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Project Design

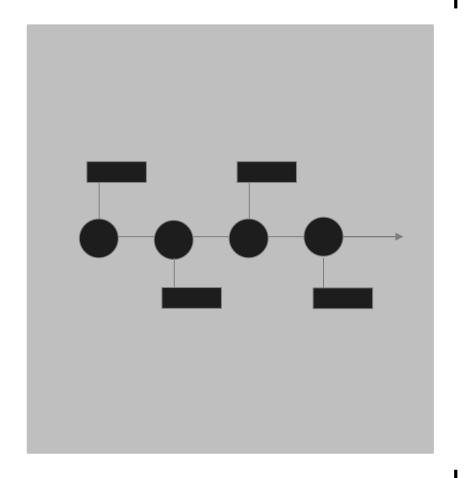
Data
Visualization

**12** Web Crawlers

Data
Preparation

01

### Project Design

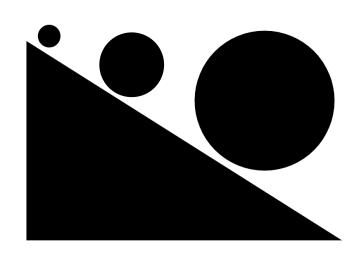


#### **Project Description**

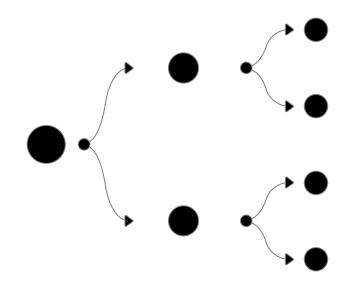
Music Recommendation Service:

