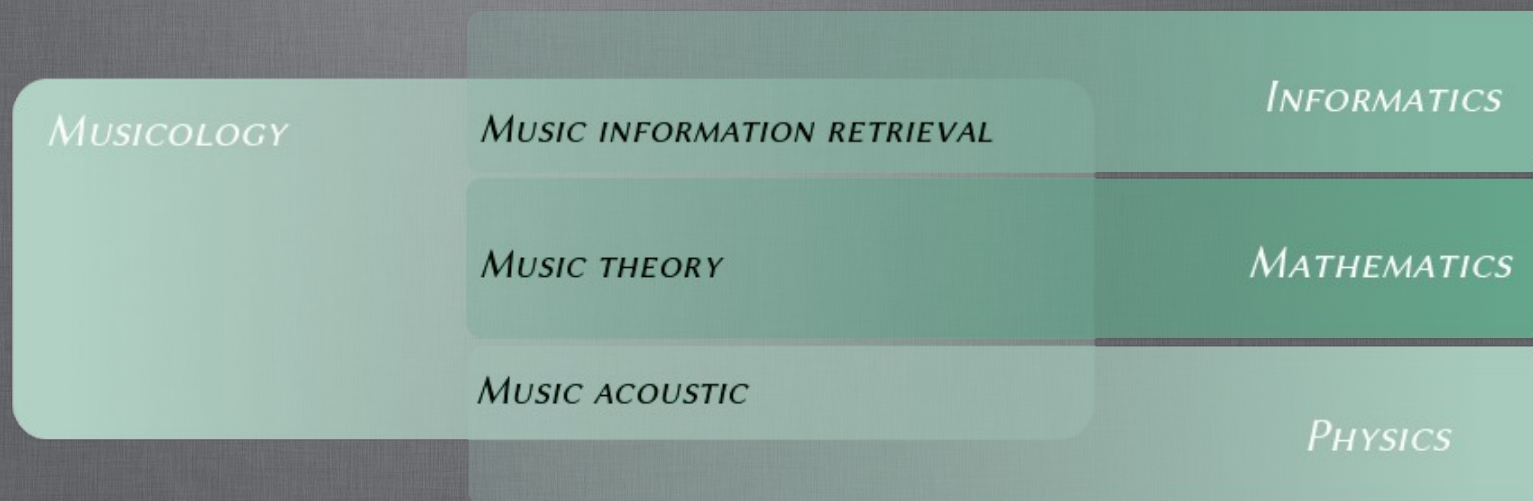


Music Information Retrieval

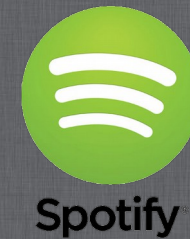
State-of-the-art techniques

Ladislav Maršík
Charles University, Prague

Music Information Retrieval (MIR)



Applications



Outline

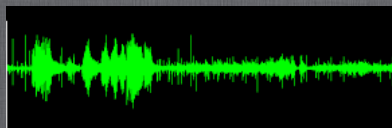
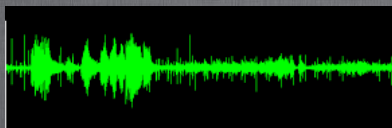
MIR problems (focus: audio query)
with state-of-the-art techniques

Categorization of techniques

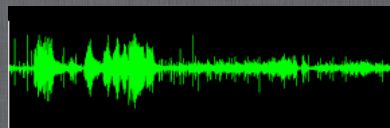
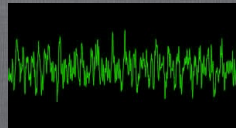
MIR problems (audio query)

1. Audio Fingerprinting
2. Whistling and Humming Queries
3. Cover Song Identification
4. Audio similarity (related: music recommendation)

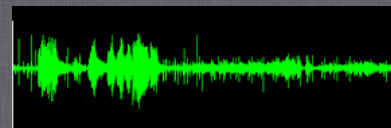
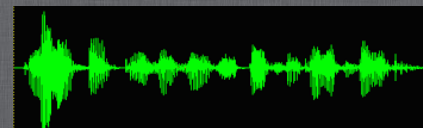
1.



2.



3. and 4.



