:47:53.872] epoch 29, loss 0.0158
## INFO
        [20:47:53.920] epoch 30, loss 0.0154
## INFO
        [20:47:53.968] epoch 31, loss 0.0151
## INFO
         [20:47:54.015] epoch 32, loss 0.0148
## INFO
         [20:47:54.056] epoch 33, loss 0.0145
## INFO
         [20:47:54.104] epoch 34, loss 0.0142
         [20:47:54.144] epoch 35, loss 0.0140
## INFO
## INFO
         [20:47:54.188] epoch 36, loss 0.0137
         [20:47:54.226] epoch 37, loss 0.0135
## INFO
## INFO
         [20:47:54.262] epoch 38, loss 0.0133
## INFO
        [20:47:54.297] epoch 39, loss 0.0131
## INFO
        [20:47:54.333] epoch 40, loss 0.0129
        [20:47:54.366] epoch 41, loss 0.0127
## INFO
## INFO
        [20:47:54.403] epoch 42, loss 0.0125
        [20:47:54.442] epoch 43, loss 0.0123
## INFO
```

```
## INFO [20:47:54.485] epoch 44, loss 0.0122
## INFO [20:47:54.526] epoch 45, loss 0.0120
## INFO [20:47:54.571] epoch 46, loss 0.0119
## INFO [20:47:54.616] epoch 47, loss 0.0117
## INFO [20:47:54.658] epoch 48, loss 0.0116
## INFO [20:47:54.693] epoch 49, loss 0.0114
## INFO [20:47:54.733] epoch 50, loss 0.0113
## INFO [20:47:54.770] epoch 51, loss 0.0112
## INFO [20:47:54.807] epoch 52, loss 0.0110
## INFO [20:47:54.842] epoch 53, loss 0.0109
## INFO [20:47:54.877] epoch 54, loss 0.0108
## INFO [20:47:54.915] epoch 55, loss 0.0107
## INFO [20:47:54.956] epoch 56, loss 0.0106
## INFO [20:47:54.996] epoch 57, loss 0.0105
## INFO [20:47:54.996] Success: early stopping. Improvement at iterartion 57 is less then convergence_
wv_context2 = glove2$components
word_vectors2 = wv_main2 + t(wv_context2)
#wv = glove$get_word_vectors()
#dim(wv)
#wυ
#If your goal is to classify documents - I doubt any doc2vec approach will beat bag-of-words/ngrams.
#If you still want to try - common simple strategy short documents (< 20 words) is to represent documen
#test= word_vectors["link", , drop=F]
\#cos\_sim\_rom = sim2(x = word\_vectors, y = test, method = "cosine", norm = "l2")
#head(sort(cos_sim_rom[,1], decreasing = T), 10)
common_terms = intersect(colnames(dtm2), rownames(word_vectors2) )
dtm_averaged = normalize(dtm2[, common_terms], "11")
# you can re-weight dtm above with tf-idf instead of "l1" norm
sentence_vectors2 = dtm_averaged %*% word_vectors2[common_terms, ]
vectors.glove_post <- sentence_vectors2</pre>
```

## Grupowanie

#### K-medoids

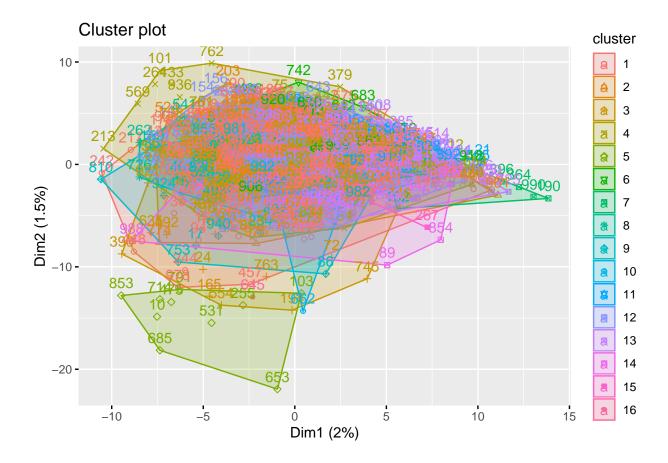
```
pam.dtm = pam(dtm, 16, metric = "euclidean", stand = FALSE)
pam.tfidf = pam(dt_tfidf, 16, metric = "euclidean", stand = FALSE)
pam.glove = pam(sentence_vectors, 16, metric = "euclidean")
pam.glove2 = pam(sentence_vectors2, 16, metric = "euclidean", stand = FALSE)
```

#### K-medoids DTM

```
pam_results_dtm <- data %>%
mutate(cluster = pam.dtm$clustering) %>%
group_by(cluster)