- 2 Web Crawlers
- 2 User Data sources



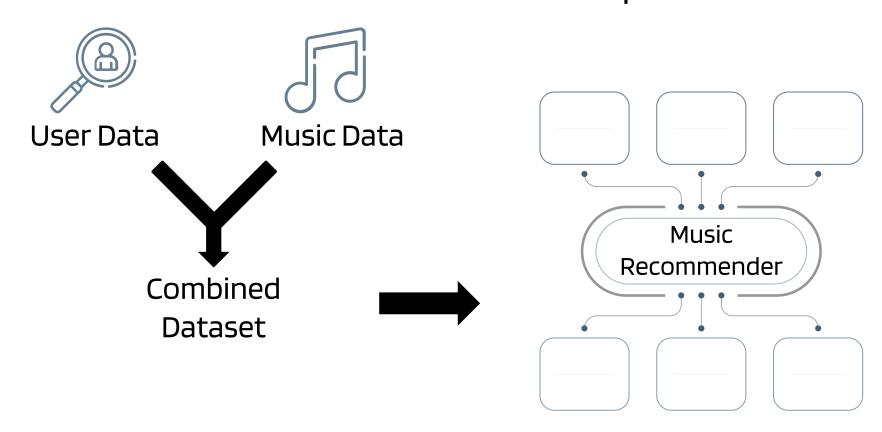


Snowball Effect for genres

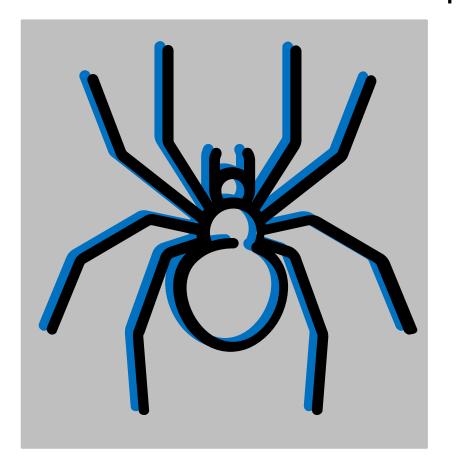


Snowball effect for Artists

#### **Project Design**

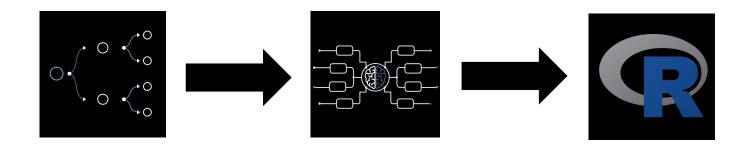


# 02 Web Crawlers



#### **Web Crawler Design**

Isaiah



**Music Map** 

Last.fm

**Script** 

Obtains Related Artists to a given Artist

Holds Song Information

Stores data across several files

#### **Music Map**

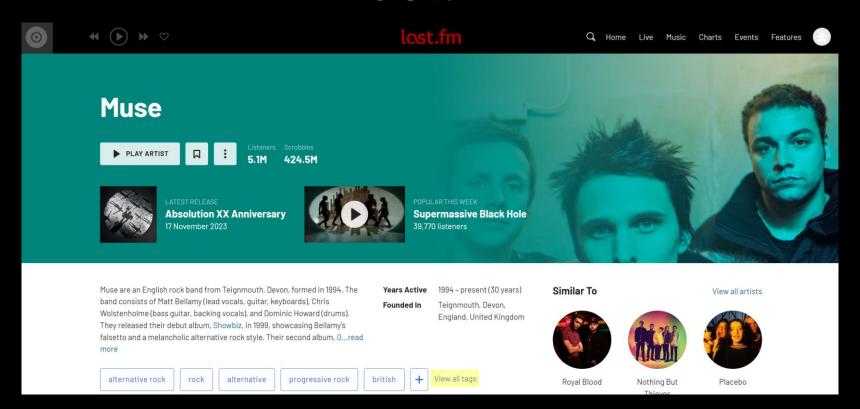
Type the name of an artist to find it on the map:

Muse



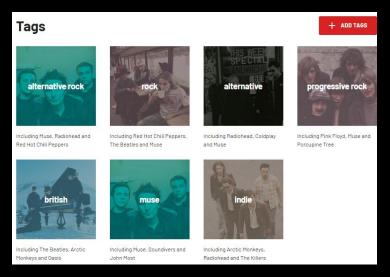
Artist Name to search on music-map.com





alternative rock rock alternative progressive rock british + View all tags

View all Artist Tags



All Albums



Black Holes and Revelations 2,732,386 listeners 30 Jun 2006 - 11 tracks



Absolution 2,349,202 listeners 21 Sep 2003 - 14 tracks



Origin of Symmetry 1,667,043 listeners 15 Jun 2001 - 11 tracks



Most popular ➤

The Resistance



Showbiz 1,058,413 listeners 4 Sep 1999 · 12 tracks



The 2nd Law 822,164 listeners 24 Sep 2012 - 13 tracks



Drones 466,976 listeners 5 Jun 2015 - 12 tracks



Simulation Theory (Super Deluxe)
233,894 listeners



Black Holes & Revelations



Supermassive Black Hole



Will Of The People



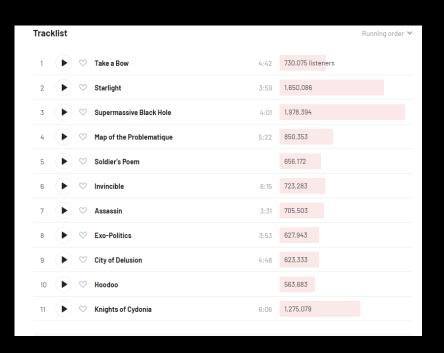
Dead Star / In Your World

Collect all albums



#### Desired information:

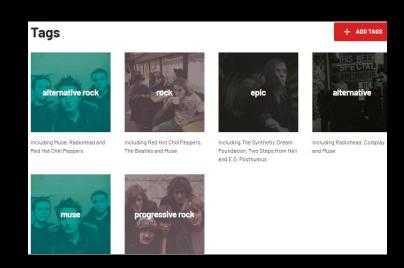
- Album Name
- Release Date



Album Tracklist



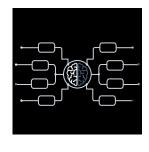
Song Length

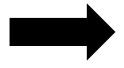


Song Tags

#### **Web Crawler Design**

Jason







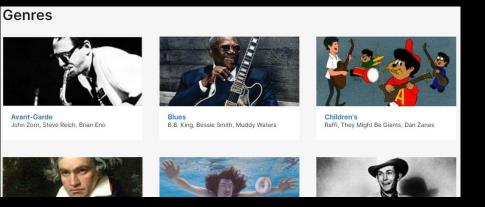
**All Music** 

**Script** 

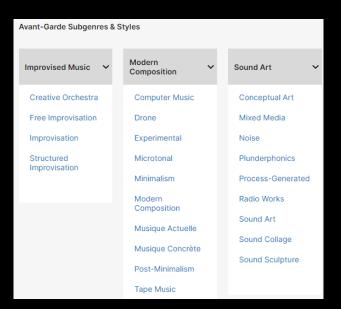
Holds Genre and Song Information

Stores data into a csv

#### **All Music**







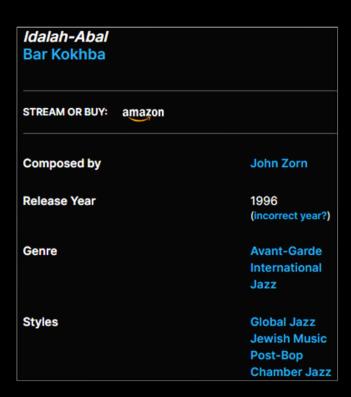
All Sub-Genres

#### **All Music**





All Songs

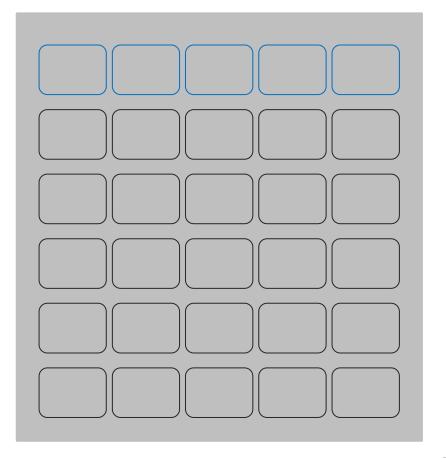


**Song Information** 

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03

## Data Visualization



#### **Dataset**

^	Song.Name :	Song.Length ‡	Album	Artist	Date.Released +	Tags
1	Welcome	3:47	Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	stoner rock;psychedelic rock;progressive rock;2019;greek;folk;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
2	Age of Aquarius	8:09	Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	age of aquarius/importado_do_spotlify;stoner rock;psychedelic rock;greek;folic/folk rock;rock;psychedelic/importado_do_spotlify
3	Part V		Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	2019;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
- 4	Dance of Night	8:46	Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	$stoner rock; psychedelic rock; progressive rock; 2019; greek; folk; folk rock; stoner rock; psychedelic rock; greek; folk; folk rock; rock; psychedelic; importato_do_spotlify; and rock; psychedelic rock; psychedelic rock; psychedelic rock; psychedelic; psychedelic; rock; psychedelic; psychedelic$
5	Arrival		Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	$stoner rock; psychedelic rock; progressive rock; 2019; greek; folk; folk rock; stoner rock; psychedelic rock; greek; folk; folk rock; rock; psychedelic; importato_do_spolify; and rock; psychedelic rock; psych$
6	Father Sun		Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	$stoner \ rock; psychedelic \ rock; progressive \ rock; 2019; greek; folk folk \ rock; stoner \ rock; psychedelic \ rock; greek; folk; folk \ rock; psychedelic \ roc$
7	Millennium Blues		Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	$importado\_do\_spotify; stoner rock; psychedelik rock; greek; folk fock rock; psychedelic; importado\_do\_spotify$
8	Cosmic Soul		Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	$stoner\ rock; psychedelic\ rock; progressive\ rock; 2019; greek; folk folk\ rock; stoner\ rock; psychedelic\ rock; greek; folk; folk\ rock; psychedelic; importado\_do\_spolify; and the process of the p$
9	For the Innocent		Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	$importado\_do\_spotify; stoner rock; psychedelic rock; greek; folk rock; rock; psychedelic; importado\_do\_spotify$
