



596: Machine Learning
Term Project
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TED Data Analysis

Dec 20, 2017

What is TED?

“A nonprofit devoted to spreading ideas, usually in the form of short, powerful talks (18 minutes or less).”

Example TED Talks:

- “Do schools kill creativity?”
- “Extreme swimming with the world’s most dangerous jellyfish”
- “The enchanting music of sign language”



TED TALKS

Technology. Entertainment. Design.



A vehicle built in Africa, for Africa

Joel Jackson / Transport entrepreneur



How to overcome bias

TED Talk: Learn about the danger of bias and how to address these unconscious attitudes, boldly

NEWEST TALKS



A vehicle built in Africa



The power of citizen



The history of human

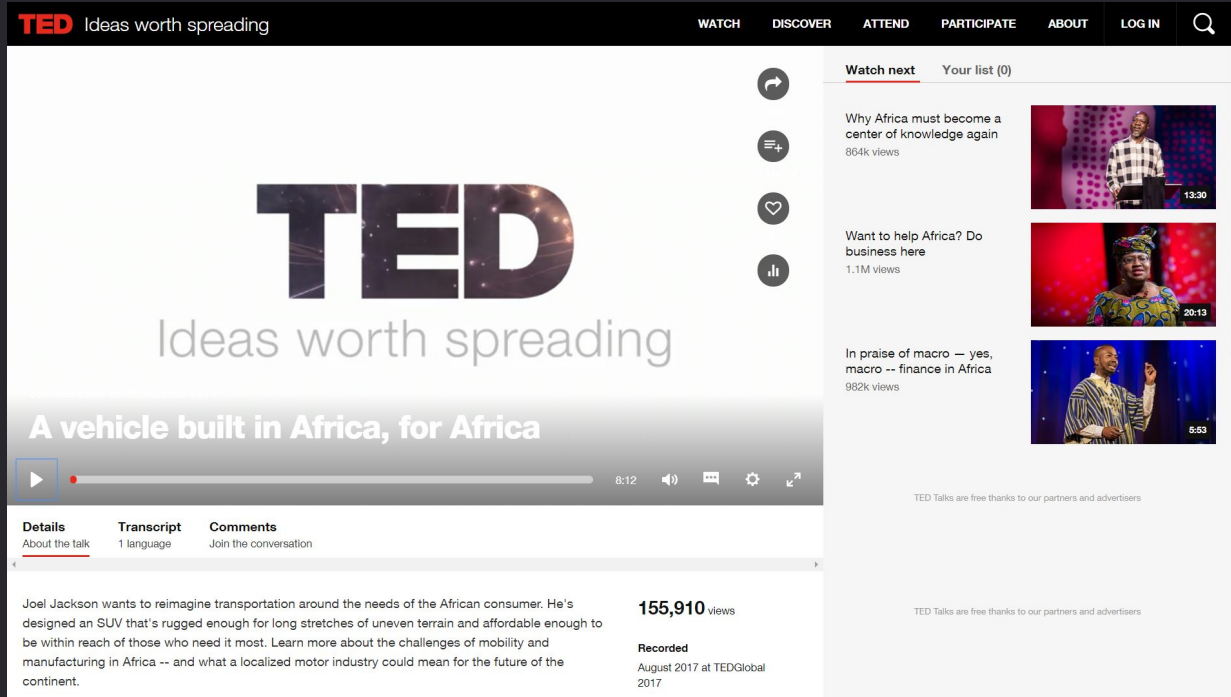


The gift of words



Want to get

Descriptive Findings

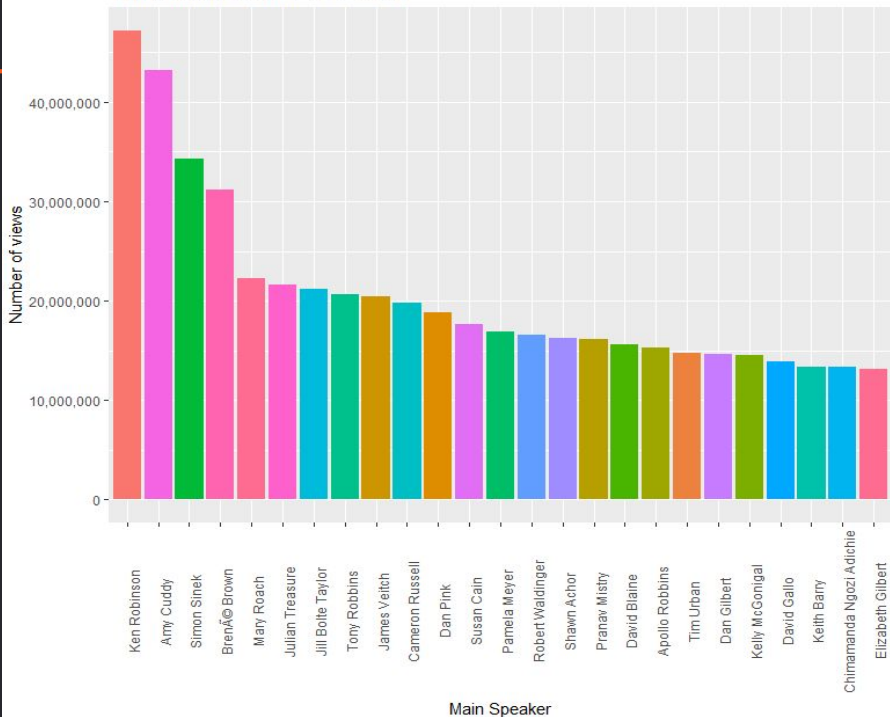


The screenshot shows the TED website interface. At the top, the navigation bar includes 'WATCH', 'DISCOVER', 'ATTEND', 'PARTICIPATE', 'ABOUT', 'LOG IN', and a search icon. The main content area features a large video player for the talk 'A vehicle built in Africa, for Africa' by Joel Jackson. The video player includes a progress bar at 8:12 and a play button. To the right of the video player, there are four circular icons: a share icon, a plus icon, a heart icon, and a volume icon. Below the video player, there are three tabs: 'Details', 'Transcript', and 'Comments'. The 'Details' tab is active, showing the title 'About the talk', the number of languages '1 language', and a link to 'Join the conversation'. The video description states: 'Joel Jackson wants to reimagine transportation around the needs of the African consumer. He's designed an SUV that's rugged enough for long stretches of uneven terrain and affordable enough to be within reach of those who need it most. Learn more about the challenges of mobility and manufacturing in Africa -- and what a localized motor industry could mean for the future of the continent.' The video has 155,910 views and was recorded in August 2017 at TEDGlobal 2017. To the right of the video player, there is a 'Watch next' section with a 'Your list (0)' link. It lists three recommended videos: 'Why Africa must become a center of knowledge again' (864k views, 13:30), 'Want to help Africa? Do business here' (1.1M views, 20:13), and 'In praise of macro -- yes, macro -- finance in Africa' (982k views, 5:53). Each video has a small thumbnail image and a duration indicator. At the bottom of the recommended videos section, there are two lines of text: 'TED Talks are free thanks to our partners and advertisers'.

- Looking at TED.com the videos are ordered by newest released first
 - 2017 - 2006
- Transcripts, Details, Favoriting, and Rating Features
 - Controlled List
- Commenting and Discussions are encouraged and are Monitored for Spam