pam_results <- subset(pam_results_dtm, select = c(type, cluster))
t <- table(pam_results)
print ("Wyniki ilosciowe grupowania dla dtm")</pre>
```

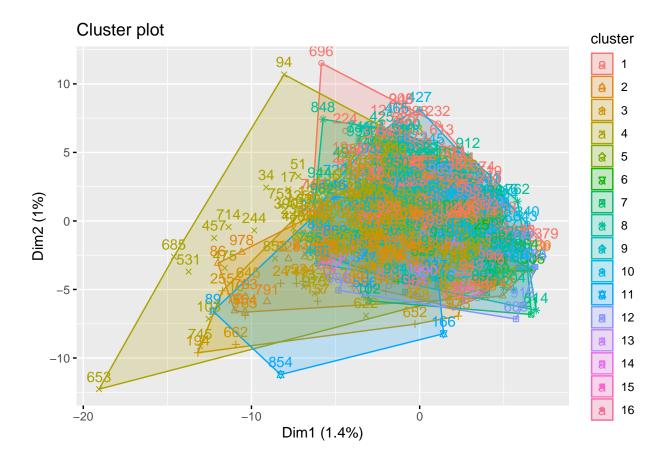
```
## [1] "Wyniki ilosciowe grupowania dla dtm"
print (t)
         cluster
##
## type
           1
              2
                 3
                    4
                       5
                           6
                              7
                                 8
                                    9 10 11 12 13 14 15 16
##
     ENFJ
           8
              6
                 0
                    6
                       0
                           1
                              0
                                 1
                                    0
                                       0
                                          0
                                             4
                                                3
                                                   1
##
     ENFP 17 10
                 8 13
                       1
                          5
                              0
                                 3
                                    0
                                       3
                                          2
                                             9
                                                7
                                                   2
                                                       0
##
     ENTJ 14
             5 1
                   4
                       0
                          0
                              0
                                 0
                                          1 13
                                                5
                                    0
                                       0
##
     ENTP 16 8 8 27
                       1
                          3
                              0
                                 0
                                    1
                                       0
                                          0
                                             3 13
                                                   1
                          0
                              0
                                             2
##
     ESFJ
          1
              1
                 1
                    0
                       1
                                 0
                                    0
                                       0
                                          0
##
     ESFP
           2
              1
                 0
                    2
                       0
                          0
                              0
                                 0
                                    0
                                       0
                                          0
                                             0
                                                0
                                                   0
##
     ESTJ 0
                 0
                    3
                       0
                          0
                              0
                                 0
                                    0
                                          0
                                             1
##
     ESTP
           2
                       0
                              0
                                 0
             1
                 1 4
                          1
                                    0
                                       0
                                          0
                                             1
                                                2
                                                   1
                                                       0
     INFJ 92
              8
                 9 11
                          5
                              2
                                                   2
##
                       0
                                 5
                                    1
                                       0
                                          4
                                             7
                                               13
##
     INFP 51 35
                 2 18
                       3
                          8
                              3
                                 2
                                    0
                                       0 12 25 36
                                                   5
##
     INTJ 34
             6
                 2 20
                       1
                          1
                              1 17
                                    2
                                          1 15 15
##
     INTP 31
             3
                 3 29
                       3
                          3
                              0
                                 0 15
                                       0
                                          3 15 28
##
     ISFJ
              7
                    2
                       0
                          2
                              1
                                 0
                                             8
                                    1
                                       0
                                          1
##
           2 2 0
                   5
                       0
                          0
                              0
                                 0
                                             9
                                                6
     ISFP
                                    1
                                       0
                                          1
##
                       0
                                 0
                                          0
                                             3
                                                2
     ISTJ 6
             1
                 1
                    8
                          0
                              0
                                    0
                                       0
     ISTP 18
             3
                 1
                    3
                       0
                          2
                              2
##
                                 0
                                    1
                                       0
                                          3
                                             4
                                                5
t2 <- round(t/rowSums(t)*100)
t2 <- cbind(t2,rowSums(t))</pre>
print ("Wyniki procentowe grupowania dla dtm")
## [1] "Wyniki procentowe grupowania dla dtm"
print (t2)
         1
            2
               3
                  4
                     5 6 7
                             8
                               9 10 11 12 13 14 15 16
## ENFJ 27 20
               0 20
                     0 3 0
                             3
                                0
                                   0
                                      0 13 10
                                               3
                                                         30
## ENFP 21 12 10 16
                     1 6 0
                             4
                                0
                                   4
                                      2 11
                                               2
                                                         80
                                            9
                                                  0
                                                      0
## ENTJ 33 12
                                      2 30 12
               2
                  9
                     0 0 0
                             0
                                0
                                   0
                                               0
                                                  0
                                                      0
                                                         43
## ENTP 19 10 10 33
                     1 4 0
                             0
                                1
                                   0
                                      0
                                         4 16
                                               1
                                                         83
                                                  1
                                                     1
## ESFJ 17 17 17
                  0 17 0 0
                             0
                                0
                                   0
                                      0 33
                                                          6
## ESFP 40 20
               0 40
                     0 0 0
                             0
                                0
                                   0
                                      0
                                         0
                                            0
                                               0
                                                  0
                                                     0
                                                          5
## ESTJ 0 17
               0 50
                     0 0 0
                             0
                                0
                                   0
                                      0 17
                                            0 17
                                                          6
               8 31
## ESTP 15
           8
                     0 8 0
                            0
                               0
                                   0
                                      0
                                         8 15
                                                  0
                                                       13
                                               8
                                                     0
## INFJ 58
           5
               6 7
                     0 3 1
                             3
                                1
                                   0
                                      3
                     2 4 2
## INFP 26 18
               1
                  9
                             1
                                0
                                   0
                                      6 12 18
                                               2
                                                  0
                                                     0 200
## INTJ 29
           5
               2 17
                     1 1 1 15
                                2
                                   0
                                      1 13 13
                                               2
                                                  0
                                                     0 117
## INTP 23 2
               2 21
                     2 2 0
                            0 11
                                      2 11 21
                                                     0 135
                                   0
                                               1
                                                  0
## ISFJ 7 23 13 7
                     0 7 3
                             0
                                3
                                      3 27
                                               0
                                                         30
                                   0
                                                  0
## ISFP 7
           7 0 17
                     0 0 0
                             0
                               3
                                   0
                                      3 31 21
                                               7
                                                  3
                                                         29
                                                     0
               5 38
                     0 0 0 0
## ISTJ 29
            5
                               0
                                  0
                                      0 14 10
                                               0
                                                  0
                                                     0
                                                         21
## ISTP 42
           7
               2
                 7
                     0550207
                                         9 12
fviz_cluster(pam.dtm)
```



### K-medoids TFIDF