10	Sparkle out of Black Hole		Age Of Aquarius	Villagers of Ioannina Cit	y 19 September 2019	$stoner \ rock; psychedelic \ rock; progressive \ rock; 2019; greek; folk folk \ rock; stoner \ rock; psychedelic \ rock; greek; folk; folk \ rock; psychedelic \ rock; psychedelic; importado\_do\_spolify \ rock; psychedelic; importado\_do\_spolify \ rock; psychedelic; psychedelic; importado\_do\_spolify \ rock; psychedelic; psychedel$
11	Kalesma			Villagers of Ioannina Cit	y 31 March 2014	$stoner\ rock; psychedelic\ rock; folk rock; stoner\ rock; psychedelic\ rock; psychedeli$
12	Echoes			Villagers of Ioannina Cit	y 31 March 2014	$stoner\ rock; psychedelic\ rock; folk rock; stoner\ rock; psychedelic\ rock; psychedelic\ rock; psychedelic; importado\_do\_spotify$
13	Nova			Villagers of Ioannina Cit	y 31 March 2014	stoner rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotlify
	Jiannim			Villagers of Ioannina Cit	y 31 March 2014	$stoner\ rock; band; greek; punk \ rock; greek; greek; punk; stoner\ rock; psychedelic\ rock; greek; folk; folk\ rock; psychedelic; importado\_do\_spotlify$
_	Tabourla	Add lyrics on Musixmatch		Villagers of Ioannina Cit	y 31 March 2014	$stoner\ rock; psychedelic\ rock; folk rock; rock; folk rock; rock; psychedelic\ rock; psychedelic; psyched$
_	Krasi	647		Villagers of Ioannina Cit	y 31 March 2014	stoner;stoner rock;psychedelic rock;greek;folicfolik rock;rock;psychedelic;importado_do_spotify
_	Ti kako			Villagers of Ioannina Cit	y 31 March 2014	stoner rock;psychedelic rock;folk;areek;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spolify
_	Perdikomata			Villagers of Ioannina Cit		kew/stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotlfy
_	Skaros			Villagers of Ioannina Cit	y 31 March 2014	stoner rock;psychedelic rock;folk;greek;folk rock;stoner rock;psychedelic rock;greek;folk;rock;rock;psychedelic;importado_do_spotify
_	St. Triad			Villagers of Ioannina Cit	y 31 March 2014	stoner rockpsychedelic rock;folk;greek;folk rock;stoner rock;psychedelic rock;greek;folk;rock;rock;psychedelic;importado_do_spotify
	Riza			Villagers of Ioannina Cit		stoner rock;psychedelic rock;folk;greek;folk rock;stoner rock;psychedelic rock;greek;folk rock;rock;psychedelic;importado_do_spotify
_	Zvara		Zvara / Karakolia			stoner rock;psychedelic rock;greek;folicfolk rock;rock;stoner rock;psychedelic rock;greek;folicfolk rock;rock;psychedelic;importado_do_spotify
	Karakolia		Zvara / Karakolia			stoner rock;psychedelic rock;greek;folicfolik rock;rock;stoner rock;psychedelic rock;greek;folicfolik rock;rock;psychedelic;importado_do_spotify
_	Welcome	3:47	Through Space and Time (Alive in Athens 2020)			stoner rock;psychedelic rock;progressive rock;2019;greek;folk;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spolify
_	Age of Aquarius		Through Space and Time (Alive in Athens 2020)			age of aquarius/importado_do_spotify;stoner rock;psychedelic rock;greek;folic;folk rock;rock;psychedelic;importado_do_spotify
	Part V	10:01	Through Space and Time (Alive in Athens 2020)			2019;stoner rockpsychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
_	Nova		Through Space and Time (Alive in Athens 2020)			stoner rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
	Perdikomata	7:49	Through Space and Time (Alive in Athens 2020)			kew/stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
	Skaros		Through Space and Time (Alive in Athens 2020)			stoner rock;psychedelic rock;folk;greek;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
	Dance of Night	8:46	Through Space and Time (Alive in Athens 2020)			stoner rock;psychedelic rock;progressive rock;2019;greek;folk;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;prock;psychedelic;importado_do_spolify
