

*“Music happens to be an art form that transcends languages, age, gender, culture, stereotypes and prejudice.”*

## ANALYSIS AND RECOMMENDER SYSTEM BASED ON YOUR MUSIC LISTENING HABITS.

# Introduction

## Overview

Music is inherently something that binds people together. Its common practice for someone to ask new friends' what kind of music they listen to as one of the ice breakers questions. Just talking about your favorite songs, the lyrics, the meaning behind the themes and how you personally relate to what the artist is singing about can lead to you forming a deeper relationship with someone.

Personally, I think music is a big part of who I am as a person. The artists you decide to follow and the music you listen to can really change you as a person. I sometimes wonder what kind of a person I would be if I never found my favorite artist. So, for this project I wanted to focus on building an interface that would find and recommend you the most similar songs to your picked song as well as have a way to compare and contrast songs based on artists.

# Design Outline

## Data Sets

We found two datasets on Kaggle which we utilized for our analysis. I did the initial analysis using the first dataset which is the “Spotify Top Chart Songs 2022”. This dataset provides a list of all songs that have appeared on the weekly top chart where the data has been collected from Spotify’s top global charts which are publicly available on their website. I used this one because I was already familiar with the data and I wanted to test the algorithm using a smaller dataset. The second dataset I used was a much larger dataset. It had 54000 songs from all around the world which I will be using for the final analysis. I did some initial cleaning on the data in Excel. I took out any duplicating cells as well as removed rows with any missing and/or incorrect values. There were quite a lot of rows where the song data was not parsed properly when pulling from the API so I decided to remove these songs as well. For this project I decided to only use the songs which has a popularity index of greater than 70 (out of 100). In the future, I would add a toggle function where the user can decide if they only want to look at and analyze popular songs or all songs.

These datasets include attribute information that is needed for further analysis, from the basic song attributes like track name and artist name, as well as specific information about the songs danceability, tempo, instrumentalness, etc.

