What makes a song "classic": an analysis of lyrics from top songs from 1960 to 2005?

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STATS 535 Group 2 Final Project Presentation

Outline

- Introduction (Research Question & Dataset)
- Textual processing/analysis
- Webscraping
- Nonparametric analysis
- Power analysis
- Parametric analysis
- Conclusion

Background (motivation)





College Music Classes on Taylor Swift & Other Pop Stars



Research Question

• Does the times of repetition of the song title explain how popular a song is?

• Hypothesis: the song title repeats \(\) memorability & catchiness \(\), hence popularity \(\)

• Popularity (YouTube Viewcount) ~ song title repetition times

Original dataset

- https://www.kaggle.com/datasets/stefancomanita/top-us-songs-from-1950-to-2019-w-lyrics
- 5 columns and 700 rows (10 top songs per year, for 70 years)
- Lines of lyrics are segmented with |

•	year [‡]	rank [‡]	artist	\$song	lyrics
1	1960	1	Shirelles	Will You Love Me Tomorrow	Tonight you're mine completely You give your love so sweet
2	1960	2	Ray Charles	Georgia On My Mind	Georgia Georgia The whole day through (The whole day thr
3	1960	4	Hank Ballard & the Midnighters	Let's Go, Let's Go	There's a thrill upon the hill Let's go, let's a-go, let's go Ther
4	1960	5	Maurice Williams & the Zodiacs	Stay	(Please) Please, please, please Tell me you're going to Now y
5	1960	6	Sam Cooke	Chain Gang	Hoh ah, hoh, I hear something saying Hoh ah, hoh ah Uh ah,
6	1960	7	Drifters	Save The Last Dance For Me	You can dance Every dance with the guy Who gives you the \dots
7	1960	8	Miracles	Shop Around	When I became of age, my mother called me to her side Sh
8	1960	9	Chubby Checker	The Twist	Come on, baby, let's, do the twist Come on, baby, let's do th
9	1960	10	Everly Brothers	Cathy's Clown	Don't want your love any more Don't want your kisses, that'
10	1961	1	Ben E. King	Stand By Me	When the night has come And the land is dark And the moo
11	1961	2	Patsy Cline	Crazy	Crazy, I'm crazy for feeling so lonely I'm crazy, crazy for feeli

 Augmented with data scraped from



Trimming

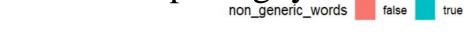
- YouTube came out in the end of 2005.
- Used only songs from 1960-2005 (remove too-old or too-new songs)
- A few songs' lyrics are incorrectly provided

1952	2 Hank W	/illicJambalaya (On The Bayou)	Goodbye Joe me gotta go me oh my oh Me gotta go pole the pirogue down the
1952	3 Domino	oes Have Mercy Baby	Have mercy, mercy baby I know I've done you wrong Have mercy, mercy baby I
1952	4 Clovers	One Mint Julep	One early morning, as I was walking I met a woman, we started talking I took he
1952	5 Jimmy	For Night Train	
1952	6 Johnny	Act My Song	That you would leave me here in tears But now you're gone and hours seem like
1952	7 Fats Do	omii Goin' Home	Can't stand your evil way Goin' home tomorrow Can't stand your evil way Whe
1952	8 King Ple	east Moody Mood For Love	There I go, there I go There I go, there I go Pretty baby, you are the soul Who sr
1952	9 Little W	/alt Juke	
1952	10 5 Roya	les Baby, Don't Do It	That you and I are through If you leave me pretty baby I'll have bread without n
1953	1 Drifters	fe: Money Honey	Uh ooooh You know the landlord rang my front door bell I let it ring for a long, I
1953	2 Hank W	/illia Your Cheatin' Heart	Your cheatin' heart will make you weep You'll cry and cry and try to sleep But sl
1953	3 Orioles	Crying In The Chapel	The tears I shed were tears of joy I know the meaning of contentment I am hap
1953	4 Crows	Gee	Do do-do do, do-do do, do-do do-do-do Do do-do do, do-do do, do-do do-do-do
1953	5 Faye Ad	dam Shake A Hand	Just leave it to me Don't ever be ashamed Just give me a chance I'll take care o
1953	6 Joe Tur	ner Honey Hush	In a Georgia cotton field Honey hush Come in this house, stop all that yackety y
1953	7 Ruth Br	row Mama, He Treats Your Daughter	Mear Mama, he treats your daughter mean Mama, he treats your daughter mean Ma
1953	8 Willie N	Лае Hound Dog	You ain't nothin' but a hound dog Been snoopin' 'round my door You ain't nothin
1953	9 Hank W	/illi≀Kaw-Liga	He fell in love with an Indian maid over in the antique store Kaw-Liga just stood
1953	10 Guitar	Slim The Things That I Used To Do	The things that I used to do Lord, I won't do no more The things that I used to d
1954	1 Bill Hal	ey & Rock Around The Clock	One, two, three o'clock, four o'clock rock Five, six, seven o'clock, eight o'clock ro
1954	2 Joe Tur	ner Shake, Rattle And Roll	2. Satisfaction by The Rolling Stones 3. Imagine by John Lennon 4. What's Going
1954	3 Penguir	ns Earth Angel	Earth angel, earth angel Will you be mine? My darling dear, love you all the time