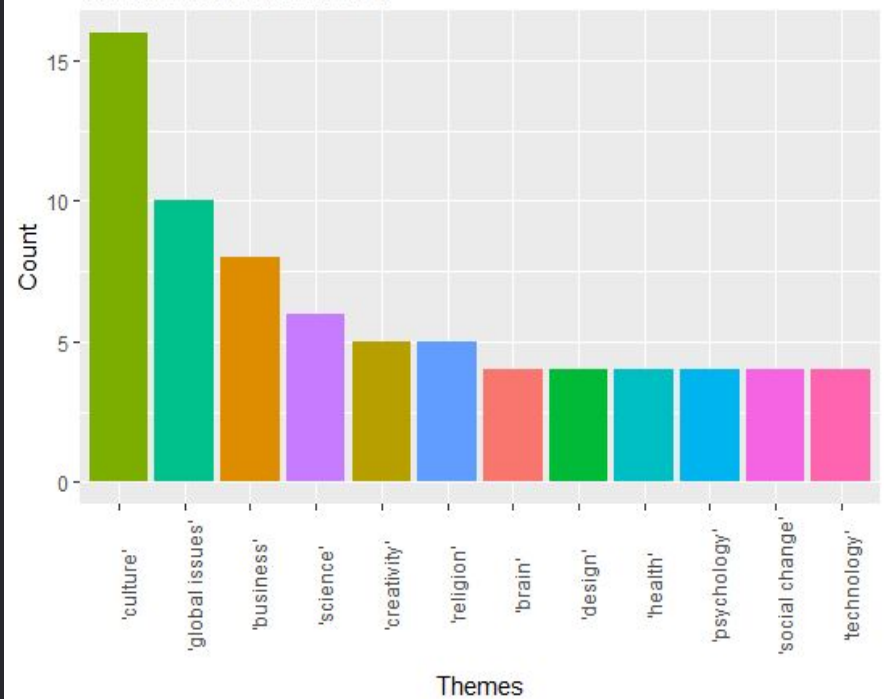
Initial Descriptive Findings

Top 25 Most Viewed TED Talks



- “Do schools kill creativity?”
- “How to escape education's death valley”

Themes most discussed



- Culture, Global Issues, Business, Science

Business questions

- 
1. Can we predict views and comments for new videos?
 2. Can we categorize videos by popularity?
 3. What kind of impact did a video have on viewers?
 4. Can we cluster videos based on tags?

Data Processing and Curation

Aggregate Data

- Unix and Excel to separate columns
 - REGEX, grep, and pivot tables
- R to clean/curate remaining data
 - Incomplete data, unix timestamps, string manipulation

Prioritize Metrics

- Ratings
- Tags/Themes
- Number of views
- Number of comments
- Duration
- Number of Languages

QUESTION 1

PREDICTING

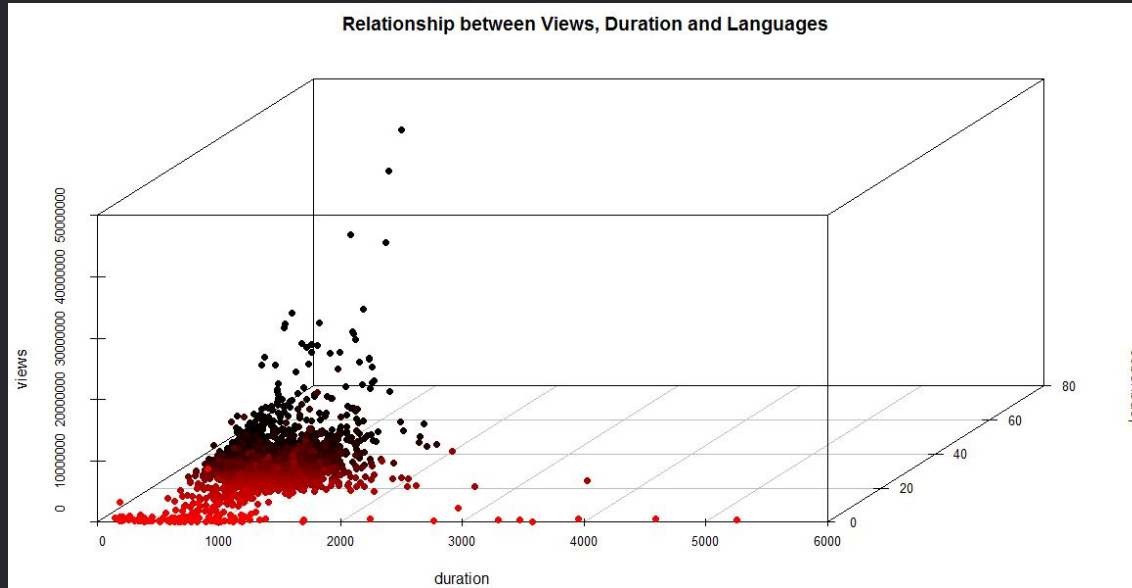
VIEWS & COMMENTS



Using linear regression and artificial neural networks to predict the number of views and the number of comments a video will receive.



