

Search Inside the Music

Paul Lamere
Principal Investigator



2005
Sun Labs
Open House

Finding Music – the Old Way



I'm looking for a record for my daughter. For her birthday.
 "I Just Called To Say I Love You." Do you have it?

- Genre / Artist
- Playlists
- Ask the guy
(if you dare)



Finding Music - the New Way

- Music search on line:
 - Album / Artist / Song
 - Playlists / Genre
- It's getting harder:
 - Million song iPod
 - Napster-to-go
 - 100,000 new songs per year
 - Like the web before google



Google™

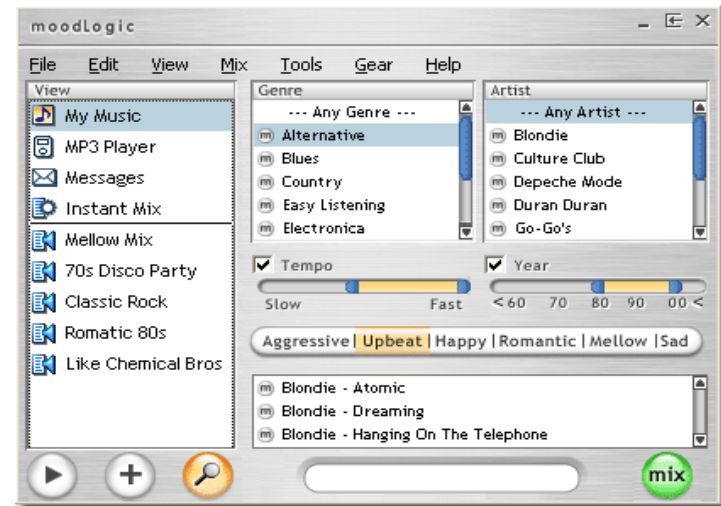
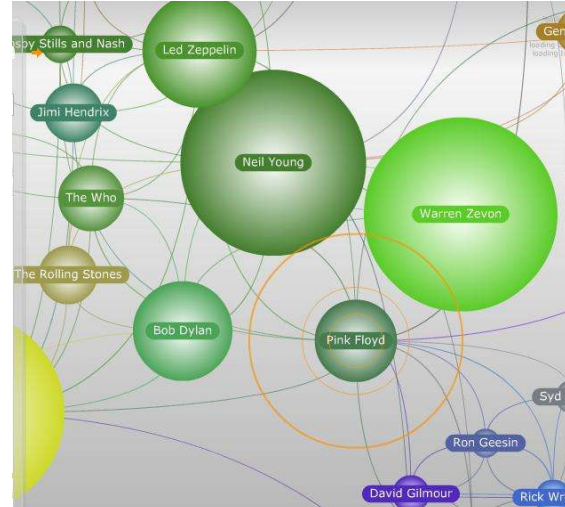


What I Really Want ...



Extend Search

- Use metadata:
 - Playlists
 - User collaboration
 - Reviews
 - Mood / Theme
 - Instrumentation
 - Artist history
 - Lyrics



Problems with Metadata



- Where does the metadata come from?
 - For popular music – hand edited
 - For less popular music, or new music ... too bad!
- Always find U2
- Never find



Dead Heroes Club

Search Inside the Music

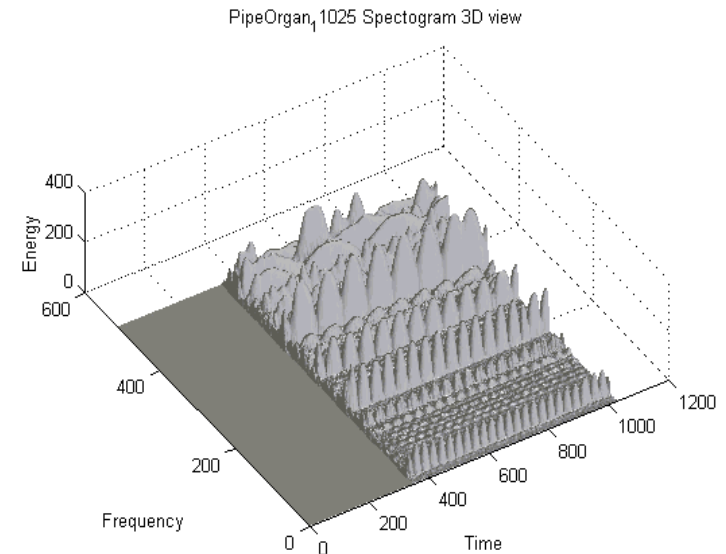
Make it easier to find music,
especially new music by:

- Extending music search beyond bibliographic data by using metadata
- Generating metadata directly from content

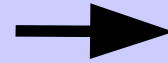
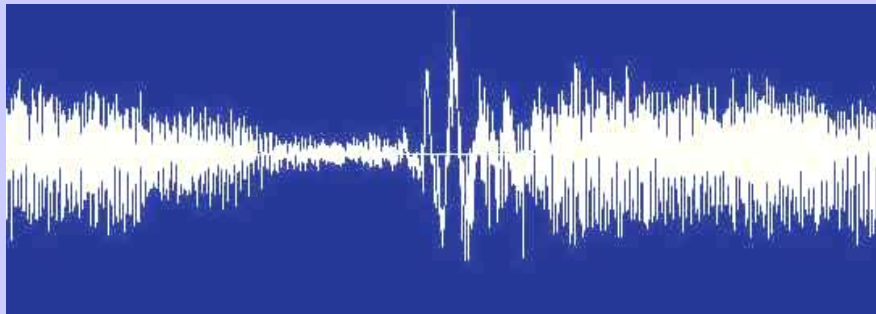


Fixing Metadata Problems

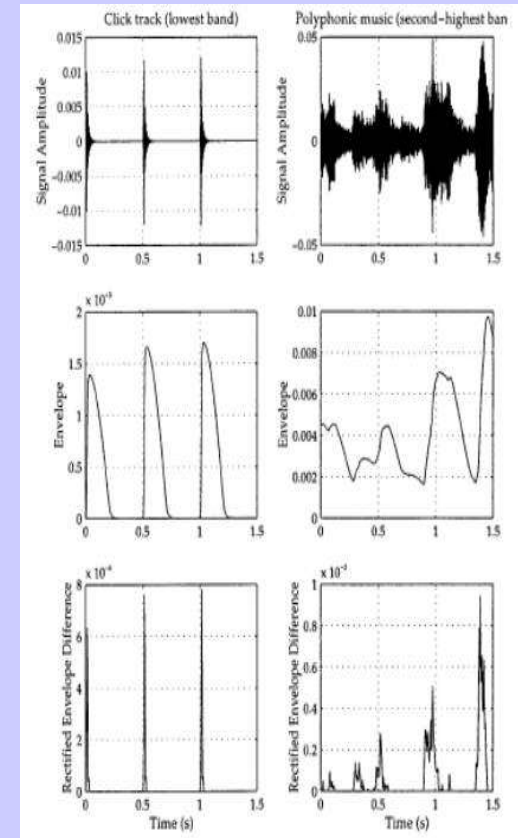
- Generate metadata directly from audio content
 - Eliminates 'popularity' bias
 - Can generate new kinds of data
 - But it's hard!