1. Audio Fingerprinting

INPUT: Song recording

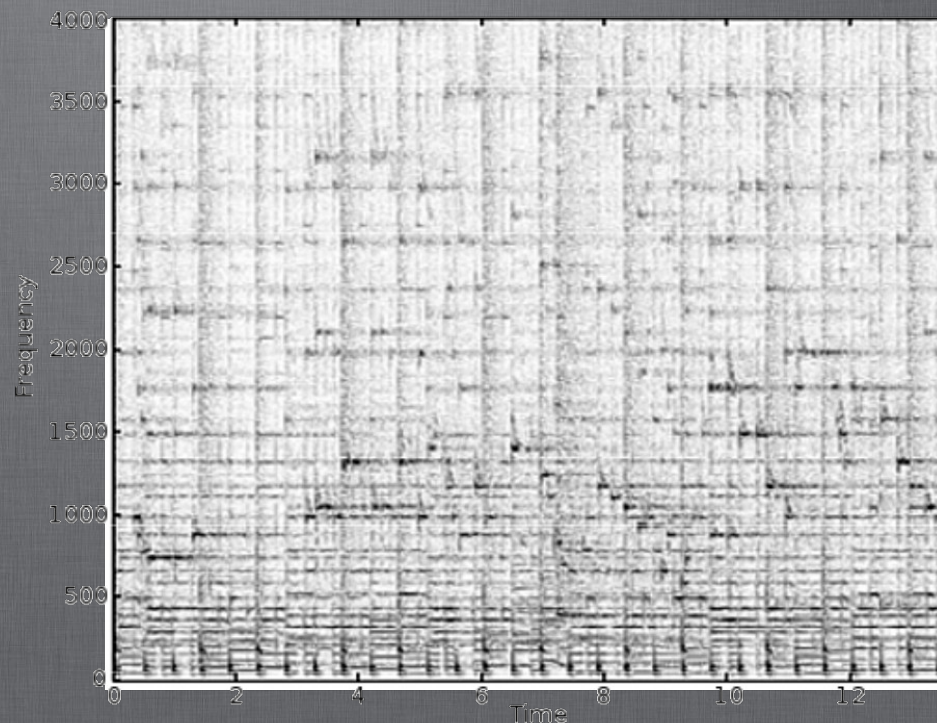
OUTPUT: The exact match



1. Audio Fingerprinting

Wang and Smith: An Industrial-Strength Audio Search Algorithm (2002)

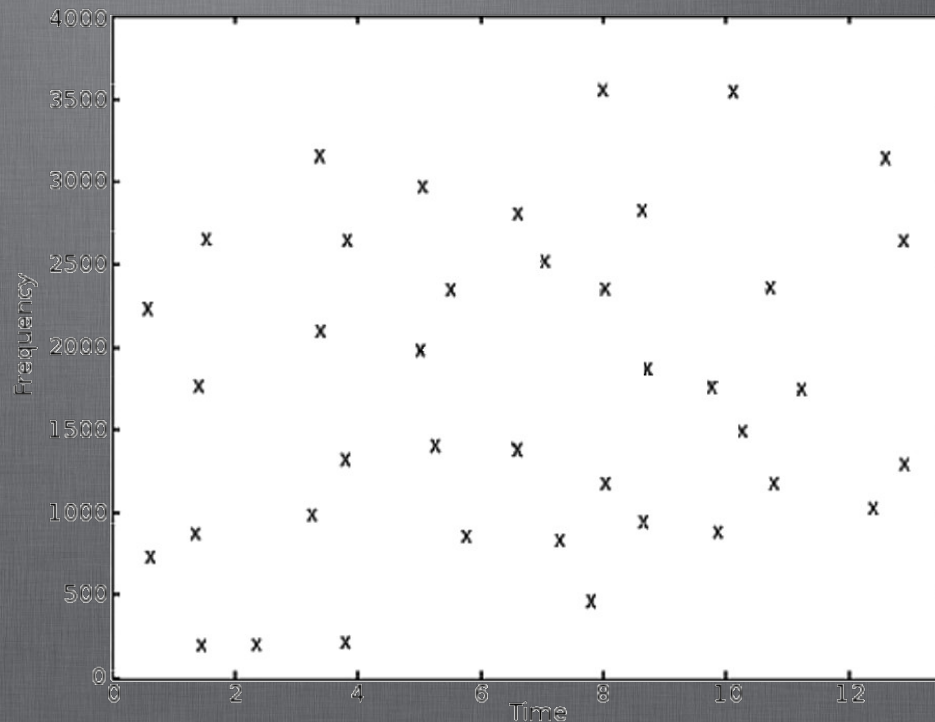
Time-Frequency spectrogram



1. Audio Fingerprinting

Wang and Smith: An Industrial-Strength Audio Search Algorithm (2002)

