NYC Group TED Talks Review Study

Used kernel: https://www.kaggle.com/mikaelhuss/r-clone-of-ted-data-analysscriptVersionId=1614520

```
month_order = c('Jan', 'Feb', 'Mar', 'Apr', 'May', 'Jun', 'Jul', 'Aug', 'Sep', 'Oct', 'Nov', 'Dec')
day_order = c('Mon', 'Tue', 'Wed', 'Thu', 'Fri', 'Sat', 'Sun')
df <- read csv("C:/AT/tedtalks/ted main.csv")</pre>
## Parsed with column specification:
## cols(
##
     comments = col_integer(),
    description = col_character(),
##
    duration = col_integer(),
##
    event = col_character(),
##
    film_date = col_integer(),
    languages = col_integer(),
##
    main_speaker = col_character(),
##
    name = col_character(),
##
    num_speaker = col_integer(),
##
    published_date = col_integer(),
##
    ratings = col_character(),
##
    related_talks = col_character(),
    speaker_occupation = col_character(),
##
    tags = col_character(),
    title = col_character(),
##
    url = col_character(),
##
    views = col_integer()
## )
colnames (df)
## [1] "comments"
                             "description"
                                                   "duration"
## [4] "event"
                             "film_date"
                                                   "languages"
                             "name"
## [7] "main_speaker"
                                                   "num_speaker"
## [10] "published_date"
                             "ratings"
                                                   "related_talks"
## [13] "speaker_occupation" "tags"
                                                   "title"
## [16] "url"
                             "views"
# For reordering data
df = df[, c('name', 'title', 'description', 'main_speaker', 'speaker_occupation', 'num_speaker', 'durat
# For converting unix dates
df$film_date = anydate(df$film_date)
df$published_date = anydate(df$published_date)
head(df)
## # A tibble: 6 x 17
```

name

##

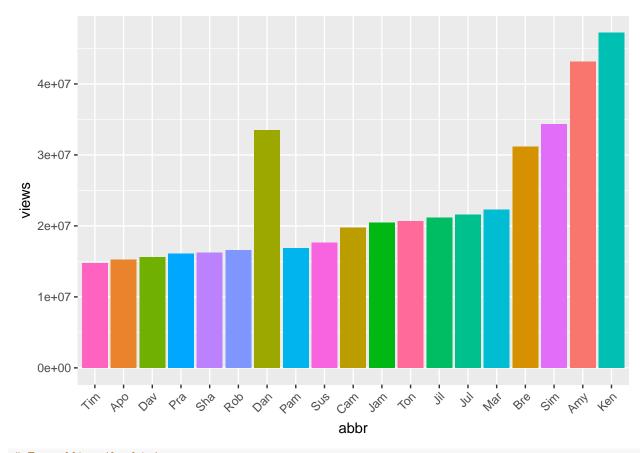
```
##
                                              <chr>
## 1
         Ken Robinson: Do schools kill creativity?
## 2
              Al Gore: Averting the climate crisis
## 3
                     David Pogue: Simplicity sells
                Majora Carter: Greening the ghetto
## 5 Hans Rosling: The best stats you've ever seen
                Tony Robbins: Why we do what we do
     ... with 16 more variables: title <chr>, description <chr>,
       main_speaker <chr>, speaker_occupation <chr>, num_speaker <int>,
       duration <int>, event <chr>, film_date <date>, published_date <date>,
       comments <int>, tags <chr>, languages <int>, ratings <chr>,
## #
       related_talks <chr>, url <chr>, views <int>
nrow(df)
## [1] 2550
```

For displaying the top 20 viewed talks

```
pop_talks = df[, c("title", "main_speaker", "views", "film_date")] %% arrange(desc(views)) %% head(20
pop_talks
## # A tibble: 20 x 4
##
                                                                      title
##
                                                                      <chr>
##
   1
                                               Do schools kill creativity?
##
                                  Your body language may shape who you are
    3
##
                                          How great leaders inspire action
##
                                                The power of vulnerability
##
    5
                                    10 things you didn't know about orgasm
##
    6
                                How to speak so that people want to listen
    7
##
                                                      My stroke of insight
##
    8
                                                      Why we do what we do
##
    9
                        This is what happens when you reply to spam email
## 10
                        Looks aren't everything. Believe me, I'm a model.
## 11
                                                  The puzzle of motivation
## 12
                                                   The power of introverts
## 13
                                                        How to spot a liar
## 14 What makes a good life? Lessons from the longest study on happiness
                                           The happy secret to better work
## 16
                         The thrilling potential of SixthSense technology
## 17
                                       How I held my breath for 17 minutes
                                                   The art of misdirection
## 18
## 19
                                Inside the mind of a master procrastinator
## 20
                                       The surprising science of happiness
## # ... with 3 more variables: main_speaker <chr>, views <int>,
       film_date <date>
```