Audio Content Analysis

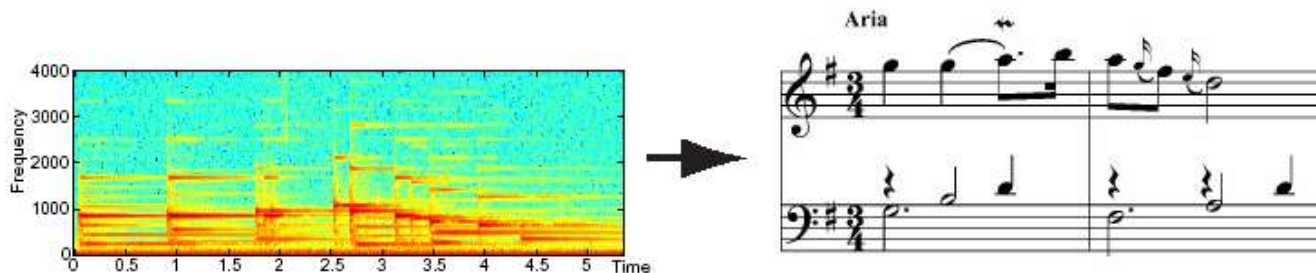


- Pitch / Harmony / Key
- Timbre / Instrumentation
- Tempo / Rhythm / Energy



Feature Extraction – Pitch Tracking

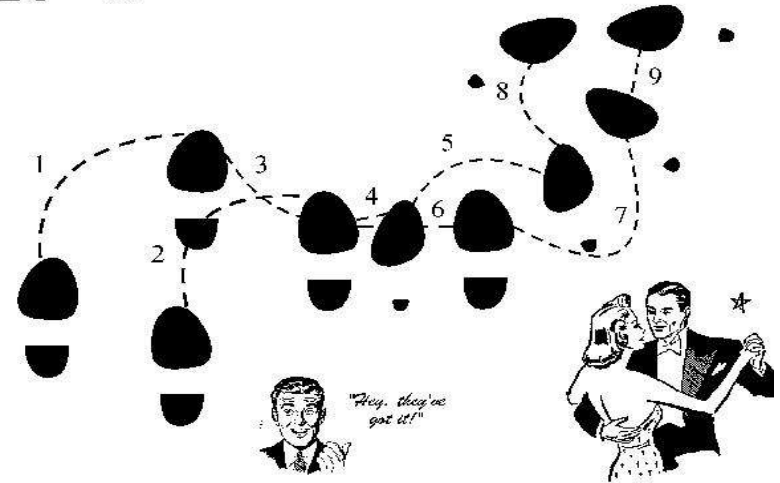
- Uses:
 - Composer tools / Transcription
 - Genre / Mood / Similarity
 - Score tracking / Query-By-Humming (QBH)
- Issues:
 - Monophonic – fairly easy / Polyphonic – Extremely Difficult
 - Current focus: Piano / Two known instruments



Feature Extraction – Rhythm

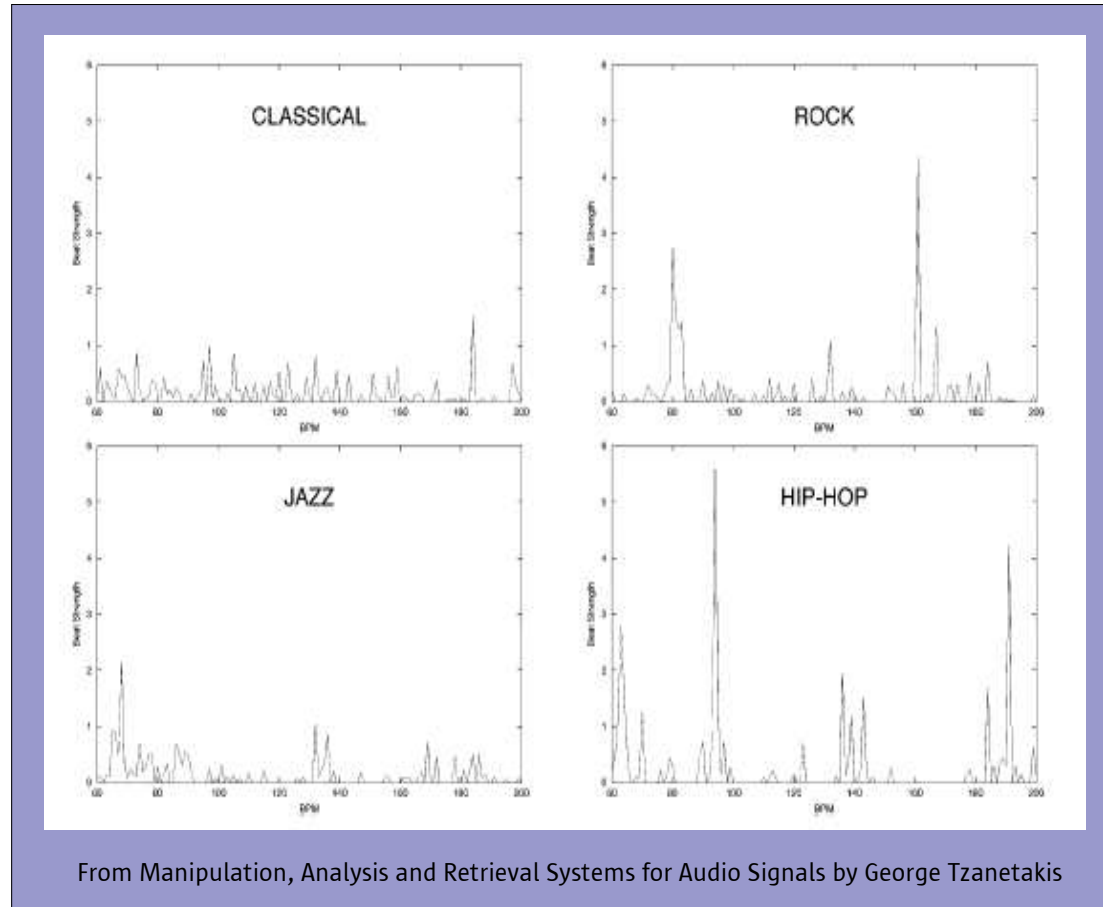
Rhumba!