```
pam_results_tfidf <- data %>%
mutate(cluster = pam.tfidf$clustering) %>%
group_by(cluster)
pam_results <- subset(pam_results_tfidf, select = c(type, cluster))</pre>
t <- table(pam_results)</pre>
print ("Wyniki ilosciowe grupowania dla tf-idf")
## [1] "Wyniki ilosciowe grupowania dla tf-idf"
print (t)
##
         cluster
## type
               2
                  3
                        5
                                  8
                                     9 10 11 12 13 14 15 16
##
     ENFP 18
               5 22 12
                        0
                            0
                               0 10
                                            3
                                               2
                                                  0
                  9
                     7
                               0
                                            0
##
##
     ENTP 18
                    23
                        1
                            0
                               1
                                      0
                                        13
##
##
     ESFP
           1
               0
                  2
                     0
                        0
                            0
                               0
                                  0
                                               0
                                                  0
##
     ESTJ
           1
               0
                  0
                     3
                        0
                            0
                               0
##
     ESTP
           3
               0
                  2
                     0
                        0
                            0
                               0
                                  5
                                      0
                                        0
                                               2
##
     INFJ 24 15
                  9 33
                        0
                            1
                               6
                                  7
                                     1 55
     INFP 42 9 16 41
                           2 18 13
##
                        0
                                     0 49
```

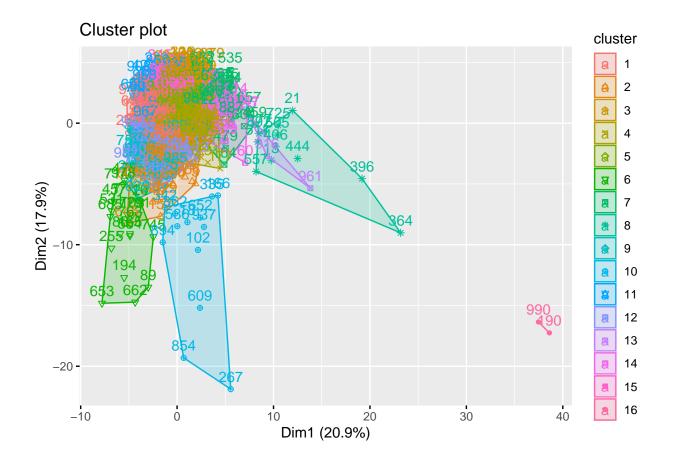
```
INTJ 17 3 11 19 0 2 2 41 0 20 1
##
##
    INTP 24 7 10 24 0 0 7 24
                              1 34
                                    2
                                       2
                                          0
    ISFJ 2 12 2 2
##
                    0
                       0
                         1 4 0 4
                                    0
                                       1
##
    ISFP 4 4 6 4
                    0
                       0
                          2 3
                               0 4
                                    0
                                       1
                                          0
                                             1
##
    ISTJ 14
               3
                 1
                    0
                       0
                          0
                            2
                               0
                                  0
                                    0
                                       0
                                          0
##
    ISTP 11 0 3 7
                    0 0 5 3
                               0 10
                                    1 2 1
t2 <- round(t/rowSums(t)*100)
t2 <- cbind(t2,rowSums(t))
print ("Wyniki procentowe grupowania dla tf-idf")
## [1] "Wyniki procentowe grupowania dla tf-idf"
print (t2)
        1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16
## ENFJ 20 17 3 20 0 0 0 13 0 17
                                3
                                  7
                                        0
                                                30
## ENFP 22 6 28 15 0 0 0 12 0 10
                                4
                                   2
                                     0
                                        0
                                             0
                                                80
## ENTJ 16 5 21 16 0 2 0 23 0 16
                               0 0
                                        0
                                                43
## ENTP 22 5 8 28 1 0 1 13 0 16
                                2
                                   2 0
                                                83
## ESFJ 0 17 17 50 0 0 0 17 0 0
                                0
                                   0
                                      0
                                        0
                                                 6
## ESFP 20 0 40 0 0 0 0 0 40
                                0 0
                                     0
                                        0
                                                 5
## ESTJ 17 0 0 50 0 0 0 0 0 17 17
                                   0
## ESTP 23 0 15 0 0 0 0 38 0 0
                                8 15
                                     0
                                        0
                                           0 0 13
## INFJ 15 9 6 21 0 1 4 4 1 35
                                1
                                              0 159
## INFP 21 4 8 20 0 1 9 6 0 24
                                2
                                   2
                                     0
                                        0
                                             0 200
## INTJ 15
         3 9 16 0 2 2 35 0 17
                                             0 135
## INTP 18 5 7 18 0 0 5 18 1 25
                                1
                                   1
                                     0
                                       0
## ISFJ 7 40 7 7 0 0 3 13 0 13
                                0
                                   3
                                     3
                                        0
                                0
## ISFP 14 14 21 14 0 0 7 10 0 14
                                   3 0
                                        3 0
                                                29
## ISTJ 67 5 14 5 0 0 0 10 0 0 0 0 0 0 0
## ISTP 26 0 7 16 0 0 12 7 0 23 2 5 2 0 0 0 43
fviz_cluster(pam.tfidf)
```



### K-medoids Glove

