### APCOMP 297r Capstone Project

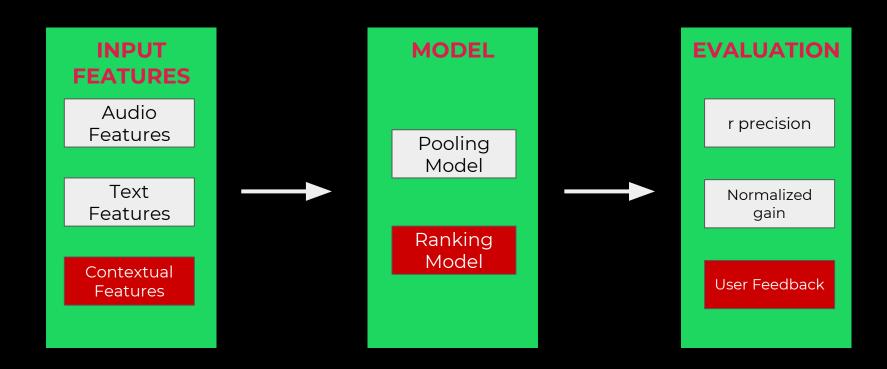


### Milestone 3 presentation

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### Next Steps, next month



### **Next Steps**

1. 2. 3. 4.

Experiments RECSYS Smarter Ground truth on Contextual Data Pipeline Parking for Context Tasks (UX)

Full todo-list:

https://docs.google.com/document/d/1ASbP8S64QgXvXiZCmUl9KlCSquCuzyeAgNWRdLwQ4uo/edit#

### Tentative Aim:

RECSYS conference submission (April 30th deadline, May 7th)

or

RECSYS challenge submission (July)

We have evaluation metrics We have a pooling model

We need to improve our ranking
We want to think of intent-based completion of playlist
We need to optimize our model (embedding/sources/weights)

To build intent, we are brainstorming the UX and how to leverage the Genius/Youtube/lyrics data.

### Progress Overview:

Generating playlists + evaluating them

1. 2. 3. 4. Evaluation Pooling Ranking UX

## Model schematic (Pipeline)



Audio Features

Text Features

Contextual Features



Pooling Model

Ranking Model



r precision

**EVALUATION** 

Normalized gain

User Feedback

### Evaluation: experimental setup

Incomplete playlist of length k (k =5,10,25,50,100) Held out tracks GA set R of 500 recommend tracks

### Metrics on:

- Track Level
- Artist Level
- Contextual Level (Future directions?)

### Evaluation: r-precision (good pooling)

$$ext{R-precision} = rac{\left|G \cap R_{1:|G|}
ight|}{|G|}$$

Playlist id 194

k	r precision	NDGC
1	0.038760	0.589310
5	0.016000	0.185832
10	0.033333	0.337495
25	0.066667	0.702462
100	0.066667	0.787717

## Evaluation: Normalized Discounted Gain

$$DCG = rel_1 + \sum_{i=2}^{|R|} rac{rel_i}{\log_2 i}$$

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Playlist id 194

k	r precision	NDGC
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25	0.066667	0.702462
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$$NDCG = rac{DCG}{IDCG}$$

## Prediction Model

## Playlist Completion Ranking using lyrics



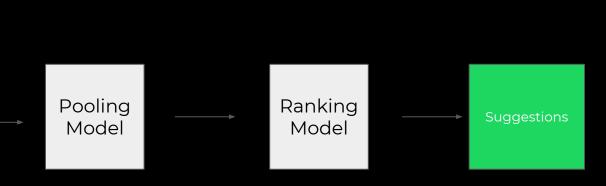
#### **Top Suggestions:**

'Why Can't We Be Friends?' by 'War'
'My House' by 'Pvris'
'Box Around The Sun' by 'MisterWives'
'Gente De Accionar' by 'Grupo Codiciado'
'The Fear' by 'Ben Howard'
'Hold Me Now' by 'Thompson Twins'
'Lump Sum' by 'Bon Iver'
'Insides Out' by 'Kid Cudi'
'Send It On' by 'D'Angelo'
'Shake' by 'MercyMe'

## **Playlist Completion**

### Pooling using word2vec





### **Playlist Completion**

### Pooling using Word2Vec



### **Top Suggestions:**

'Imagine - 2010 - Remaster' by 'John Lennon'

'Hotel California - Remastered' by 'Eagles'

'Dust in the Wind' by 'Kansas'

'Knockin' On Heaven's Door - Remastered' by 'Bob Dylan

'Come Together' by 'Aerosmith'

'Layla - 40th Anniversary Version / 2010 Remastered' by 'Derek & The Dominos'

'Free Bird' by 'Lynyrd Skynyrd'

'House Of The Rising Sun' by 'The Animals'

'Behind Blue Eyes' by 'The Who'

'Come Together' by 'Re Beatles'

### Ranking

Basic idea: Train new embedding, pick closest elements in neighborhood.

#### Embeddings:

- Doc2vec
- Joint Embedding method: Generate pairs with correct and incorrect samples, force net to
  - i. Put correct songs closer to input songs than incorrect songs (first few iterations).
  - ii. Finetune further to rank- Put correct samples in right order, while ensuring above doesn't change.
- Play with different input representations here: Audio/ mean word2vec/ Adjectives + noun words

# Problem: User Experience (UX) Evaluation on Automatic Continuation of Playlists

http://spandan-project-manager.herokuapp.com/

# Contact us if you want to get song suggestions!

Thanks! Any questions?