- Uses:
 - Classification:
 - Mood / Genre
 - Similarity
 - Segmentation / Alignment
 - Playlist generation / Auto DJ
- Issues:
 - Tempo variations / Beat Complexity
 - Hierarchical structure
 - Wide range (marching band vs. string quartet)



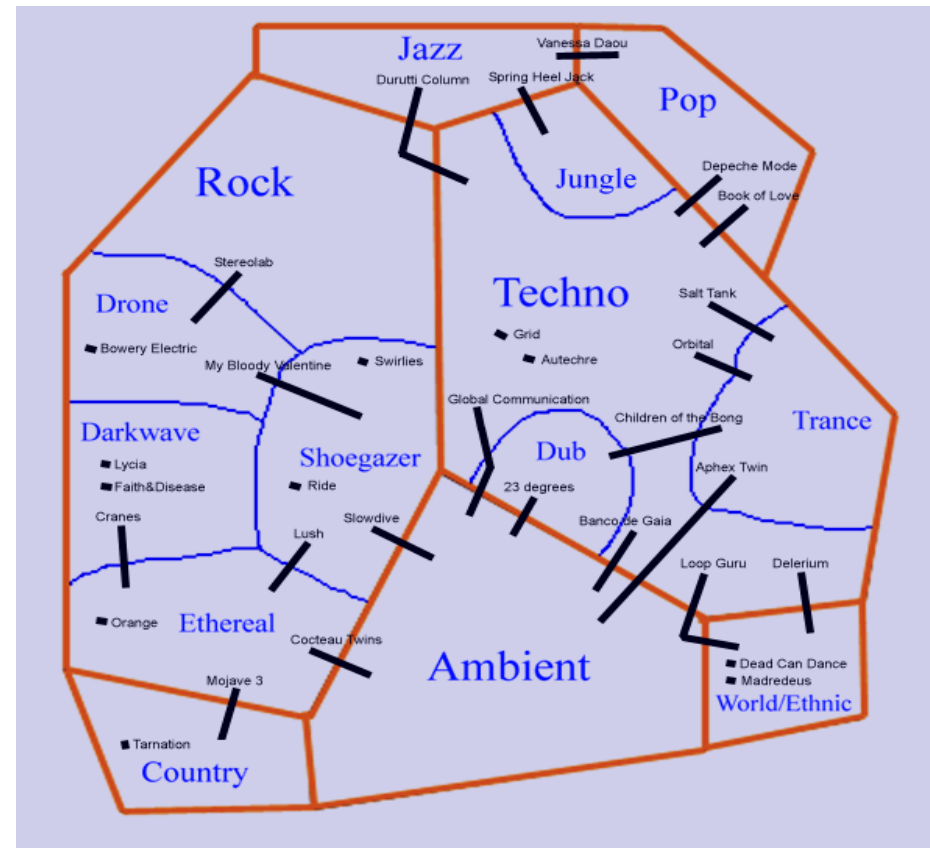
Music Classification

- Genre
- Similarity
- Segmentation
- Fingerprinting



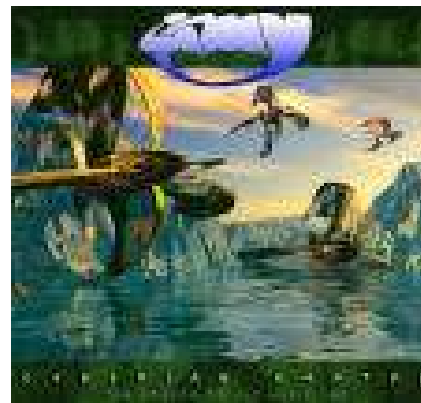
Classification - Genre

- Uses:
 - Music search / recommendation
- Issues:
 - Often available as metadata
 - Difficulty with cross-genre music
 - Artists can span genre
 - AMG: 35 Genres
>150 rock subgenera
 - Amazon: >1300 Genres



Classification - Similarity

- Uses:
 - Playlists / Recommenders
- Issues
 - Lack of 'ground truth'
 - Best feature set?
 - Best classifier?



