

# Music Recommendation System



*By Carols*



# Dataset

- ❖ Full history for 1 million of users (110 songs/user)
- ❖ Half of History 110000 users
- ❖ History Information:
  - User\_id
  - Song\_id
  - play\_times
- ❖ Each song has the corresponding name, album, genre (386213 songs)

b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOKSIKA12A6D4F5DC7	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOKUZGZ12A8C136F88	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLFJVY12A6D4F9DCA	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLGNOE12A8C139CA9	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLLGNU12AF72A4D4F	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLUHPJ12A8C13AB0F	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLXHAI12A6D4FD6F3	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOMGIYR12AB0187973	6
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOMLMKI12A81C204BC	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOMSQJY12A8C138539	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOMZWUW12A8C1400BC	6
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONKSNV12A58A7F654	2
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONRXOY12AB0181E84	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONSAEZ12A8C138D7A	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONVJAW12A8C139EFB	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONYTAN12A8C13BF88	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S00CURD12A81C21C23	5
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S00GGEX12A58A7DACF	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S00KGRB12A8C13CD66	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S00SIVQ12A6D4F8AE0	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOPBCSY12A6D4F5DC4	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOPCVQE12AC468AF36	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOPZAUC12A58A7DB24	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S0QDBOA12A8C13E5E6	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S0QEMEN12A8C13BF8B	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S0QIVUD12AB01821D2	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S0QJLDY12AAF3B456D	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S0QLCKR12A81C22440	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S0QMUDW12A58A7AF03	1

*All the data are downloaded from  
the Echo Nest*



# How the System works?

- ❖ General Idea is collaborative filtering approach and user-based similarity

$$h_{ui}^U = \sum_{v \in \mathcal{U}} w_{uv} r_{vi}$$

How to calculate:

- $w$ : user similarity?
- $r$ : rating for each song of each user?



# User Similarity

- ❖ Analogies to textual information retrieval

*term*

*document (the  
listening history  
of user  $u$ )*

b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOKSIKA12A6D4F5DC7	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOKUZGZ12A8C136F88	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLFJVY12A6D4F9DCA	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLGNOE12A8C139CA9	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLLGNU12AF72A4D4F	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLUHPJ12A8C13AB0F	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOLXHAI12A6D4FD6F3	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOMGIYR12AB0187973	6
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOMLMKI12A81C204BC	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOMSQJY12A8C138539	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOMZWUW12A8C1400BC	6
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONKSNV12A58A7F654	2
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONRXOY12AB0181E84	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONSAEZ12A8C138D7A	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONVJAW12A8C139EFB	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SONYTAN12A8C13BF88	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S00CURD12A81C21C23	5
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S00GGEX12A58A7DACF	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S00KGRB12A8C13CD66	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S00SIVQ12A6D4F8AE0	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S0PBCSY12A6D4F5DC4	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S0PCVQE12AC468AF36	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	S0PZAUC12A58A7DB24	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOQDB0A12A8C13E5E6	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOQEMEN12A8C13BF8B	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOQIVUD12AB01821D2	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOQJLDY12AAF3B456D	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOQLCKR12A81C22440	1
b80344d063b5ccb3212f76538f3d9e43d87dca9e	SOQMUDW12A58A7AF03	1

*occurrences of  
this term in the  
document*



# User Similarity

$$idf_t = \log \frac{n}{df_t}$$

*total number of users*

*number of users who listened to song  $t$*

- the value of idf is **high** for **rare songs**, which were listened by only a few users
- the **users** are probably **similar**, if two users **listened to the same track** and nobody else did it

# How to calculate user similarity?

## ❖ The similarity

$W_{uv}$  between users  
u and v :

the sum of idf of  
the tracks that  
they have listened  
both

$$\sum_{\substack{i: M(u,i) > 0 \\ M(v,i) > 0}} idf_i$$

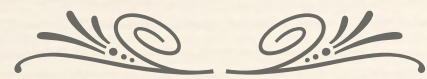
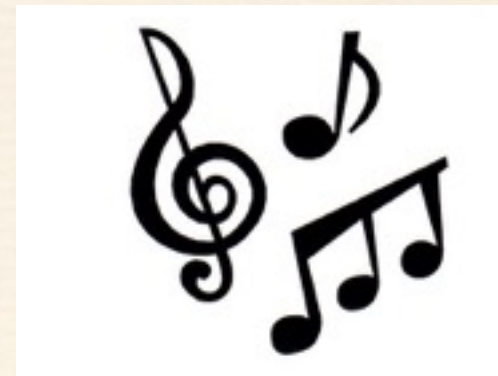


# Rating for each song?

- ❖  $R_{vi}$  of how much a user  $v$  likes a track  $i$  is chosen as 1 if user  $v$  listened to a track  $i$  and 0 otherwise.
- ❖  $R_{vi} = 1/C_v$  ( $C_v$ : the sum of all play counts from user  $v$ 's history)
- ❖ So all the tracks are ranked equally regardless of their play counts.

# Recommendation!

$$h_{ui}^U = \sum_{v \in \mathcal{U}_s} \left( \sum_{\substack{i: M(u,i) > 0 \\ M(v,i) > 0}} idf_i \right) \frac{1}{c_v}$$



*The Resulting score function*

recommend songs  
with top 20 scores!



# Evaluation

$$AP(u, y) = \frac{1}{n_u} \sum_{k=1}^{\tau} P_k(u, y) \cdot M_{u, y(k)}$$

Baseline : 0.15037

Our Method : 0.21514



**Let the joy of Carols**

**Begin** 