```
pam_results_glove <- data %>%
mutate(cluster = pam.glove$clustering) %>%
group_by(cluster)
pam_results <- subset(pam_results_glove, select = c(type, cluster))</pre>
t <- table(pam_results)
print ("Wyniki ilosciowe grupowania dla glove1")
## [1] "Wyniki ilosciowe grupowania dla glove1"
print (t)
##
         cluster
## type
              2
                  3
                        5
                                  8
                                     9 10 11 12 13 14 15 16
                                                     9
##
           8 12
                  4 22
                        5
                           3
                               1
                                  0
                                        3
                                           3
                                               2
                                                 0
                                                    10
                                                           0
                                           3
##
##
     ENTP 13
                  5 12
                              3
                                  0
##
##
     ESFP
           0
              3
                     0
                        0
                           0
                               0
                                  0
                                           0
                                               0
                  1
##
     ESTJ
           0
              1
                  0
                     1
                        3
                           0
                               0
                                  0
                                              0
##
     ESTP
           2
              1
                 2
                     3
                        1
                           0
                              1
                                  0
                                     0
                                              1
##
     INFJ 26 17 18 24 17
                           0
                              6
                                  2
                                     8
                                        0
                                           6 11
                                                 1
     INFP 17 11 29 31 14 3 27
                                              9
##
                                 6
                                    7
                                        2 12
```

```
INTJ 31 4 11 17 13 3 1 1 8 0 6 9 0
##
    INTP 16 3 17 15 19
                       7
                          6
##
                            0
                                7
                                   1
                                     9 15
                                           1 7 12
    ISFJ 3 5 2 4 2
                                        3
##
                          0
                             1
                                3
                                   0
                                     0
##
    ISFP 3 5 2 4 0
                        0
                          0
                            0
                                      1 5
                                           0
                                1
                                   1
                                              2
##
    ISTJ
                  1
                       1
                          0
                             0
                                0
                                   0
                                      2
                                        1
                                           0
##
    ISTP 3 1 8 5 4
                       0
                          2 1
                                5
                                   2 2 3 0
t2 <- round(t/rowSums(t)*100)
t2 <- cbind(t2,rowSums(t))
print ("Wyniki procentowe grupowania dla glove1")
## [1] "Wyniki procentowe grupowania dla glove1"
print (t2)
        1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16
## ENFJ 13 3 0 17 10 0 0 0
                                     3
                                        0 30 10 0
                             7
                                0
                                  7
                                                    30
## ENFP 10 15 5 28
                         1 0
                                      2
                                        0 12 8 0
                   6
                      4
                             1
                                4
                                   4
                                                    80
             2 19
                         0 2
                                           9
## ENTJ 21 7
                   9
                      2
                             7
                                0
                                   7
                                                    43
## ENTP 16 7
             6 14
                   8 1
                         4 0
                             8
                                2
                                   6 10
                                        0
                                           6 11 0
## ESFJ 50 0
             0 33
                   0 17
                         0 0
                             0
                                0
                                      0
                                           0
                                              0
                                   0
                                        0
                                                    6
## ESFP 0 60 20
                0
                   0
                      0
                         0 0 20
                                0
                                   0
                                      0
                                        0
                                           0
                                              0
                                                     5
## ESTJ 0 17
                         0 0
                             0 17
                                                     6
             0 17 50
                      0
## ESTP 15 8 15 23
                  8
                      0
                        8 0
                             0
                                8
                                   0
                                      8
                                        0
                                           0
                                              8
                                                   13
## INFJ 16 11 11 15 11
                      0
                         4 1
                             5
                                0
                                   4
                                      7
                                           4 10
## INFP 8 6 14 16
                      2 14 3
                                           7
                             4
                                1
                                   6
                                      4
                                        0
                                                 0 200
## INTJ 26 3 9 15 11
                      3
                        1 1
                             7
                                0
                                   5
                                     8
                                   7 11
## INTP 12 2 13 11 14
                      5
                        4 0
                             5
                                1
                                        1
                                           5
                                             9
                                                0 135
## ISFJ 10 17 7 13
                  7
                      3
                        0 3 10
                                0
                                   0 10
                                        3
                                           0 13
## ISFP 10 17 7 14 0
                      0 0 0
                             3
                                          7 17
                                3 3 17
                                        0
## ISTJ 14 19 5 5 19
                      5 0 0 0 0 10
                                     5 0 10 10 0
## ISTP 7 2 19 12 9 0 5 2 12 5 5 7 0 0 14 2 43
fviz_cluster(pam.glove)
```



### ${\bf K\text{-}medoids} \,\, {\bf Glove}({\bf oddzielne} \,\, {\bf posty})$

```
pam_results_glove2 <- data2 %>%
mutate(cluster = pam.glove2$clustering) %>%
group_by(cluster)

pam_results <- subset(pam_results_glove2, select = c(type, cluster))
t <- table(pam_results)
print ("Wyniki ilosciowe grupowania dla glove2")</pre>
```

## [1] "Wyniki ilosciowe grupowania dla glove2"

print (t)