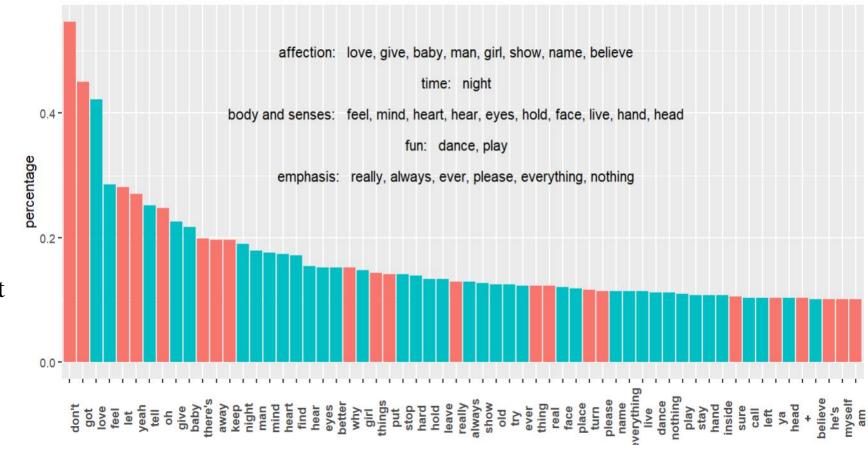
> nrow(Data) [1] 446

Lyrics analysis

• The most common content words in top-song lyrics



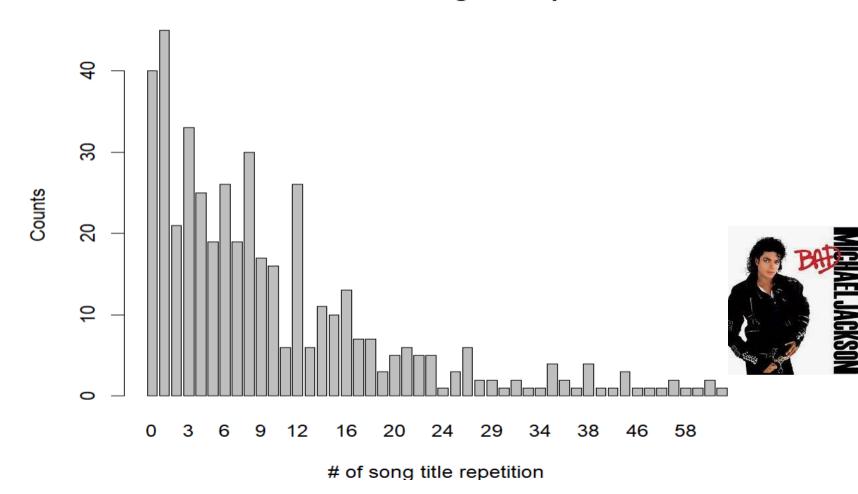
- str_replace_all
- str_split
- for-loop + unique
- nested for-loop + str_detect



of times song title repeats

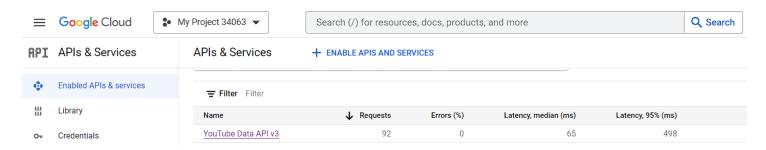
- str_replace_all
- tolower
- str_detect
- str_count

Distribution of song title repetition



Web Scraping

YouTube API available in Google Cloud



youtube_api <- "https://www.googleapis.com/youtube/v3/search"</pre>

query string

request_url <- paste(youtube_api , "?part=snippet&maxResults=1&q=", URLencode(search_query), "&key=", api_key, sep="")