Linear Regression - Relationship



Videos clustered between

0 - 10,000,000 views

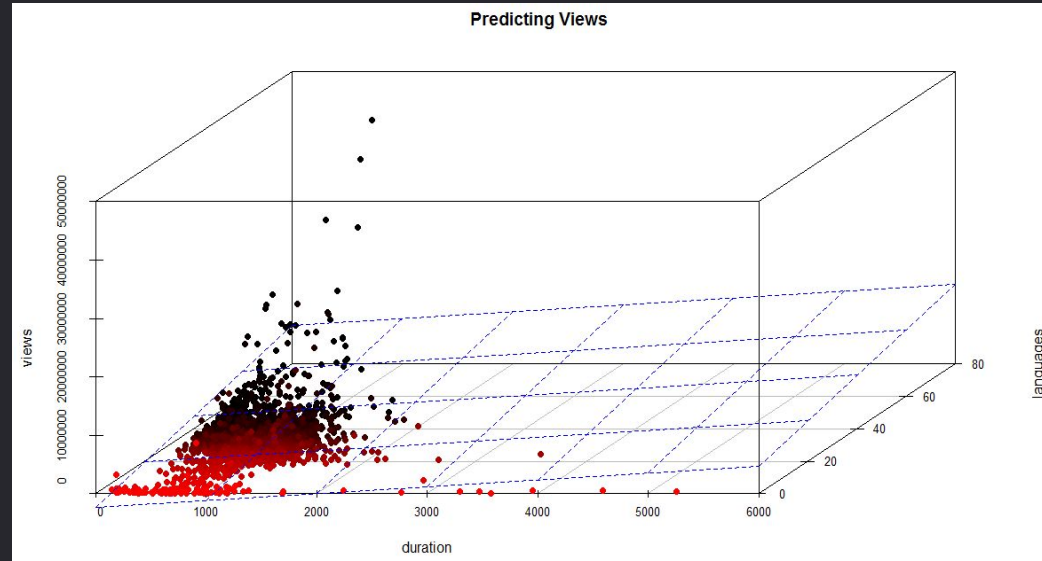
0 - 1,000 seconds

0 - 40 languages

Linear Regression - Predicting Views

$$\text{Views} = 11741.1(\text{duration}) + 112232.3(\text{languages}) - 2339034.6$$

Correlation	Duration	Language
Views	0.38	.005

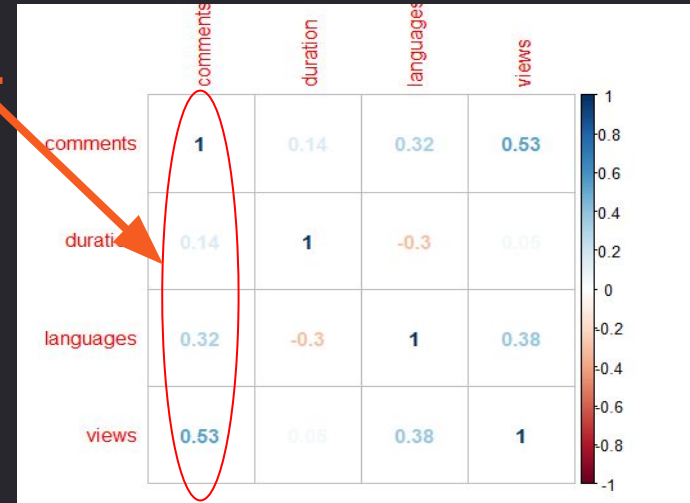


Linear Regression - Predicting comments

$$\text{Comments} = -.01693 + 0.1351(\text{duration}) - 0.0005035(\text{views}) + 5.991(\text{languages})$$