```
##
          cluster
## type
                                                                                      16
              1
                   2
                        3
                             4
                                 5
                                      6
                                           7
                                                8
                                                     9
                                                         10
                                                             11
                                                                  12
                                                                       13
                                                                            14
                                                                                 15
##
      ENFJ
                 21
                       12
                                 3
                                      8
                                                3
                                                     4
                                                          3
                                                              6
                                                                  10
                                                                        2
                                                                             3
                                                                                  6
                                                                                       0
                                           1
##
      ENFP
             12
                 28
                        3
                             2
                                 0
                                      8
                                           7
                                                6
                                                     5
                                                          2
                                                              2
                                                                   8
                                                                        4
                                                                             1
                                                                                  1
                                                                                       1
              8
                        2
                                           2
                                                2
                                                     3
                                                          2
                                                                   5
                                                                        3
                                                                             2
##
      ENTJ
                  11
                             0
                                 1
                                      1
                                                              0
                                                                                  1
                                                                                       0
##
      ENTP
             17
                  18
                        3
                             4
                                 3
                                      2
                                           5
                                                4
                                                     3
                                                          2
                                                                   5
                                                                        4
                                                                                  2
                                                              1
                                                                             1
                                                                                       1
                                      2
                                           3
                                                2
##
      ESFP
             10
                  11
                                 0
                                                          3
                                                                   2
                                                                        3
                                                                             0
##
      ESTJ
              7
                        4
                             0
                                 0
                                      3
                                           3
                                                4
                                                     0
                                                          1
                                                                   4
                                                                        2
                                                                             2
                                                                                  0
                                                                                       0
                 18
                                                              1
##
      INFJ
             65 144
                       37
                           21
                                16
                                     40
                                          44
                                               36
                                                    25
                                                         27
                                                             11
                                                                  38
                                                                       41
                                                                            30
                                                                                 24
##
             33 104
                       22
                           24
                                17
                                     29
                                          26
                                               34
                                                   23
                                                         19
                                                             13
                                                                  33
                                                                       28
                                                                             8
                                                                                 16
                                                                                       1
      INFP
##
      INTJ
             34 121
                       15
                           22
                                12
                                     19
                                          21
                                               23
                                                   18
                                                        10
                                                             13
                                                                  33
                                                                       13
                                                                            12
                                                                                 15
                                                                                       3
##
      INTP
                 25
                        5
                                 2
                                      9
                                           5
                                                5
                                                     2
                                                          2
                                                                   8
                                                                             3
                                                                                       0
                            5
                                                              1
```

```
##
     ISTJ
             1
                                   1
                                        1
                                            1
                                                0
                                                              0
                                                                      1
     ISTP
            12
##
                                                             10
t2 <- round(t/rowSums(t)*100)
t2 <- cbind(t2,rowSums(t))</pre>
print ("Wyniki procentowe grupowania dla glove2")
```

## [1] "Wyniki procentowe grupowania dla glove2"

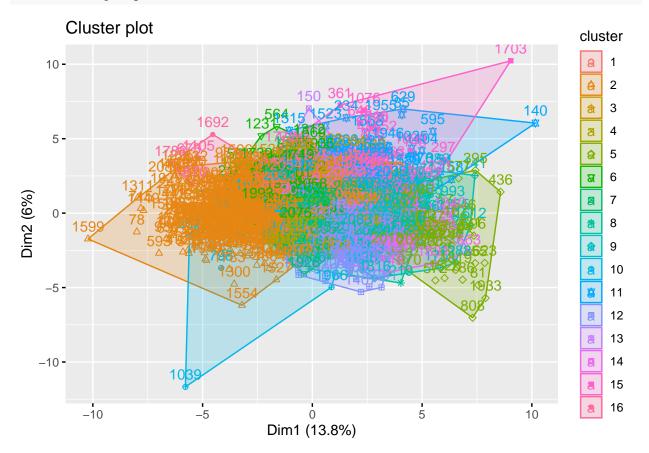
### print (t2)

**ISFP** 

##

```
##
                       6 7
                            8 9 10 11 12 13 14 15 16
         1
## ENFJ 10 23 13 1 3
                       9
                         1
                            3
                              4
                                                        92
## ENFP 13 31
               3 2 0
                       9 8
                              6
                                                        90
  ENTJ 19
           26
               5 0 2
                       2 5
                                     0 12
                                                        43
               4 5 4
                       3 7
                            5
                              4
                                  3
                                                        75
## ENTP 23 24
                                           5
                                                     1
  ESFP 23 25
              11 2 0
                       5
                            5
                              0
                                 7
                                     5
                                                        44
## ESTJ 14 37
               8 0 0
                       6 6
                            8
                              0
                                                        49
  INFJ 11 24
               6 4 3
                       7 7
                            6 4
                                  5
                                                     0 599
                       7 6
         8 24
               5 6 4
                            8 5
                                           7
                                              2
## INFP
                                  4
                                     3
                                                     0
                                                       430
   INTJ
         9 32
               4 6 3
                       5 5
                            6 5
                                  3
                                     3
                                           3
                                              3
                                                     1
                                                       384
               5 5 2 10 5
                            5 2
  INTP
         9 27
                                                        91
               5 2 7
                       5 5 12 2
## ISFP
         5 17
                                 5 12 10
                                          12
                                              0
                                                        42
               07077
                            7 0
## ISTJ
         7 60
                                 0
                                        0
                                           0
                                              7
                                                     0
                                                        15
               5 5 2 10 5
## ISTP
         9 30
                           7 2
                                 2
                                                     0 132
```

fviz\_cluster(pam.glove2)



#### **DBSCAN**