_	Zvara		Through Space and Time (Alive in Athens 2020)			stoner rockpsychedelic rockgreek;folk/folk rock;rock;stoner rockpsychedelic rockgreek;folk/folk rock;rock;psychedelic;importado_do_spotlify
	Arrival		Through Space and Time (Alive in Athens 2020)			stoner rock;psychedelic rock;progressive rock;2019;greek;folk;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;psychedelic;importado_do_spolify
_	Father Sun		Through Space and Time (Alive in Athens 2020)			stoner rock;psychedelic rock;progressive rock;2019;greek;folk;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spolify
	Millennium Blues	8:18	Through Space and Time (Alive in Athens 2020)			importado_do_spotify,stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
	Ti kako		Through Space and Time (Alive in Athens 2020)			stoner rock;psychedelic rock;folk;greek;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spolify
_	Audience I	1:38	Through Space and Time (Alive in Athens 2020)			stoner rockpsychedelic rockgreek;folk/rockprodustoner rockpsychedelic rockgreek;folk/folk rockprockpsychedelic/importado_do_spotify
	Cosmic Soul	8:30	Through Space and Time (Alive in Athens 2020)			stoner rock;psychedelic rock;progressive rock;2019;greek;folk;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;psychedelic;importado_do_spotify
_	For the Innocent	551	Through Space and Time (Alive in Athens 2020)			importado_do_spotify;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
	Audience II	0.51	Through Space and Time (Alive in Athens 2020)			stoner rock;psychedelic rock;greek;folk;folk rock;rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
_	Karakolia Welcome	11:27	Through Space and Time (Alive in Athens 2020)			stoner rock;psychedelic rock;greek;folicfolic rock;rock;stoner rock;psychedelic rock;greek;folicfolic rock;psychedelic;importado_do_spotify
	Melcome Age of Aguarius	3:47 8:09	Through Space and Time Through Space and Time	Villagers of loannina Cit Villagers of loannina Cit		stoner rock;psychedelic rock;progressive rock;2019;greek;folk;folk rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spolify
	Age of Aquarius Part V	10:01	Through Space and Time Through Space and Time	Villagers of Ioannina Cit Villagers of Ioannina Cit	,,	age of aquarius/importado_do_spotifystoner rock;psychedelic rock;greek;folic/folik rock;rock;psychedelic;importado_do_spotify 2019stoner rock;psychedelic rock;preek;folic/folik rock;preek;folic-folik rock;psychedelic;importado do spotify
	Part V Nova					
_		7:37	Through Space and Time	Villagers of Ioannina Cit		stoner rock;stoner rock;psychedelic rock;greek;folk;folk rock;rock;psychedelic;importado_do_spotify
	Perdikomata Skaros	7:49 8:25	Through Space and Time	Villagers of Ioannina Ci		kewistoner rockspsychedelic rockspreek; folk; folk rockspckedelic; importado_do_spotlify
	Skaros Dance of Night	8:25	Through Space and Time Through Space and Time	Villagers of Ioannina Cit Villagers of Ioannina Cit		stoner rodcpsychedelic rodcytolkgreek/folk rodcystoner rodcpsychedelic rodcyrodcpsychedelic/importado_do_spotify stoner rodcpsychedelic rodcprogressive rodc2019;greek/folk/folk rodcystoner rodcpsychedelic/rodcprodcpsychedelic/importado do spotify
_						
	Zvara	5:53	Through Space and Time	Villagers of Ioannina Cit		stoner rockgsychedelic rockgreek;folicfolik rockgrock;stoner rockgsychedelic rockgreek;folicfolik rockgrockgsychedelic;importado_do_spotify
49			Through Space and Time	Villagers of Ioannina Ci	y 20 May 2021	stoner rock;psychedelic rock;progressive rock;2019;greek;folkfolk rock;stoner rock;psychedelic rock;greek;folk;folk rock;psychedelic;importado_do_spolify
	Falls as From	1.17	***************************************			