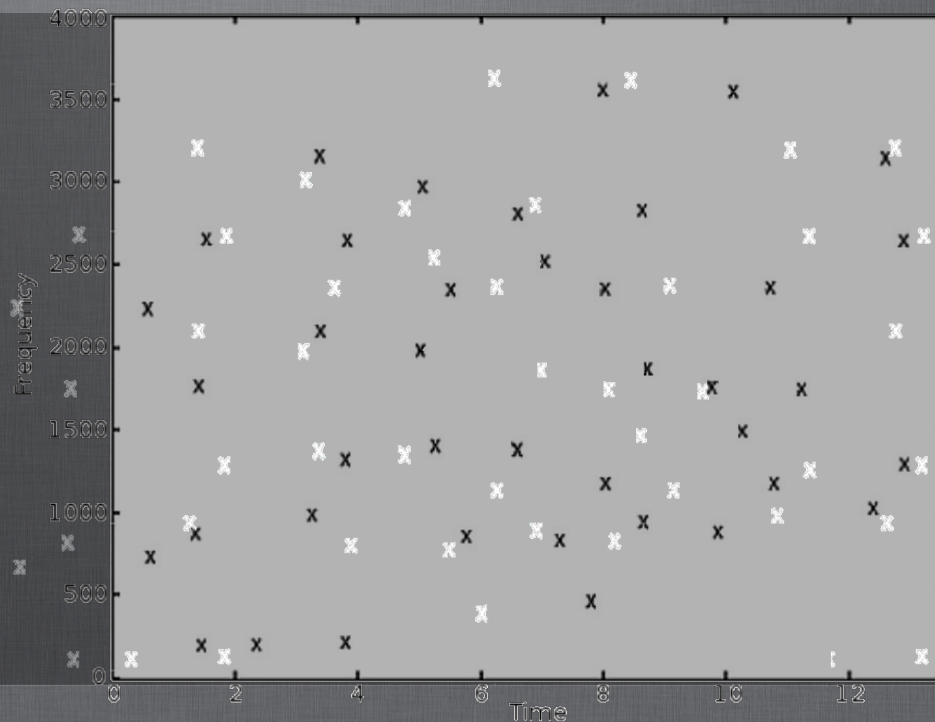
Constellation analysis



1. Audio Fingerprinting

Wang and Smith: An Industrial-Strength Audio Search Algorithm (2002)