Segmentation

- Breaking Audio into smaller pieces
- Uses:
 - Audio indexing (find the horn solo)
 - Thumbnailing (extract the chorus)
 - Fingerprinting (separate songs and identify them)



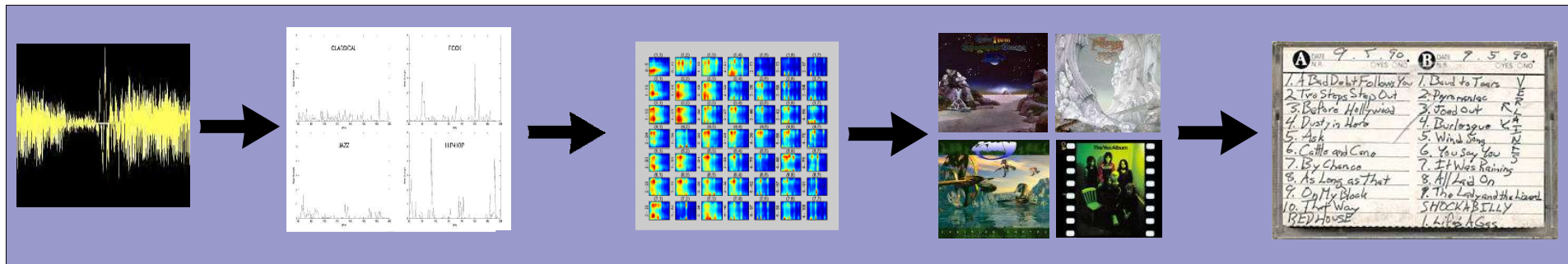


Fingerprinting

- Identifying a song based on content
- Uses:
 - Copyright enforcement
 - “What's this song?”
 - Attaching Metadata
- Must be insensitive to
 - Encoding / sample rate
 - Starting / ending point



What are We Doing Now?



- Song Similarity -> playlist generation
- Research Questions:
 - What acoustic features / metadata to use?
 - What classifiers to use?
 - What's a good user interface?
 - How can a system be evaluated?

Music Manager

MusicMan

Browse Details Search Similar

The Wanton Song
Physical Graffiti
Led Zeppelin

Genres:
 Classic Rock, Hard Rock,



Worklist Playlist Junklist

#	Track	Album	Artist	Year
1	Freedom	Rage Against the Machine (misc...	Rage Against the Machine	2002
2	The Wanton Song	Physical Graffiti	Led Zeppelin	1995
3	Uh-Oh, Love Comes To Town	The Best of Talking Heads	Talking Heads	2004
4	Another Day	The Best of Rent	Rent - Original Broadway Cast	1999
5	Winner Take All	Over 60 Minute With...	Red Rider	1987
6	Something's Gotta Give	The Best of the Song Books	Ella Fitzgerald	1993
7	Gumboots	Graceland	Paul Simon	1990
8	Teach Me Tonight	How Long Has This Been Going...	Sarah Vaughan	1991
9	Record Body Count	Melville	The Rheostatics	1991
10	Branle Simple	Le Tresor d'Orphee by Antoine...	James Edwards	2004
11	Impromptu in B-flat major, op...	Schubert - Works for Solo Forte...	Seth Carlin	2005
12	Papillones, Op. 2	CD1-Schumann Piano Music	Leon McCawley	2003
13	Fantasia in F minor - largoo	Schubert - Music for fortepiano...	Seth and Maryse Carlin	2000
14	David Bryan / Beethoven's Moo...	Steinway To Heaven	Various	1996
15	Stardust	Songs Of Hoagy Carmichael	The Beegie Adair Trio	1995
16	Chansons sans paroles (1989),...	Dry Fig Trees	Gerard Satamian	1996
17	Steve Porcaro / Ravel's Pavane...	Steinway To Heaven	Various	1996
18	Widmung	CD2 Schumann Piano Music	Leon McCawley	2003