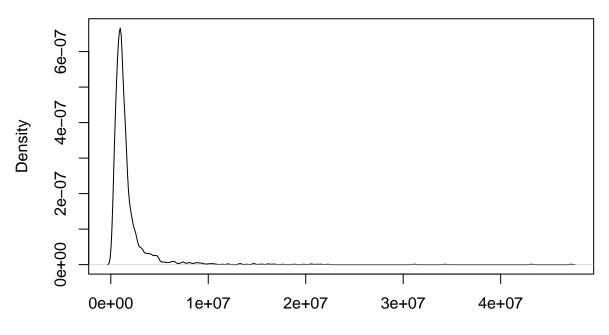
For visualizing the top 20 viewed talks

```
pop_talks$abbr <- pop_talks$main_speaker %>% as.character() %>% substr(0,3)
ggplot(pop_talks, aes(x=reorder(abbr, views), y=views, fill=abbr)) +
   geom_bar(stat = 'identity') +
   guides(fill=FALSE) +
   labs(x="abbr") + theme(axis.text.x = element_text(angle = 45, vjust = 1, hjust=1))
```



For adding the histogram
plot(density(df\$views))

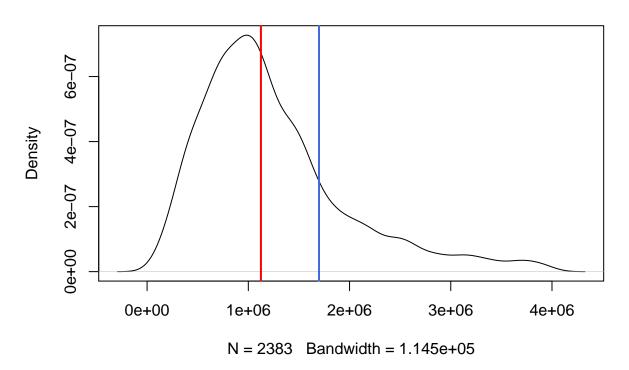
density.default(x = df\$views)



N = 2550 Bandwidth = 1.322e+05

```
plot(density(df$views[df$views<0.4e7]))
abline(v = mean(df$views),
    col = "royalblue",
    lwd = 2)
abline(v = median(df$views),
    col = "red",
    lwd = 2)</pre>
```

density.default(x = df\$views[df\$views < 4e+06])



```
summary(df$views)

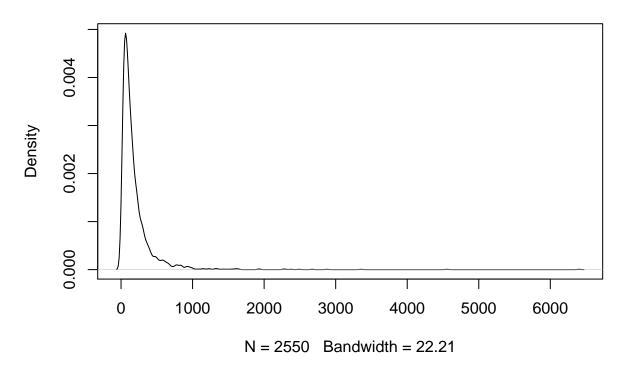
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 50443 755793 1124524 1698297 1700760 47227110

# There are two talks viewed over 40 million times.

# For summarizing the comments

plot(density(df$comments))
```

density.default(x = df\$comments)

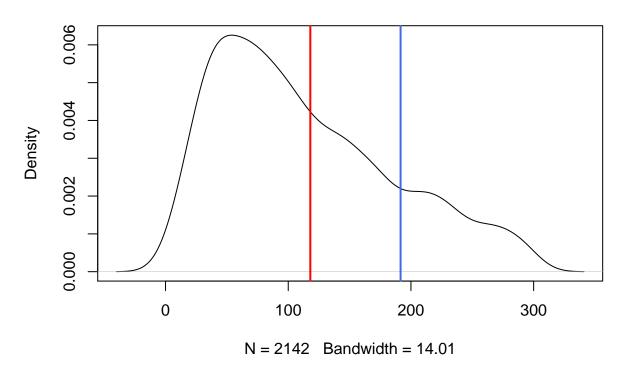


```
# Since most of the talks have less than 300 comments we now replot the chart
plot(density(df$comments[df$comments < 300]))

abline(v = mean(df$comments),
    col = "royalblue",
    lwd = 2)

abline(v = median(df$comments),
    col = "red",
    lwd = 2)</pre>
```

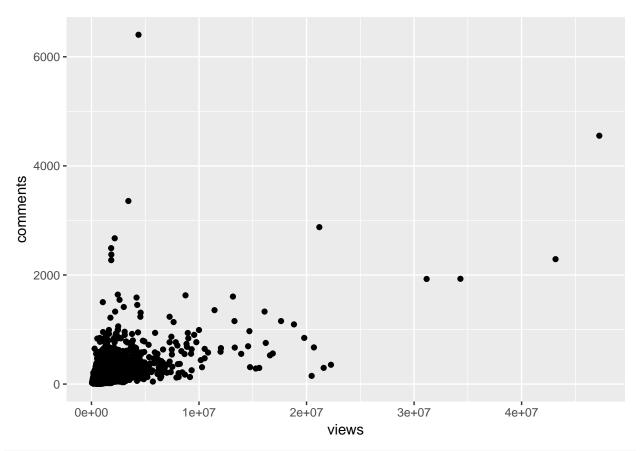
density.default(x = df\$comments[df\$comments < 300])



```
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 2.0 63.0 118.0 191.6 221.8 6404.0
```