- part=snippet
- o maxResults=1
- q=URLencode(search_query)
- o key="your_api_key"

Parameters				
equired parameters				
string The part parameter specifies a comma-separated list of one or more video resource properties that the API response will include. If the parameter identifies a property that contains child properties, the child properties will be included in the response. For example, in a video resource, the snippet property contains the				
channelId, title, description, tags, and categoryId properties. As such, if you set part=snippet, the API response will contain all of those properties.				
The following list contains the part names that you can include in the parameter value:				
• contentDetails				
• fileDetails				
• id				
• liveStreamingDetails				
• localizations				
• player				
• processingDetails				
• recordingDetails				
• snippet				
• statistics				
• status				
• suggestions				
• topicDetails				

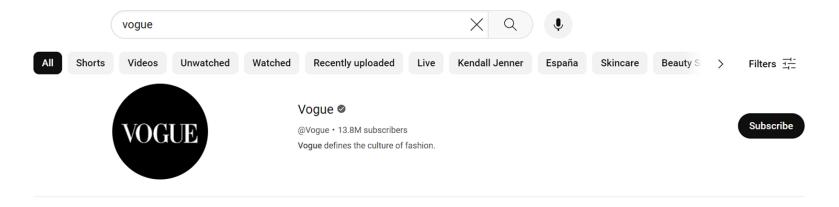
Libraries Used in Web Scraping – httr, jsonlite

```
GET() - httr
# Make the API request
response <- GET(request url)
                                                                                video_details
                                                                                                       list [6]
                                                                                                                               List of length 6
                                                                                    kind
                                                                                                       character [1]
                                                                                                                               'youtube#videoListResponse'
                                                                                                                               'ALmgp32eScFEfjP58HzLuV_VqmU'
                                                                                                       character [1]
                                                                                    etag
status code() - httr
                                                                                                       list [1 x 4] (S3: data.frame)
                                                                                                                               A data frame with 1 row and 4 columns
                                                                                 items
# Check the HTTP status code of the response
                                                                                     kind
                                                                                                       character [1]
                                                                                                                               'youtube#video'
if (status code(response) == 200) {}
                                                                                     etag
                                                                                                       character [1]
                                                                                                                               'Pb3rK8ZpjyUQG0X2OOAmdBQjF1M'
200 – OK; 404 – Not Found; 500 – Internal Server Error
                                                                                                       character [1]
                                                                                                                               'O1dUDzBdnml'
                                                                                                       list [1 x 4] (S3: data.frame)
                                                                                                                               A data frame with 1 row and 4 columns
                                                                                   statistics
                                                                                       viewCount
                                                                                                       character [1]
                                                                                                                               '140220452'
content() - httr
                                                                                       likeCount
                                                                                                       character [1]
                                                                                                                               '721342'
# Extract content from the response
                                                                                       favoriteCount
                                                                                                       character [1]
content <- content(response, "text")
                                                                                      commentCount
                                                                                                       character [1]
                                                                                                                               '23462'
                                                                                 pageInfo
                                                                                                                               List of length 2
                                                                                                       list [2]
fromJSON() - isonlite
                                                                                     totalResults
                                                                                                       integer [1]
                                                                                     resultsPerPage
                                                                                                       integer [1]
# Parse JSON content
                                                                                    search query
                                                                                                       character [1]
                                                                                                                               'Check On It Beyonc?? feat. Slim Thug'
video details <- from JSON (content)
                                                                                    video id
                                                                                                       character [1]
                                                                                                                               'Q1dUDzBdnml'
```

write_json() - jsonlite
Write json file
write_json(json, "data.json", pretty = TRUE, auto_unbox = TRUE)

Web Scraping Tips

Sometimes, the first search result is not a video but an advertisement.



- Special symbols do not work and can cause errors in search queries, for example, when searching for a song named 'Neighborhood #1 (Tunnels)'.
- The problem was then solved by using a combined query with both the song name and the singer's name. This approach makes sense, as some song names can refer to other things.