Audio Controls

Pause Play Prev Next

Total Tracks: 21

Audio Player

00:19 (4:09) *** 1; LED ZEPPELIN -
 256KBPS 44KHZ STEREO

EQ PL

SHUFF REP

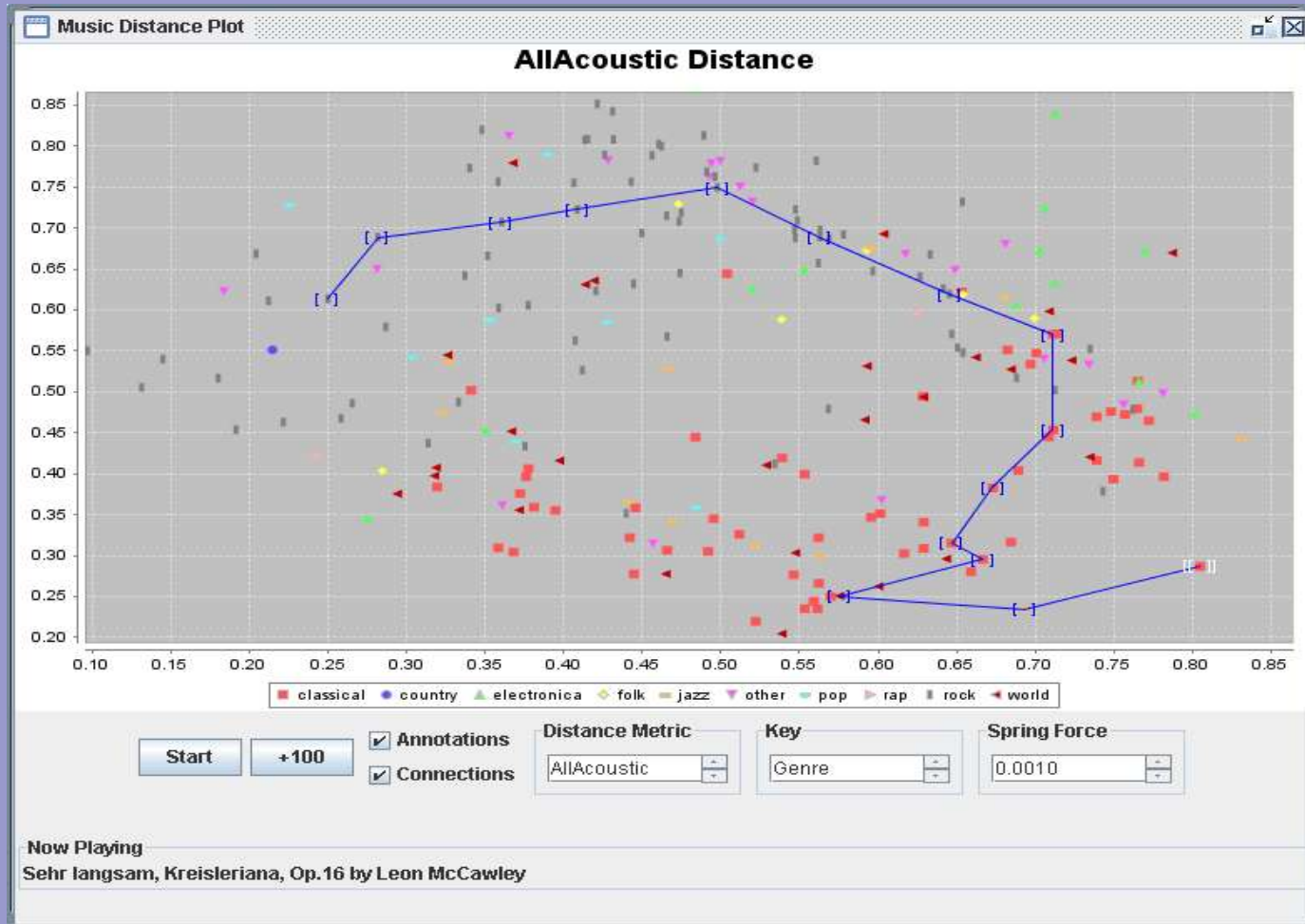
Playlist

1. Rage Against the Machine - Freedom 6:06
2. Led Zeppelin - The Wanton Song 4:09
3. Talking Heads - Uh-Oh, Love Comes T... 2:50
4. Rent - Original Broadway Cast - Anoth... 4:44
5. Red Rider - Winner Take All 4:02
6. Ella Fitzgerald - Something's Gotta Give 2:35
7. Paul Simon - Gumboots 2:44
8. Sarah Vaughan - Teach Me Tonight 3:05
9. Rheostatics - Record Body Count 1:54
10. James Edwards - Branle Simple 1:22
11. Seth Carlin - Impromptu in B-flat majo... 2:40
12. Leon McCawley - Papillones, Op. 2 14:31
13. Seth and Maryse Carlin - Fantasie in ... 1:44
14. David Bryan - David Bryan / Beethove... 5:11
15. The Beegie Adair Trio - Stardust 3:39
16. Gerard Satamian - Chansons sans par... 3:28
17. Steve Porcaro - Steve Porcaro / Ravel... 4:23
18. Leon McCawley - Widmung 3:26