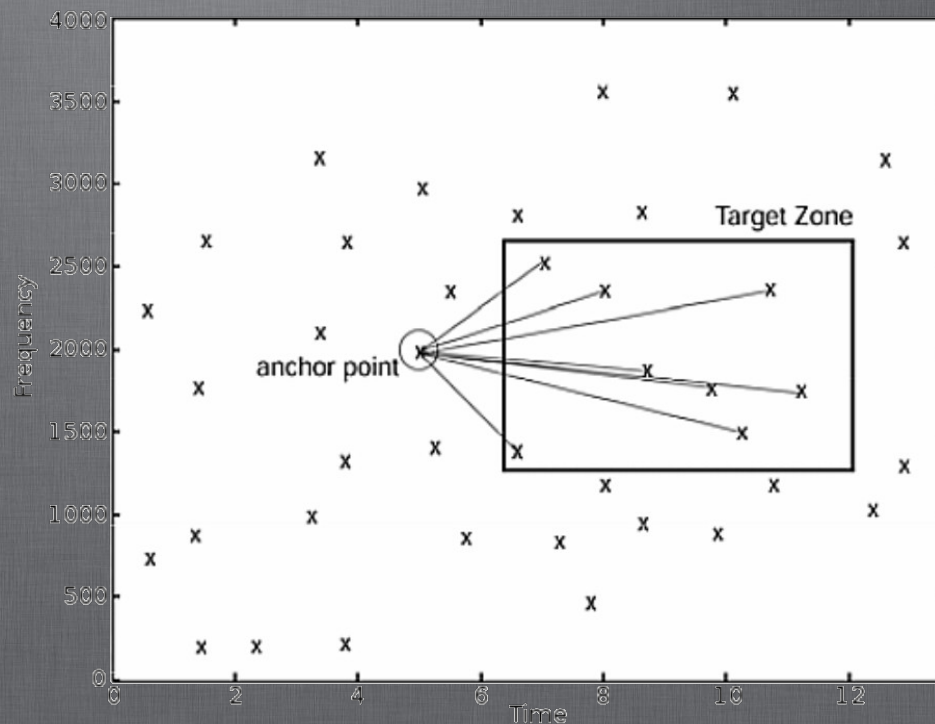
Constellation analysis



1. Audio Fingerprinting

Wang and Smith: An Industrial-Strength Audio Search Algorithm (2002)

Combinatorially hashed $h(f_1, f_2, t_2 - t_1) \mid t_1$



1. Audio Fingerprinting

Summary & State-of-the-art

Summary

- Short search time: 5-500 milliseconds / query
- Robust to noisy environment

State-of-the-art

- Various indexing techniques
- Benchmarking: MIREX 2015
- Focus on commercial deployment, advertisement

2. Whistling and Humming Queries

INPUT: Whistling or Humming

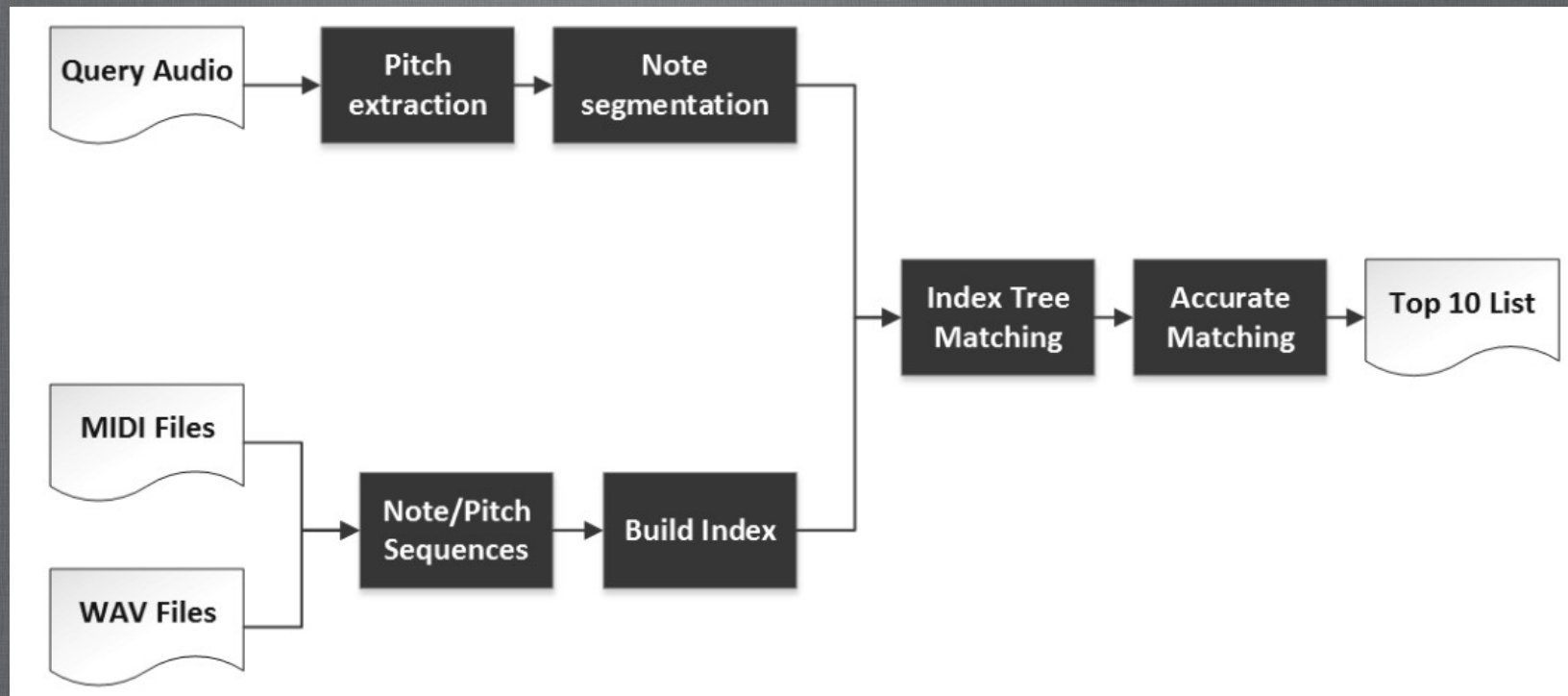
OUTPUT: Song containing the melody



2. Whistling and Humming Queries

Shen and Lee: Whistle for Music (2007)