For visualizing the relation between views and comments

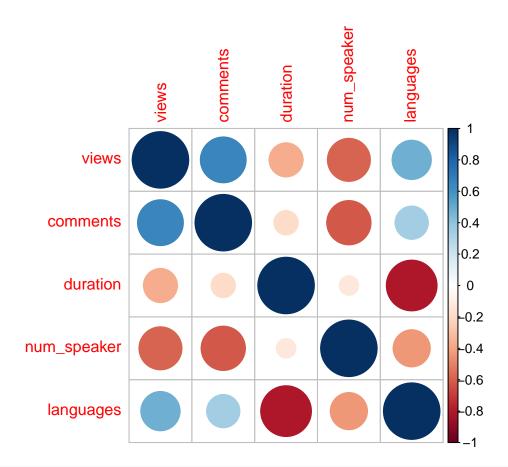
```
ggplot(df, aes(x=views, y=comments)) +
geom_point()
```



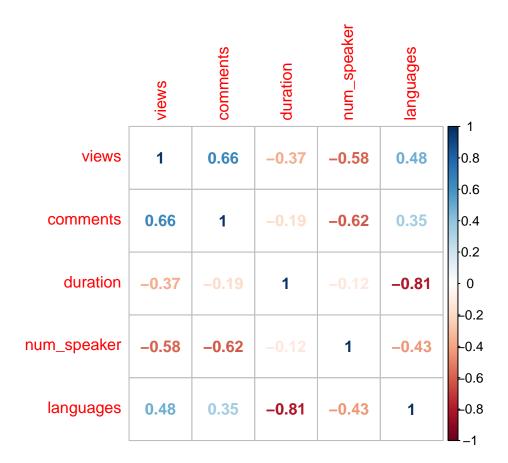
```
# For the calculation of correlation between views and comments
cor(df[, c("views", "comments")])
```

```
## views comments
## views 1.0000000 0.5309387
## comments 0.5309387 1.0000000

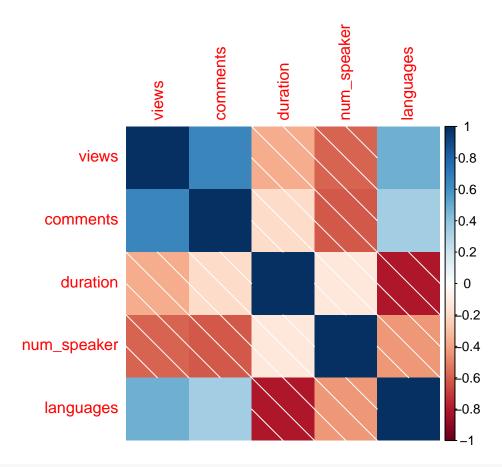
# Let's check all the correlations between the numeric fields, which was not analyzed on the kernel we
for_cor = cor(df[, c("views", "comments", "duration", "num_speaker", "languages")])
M <- cor(for_cor)
View(M)
corrplot(M,method = "circle")</pre>
```



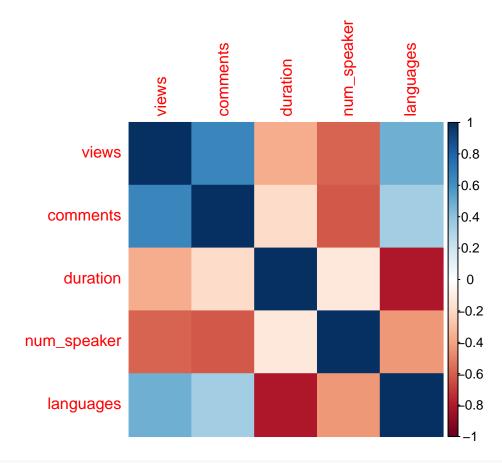
corrplot(M,method = "number")



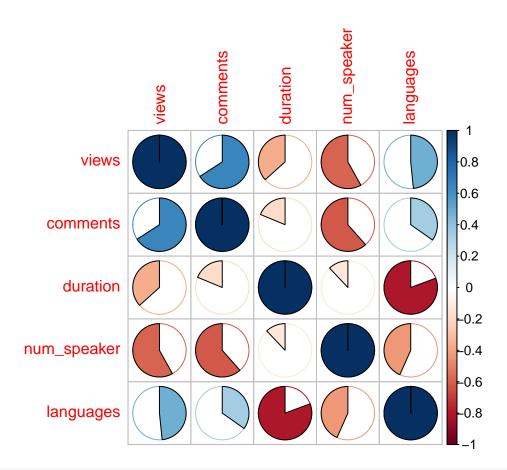
corrplot(M,method = "shade")



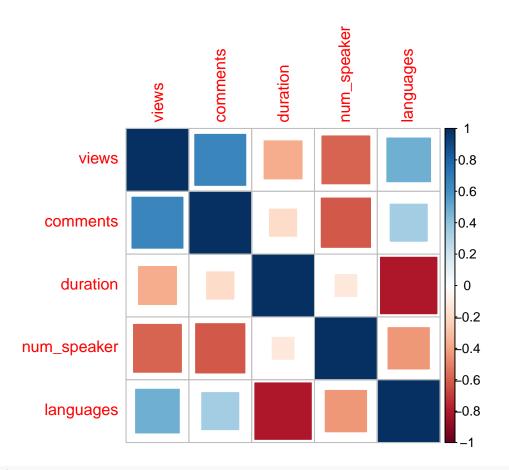
corrplot(M,method = "color")



corrplot(M,method = "pie")



corrplot(M,method = "square")