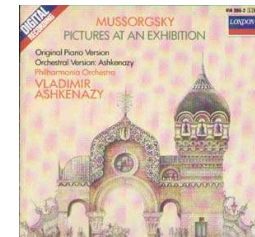
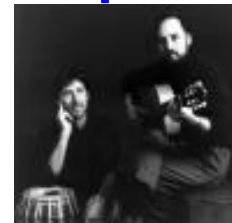
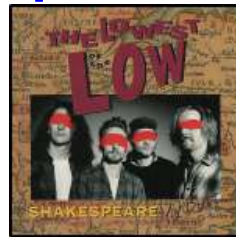
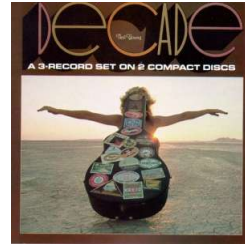
Add Sub Sel Misc 4:09/1:12:33 List

88:42

Musical Journey



A Musical Journey



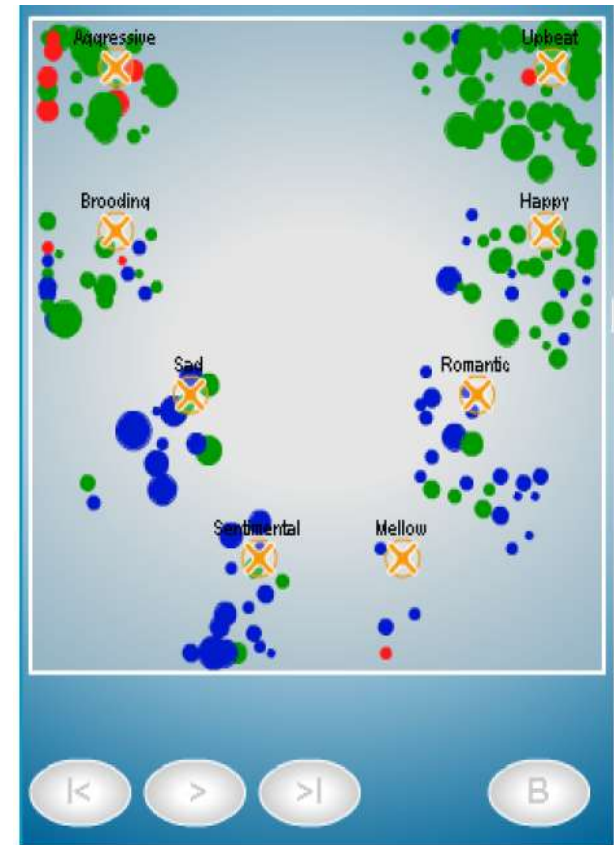
YAKSHI
Lisa Sangita Moscow Mihai Manoliu



#	Track	Album	Artist	Year
1	Freedom	Rage Against the Machine (Mil...	Rage Against the Machine	2003
2	The Lemon Song	Led Zeppelin II (Limited Editio...	Led Zeppelin	2003
3	This Kiss	100% Hits Volume 27	Various	1999
4	Never is a Long, Long Time (T...	Return To The Centre Of The ...	Rick Wakeman	1999
5	Billy Joel Movin Out Anthony...	The Rs500 Super Audio Cd Sa...	Various	
6	Under the Carlaw Bridge	Shakespeare My Butt	The Lowest of the Low	1997
7	Walk On	Decade	Neil Young	1997
8	Fame Is	Woodface	Crowded House	1991
9	Mosaicos do Soledad	Flamenco Passion	Curandero	1998
10	Suite no. 2 in D Minor: BWV 1...	J.S. Bach: The 6 Cello Suites C...	Phoebe Carrai	2003
11	Suite no. 2 in D Minor: BWV 1...	J.S. Bach: The 6 Cello Suites C...	Phoebe Carrai	2003
12	Fantasia in F minor – largoo	Schubert – Music for fortepia...	Seth and Maryse Carlin	2000
13	Yakshi	Yakshi	Lisa Moscow and Mihai Manoliu	2003
14	08-mussorgsky bilder einer ...	Mussorgsky Bilder Einer Ausste	Vladimir Askenazy	
15	Stardust	Songs Of Hoagy Carmichael	The Beegie Adair Trio	1995
16	Sonata in G minor, op. 5, no. ...	Beethoven Piano and Cello Wo...	Tanya Tomkins and Eric Zivian	2003
17	Widmung	CD2 Schumann Piano Music	Leon McCawley	2003