- Whistle: 700Hz-2.8KHz
- Translation to MIDI (Query and DB)
- String matching methods



2. Whistling and Humming Queries

Summary & State-of-the-art

Summary

- Fast & Effective
- False positives

State-of-the-art

- Hou et al.: Hierarchical K-means tree, dynamic progr.
- MusicRadar
- Benchmarking: MIREX 2015

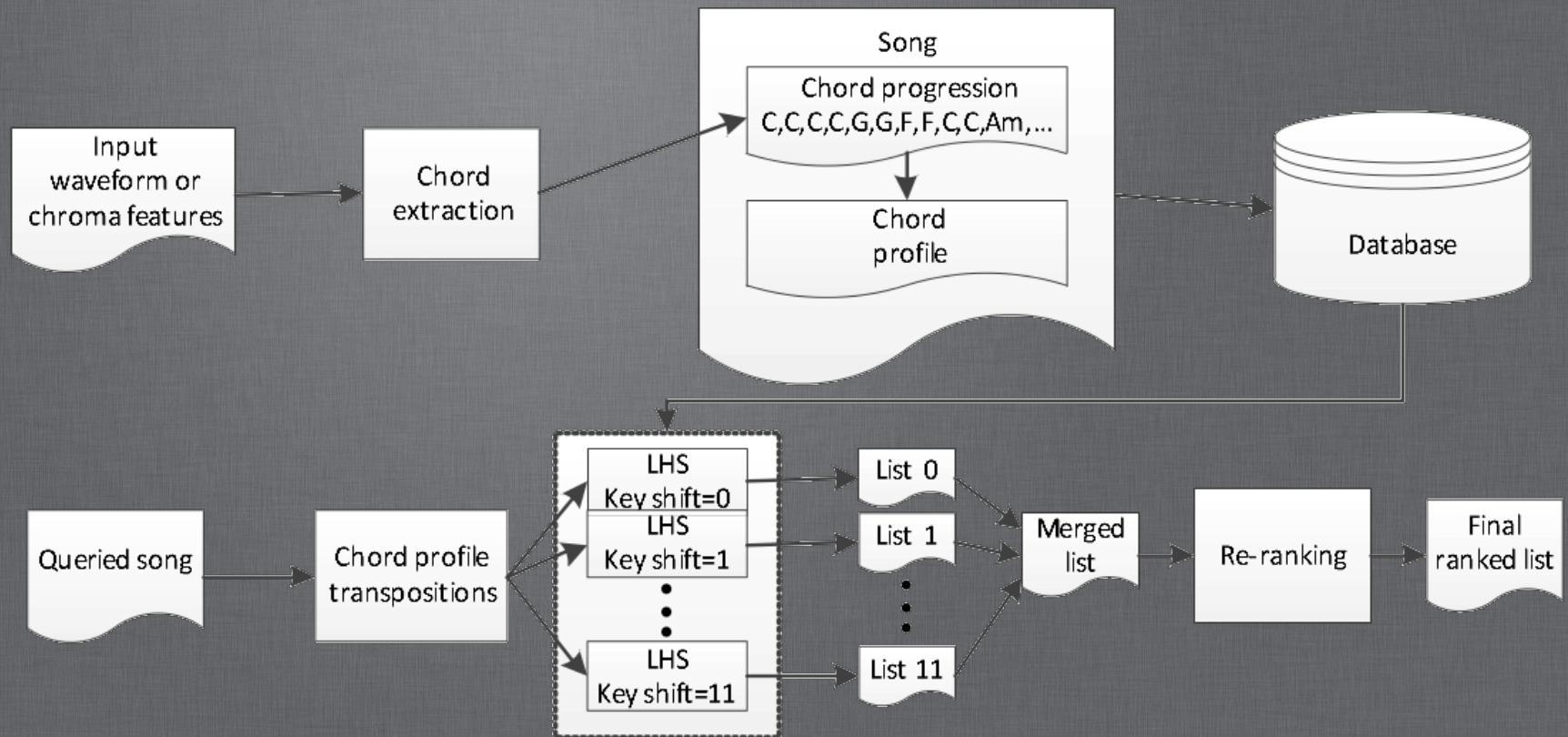