```
# metric = "euclidean", "manhattan", "gower"
dissimilarity.dtm <- daisy(as.matrix(vectors.dtm), metric = "euclidean")
dissimilarity.tfidf <- daisy(as.matrix(vectors.tfidf), metric = "euclidean")
dissimilarity.glove <- daisy(as.matrix(vectors.glove), metric = "euclidean")
dissimilarity.glove_post <- daisy(as.matrix(vectors.glove_post), metric = "euclidean")</pre>
```



### USTALENIE OPTYMALNEGO PARAMETRU EPS

Metoda polega na obliczeniu odległości kNN w macierzy punktów.

Wartość k jest określona przez użytkownika i odpowiada MinPts.

Następnie te odległości k są nanoszone w kolejności rosnącej na wykres. Celem jest określenie "kolana", które odpowiada optymalnemu parametrowi eps.

Kolano odpowiada progowi, w którym następuje ostra zmiana wzdłuż krzywej kodległości.

Funkcji kNNdistplot () można użyć do narysowania wykresu odległości k:

➤ kNNdist - Calculate and plot the k-Nearest Neighbor Distance — pozwala na szybkie wyznaczenie odległości k-najbliższych sąsiadów w macierzy punktów. Wykres stworzony na bazie funkcji może być używany do pomóc w znalezieniu odpowiedniej wartości parametru eps dla funkcji DBSCAN (szukanie "kolana" w wykresie).

kNNdistplot(dane, k = 5)

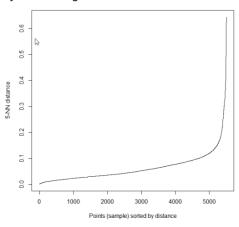


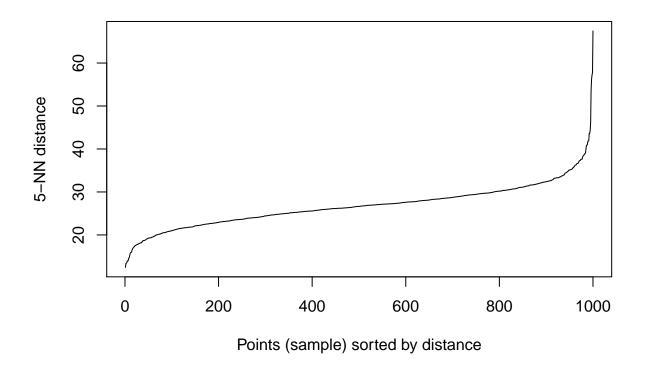
Figure 1: ESP

```
plot_desity <- function(desity, dissimilarity, method) {
  points <- cmdscale(dissimilarity, k = 2)
  plot(points,
        main = method,
        col = as.factor(desity$cluster),
        mai = c(0, 0, 0, 0),
        mar = c(0, 0, 0, 0),
        xaxt = 'n', yaxt = 'n',
        xlab = '', ylab = '')
}</pre>
```

#### DTM

www.agh.edu.pl

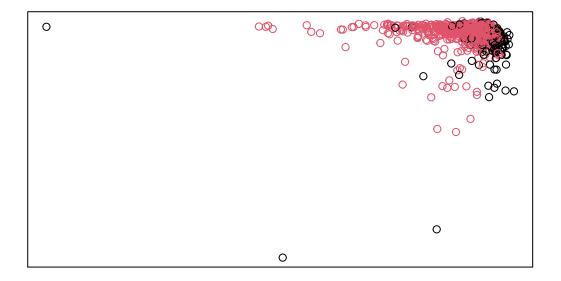
Należy odczytać gdzie na wykresie jest tak zwanne kolano, czyli punkt, po którym wykres zaczyna ustawiać się w pionie. Wartość tego punktu zostaje zastosowana jako eps.