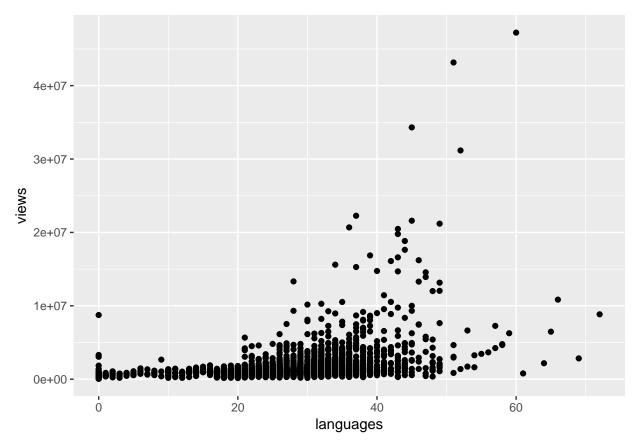
summary(for_cor)

```
duration
##
       views
                        comments
   Min. :-0.02639
                    Min. :-0.03549
                                        Min. :-0.29568
   1st Qu.: 0.04874
                     1st Qu.: 0.14069
                                        1st Qu.: 0.02226
  Median: 0.37762
                     Median : 0.31828
                                        Median: 0.04874
                      Mean : 0.39089
## Mean : 0.38618
                                        Mean : 0.18320
   3rd Qu.: 0.53094
                      3rd Qu.: 0.53094
                                        3rd Qu.: 0.14069
##
##
  Max. : 1.00000
                      Max. : 1.00000
                                        Max. : 1.00000
##
    num_speaker
                       languages
         :-0.06310
                            :-0.2957
## Min.
                    Min.
  1st Qu.:-0.03549
                     1st Qu.:-0.0631
##
## Median :-0.02639
                    Median: 0.3183
         : 0.17946
                      Mean : 0.2674
## Mean
                      3rd Qu.: 0.3776
## 3rd Qu.: 0.02226
## Max.
         : 1.00000
                     Max. : 1.0000
# From the visualizations above we cans see that;
# Views and comments have a mid positive relation of 66%,
# More the views more the comments is observed.
# Views and number of translations (languages) have a mid positive relation of 48%
# More the translations more the views may be observed.
# Views and number of speakers have a mid negative relation of -58\%
# More speakers lead to less viewers.
```

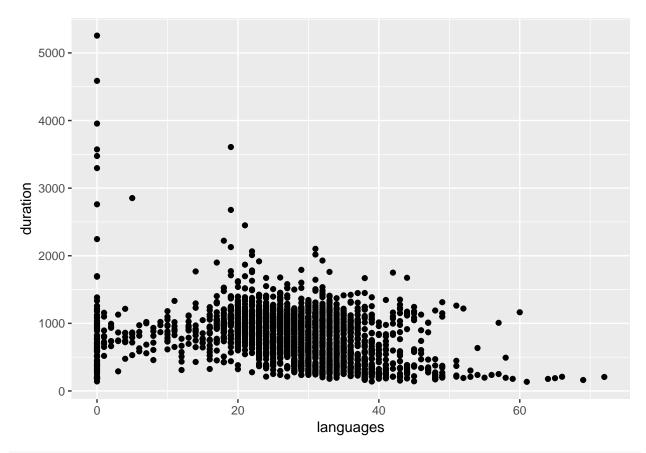
```
# Comments and number of speakers have a mid negative relation of -62%
# More speakers lead to less comments as less views stated above.

# Duration and languages have a mid to high negative relation of -81%
# Usually longer duraions lead to lower number of translations of the talks.

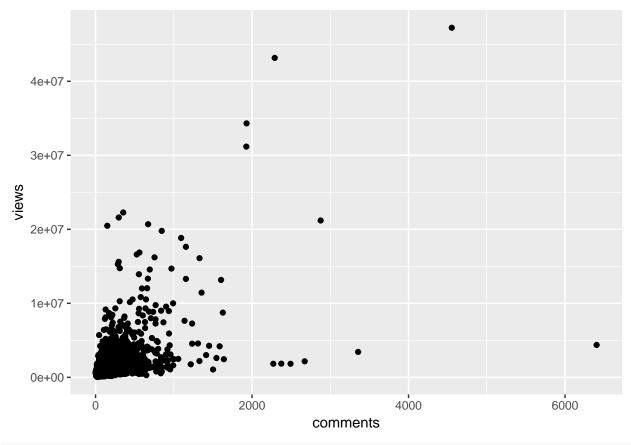
# Visualizing many possible relations
ggplot(df, aes(x=languages, y=views)) + geom_point()
```



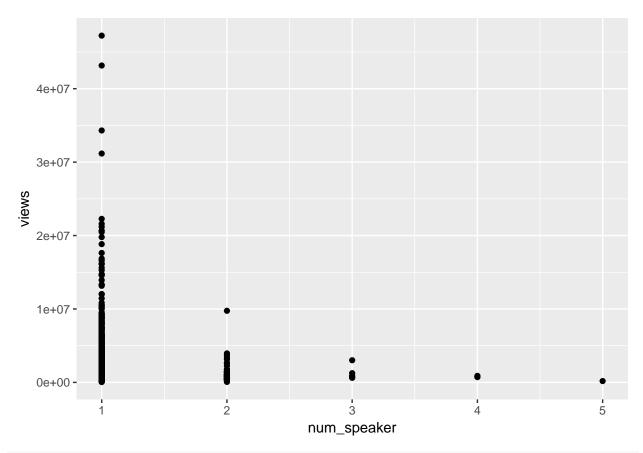
ggplot(df, aes(x=languages, y=duration)) + geom_point()