3. Cover Song Identification

INPUT: Song / Recording

OUTPUT: Cover song / Performances

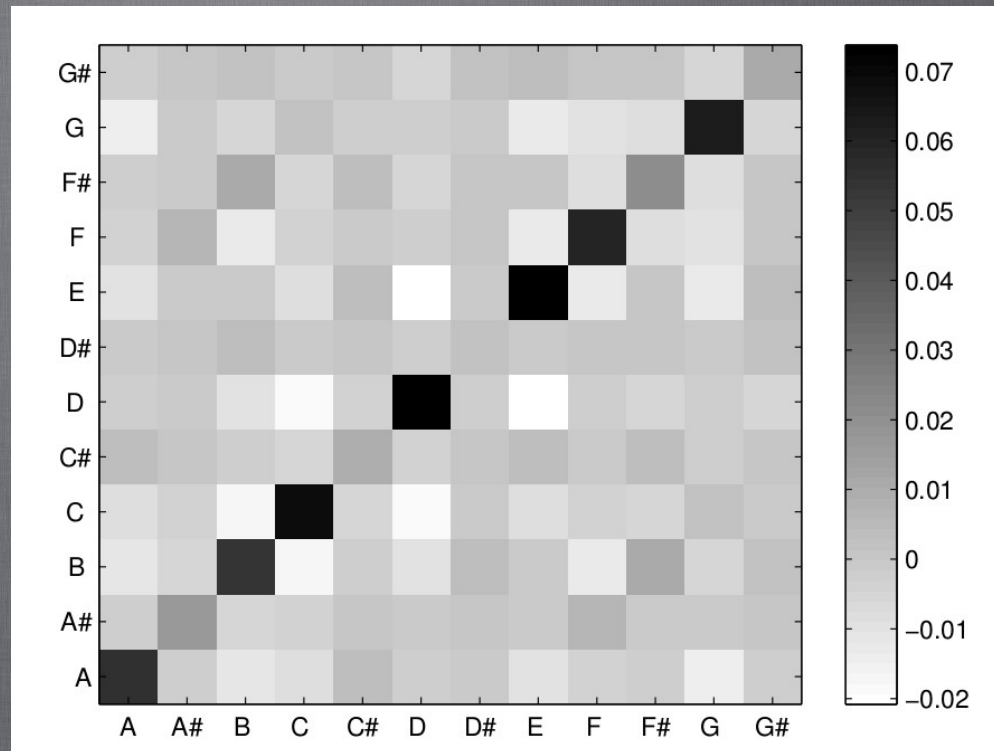
3. Cover Song Identification

Khadkevich and Omologo: CSI Using Chord Profiles (2013)



3. Cover Song Identification

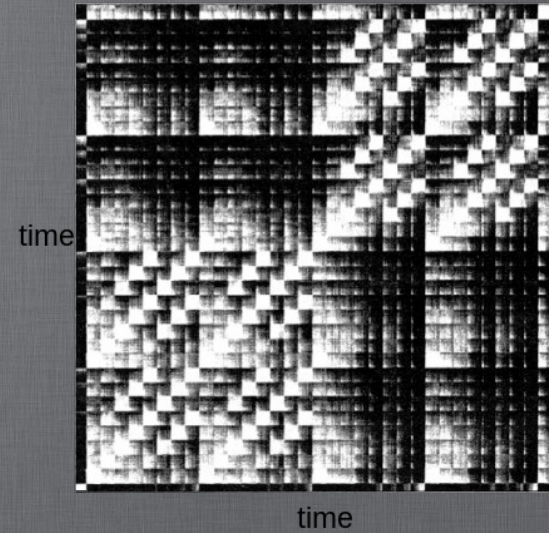
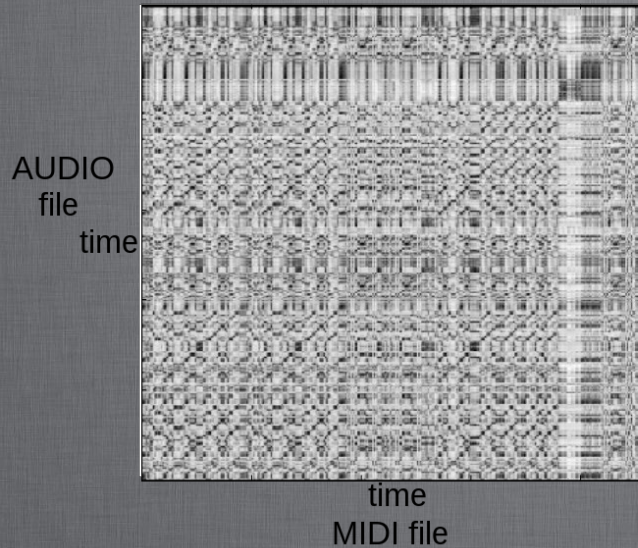
Kim et al.: Music Fingerprint Extraction