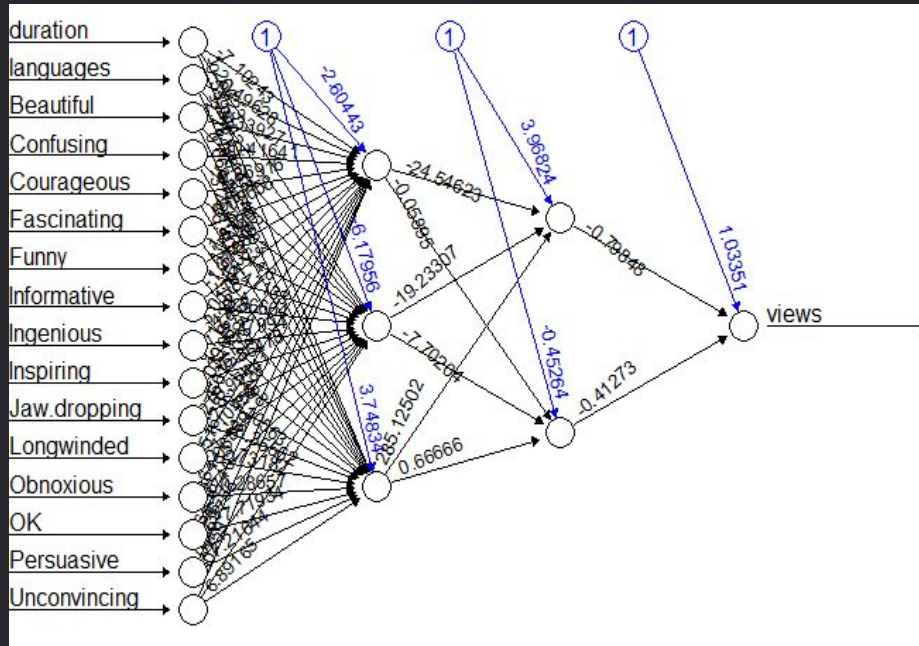
Correlation	Views	Duration	Language
Comments	0.53	0.32	.014

0.14



Artificial Neural Networks - Views

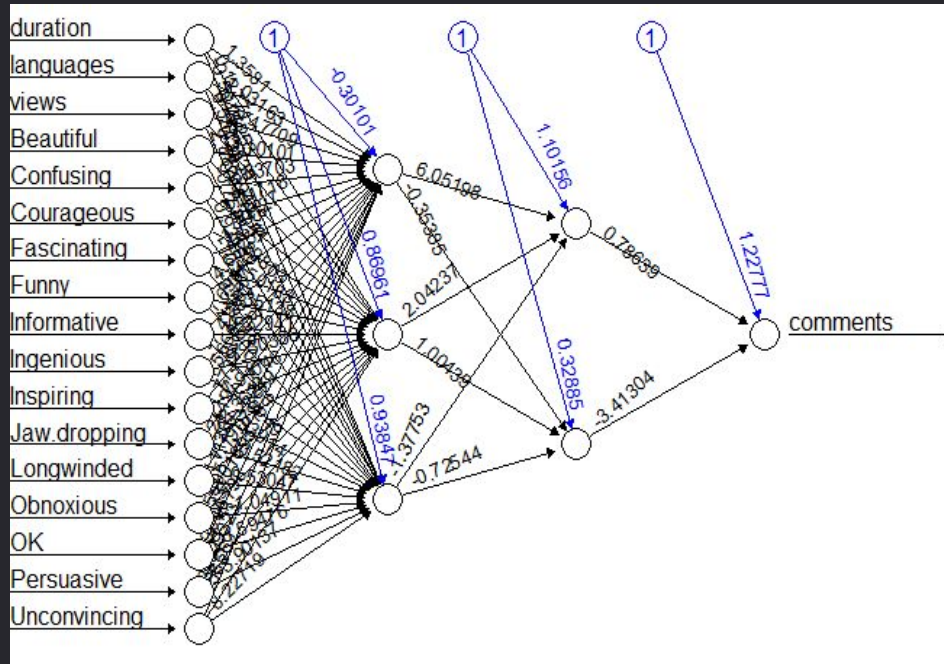
Model : Views ~ Durations + Languages + Ratings