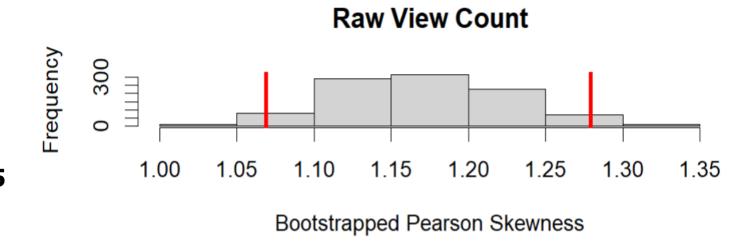
Regular Expression in Handling Json

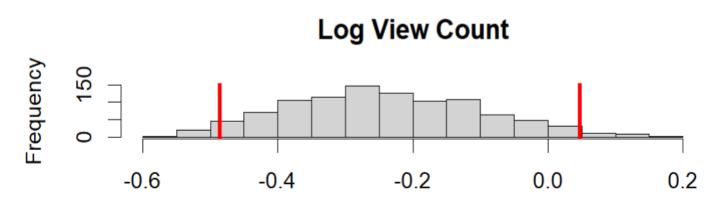
- We created the regular expression pattern for the features we want, including (song_name, view_count, like_ count)
- The function we used is str_extract_all() to find all matching pairs.

search_query	viewCount [‡]	likeCount [‡]
Will You Love Me Tomorrow Shirelles	11038942	92542
Georgia On My Mind Ray Charles	2077198	28663
Let's Go, Let's Go, Let's Go Hank Ballard & the Midnig	647485	4972
Stay Maurice Williams & the Zodiacs	9269625	56605
Chain Gang Sam Cooke	8136356	72602
Save The Last Dance For Me Drifters	35736750	160597
Shop Around Miracles	359871	3445
The Twist Chubby Checker	5935430	39116
Cathy's Clown Everly Brothers	3833138	26571
Stand By Me Ben E. King	9899281	91611
Crazy Patsy Cline	19023476	204739
The Wanderer Dion	32245658	298597
Runaround Sue Dion	30484544	297316
Crying Roy Orbison	7695729	56769
Hit The Road Jack Ray Charles	17898477	319281
Runaway Del Shannon	7875941	81034
Quarter To Three Gary U.S. Bonds	264328	2592
It Will Stand Showmen	506756	2134
Running Scared Roy Orbison	677486	7518
Bring It On Home To Me Sam Cooke	5419440	60149
You've Really Got A Hold On Me Miracles	10804387	105068
The Loco-Motion Little Eva	23747401	134406
Sherry Four Seasons	6716155	65981

Skewness of the Data Distribution Using Bootstrap

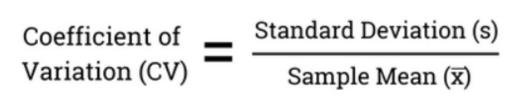
- Perform a bootstrap analysis to estimate the distribution of the Pearson's median skewness coefficient for the view_count variable.
- This histogram has values around 1.05
 to 1.3, indicating a positive skew in
 the view_count data.
- The skewness values after the log transformation range from about -0.5 to 0.05. The distribution is more centered around zero, suggesting that log transformation can help reduce the skewness of the data, leading to a more symmetric distribution.

