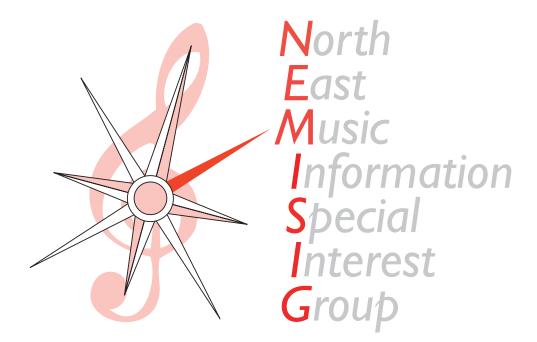
# Welcome!

- \* Adobe Labs
- \* Amie Street
- \* Carnegie Mellon
- \* The College of NJ
- \* Columbia
- \* Connecticut College
- \* Cooper Union
- \* Dartmouth



- \* Drexel
- \* The Echo Nest
- \* Harvard / USC
- \* McGill
- \* NYU
- \* Princeton
- \* QTrax
- \* Sun Microsystems
- \* U de Montréal

... because talking is good.





### Current Music Research at LabROSA

### • The Big Picture:

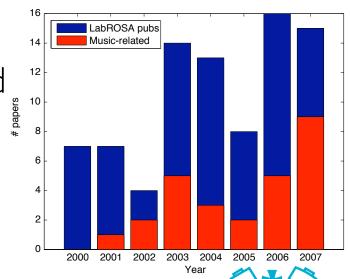
- Lots of data
  - + noisy transcription
  - + weak clustering
  - ⇒ musical insights?

### History & Support

**NEMISIG LabROSA - Ellis** 

- 2007 first year when majority of LabROSA papers were music-related
- Support:
  - Columbia Academic Quality Fund
  - Departmental & NSF fellowships
  - NSF grant (3 years from Sep 2007)







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### Transcription as Classification

Graham Poliner

### Exchange signal models for data

• transcription as pure classification problem:

#### Training data and features:

- •MIDI, multi-track recordings, playback piano, & resampled audio (less than 28 mins of train audio).
- Normalized magnitude STFT.



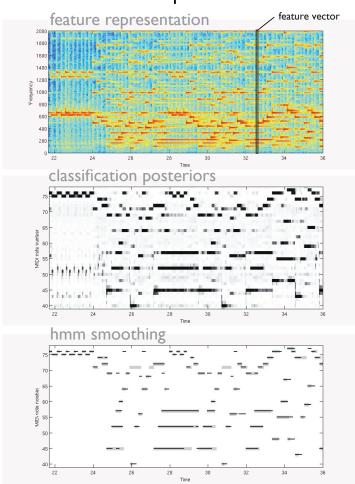
#### Classification:

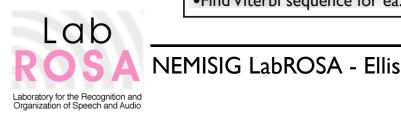
- •N-binary SVMs (one for ea. note).
- •Independent frame-level classification on 10 ms grid.
- •Dist. to class bndy as posterior.



#### **Temporal Smoothing:**

- •Two state (on/off) independent HMM for ea. note. Parameters learned from training data.
- •Find Viterbi sequence for ea. note.





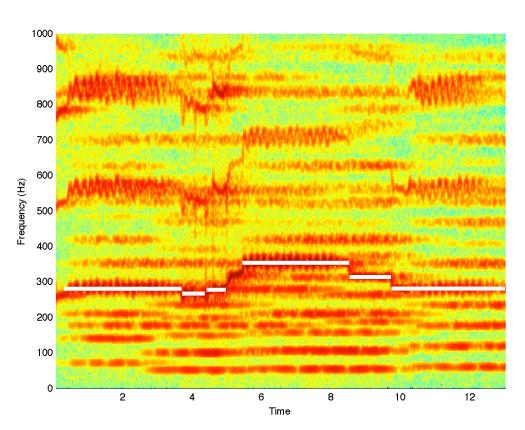
## Singing Voice Modeling & Alignment

• How are phonemes sung?

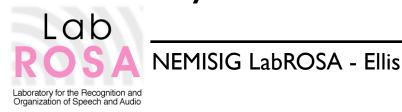
Christine Smit Johanna Devaney

o e.g. "vowel modification" in classical voice

- Collect the data
  - .. by identifying solos
  - .. by aligning libretto to recordings
  - e.g. alignKaraoke MIDI filesto original recordings



• Lyric Transcription?