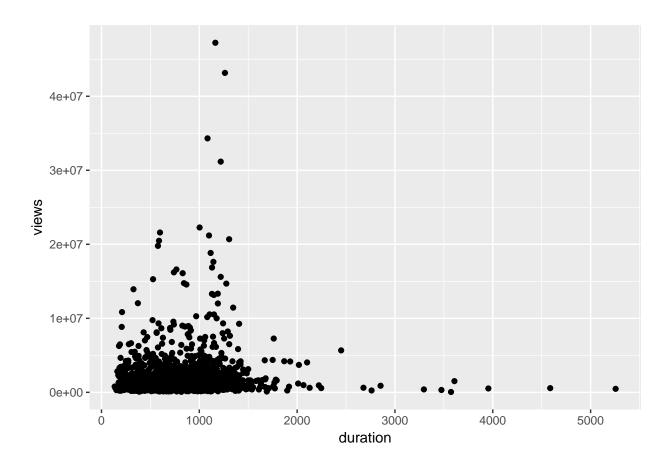
ggplot(df, aes(x=comments, y=views)) + geom_point()



ggplot(df, aes(x=num_speaker, y=views)) + geom_point()

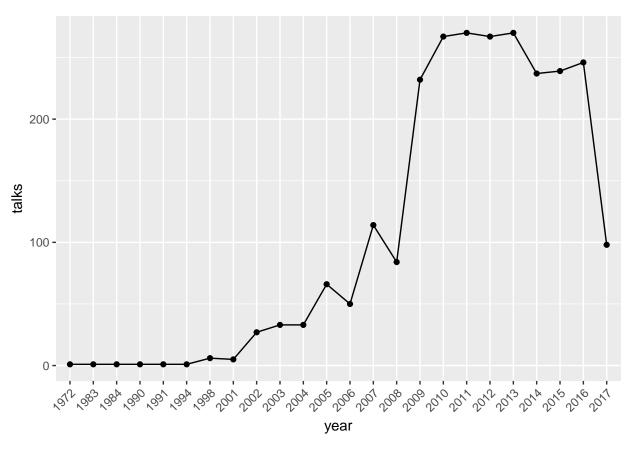


ggplot(df, aes(x=duration, y=views)) + geom_point()



For displaying the number of talks by years

```
df$year <- year(df$film_date)
year_df <- data.frame(table(df$year))
colnames(year_df) <- c("year", "talks")
ggplot(year_df, aes(x=year, y=talks, group=1)) + geom_line() + geom_point() + theme(axis.text.x = elements)</pre>
```

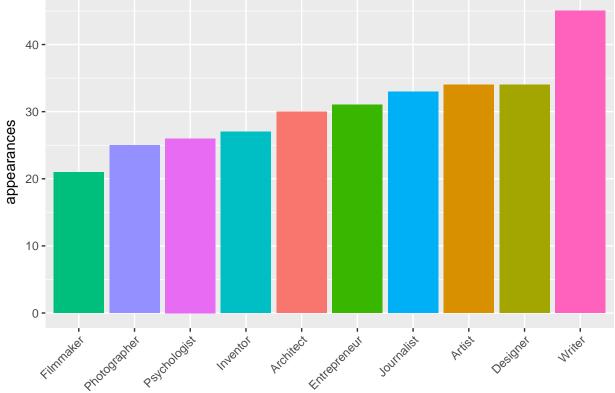


```
# For listing the 15 most popular speakers
speaker_df <- data.frame(table(df$main_speaker))
colnames(speaker_df) <- c("main_speaker", "appearances")
speaker_df <- speaker_df %>% arrange(desc(appearances))
head(speaker_df, 15)
```

```
##
              main_speaker appearances
## 1
              Hans Rosling
## 2
             Juan Enriquez
                                       7
                                       6
             Marco Tempest
## 4
                      Rives
                                       6
                Bill Gates
                                      5
## 5
                                       5
## 6
               Clay Shirky
## 7
                Dan Ariely
                                       5
                                       5
## 8
      Jacqueline Novogratz
## 9
           Julian Treasure
                                       5
                                       5
## 10
      Nicholas Negroponte
## 11
                    Al Gore
                                       4
## 12
            Barry Schwartz
                                       4
## 13
            Chris Anderson
                                       4
               Dan Dennett
## 14
## 15
               David Pogue
```