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T	U	V
	Index	ID	Title	Artist	Release_Dat Year	Duration_ms	Danceability	Energy	Tempo	Loudness	Liveness	Speechiness	Acousticness	Instrumental	Valence	Key	Popularity					
1	1	415SwdQ0H		10K [KATYARANA	12/13/2019 2019	186800	0.794	0.757	107.99	-6.444	0.0621	0.123	0.0267	0.000306	0.615	6	73					
2	2	5Hs5EeP3H		3:00 AM [Finding Ho	201951	0.55	0.147	81.991	-18.675	0.286	0.0404	0.563	0.00102	0.0346	0	72						
3	3	2gNMXXDKR		3:59 AM [DIVINE]	12/3/2020 2020	272197	0.669	0.588	97.026	-6.902	0.179	0.339	0.177	0	0.237	2	70					
4	4	1nX9KX3ff		4:00 AM [2 Chainz,	6/16/2017 2017	255560	0.796	0.5	75.012	-7.21	0.155	0.425	0.118	0	0.227	1	70					
5	5	79sf6AdpG		11:00 PM [Maluma]	5/17/2019 2019	175733	0.777	0.712	95.692	-4.84	0.091	0.277	0.217	0	0.68	10	79					
6	6	3j9lratTDxc		17 [Ufo361, B	1/1/2021 2021	148915	0.801	0.697	167.997	-7.962	0.106	0.252	0.0147	0.0264	0.629	2	71					
7	7	6x29aaazw		8 [Billie Eilish	3/29/2019 2019	173202	0.735	0.235	62.446	-13.239	0.107	0.315	0.698	0.00604	0.462	3	74					
8	8	034kyQEK7H		17 [Pink Sweat	2/28/2020 2020	160737	0.558	0.364	129.17	-8.663	0.109	0.0502	0.169	9.94E-05	0.252	5	71					
9	9	21hb20yIYO		18 [Anarbor]	6/4/2013 2013	157360	0.724	0.854	98.056	-2.779	0.0805	0.0997	0.0603	0	0.88	11	73					
10	10	3jn6U8B8A		18 [One Direct	11/17/2014 2014	248360	0.681	0.582	124.038	-7.76	0.119	0.0313	0.22	0	0.221	6	81					
11	11	13HgcA7pD7		21 [Polo G]	5/15/2020 2020	163798	0.783	0.479	176.027	-10.646	0.101	0.541	0.149	0	0.533	7	84					
12	12	6e441Vva6K		22 [Taylor Swift	10/22/2012 2012	232120	0.661	0.729	103.987	-6.561	0.0477	0.0376	0.00215	0.0013	0.668	7	73					
13	13	20FzLrU35b		23 [Mike Will	1/1/2013 2013	252520	0.859	0.599	140.005	-5.254	0.13	0.0614	0.000362	8.20E-06	0.319	9	71					
14	14	0NpDzamAt		44 [8Mill Gyal,	3/18/2021 2021	185467	0.801	0.76	102.061	-5.948	0.207	0.107	0.252	9.17E-06	0.508	5	74					
15	15	2uagN5cWye		100 [Anuel AA,	1/22/2021 2021	215293	0.769	0.455	95.097	-5.698	0.251	0.155	0.554	2.07E-06	0.293	10	73					
16	16	3K3JopyV29		120 [Bad Bunny]	11/27/2020 2020	151506	0.836	0.656	171.918	-5.542	0.287	0.0676	0.451	7.97E-06	0.439	2	76					
17	17	16EMON2w		212 [Azealia Bar	11/7/2014 2014	204957	0.846	0.772	125.998	-5.735	0.0769	0.219	0.0123	0.000106	0.622	11	71					
18	18	2XWjK6d5E		365 [Zedd, Kat	2/14/2019 2019	181900	0.745	0.693	98.039	-5.479	0.123	0.034	0.339	0	0.248	2	70					
19	19	0F14P8fhwC5		501 [Bilal Wahit	2/25/2021 2021	127592	0.613	0.796	186.102	-3.672	0.292	0.203	0.162	0	0.749	8	77					
20	20	08e4fqsDD		505 [Arctic Mon	4/22/2007 2007	253587	0.526	0.866	140.266	-5.822	0.0945	0.0568	0.00287	7.78E-05	0.248	0	81					
21	21	58geddP91c		505 [Arctic Mon	4/24/2007 2007	253587	0.52	0.852	140.267	-5.866	0.0733	0.0543	0.00237	5.79E-05	0.234	0	78					
22	22	5j9fE5yyymf		512 [Mora, Jhal	2/5/2021 2021	193636	0.818	0.673	87.961	-7.542	0.172	0.148	0.348	0	0.695	4	78					
23	23	0KdE1mGt		865 [Morgan W	1/8/2021 2021	190680	0.532	0.584	88.003	-5.254	0.101	0.0248	0.723	0	0.367	8	76					
24	24	20hKOR8Lg		911 [Damsel]	9/17/2020 2020	172293	0.685	0.706	155.989	-7.02	0.0986	0.0545	0.0894	0.0287	0.64	11	72					
25	25	217kvaRvA		911 [Sech]	2/5/2021 2021	215891	0.795	0.655	93.029	-3.815	0.296	0.0422	0.076	1.76E-06	0.744	7	91					
26	26	3bH2eMMos		911 [Elliee]	10/12/2018 2018	190000	0.698	0.611	130.098	-6.754	0.0587	0.0686	0.571	5.30E-06	0.107	10	71					
27	27	6d0MU175C		911 [Lady Gaga]	5/29/2020 2020	172133	0.789	0.813	116.007	-4.563	0.519	0.0374	0.0294	2.07E-06	0.42	5	74					
28	28	38386mDyP		1942 [Aes War]	2/25/2021 2021	185263	0.72	0.47	85.496	-6.922	0.138	0.224	0.026	3.70E-05	0.208	10	70					
29	29	0C28guo7X2		1950 [King Price	2/23/2018 2018	225133	0.6	0.535	71.912	-7.043	0.162	0.107	0.648	4.70E-06	0.269	4	78					