CSV file combined and imported into R

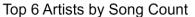
### > 100,000

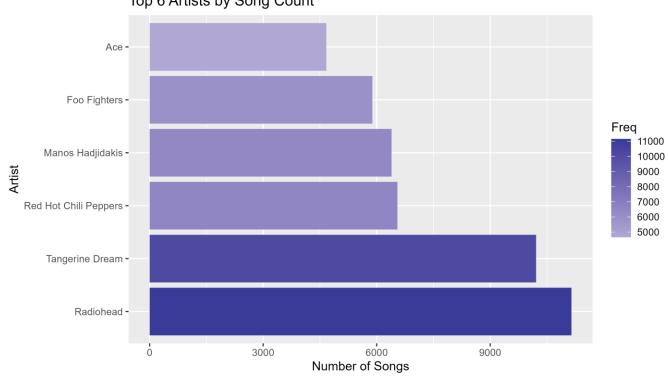
Total Songs with information\*

songData

133204 obs. of 6 variables

#### **Top Artists by Song Count**



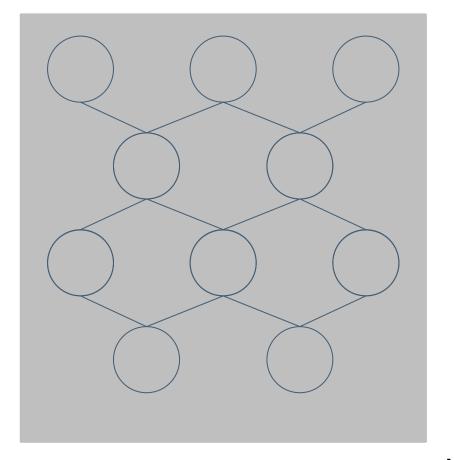


#### **Unique Artists**

	t(artists) "Villagers of Ioannina City"	"Black Hat Bones"	"Transidelia"	"Thrax Punks"	"Alkinoos Ioannidis"
[6]	"MOLYBARON"	"Nikos Ksilouris"	"Slomosa"	"1000mods"	"Pyx Lax"
	"Sun of Nothing"	"Sokratis Malamas"	"Nightstalker"	"Ohhms"	"Anser"
	"Leo Moracchioli"	"Mephorash"	"Monkey3"	"Sleepwulf"	"Yatha Sidra"
[21]	"Manos Hadjidakis"	"My Sleeping Karma"	"Silent Island"	"Diagonal"	"Obsidian Gate"
[26]	"Blackbraid"	"Daliborovo Granje"	"Universe217"	"Ganga"	"Planet Of Zeus"
	"Pavlos Sidiropoulos"	"Frayle"	"Khonsu"	"Socrates"	"Papakonstantinou"
	"Swan Valley Heights"	"Giannis Kotsiras"	"Locomondo"	"Hashiya"	"The Faith And The Mus
	"Thanasis papakonstantinou"	"Youngblood Supercult"	"Those Who Ride With Giants"	"Aphrodites Child"	"Magick Brother & Myst
	"Osjan"	"Natural Acoustic Band"	"Atman"	"Quintessence"	"Orient Expressions"
	"Manson Family"	"Zaum"	"Daemonia Nymphe"	"Suns Of Arqa"	"David And Steve Gordo
	"Villagers of Ioannina city"	"Dando Shaft"	"Stephan Micus"	"Bong"	"Brian Eno & David Byr
	"Robert Fripp & Brian Eno"	"Tangerine Dream"	NA	"Muse"	"The Killers"
	"Arctic Monkeys"	"Radi ohead"	"Coldplay"	"Franz Ferdinand"	"Kings of leon"
	"Oasis"	"The Strokes"	"Placebo"	"Red Hot Chili Peppers"	"Foo Fighters"
	"Royal Blood"	"Queens Of The Stone Age"	"(G)I-dle"	"Dreamcatcher"	"Everglow"
	"IZ*ONE"	"Мататоо"	"ITZY"	"CLC"	"Twice"
	"Blackpink"	"Kard"	"Loona"	"Red Velvet"	"Ikon"
	"Chungha"	"K.A.R.D"	"GFriend"	"K/DA"	"TOMORROW X TOGETHER"
	"LOONA 1/3"	"Dreamcather"	"Stray Kids"	"BTS"	"ATEEZ"
	"Aespa"	"Solar"	"DreamNote"	"Soojin"	"Rose"
	"ONEUS"	"Cherry Bullet"	"STAYC"	"Fromis_9"	"BVNDIT"
	"3YE"	"Little Mix"	"MoonByul"	"Girls' Generation"	"Sumni"
	"FIFTY FIFTY"	"JIS00"	"NMIXX"	"EXO"	"Day6"
	"(G)I-DLE"	"Odd eye circle"	"GWSN"	"Weki Meki"	"Weeekly"
	"Cignature"	"MOMOLAND"	"Purple Kiss"	"HINAPIA"	"April"
	"x1"	"ANS"	"Cix"	"PIXY"	"BOL4"
	"ENHYPEN"	"Rolling Quartz"	"PinkFantasy"	"Niziu"	"Ace"
	"ONEWE"	"wasn"	"Golden Child"	"Sunmi"	"Hwasa"
[46]		"SuperM"	"SEVENTEEN"	"Nct 127"	"WooSung"
	"LE SSERAFIM"	"NewJeans"	"IVE"	"EXID"	"SVT"
	"CHUNG HA"	"IU"	"Крор"	"Hyuna"	"Hyolyn" "CI"
	"SULLI"	"APink"	"Jessi"	"SOYEON"	
	"2NE1"	"Aoa"	"Spica"	"Ladies Code"	"Bolbbalgan4"
	"9MUSES" "Somi"	"Got7"	"Gain" "JENNIE"	"Lee Hyori" "Likey"	"Lee Hi" "Kepler"
	"GOT the beat"	"Pretty Savage" "PRISTIN"	"I.O.I"	"Hello Venus"	"Gugudan"
				"Dia"	
	"Sonamoo"	"Oh My Girl"	"Fiestar"		"Lovelyz" "Nine Muses"
	"4minute" "Girls' Generation"	"Yezi" "F(X)"	"Laboum" "SISTAR"	"BESTIE" "Dalshabet"	
		"YOASOBI"			"Monsta X"
	"Forever Young" "Tuyu"	"Nct"	"Big Bang" "South Club"	"Now United" "Winner"	"K-Pop" "Akdong Musician"
					"AKMU"
	"Somin" "MCND"	"Eric Nam" "LEE SUHYUN"	"Astro" "Hiphop"	"Minzy" "DKB"	"Dean"
	"Amber Liu"	"YOOA"	нтрпор "Rnb"	"VAV"	"POP"
	"One Ok Rock"	"Eddy Kim"	"Nu'est"	"Zico"	"Olivia Hve"
	"Girlfriend"	"Billlie"	Nu est "WayV"	"Weekly"	"YUKIKA"
	"Xdinary heroes"	"Suho"	"A.C.E"	"AB6IX"	"SEHUN"
	"NewKidd"	"Limitless"	"Pentagon"	"TREASURE"	"Cravity"
	"GD & TOP"	"Boy Story"	"the Bovz"	"N.Flying"	"Highlight"
	"B.I"	"Hip Hop Hoodios"	"Fields of the Nephilim"	"Love Like Blood"	"Diary of Dreams"
	"Taeveon"	"Ariana Grande"	"Mobb"	"EXO K"	"Top"
	"G Dragon"	"Daesung"	"High4"	"Taemin"	"Kris Wu"
	"Jung Joon Young"	"Hotshot"	"Wanna One"	"Nct u"	"SE9"
	"Chanmina"	"Park Bom"	"Suboi"	"El Arrebato"	"Rnla"
	"MIYEON"	"JIHYO"	50001	ET AFTEDATO	