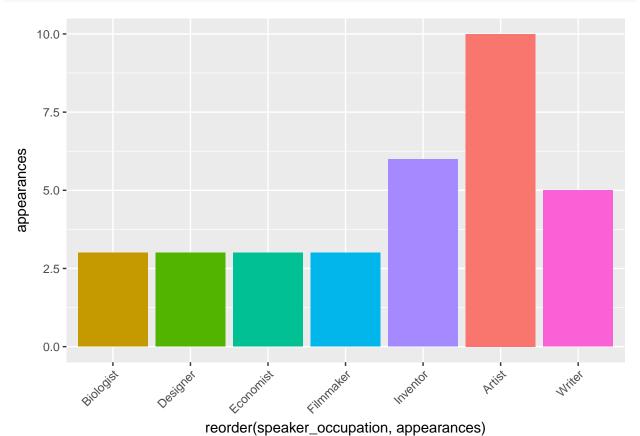
To find the most popular occupations among speakers

```
occupation_df <- data.frame(table(df$speaker_occupation))</pre>
colnames(occupation_df) <- c("occupation", "appearances")</pre>
occupation_df <- occupation_df %>% arrange(desc(appearances))
head(occupation_df, 10)
##
        occupation appearances
## 1
            Writer
## 2
            Artist
                             34
## 3
          Designer
                             34
## 4
        Journalist
                             33
    Entrepreneur
                             31
                             30
## 6
         Architect
## 7
          Inventor
                             27
                             26
## 8 Psychologist
## 9
      Photographer
                             25
         Filmmaker
                             21
## 10
# To plot the popular occupations on a barchart
ggplot(head(occupation_df,10), aes(x=reorder(occupation, appearances),
                                    y=appearances, fill=occupation)) +
    geom_bar(stat="identity") + guides(fill=FALSE) + theme(axis.text.x = element_text(angle = 45, vjust
    40
    30 -
```



```
# To find the most popular occupations per event which was not analyzed on the kernel we used as a basi
occup_dfLast <- data.frame(table(df$event, df$speaker_occupation))
colnames(occup_dfLast) <- c("event", "speaker_occupation", "appearances")
occup_dfLast <- occup_dfLast %>% arrange(desc(appearances))
View(occup_dfLast)

# To plot those occupations on a barchart
ggplot(head(occup_dfLast,10), aes(x=reorder(speaker_occupation, appearances), y=appearances, fill=speak
```



Number of speakers by talks

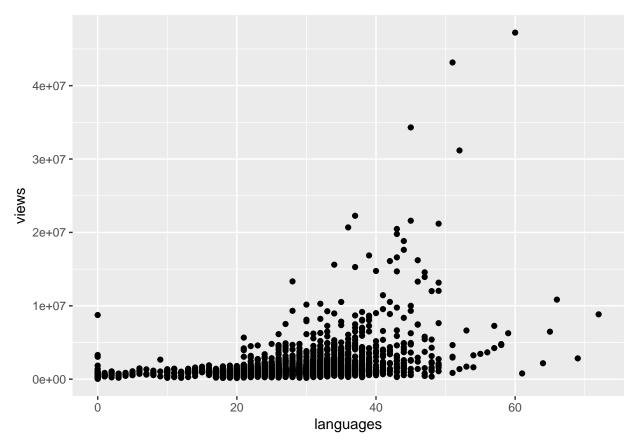
```
table(df$num_speaker)
##
##
                           5
      1
                3
                     3
## 2492
          49
# Let's list the 3 talks which had 4 speakers
df[df[,'num_speaker'] == 4, c('title', 'description', 'main_speaker', 'event')]
## # A tibble: 3 x 4
##
                                                     title
##
## 1
           The interspecies internet? An idea in progress
```

```
## 2 An interview with the founders of Black Lives Matter
## 3 Political common ground in a polarized United States
## # ... with 3 more variables: description <chr>, main_speaker <chr>,
## # event <chr>
```

Number of talks by events

```
event_df <- data.frame(table(df$event))</pre>
colnames(event_df) <- c("event", "talks")</pre>
event_df <- event_df %>% arrange(desc(talks))
head(event df, 10)
##
               event talks
## 1
             TED2014
## 2
             TED2009
                        83
## 3
             TED2013
                        77
## 4
             TED2016
                        77
## 5
             TED2015
## 6
             TED2011
                        70
## 7 TEDGlobal 2012
                        70
## 8
             TED2007
                        68
             TED2010
                        68
## 10 TEDGlobal 2011
                        68
```

Languages



```
cor(df[, c("languages","views")])
```

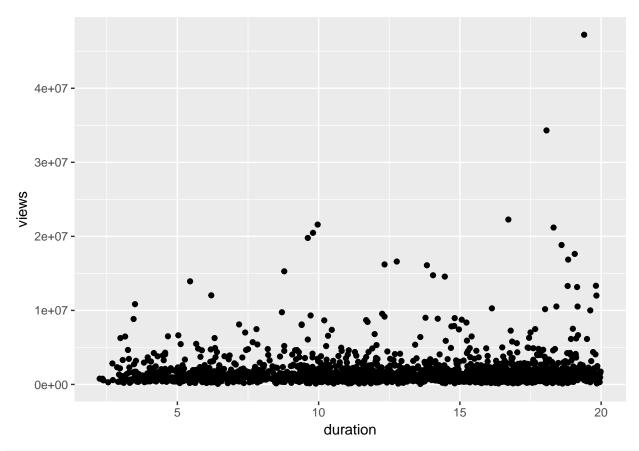
```
## languages views
## languages 1.0000000 0.3776231
## views 0.3776231 1.0000000
```

Distribution of talk durations

```
df$duration <- df$duration/60
summary(df$duration)

## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 2.250 9.617 14.133 13.775 17.446 87.600

# Since the talks average to less than 14 mins we would like to plot the talks shorter than 20 mins
ggplot(df[df$duration<20,], aes(x=duration, y=views)) + geom_point()</pre>
```



```
df2 <- read.csv("C:/AT/tedtalks/transcripts.csv", stringsAsFactors = FALSE)
head (df2)</pre>
```