30	30	5oQcDu1om		1985 [Bowling Bo	6/26/1905 1905	193000	0.606	0.887	119.974	-4.404	0.337	0.0598	0.000242	0	0.903	4	74					
31	31	2BgEsaKtH		2002 [Anne-Marie	4/27/2018 2018	186987	0.697	0.683	96.133	-2.881	0.137	0.117	0.0372	0	0.603	1	84					
32	32	2u8AXy8p		2002 [Sido, Apac	9/26/2019 2019	237157	0.657	0.691	160.106	-7.907	0.099	0.236	0.213	0	0.493	8	70					
33	33	4Pqg7e7Bp		2002 [Anne-Marie	4/19/2018 2018	186987	0.697	0.683	96.133	-2.881	0.137	0.117	0.0372	0	0.603	1	71					
34	34	6dFmYy1H		2009 [Mac Miller	8/3/2018 2018	347987	0.533	0.496	155.158	-9.363	0.0969	0.517	0.77	0.000164	0.173	6	71					
35	35	0YETkron7		2019 [Martin Jene	2/26/2021 2021	131381	0.876	0.765	115.072	-6.554	0.0826	0.269	0.119	5.20E-06	0.729	9	71					
36	36	22HjqrftZt		3005 [Childish Ga	12/10/2013 2013	234215	0.472	0.448	166.077	-7.272	0.0914	0.326	0.113	0	0.636	6	78					
37	37	02M6vuxOm		11-Jul [BeyonceD	11/24/2014 2014	213507	0.747	0.705	136.024	-5.137	0.126	0.126	0.0128	0	0.56	9	72					
38	38	30C0nduJd		38 [30C0nduJd ...	2/14/2020 2020	168490	0.792	0.511	113.983	-6.876	0.14	0.0409	0.124	9.04E-05	0.111	2	80					
39	39	3MUMNVqV		39 [Britney Spe	1/22/1999 1999	211067	0.759	0.699	92.96	-5.745	0.443	0.0307	0.202	0.000331	0.907	0	80					
40	40	2u4OQUQdL		40 [Taylor Swift	11/10/2017 2017	208187	0.613	0.764	160.015	-6.509	0.197	0.136	0.0527	0	0.417	2	73					
41	41	4u4Oa5Kreah		41 [Eminem, 'I	5/26/2002 2002	297787	0.548	0.847	171.447	-3.237	0.0816	0.186	0.0622	0	0.1	1	85					
42	42	5QTrfngvV		42 [Blue vHste	5/29/1905 1905	308120	0.333	0.927	141.466	-8.55	0.297	0.0733	0.0029	0.000208	0.385	9	77					
43	43	1E990mgTr		43 [Bryan Adan	9/24/1991 1991	393640	0.533	0.36	131.229	-12.633	0.0631	0.0282	0.0805	1.03E-05	0.299	1	77					
44	44	2P4uB8B8d		44 [2P4uB8B8d (I	7/30/1965 1965	222813	0.723	0.863	136.392	-7.49	0.138	0.0388	0.0317	0.391	2	78						
45	45	7uq4KqubhB		45 [7uq4KqubhB	1/1/1993 1993	207440	0.642	0.722	172.406	-13.031	0.122	0.0375	0.0444	0.00388	0.836	2	70					
46	46	48yF0BuLX		46 [Cutting Cre	1/1/1986 1986	280400	0.625	0.726	124.945	-11.402	0.0625	0.0444	0.0158	0.000169	0.507	11	74					
47	47	48FMQ15uV		47 [Bill Medley	7/2/2004 2004	289067	0.7	0.781	108.695	-8.255	0.059	0.0507	0.0874	0.00342	0.385	6	70					
48	48	3ubhYUHB		48 [Otis Reddr	5/21/1905 1905	163756	0.769	0.367	103.621	-11.226	0.081	0.0312	0.684	1.62E-05	0.535	2	76					
49	49	2g2GKhzhZH		49 [2g2GKhzhZH	9/26/2000 2000	125440	0.691	0.507	128.518	-10.23	0.457	0.0343	0.627	0	0.885	11	73					
50	50	5k09Yw8dH		50 [5k09Yw8dH	1/23/1968 1968	165313	0.603	0.271	110.49	-10.083	0.141	0.0284	0.679	0	0.465	5	70					
51	51	47BBP2x7J		51 [47BBP2x7J	6/28/1905 1905	181067	0.631	0.69	94.574	-6.676	0.121	0.0531	0.176	0	0.938	2	70					
52	52	5eqyH50P4		52 [5eqyH50P4	5/20/1905 1905	179120	0.634	0.677	95.792	-7.19	0.0902	0.0448	0.318	0	0.939	2	70					
53	53	7zg2ib8dDe		53 [7zg2ib8dDe	5/17/2017 2017	142183	0.843	0.256	68.997	-13.565	0.133	0.0752	0.538	0.114	0.655	7	70					
54	54	01TUobvVd7		54 [01TUobvVd7	1/1/2013 2013	279507	0.797	0.608	127.999	-6.096	0.0748	0.0584	0.00112	7.66E-05	0.402	6	70					
55	55	5Cb3o7pRg+		55 [5Cb3o7pRg+	12/17/2019 2019	219767	0.561	0.665	160.019	-4.243	0.123	0.0222	0.106	0	0.675	8	70					
56	56	4MZ5gwE1-3		56 [4MZ5gwE1-3	2/28/2020 2020	157967	0.631	0.665	80.353	-7.589	0.153	0.229	0.602	1.70E-06	0.634	10	72					
57	57	4yUz2m9W0		57 [4yUz2m9W0	7/14/2013 2013	275227	0.559	0.716	176.618	-3.964	0.252	0.39	0.737	0	0.504	11	73					
58	58	4AlHvDp0u0		58 [4AlHvDp0u0	0/00-273-8255	250296	0.566	0.548	157.999	-6.456	0.11	0.0579	0.0802	0	0.196	1	74					
59	59	5x69p7uG		59 [5x69p7uG	5/5/2017 2017	250173	0.62	0.574	100.023	-7.788	0.19	0.0479	0.569	0	0.357	5	79					
60	60	5x69p7uG		60 [5x69p7uG	5/5/2017 2017	250173	0.62	0.574	100.023	-7.788	0.19	0.0479	0.569	0	0.357	5	79					