MSE: 6283596155909

Artificial Neural Networks - Comments

Model : Comments ~ Duration + Languages + Ratings



MSE: 4068261144209

QUESTION 2

VIDEO POPULARITY GROUPS



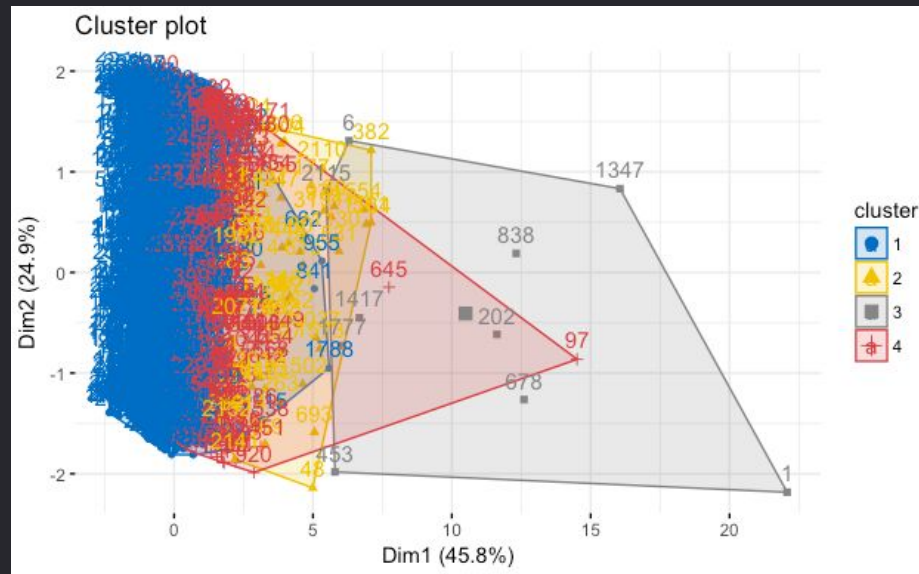
Unsupervised clustering using K-means to group videos according to the popularity, determining with the number of its views, comments, and languages available.



K-means clustering : Clusters

Model : Popularity ~ Views + comments + languages

- 75 : 25 data split
- Four clusters of sizes:
 - 318, 10, 2167, 55
- $\text{Between_SS} / \text{Total_SS} = 84.7 \%$



K-means: Findings

- The majority of the spots are highly concentrated on the left side of the plot, which indicates that most of the videos share similar popularity according to the number of its views, comments, and languages available.
- On the other hand, a few spots are spread apart in the center and on the right of the plot, which demonstrates there are small number of videos that have different popularity compared to the majority.