1

```
nrow (df2)
## [1] 2467
df3 <- base::merge(df, df2, by="url")
head(df3)
##</pre>
```

```
## 3
                                   https://www.ted.com/talks/a_robot_that_flies_like_a_bird\n
## 4
                                   https://www.ted.com/talks/a_ted_speaker_s_worst_nightmare\n
## 5
                                https://www.ted.com/talks/a whistleblower you haven t heard\n
## 6 https://www.ted.com/talks/aakash_odedra_a_dance_in_a_hurricane_of_paper_wind_and_light\n
## 1 Aicha el-Wafi + Phyllis Rodriguez: The mothers who found forgiveness, friendship
                                               AJ Jacobs: My year of living biblically
## 3
                                        Markus Fischer: A robot that flies like a bird
## 4
                                    Improv Everywhere: A TED speaker's worst nightmare
## 5
                                      Geert Chatrou: A whistleblower you haven't heard
## 6
                       Aakash Odedra: A dance in a hurricane of paper, wind and light
##
                                                title
## 1
       The mothers who found forgiveness, friendship
## 2
                        My year of living biblically
## 3
                      A robot that flies like a bird
## 4
                     A TED speaker's worst nightmare
## 5
                   A whistleblower you haven't heard
## 6 A dance in a hurricane of paper, wind and light
## 1 Phyllis Rodriguez and Aicha el-Wafi have a powerful friendship born of unthinkable loss. Rodriguez
## 2
## 3
## 4
## 5
## 6
                                                     Choreographer Aakash Odedra is dyslexic and has alw
                          main_speaker
                                                speaker_occupation num_speaker
## 1 Aicha el-Wafi + Phyllis Rodriguez
                                                      9/11 mothers
                              AJ Jacobs
                                                                              1
## 2
                                                            Author
## 3
                        Markus Fischer
                                                                              1
                                                          Designer
                     Improv Everywhere Social energy entrepreneur
## 4
                                                                              1
## 5
                         Geert Chatrou
                                                                              1
## 6
                         Aakash Odedra
                                                     Choreographer
                                                                              1
##
      duration
                            event film_date published_date comments
## 1 9.900000
                                                  2011-05-02
                    TEDWomen 2010 2010-12-12
                                                                   149
## 2 17.666667
                          EG 2007 2007-12-02
                                                  2008-07-17
                                                                   583
## 3 6.316667
                   TEDGlobal 2011 2011-07-15
                                                  2011-07-22
                                                                   440
## 4 3.816667
                          TED2012 2012-03-01
                                                  2012-03-09
                                                                   324
## 5 11.933333 TEDxRotterdam 2010 2010-06-04
                                                  2011-02-11
                                                                    93
## 6 9.833333
                   TEDGlobal 2014 2014-10-21
                                                  2014-12-05
                                                                    48
##
                   ['culture', 'friendship', 'global issues', 'parenting', 'terrorism']
## 1
## 2 ['comedy', 'culture', 'entertainment', 'humanity', 'humor', 'religion', 'writing']
            ['animals', 'biomechanics', 'biomimicry', 'design', 'robots', 'technology']
## 4
                                     ['entertainment', 'performance', 'performance art']
## 5
                        ['TEDx', 'entertainment', 'live music', 'music', 'performance']
                                                       ['dance', 'music', 'performance']
## 6
     languages
##
## 1
            32
## 2
            39
## 3
            45
## 4
            51
## 5
            31
## 6
            39
##
```

```
[{'id': 10, 'name': 'Inspiring', 'count': 385}, {'id': 1, 'name': 'Beautiful', 'count':
## 2 [{'id': 22, 'name': 'Fascinating', 'count': 531}, {'id': 3, 'name': 'Courageous', 'count': 345}, {
## 3 [{'id': 23, 'name': 'Jaw-dropping', 'count': 1487}, {'id': 22, 'name': 'Fascinating', 'count': 119
         [{'id': 2, 'name': 'Confusing', 'count': 186}, {'id': 7, 'name': 'Funny', 'count': 1423}, {'id
## 5
               [{'id': 23, 'name': 'Jaw-dropping', 'count': 216}, {'id': 22, 'name': 'Fascinating', 'co
## 6
                 [{'id': 1, 'name': 'Beautiful', 'count': 423}, {'id': 25, 'name': 'OK', 'count': 92},
## 1 [{'id': 968, 'hero': 'https://pe.tedcdn.com/images/ted/202850_800x600.jpg', 'speaker': 'Inge Missm
## 3
## 4
                                                                                                    [{'i
## 5
## 6
##
      views year
## 1 820976 2010
## 2 2291701 2007
## 3 6264902 2011
## 4 2950307 2012
## 5 1917442 2010
## 6 817014 2014
```