10. **Speechiness:** Speechiness detects the presence of spoken words in a track. Values above 0.66 describe tracks that are probably made entirely of spoken words. Values between 0.33 and 0.66 describe tracks that may contain both music and speech, either in sections or layered, including such cases as rap music. Values below 0.33 most likely represent music and other non-speech-like tracks.
11. **Acousticness:** A confidence measure from 0.0 to 1.0 of whether the track is acoustic. 1.0 represents high confidence the track is acoustic.
12. **Instrumentalness:** Predicts whether a track contains no vocals. "Ooh" and "aah" sounds are treated as instrumental in this context. Values above 0.5 are intended to represent instrumental tracks.
13. **Valence:** The higher the value, the more positive mood for the song.
14. **Key:** The key the track is in. Integers map to pitches using standard Pitch Class notation. E.g. 0 = C, 1 = C#/Db, 2 = D, etc. If no key was detected, the value is -1.

## Developmental Tools

For the algorithm to find similarity between the songs I used Python to write and test the code. Even some of the static images are built using the matplotlib in Python. After finding the list of songs that is the most similar, I used Excel to make the radar charts.

I wrote a program that computes the similarity scores between one selected song and all the other songs to find the songs that are the most similar using its attributes. Also creating a cluster of similar songs with a fixed value of K.

Input: Spotify 2000's MegaSet Data - spotify-data.csv

Output:

1. List of songs similar to a selected song.
2. Cluster of similar songs using K Means Clustering.

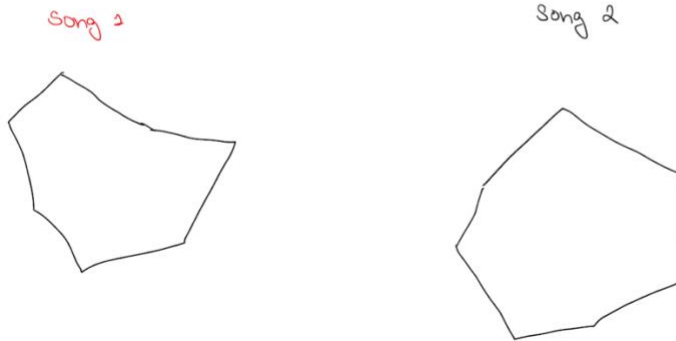
I made sure to write plenty of comments so that if you want to play around with the data it should be easy to understand.

Link to Github: <https://github.com/ishamahadalkar/spotifyvis>

Here are some of visuals I mapped out:

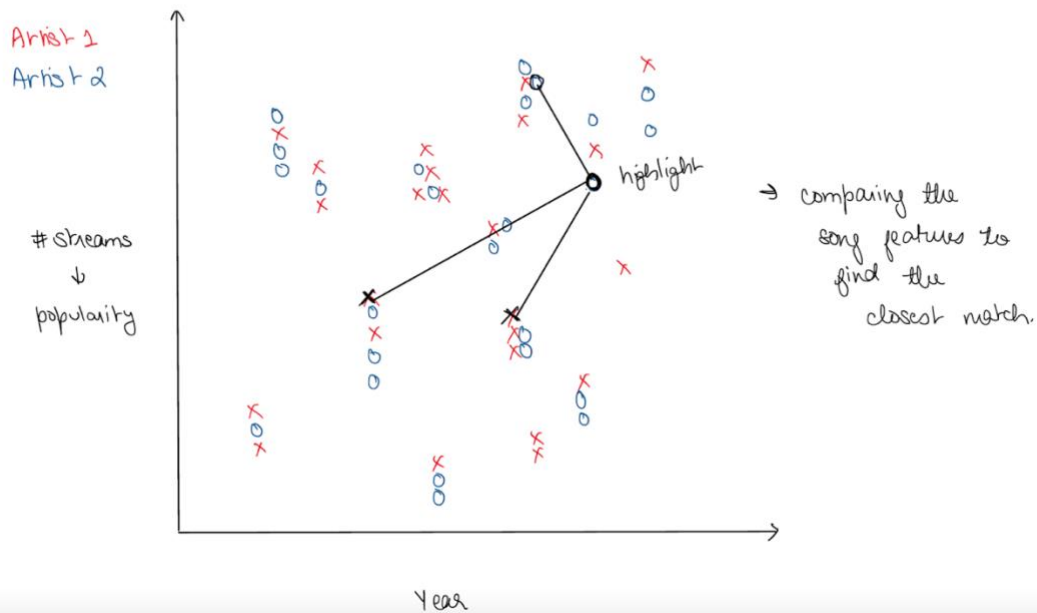
Click on each data point (each song) to show the song features using the radar charts.

↳ it opens them under the chart.



⇒ Find songs that similar to each other

① link them on the chart.



## Future Work

Currently since it is a work in progress, I only have static images but ideally, I would make it into an interactive application using Processing and D3 where the user can click on each song data point and see the radar chart for that song comparing it with radar charts of different songs.

Even for the scatterplot I would have it so that when a user clicks on one song it shows the information about the songs and then has links to the similar songs almost like a network diagram or a map while, ideally, playing the song in the background. I would also like to have a filter on Artists so the users can compare their favorite artists.