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### Data Preparation



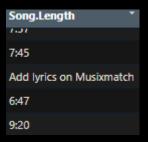
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#### **Data Cleaning**



Non-genre tags



No time format for song length



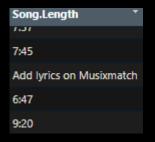
Some release dates only give the year

#### Additional Ideas:

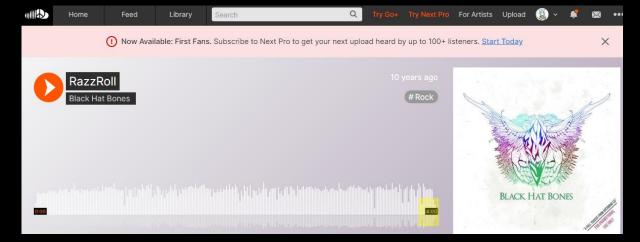
- Remove duplicate data
- Obtain User Data from API

#### **Data Cleaning Solutions**





Use secondary sources (websites) to obtain song lengths



#### **Data Cleaning Solutions**



RazzRoll Black Hat Bones 25 November 2011 Black hat bones Bleed In Face 4:28 Black hat bones Black Hat Bones 25 November 2011 Old Charlie 4:25 Black hat bones Black Hat Bones 25 November 2011 Old Charlie 4:25 2011 Black Hat Bones Promo 2011 Black Hat Bones Bleed In Face 4:28 Black Hat Bones Promo 2011 Black Hat Bones 2011 Add Ivrics on Musixmatch | Black Hat Bones Promo 2011 Black Hat Bones Razzzroll

#### Several solutions:

- Find a similar song name and delete row if found (redundant song)
- Find external source containing the song information if not redundant





### \_ Questions?

## Thanks for Listening

**CREDITS:** This presentation template was created by **Slidesgo**, including icons by **Flaticon**, infographics & images by **Freepik**