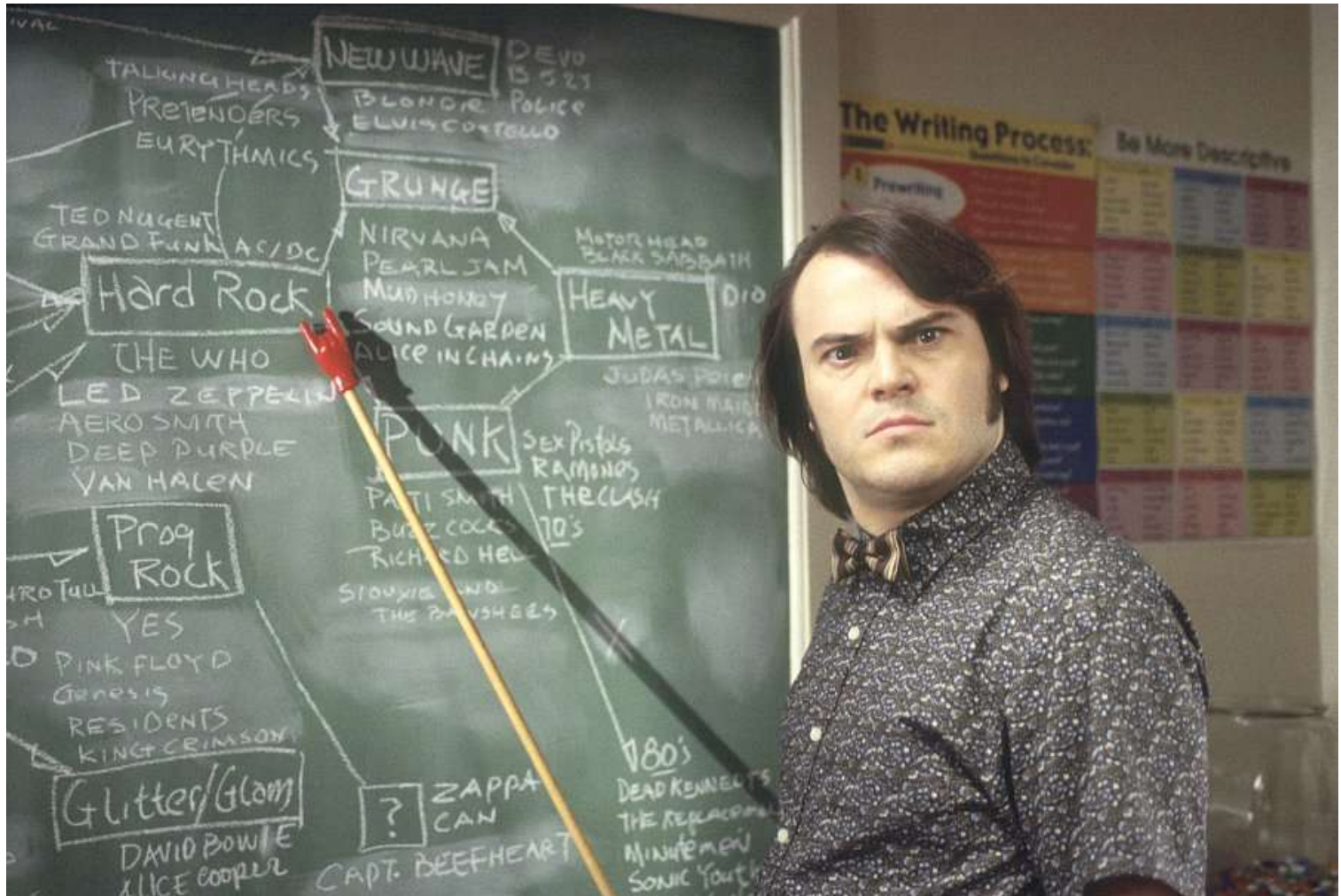
What's Next?

- Explore better features for similarity
- Combine with meta-data (lyrics, reviews, user collaboration data)
- Explore new user interfaces
- Continue with IMIRSEL



Mapping Music in the Palm of Your Hand
van Gulik, Vignoli, van der Wetering

Questions ?



Paul.Lamere@sun.com



**2005
Sun Labs
Open House**