## Results

### Algorithm analysis:

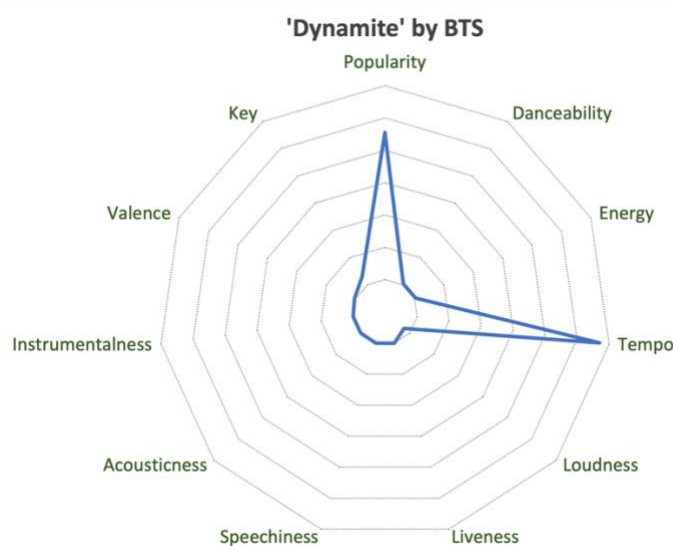
(7268 rows x 18 columns)																	
Currently analyzing 'Dynamite' by BTS																	
Host Similar Songs																	
	ID	Title	Artist	Release Date	Year	Duration_ms	Danceability	Energy	Tempo	Loudness	Liveness	Speechiness	Acousticness	Instrumentalness	Valence	Key	Popularity
293	294	001G0y0120d0mp0180A0	['Modline']	8/17/13	2013	30747	0.189	0.412	96.268	-6.733	0.0643	0.0443	0.17288	0.100000	0.102	0	84
949	959	4477131710p00710m0205	['Sam Hunt']	4/10/20	2020	210933	0.282	0.540	145.913	-5.488	0.1618	0.0404	0.21188	0.000000	0.176	0	78
1488	1488	5170y1100W0dP0d23r	['Beyoncé', 'JAY-Z']	6/24/03	2003	236133	0.646	0.778	99.165	-6.596	0.0735	0.2208	0.00249	0.000000	0.681	2	75
1558	1551	180C0d0C0d0W010p0d08	['Panic! At The Disco']	1/15/16	2016	285087	0.482	0.538	135.726	-5.527	0.0526	0.0508	0.01178	0.000000	0.405	0	73
1848	1841	404k1d0d0y100p0d00c	['BTS']	11/20/20	2020	199854	0.746	0.765	134.844	-4.418	0.0936	0.0903	0.01128	0.000000	0.737	0	91
5555	5555	240W0d0C0d00010C0d002	['Miguel']	3/15/13	2013	239666	0.517	0.438	76.773	-6.261	0.1148	0.0207	0.12588	0.000175	0.278	1	70
5621	5622	180d18X010W0d00210r	['Miguel', 'Francis Scott']	12/1/17	2017	251533	0.674	0.586	145.965	-10.512	0.0866	0.0434	0.17288	0.000000	0.183	0	76
1818	1819	240W0d0C0d00010C0d002	['Miguel']	10/13/20	2020	141580	0.584	0.544	126.477	-7.549	0.1748	0.1308	0.000000	0.135	0	71	
6426	6427	1040d0G0p1047F10d023	['Marshmello', 'J Balvin']	10/23/20	2020	183784	0.712	0.881	126.812	-7.788	0.2588	0.0401	0.00411	0.000000	0.735	0	75
6746	6747	400701100W0d00210r	['Starship']	9/28/05	2005	296688	0.461	0.388	144.493	-6.497	0.0701	0.0308	0.000000	0.056	1	70	
6779	6780	140W010P0d00010C0d002	['Taylor Swift']	4/9/21	2021	244237	0.489	0.373	106.087	-8.619	0.0779	0.0203	0.000000	0.138	0	76	
51na-Hu00ba-Pro-21p01f10y110h01																	

I chose 3 songs to analyze from different genres for some popular artists:

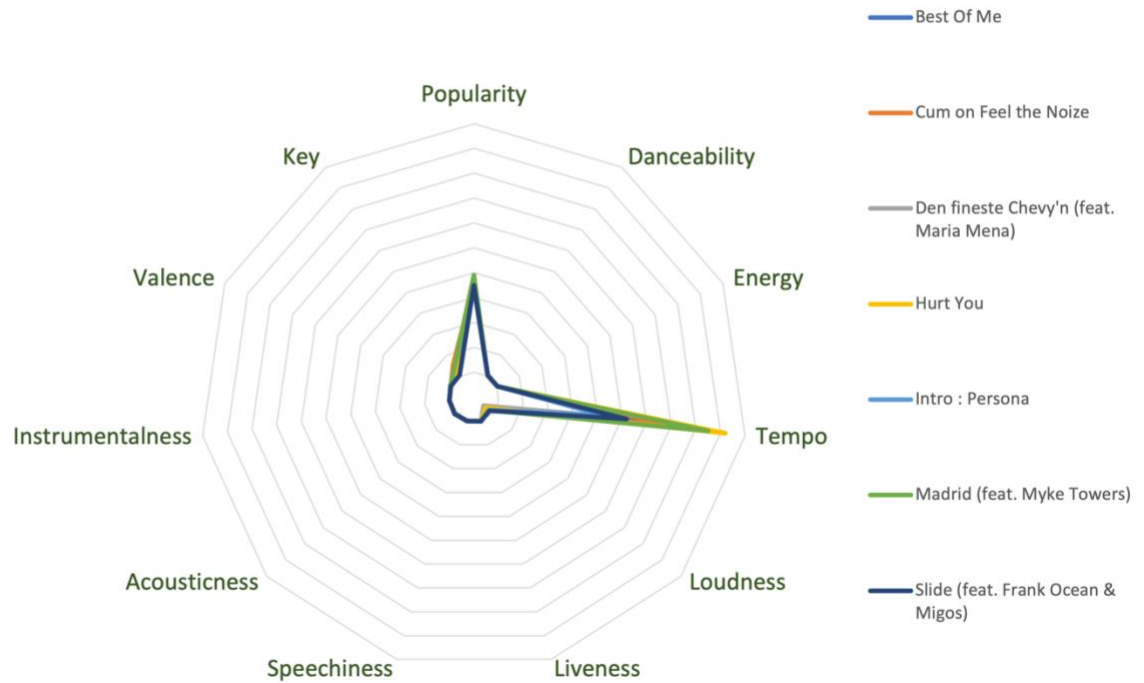
#### 1. “Dynamite” by BTS

#### Similar Songs:

Dynamite	['BTS']	11/20/2020
Best Of Me	['BTS']	8/24/2018
Cum on Feel the Noize	['Quiet Riot']	6/5/1905
Den fineste Chevy'n (feat. Maria Mena)	['Halva Priset', 'Maria Mena']	2/26/2021
Hurt You	['The Weeknd', 'Gesaffelstein']	3/30/2018
Intro : Persona	['BTS']	4/12/2019
Madrid (feat. Myke Towers)	['Maluma', 'Myke Towers']	8/21/2020
	['Calvin Harris', 'Frank Ocean',	
Slide (feat. Frank Ocean & Migos)	'Migos', 'Funk Wav']	6/30/2017



## 7 Most Similar Songs to 'Dynamite' by BTS

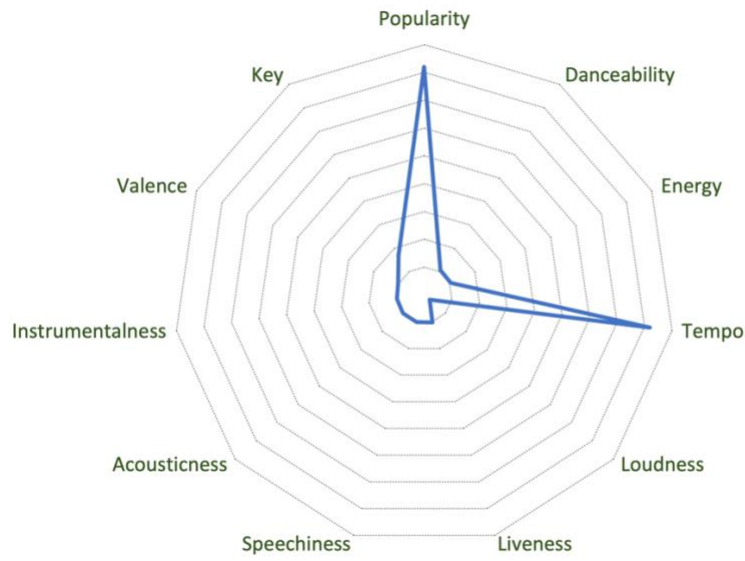


## 2. 'Money Trees' by Kendrick Lamar ft. Jay Rock

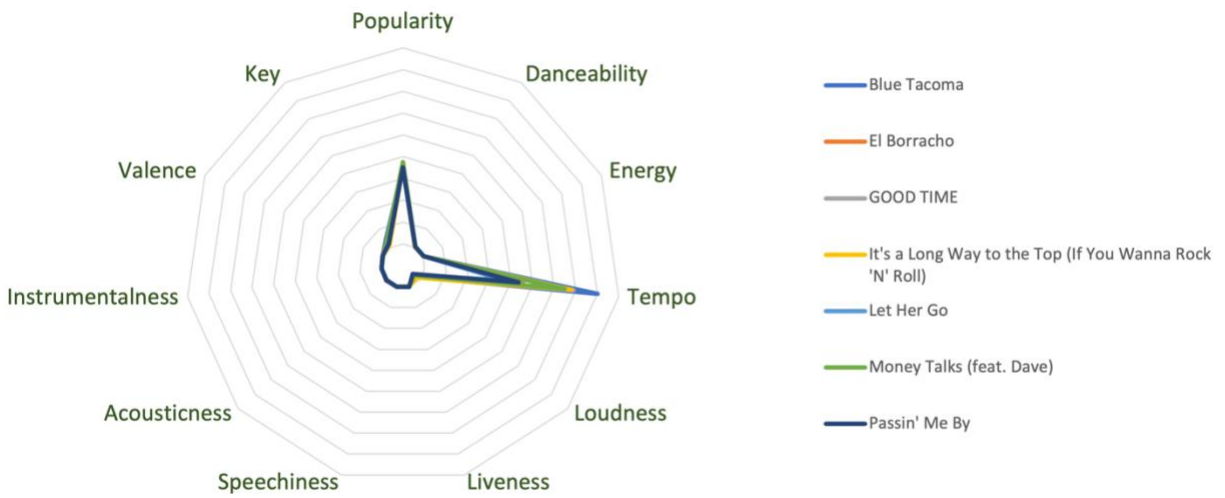
### Similar Songs:

Money Trees	['Kendrick Lamar', 'Jay Rock']	10/22/2012
Blue Tacoma	['Russell Dickerson']	6/16/2017
El Borracho	['Los Dos Carnales']	11/20/2020
GOOD TIME	['Niko Moon']	2/14/2020
It's a Long Way to the Top (If You Wanna Rock 'N' Roll)	['AC/DC']	5/14/1976
Let Her Go	['Passenger']	7/4/1905
Money Talks (feat. Dave)	['Fredo', 'Dave']	1/28/2021
Passin' Me By	['The Pharcyde']	11/24/1992

### 'Money Trees' by Kendrick Lamar ft. Jay Rock



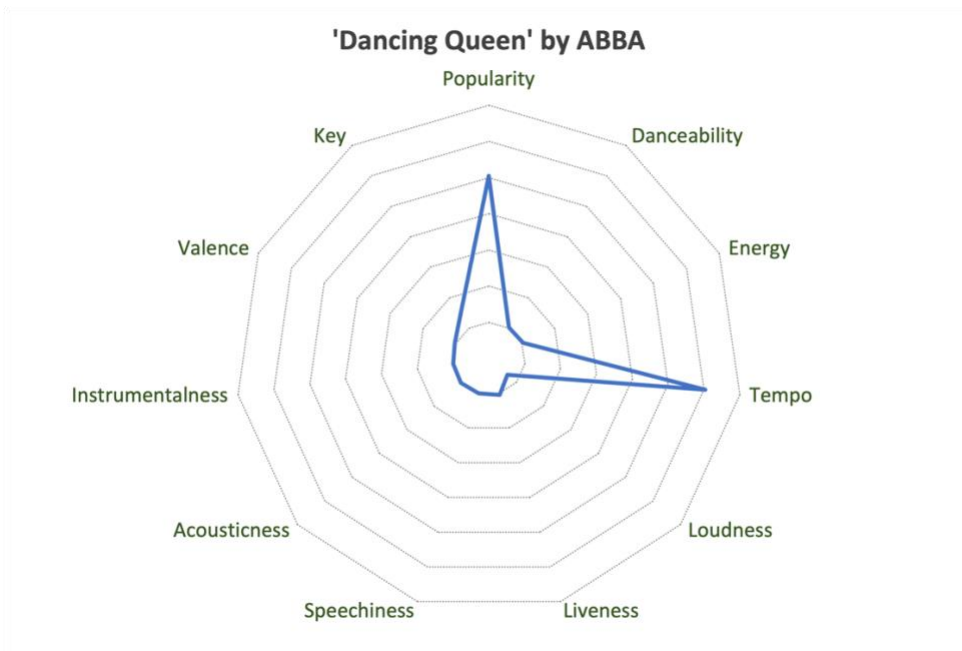
### 7 Most Similar Songs to 'Money Trees' by Kendrick Lamar ft. Jay Rock