and avoid that##h&y get married and suffer as much as I did, well this is something good. This is why I'm here in fro ## 2 I thought I'd tell you a little about what I like to write. And I like to immerse myself in my top

```
wc <- function(x){</pre>
  \#x \leftarrow as.character(x)
  words <- strsplit(x[[1]], split="\\s+")</pre>
  return(length(words[[1]]))
}
df3$wc <- sapply(df3$transcript, wc)</pre>
summary(df3$wc)
##
       Min. 1st Qu. Median
                                   Mean 3rd Qu.
                                                     Max.
##
          1
                1332
                         2028
                                   2040
                                            2707
                                                     9044
# Word Cloud
texts <- df3$transcript</pre>
\#texts \leftarrow iconv(texts, to = "utf-8")
corpus <- Corpus(VectorSource(texts))</pre>
corpus <- tm_map(corpus, PlainTextDocument)</pre>
corpus <- tm_map(corpus, removePunctuation)</pre>
corpus <- tm_map(corpus, removeWords, stopwords('english'))</pre>
corpus <- tm_map(corpus, stemDocument)</pre>
corpus <- tm_map(corpus, removeWords, c("and", "this", "there"))</pre>
corpus <- Corpus(VectorSource(corpus))</pre>
dtm <- TermDocumentMatrix(corpus)</pre>
m <- as.matrix(dtm)</pre>
v <- sort(rowSums(m),decreasing=TRUE)</pre>
d <- data.frame(word = names(v),freq=v)</pre>
```

```
head(d, 10)
##
          word freq
## and
           and 42885
## can
           can 24129
## one
           one 20275
## like
          like 19814
## peopl peopl 19527
## just
         just 16098
## thing thing 14545
## think think 14370
## that
         that 13963
## get
           get 13840
d <- d[-which(d$word %in% c("and", "this", "that")),]</pre>
set.seed(1234)
  # For temporarily disabling warnings
  oldw <- getOption("warn")</pre>
  options(warn = -1)
wordcloud(words = d$word, freq = d$freq, min.freq = 1,
          max.words=200, random.order=FALSE, rot.per=0.35,
          colors=brewer.pal(8, "Dark2"))
```

```
water to percent much someth human play interest someth human play interest countries also welly ear run reallieven also well earn fact world well earn fact well earn fact
```

```
# For re-enabling warnings
options(warn = oldw)
```

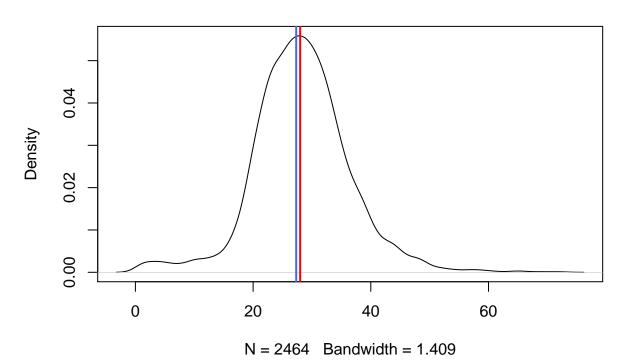
```
# Average number of languages per event, and then per TED2xxx event.
evntlang <- data.frame(df$event, df$languages)</pre>
avg <- aggregate(.~df.event, data=evntlang, mean)</pre>
avg_sub <- avg[avg$df.languages > 0, ]
avgsub_last <- avg_sub[substr(avg_sub$df.event, 1, 4) == "TED2", ]</pre>
head (avgsub_last)
      df.event df.languages
##
                    24.33333
## 75
      TED2001
## 76 TED2002
                    22.89286
## 77
      TED2003
                    24.79412
      TED2004
                    25.83871
## 78
                    25.29730
## 79
       TED2005
                    27.68889
      TED2006
## 80
graph_sub <- ggplot(avgsub_last, aes(x=df.event, y=df.languages)) + geom_point(shape=1) + geom_smooth(m
graph_sub <- graph_sub + stat_smooth() + theme(axis.text.x = element_text(angle = 45, vjust = 1, hjust=</pre>
graph_sub
## `geom_smooth()` using method = 'loess'
    35 -
    30 -
                                        0
                                   0
df.languages
                                                                                     0
                         0
    25 -
               0
    20 -
    15 -
                                                  TED2010
                                       TED2008
                                                       TEDOU TEDOUS TEDOUS TEDOUS TEDOUS
                                               df.event
plot(density(df$languages[df$languages > 0]))
abline(v = mean(df$languages),
```

col = "royalblue",

```
lwd = 2)

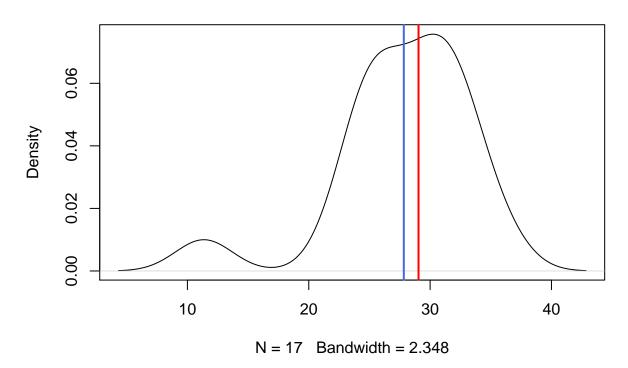
abline(v = median(df$languages),
  col = "red",
  lwd = 2)
```

density.default(x = df\$languages[df\$languages > 0])



summary(df\$languages) Min. 1st Qu. Median ## Mean 3rd Qu. Max. ## 23.00 28.00 27.33 33.00 72.00 ${\it \# Average number and histogram of languages per TED2xxx event.}$ plot(density(avgsub_last\$df.languages)) abline(v = mean(avgsub_last\$df.languages), col = "royalblue", lwd = 2)abline(v = median(avgsub_last\$df.languages), col = "red", lwd = 2)

density.default(x = avgsub_last\$df.languages)



summary(avgsub_last\$df.languages)

Min. 1st Qu. Median Mean 3rd Qu. Max. ## 11.36 25.30 29.04 27.83 31.46 35.80