```
eps = 30
dbscan.dtm <- dbscan(vectors.dtm, eps = eps, minPts = 5)
dbscan.dtm

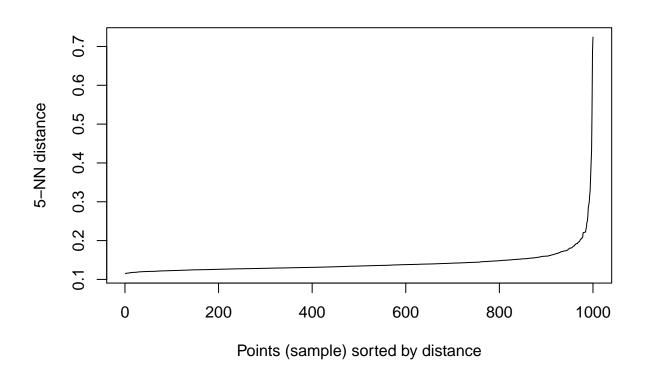
## DBSCAN clustering for 1000 objects.
## Parameters: eps = 30, minPts = 5
## The clustering contains 1 cluster(s) and 160 noise points.
##
## 0 1
## 160 840
##
## Available fields: cluster, eps, minPts
plot_desity(dbscan.dtm, dissimilarity.dtm, "DTM")</pre>
```

# DTM



## TFID

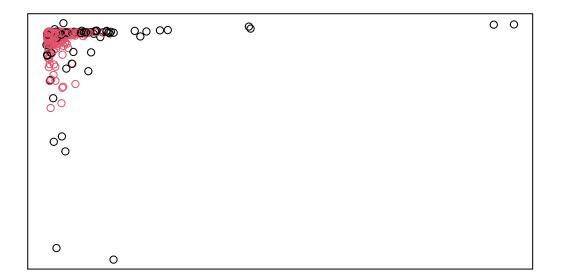
kNNdistplot(vectors.tfidf, k = 5)



eps = 0.15
dbscan.tfidf <- dbscan(vectors.tfidf, eps = eps, minPts = 5)
dbscan.tfidf

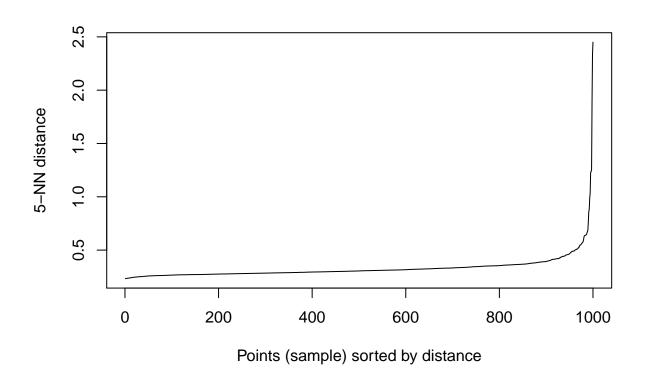
## DBSCAN clustering for 1000 objects.
## Parameters: eps = 0.15, minPts = 5
## The clustering contains 1 cluster(s) and 133 noise points.
##
## 0 1
## 133 867
##
## Available fields: cluster, eps, minPts
plot\_desity(dbscan.tfidf, dissimilarity.tfidf, "TFIDF")</pre>

## **TFIDF**



## GLOVE

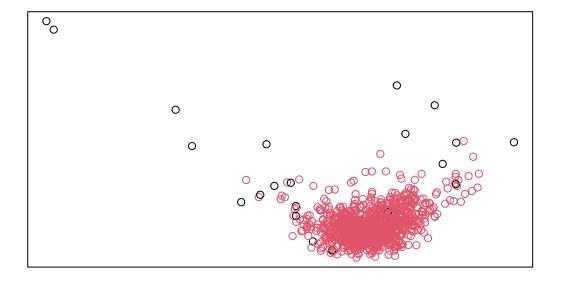
kNNdistplot(vectors.glove, k = 5)



eps = 0.5
minPts = 5
dbscan.glove <- dbscan(vectors.glove, eps = eps, minPts = minPts)
dbscan.glove

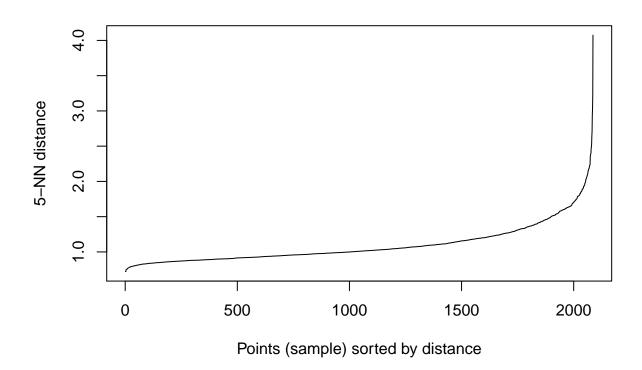
## DBSCAN clustering for 1000 objects.
## Parameters: eps = 0.5, minPts = 5
## The clustering contains 1 cluster(s) and 21 noise points.
##
## 0 1
## 21 979
##
## Available fields: cluster, eps, minPts
plot\_desity(dbscan.glove, dissimilarity.glove, "GLOVE")</pre>

# **GLOVE**



## GLOVE POST

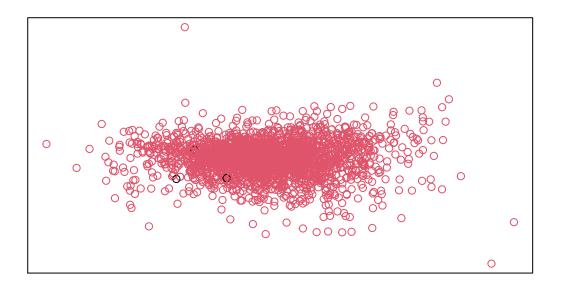
 $kNNdistplot(vectors.glove_post, k = 5)$ 



```
eps = 1.5
minPts = 5
dbscan.glove_post <- dbscan(vectors.glove, eps = eps, minPts = minPts)
dbscan.glove_post

## DBSCAN clustering for 1000 objects.
## Parameters: eps = 1.5, minPts = 5
## The clustering contains 1 cluster(s) and 2 noise points.
##
## 0 1
## 2 998
##
## Available fields: cluster, eps, minPts
plot_desity(dbscan.glove_post, dissimilarity.glove_post, "GLOVE POST")</pre>
```

## **GLOVE POST**

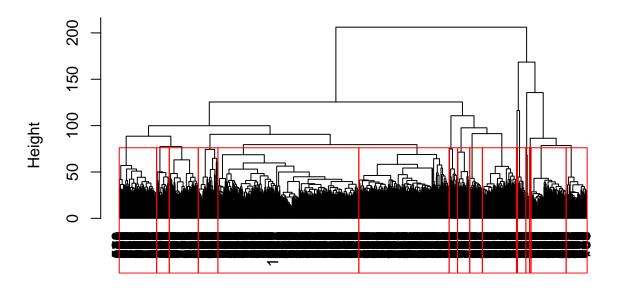


### Grupowanie Hierarchiczne

#### DTM