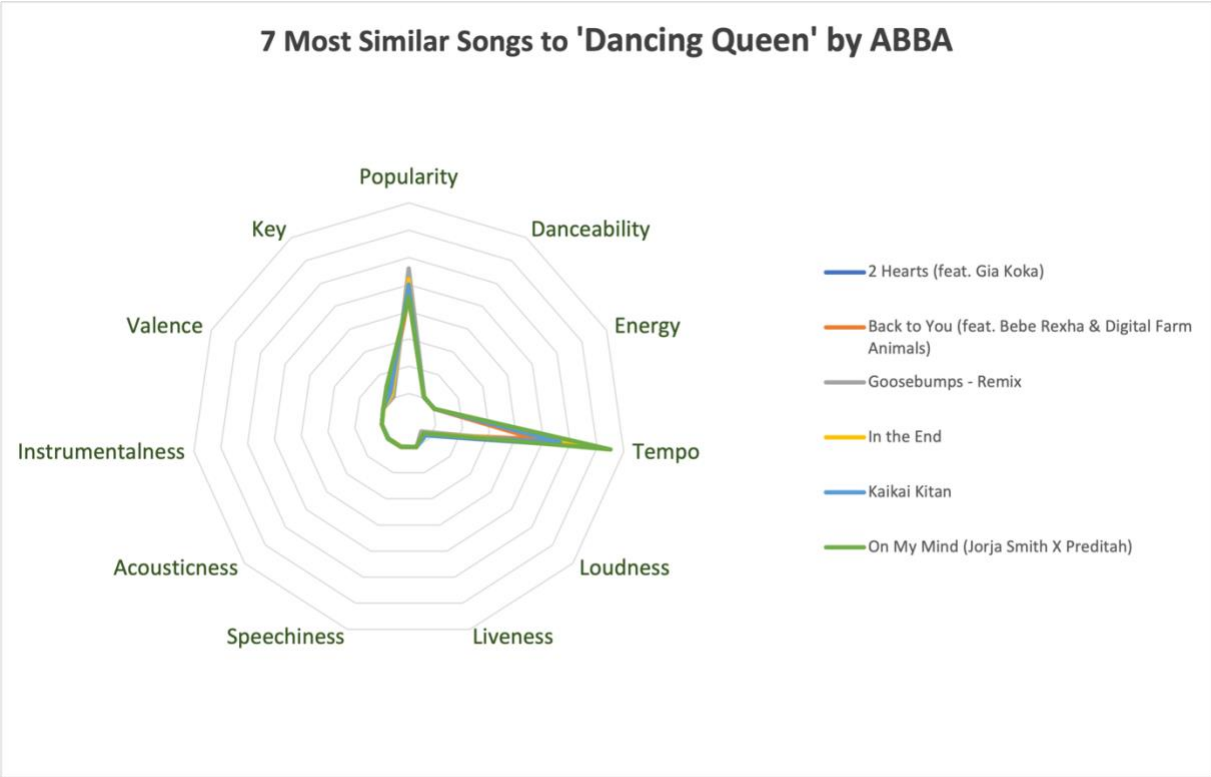
### 3. 'Dancing Queen' by ABBA

#### Similar Songs:

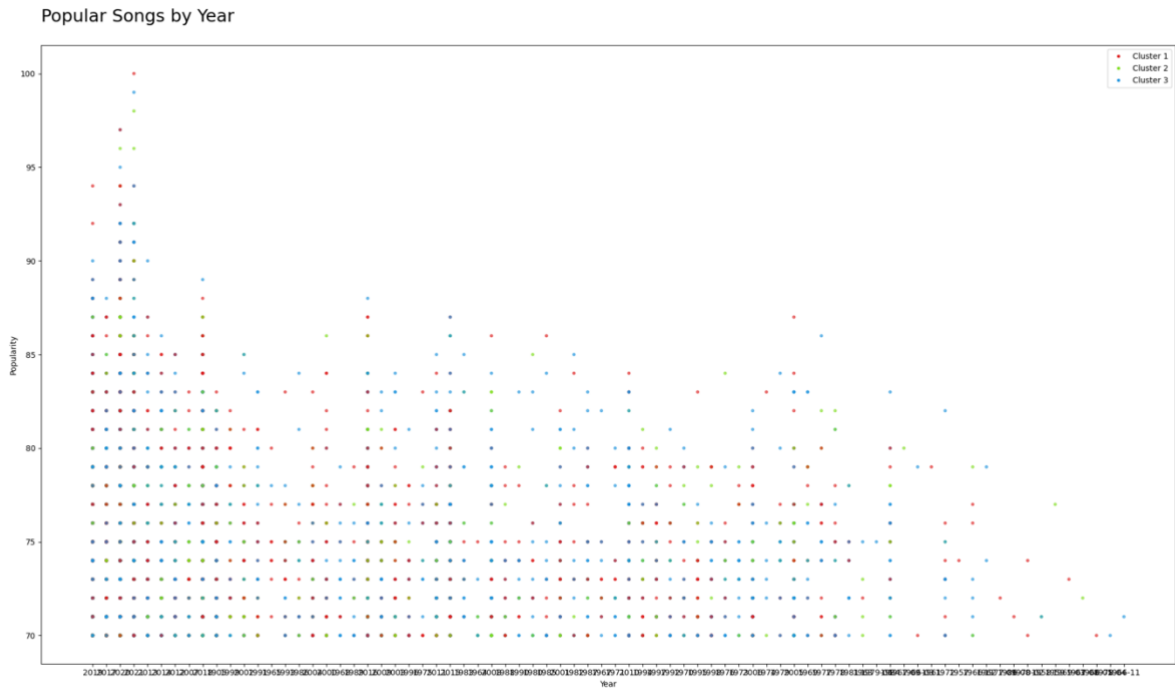
Dancing Queen	['ABBA']	5/29/1905
2 Hearts (feat. Gia Koka)	['Sam Feldt', 'Sigma', 'Gia Koka']	1/10/2020
Back to You (feat. Bebe Rexha & Digital Farm Animals)	['Louis Tomlinson', 'Bebe Rexha', 'Digital Farm Animals']	7/21/2017
Goosebumps - Remix	['Travis Scott', 'HVMC']	1/15/2021
In the End	['Linkin Park']	10/24/2000
Kaikai Kitan	['Eve']	12/23/2020
On My Mind (Jorja Smith X Preditah)	['Jorja Smith', 'Preditah']	8/25/2017
Dancing Queen	['ABBA']	5/29/1905







Scatterplots:



Note: The clusters will look “grouped” together on a 11-dimensional axis. In the interactive visual I would create 2D clusters for each individual attribute.

### Popular Songs by Danceability