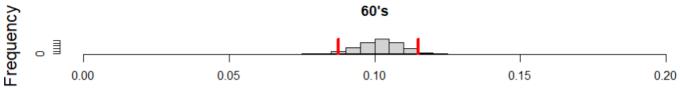


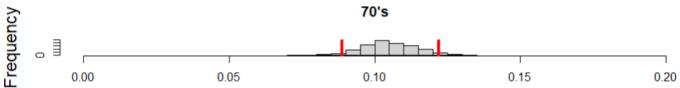


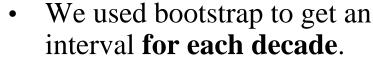
Bootstrapped Pearson Skewness

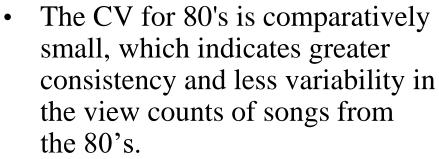
Analysis on Coefficient of Variation

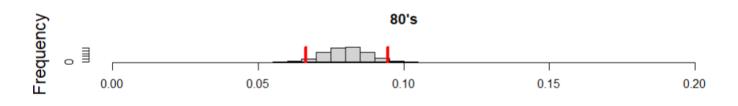


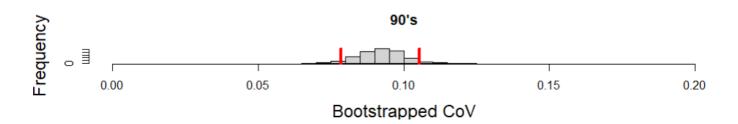




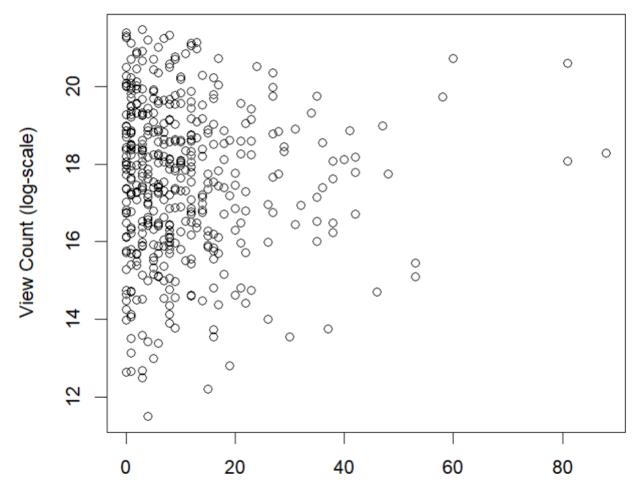








View Count ~ title repetition times Choice of predictor (continuous or categorical?)

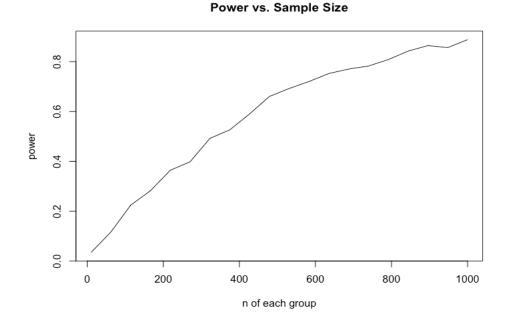


title repetition times

•	title_times_category	sample mean (log-ViewCount)	sample sd	sample size
1	0 time	17.62835	2.171227	40
2	1 time	17.59714	2.142629	45
3	2 times	18.02457	2.065578	21
4	34 times	17.36523	2.105227	58
5	58 times	17.42042	1.883426	94
6	more than 8 times	17.58930	1.842117	188

Monte Carlo Power Study

- We applied Monte Carlo method for the Power Study
- Assumptions:
 - In each group (by repetition times), the sample size n is the same
 - The true distribution has mean and standard deviation same as our sample mean and standard deviation
- F test: aov()
- Power becomes high when sample size is at least 800



Parametric F test(AOV)

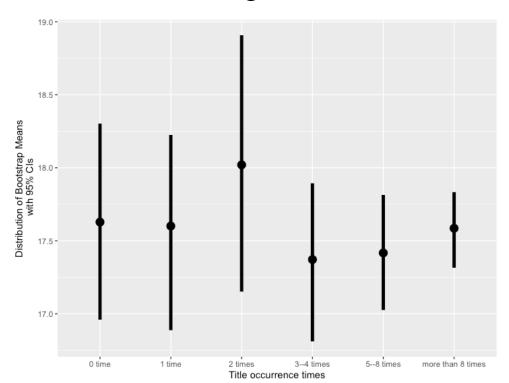
Null hypothesis(H_0): The means of each group are the same

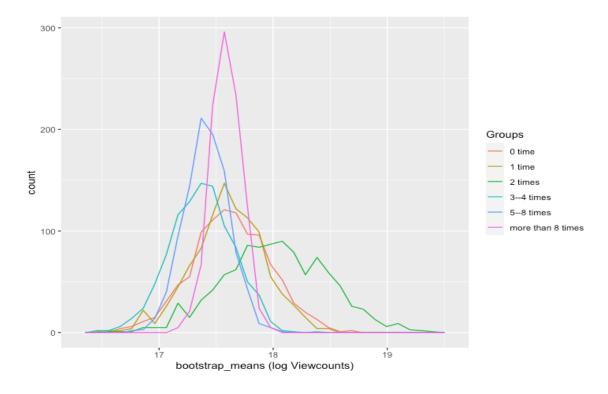
Alternative hypothesis(H_{α}): At least one sample mean differs from the others.

Result: 0.802>0.05, fail to reject the null hypothesis

Further Validation

- Bootstrap for creating confidence interval for mean of each group
- From the graph, it shows that there is no big differences among all groups, which aligns with our F test and Power study (we might be **underpowered**).





Conclusion

• There is no linear relationship between the occurrence of song title in lyrics and the popularity of songs

• Our analysis shows with a slight evidence that maybe having occurrence of 2 times might be the better option in song.