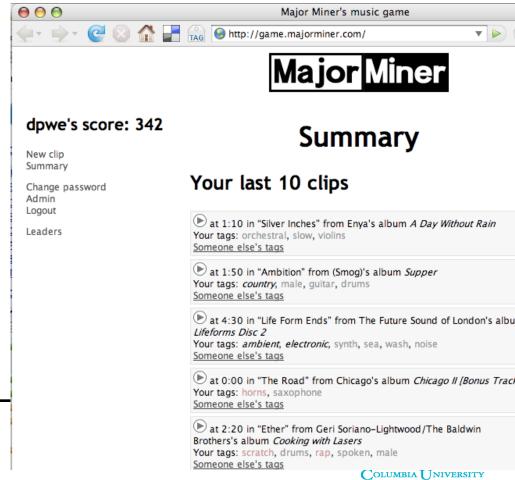


## MajorMiner: Semantic Tags

Mike Mandel

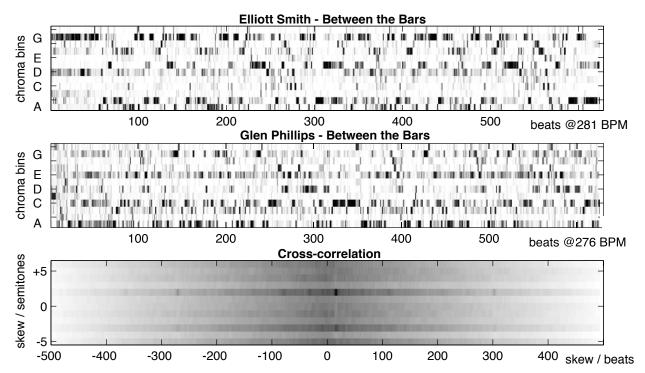
- Describe segment in human-relevant terms
  - e.g. anchor space, but more so
- Need ground truth...
  - what words to people use?
- MajorMiner game:
  - 400 users
  - 7500 unique tags
  - 70,000 taggings
  - 2200 10-sec clips used
- Train classifiers...





## Cover Song Matching: Correlation

- Cross-correlate entire song beat-chroma matrices
  - ... at all possible transpositions
  - implicit combination of match quality and duration



One good matching fragment is sufficient…?



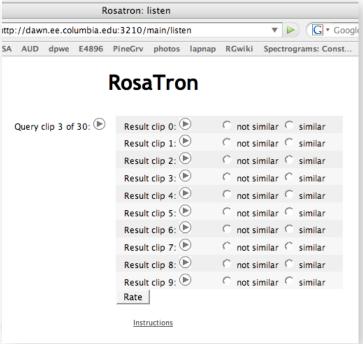
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## Cross-Correlation Similarity

• Use correlation to find similarity?

Courtenay Cotton Mike Mandel

- e.g. similar note/instrumentation sequence
- may sound very similar to judges
- Evaluate by subjective tests
  - modeled after MIREX similarity



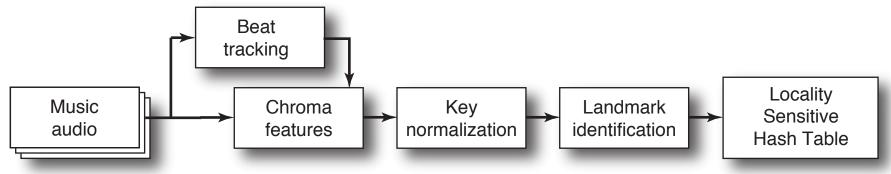
**NEMISIG LabROSA - Ellis** 

Algorithm	Similar count
(1) Xcorr, chroma	48/180 = 27%
(2) Xcorr, MFCC	48/180 = 27%
(3) Xcorr, combo	55/180 = 31%
(4) Xcorr, combo + tempo	34/180 = 19%
(5) Xcorr, combo at boundary	49/180 = 27%
(6) Baseline, MFCC	81/180 = 45%
(7) Baseline, rhythmic	49/180 = 27%
(8) Baseline, combo	<b>88/180 = 49 %</b>
Random choice 1	22/180 = 12%
Random choice 2	28/180 = 16%



## Beat Chroma Fragment Clustering

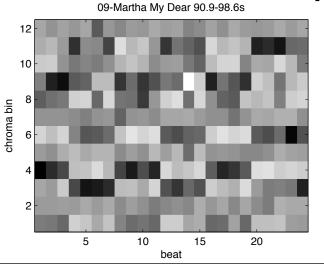
 Idea: Build a dictionary of harmonic/melodic fragments by clustering a large corpus

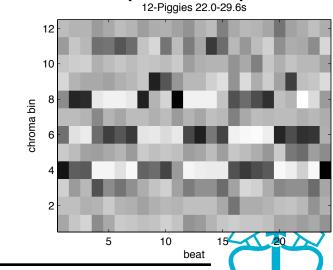


• 86 Beatles tracks  $\Rightarrow$  41,705 patches (12x24)



- High-pass along time
- Song filter







### **MEAPsoft**

- Music Engineering Art Projects
  - collaboration between EE
    and Computer Music Center

with Douglas Repetto, Ron Weiss, and the rest of the MEAP team

- MEAPsoft combines music IR analysis with wacky resequencing algorithms
  - also some neat visualizations...







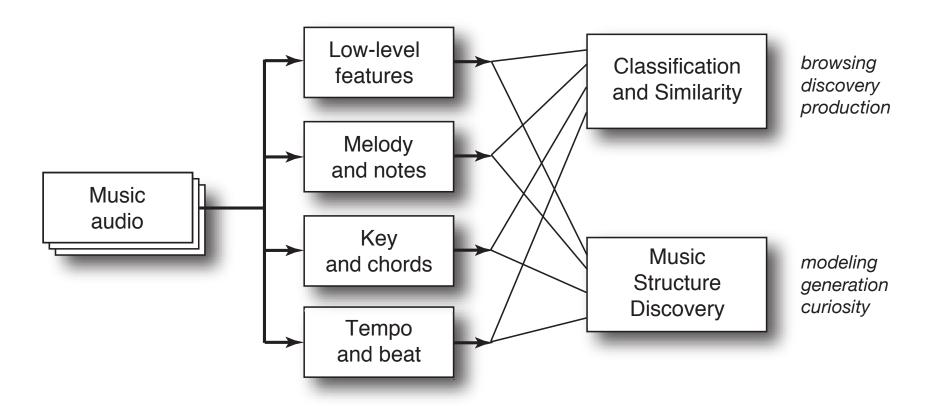
2008-01-25

p. 9/10



### Summary

What is made possible by so much data?





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