QUESTION 3

UNDERSTANDING IMPACT



**Using KNN & Random Forest to classify videos
based on views, comments, and ratings**



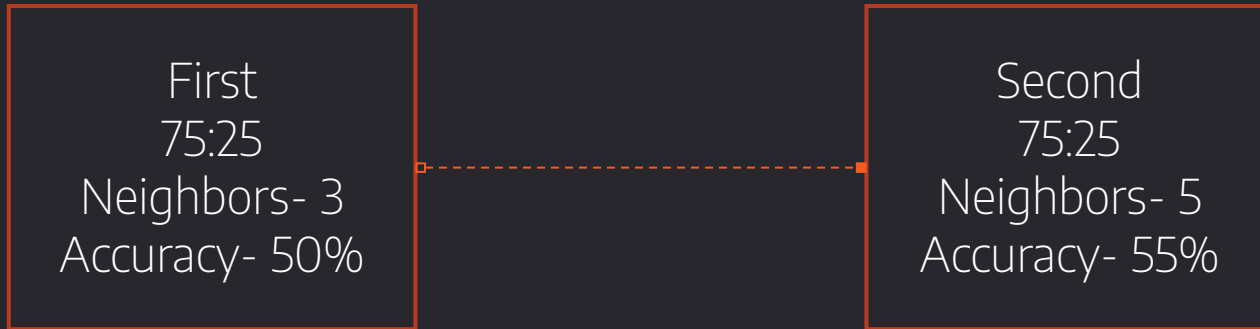
Understanding Ratings

RATINGS	METRIC	IMPACT
Beautiful, Fascinating, Jaw-dropping, Inspiring, Ingenious	4	High Impact
Informative, Courageous, Persuasive, Funny	3	Good Impact
OK, Long-winded	2	Neutral
Confusing, Obnoxious, Unconvincing	1	Bad Impact

- 14 Rating options
- Viewer can choose one, more than one, or all
- 4-level metric to understand ratings.

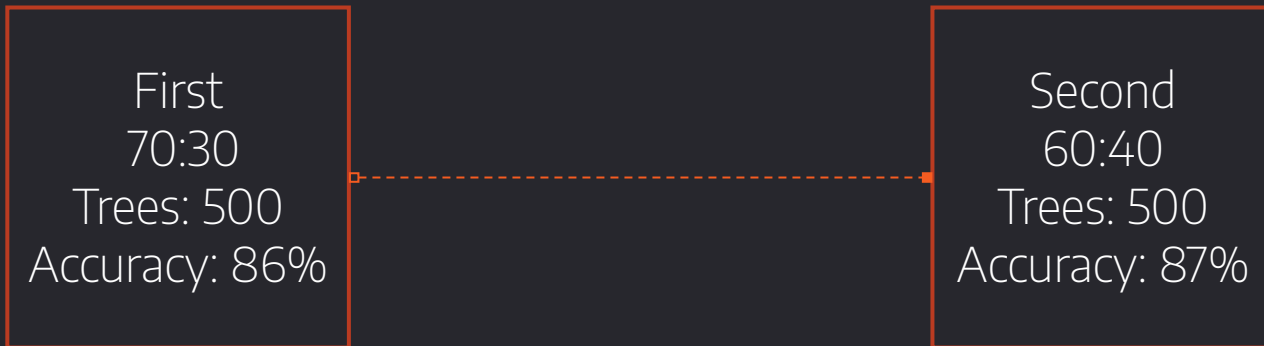
KNN

Model : Metric ~ (Ratings + View + Comments + Duration + Language)



Random Forest

Model : Metric ~ (Ratings + View + Comments + Duration + Language)



QUESTION 4

CLUSTERING FOR RECOMMENDATION



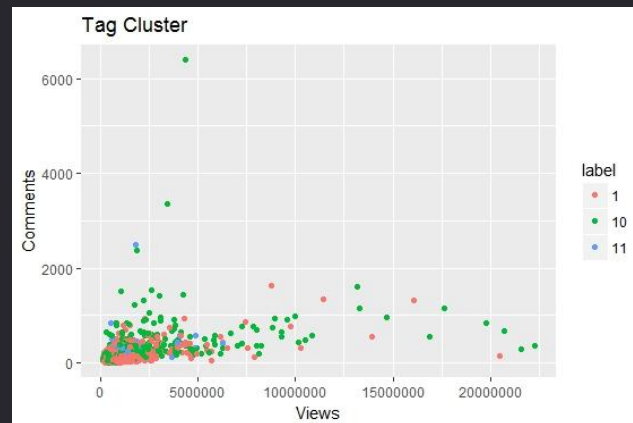
**Using Agglomerative & Divisive Clustering to
classify videos based on tags for better
recommendations**



Understanding Tags

- 147 unique tags
- Approximately 10 to 20 tags on each video
- Recommend videos with viewer's choice of tags.
- 2 of the top most tags-“technology” and “culture”