Use of Covariance Matrix Fingerprint, Beat synchronization

3. Cover Song Identification

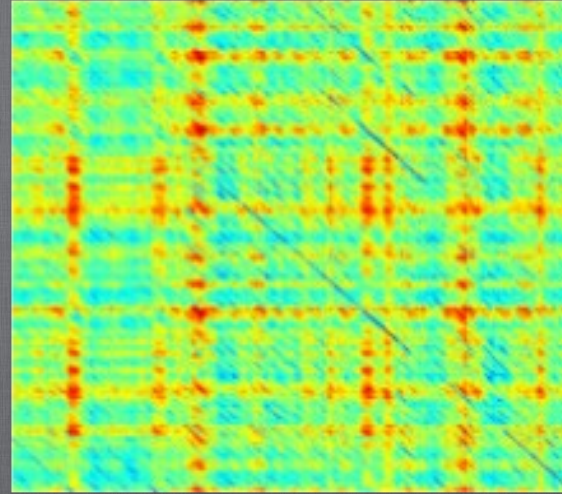
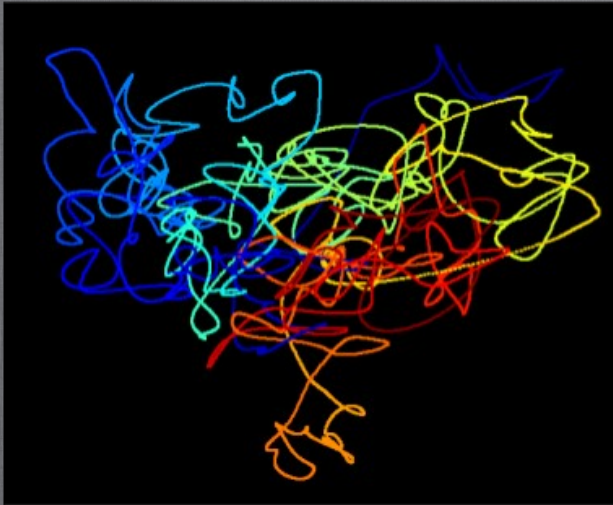
Cross-Similarity and Self-similarity matrices (Tzanetakis 2003, Foote 1999)



Alignment using: Chromagram, Spectrogram

3. Cover Song Identification

Cross-Similarity using MFCC (Traile, 2015)



Alignment using: MFCC

3. Cover Song Identification Summary & State-of-the-art

Summary

- Many various techniques
- Overall 80-90% precision of identifying covers

State-of-the-art

- Benchmarking: MIREX 2015
- Academia Sinica (Tsai, Wang): Melody extraction
- Bordeaux (Hanna): Local alignment of chroma sequences