```
# methods = "ward.D", "ward.D2", "single", "complete", "average", "mcquitty", "median", "centroid"
hc.dtm <- hclust(dissimilarity.dtm, method="ward.D2")
plot(hc.dtm, hang = -1)
rect.hclust(hc.dtm, k=16, border="red")</pre>
```

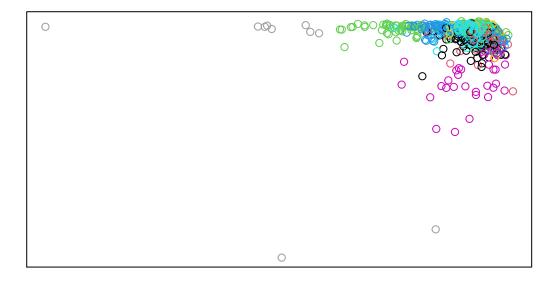
# **Cluster Dendrogram**



dissimilarity.dtm hclust (\*, "ward.D2")

plot\_hirarchical(dissimilarity.dtm, hc.dtm, "DTM")

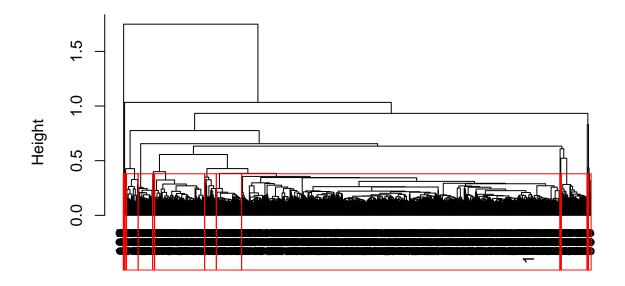
## **DTM**



## TfIDF

```
hc.tfidf <- hclust(dissimilarity.tfidf, method="ward.D2")
plot(hc.tfidf, hang = -1)
rect.hclust(hc.tfidf, k=16, border="red")</pre>
```

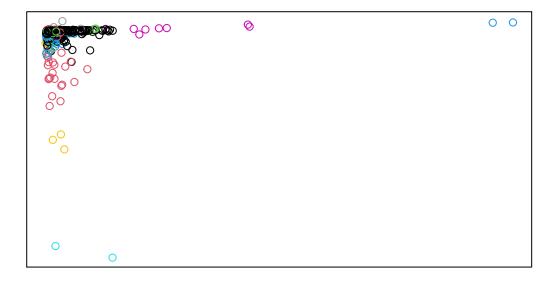
# **Cluster Dendrogram**



dissimilarity.tfidf hclust (\*, "ward.D2")

plot\_hirarchical(dissimilarity.tfidf, hc.tfidf, "TFIDF")

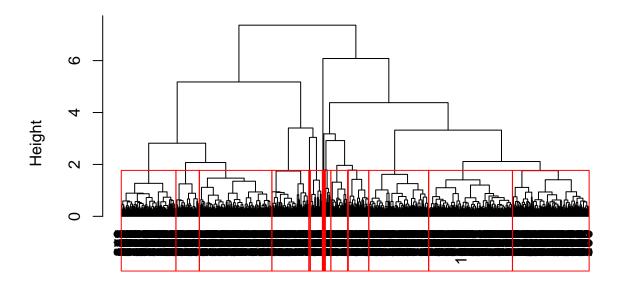
## **TFIDF**



### GLOVE

```
hc.glove <- hclust(dissimilarity.glove, method="ward.D2")
plot(hc.glove, hang = -1)
rect.hclust(hc.glove, k=16, border="red")</pre>
```

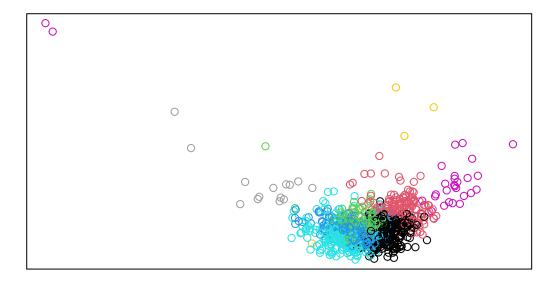
# **Cluster Dendrogram**



dissimilarity.glove hclust (\*, "ward.D2")

plot\_hirarchical(dissimilarity.glove, hc.glove, "GLOVE")

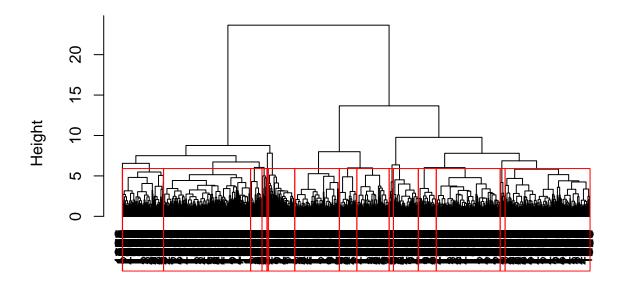
## **GLOVE**



### **GLOVE Posts**

```
hc.glove_post <- hclust(dissimilarity.glove_post, method="ward.D2")
plot(hc.glove_post, hang = -1)
rect.hclust(hc.glove_post, k=16, border="red")</pre>
```

# **Cluster Dendrogram**



dissimilarity.glove\_post hclust (\*, "ward.D2")

plot\_hirarchical(dissimilarity.glove\_post, hc.glove\_post, "GLOVE POSTS")

# **GLOVE POSTS**