TAGS	LABEL
Technology	01
Culture	10
Technology, Culture	11



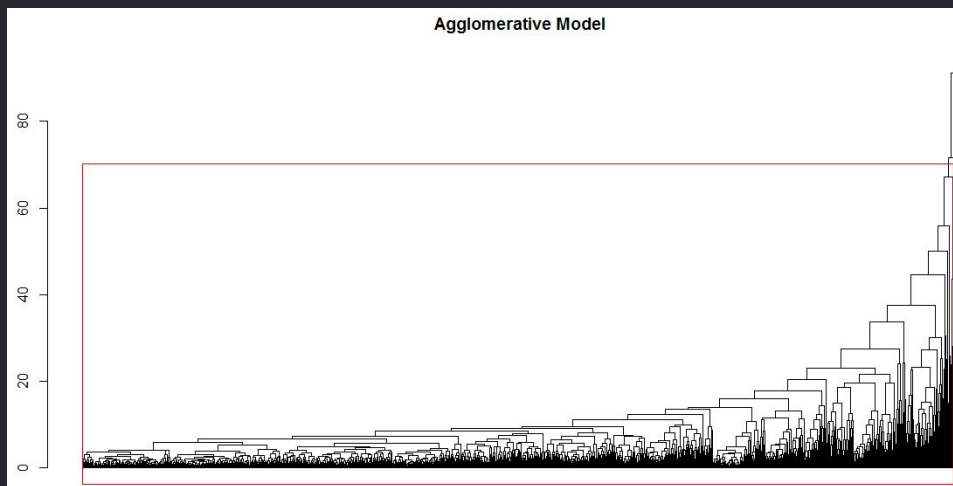
Agglomerative

Model : Tag Labels ~ Views+Comments+Duration+Languages+Ratings

No of clusters : 3

Height : 70

Accuracy : 56%



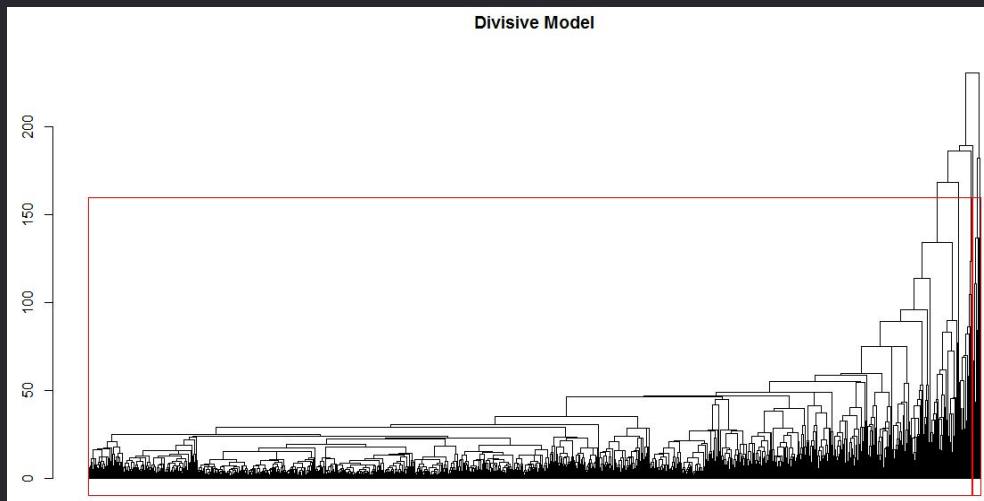
Divisive

Model : Tag Labels ~ Views+Comments+Duration+Languages+Ratings

No of clusters : 3

Height : 160

Accuracy : 57%



Limitations

- Limited analysis scope due to finite numerical variables
 - Lot of categorical variables
- Time span of videos - Comparing views of 2006 to 2017
 - Exposure on videos
 - Number of Tags have changed after 2013
- Data restricted to 2,550 unique entries with skewed clusters

Summary

- We found that the data was skewed and that was difficult to manage due to different exposure on videos and topics
- We used the 'tags', 'views', 'topic' to forecast the popularity of the talks and increase viewership
- Having more dimensional aspects like Rating out of 5, Likes, etc. can help analysts create better models to predict the viewership

THANKS!

ANY QUESTIONS?