4. Audio Similarity

INPUT: Song

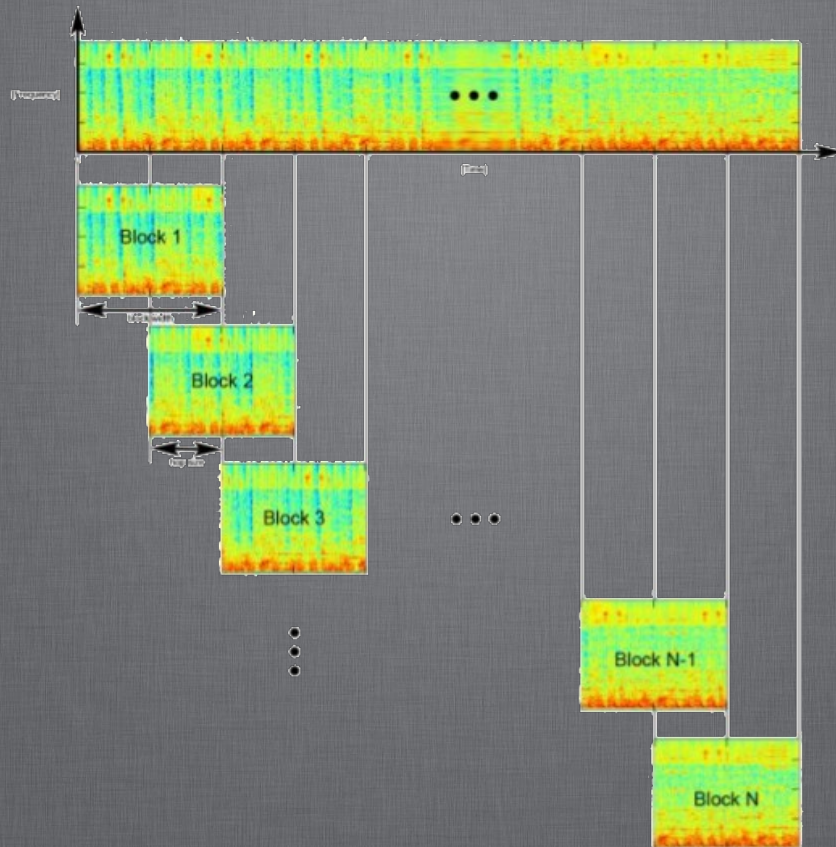
OUTPUT: Similar sounding song

Music recommendation:

OUTPUT: Song that user would like to listen to

4. Audio Similarity

Seyerlehner, Schedl: Block-Level Audio Features (2009)



Audio → blocks

**deriving features
from blocks**

**generalizing for the
song**

Distance measures

4. Audio Similarity

Summary & State-of-the-art

Summary

- Many various techniques
- Useful for genre classification / maybe recommendation?

State-of-the-art

- Benchmarking: MIREX 2015

Categorization of techniques

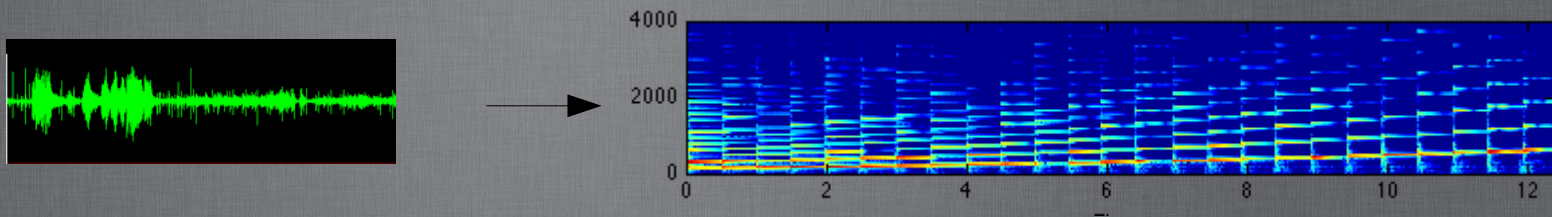
Audio → Spectrogram

Audio → MIDI

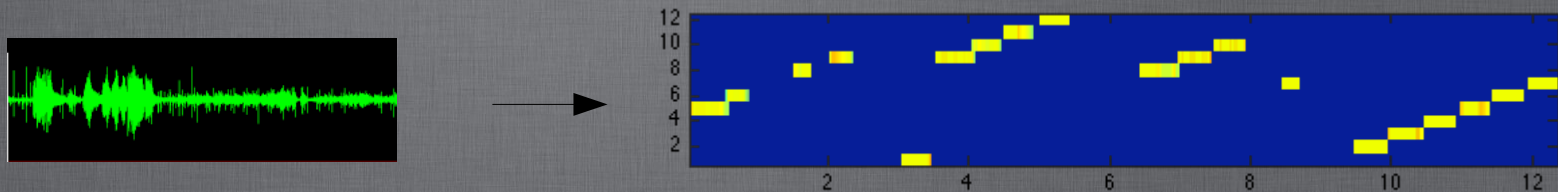
Audio → Chromagram

Categorization of techniques

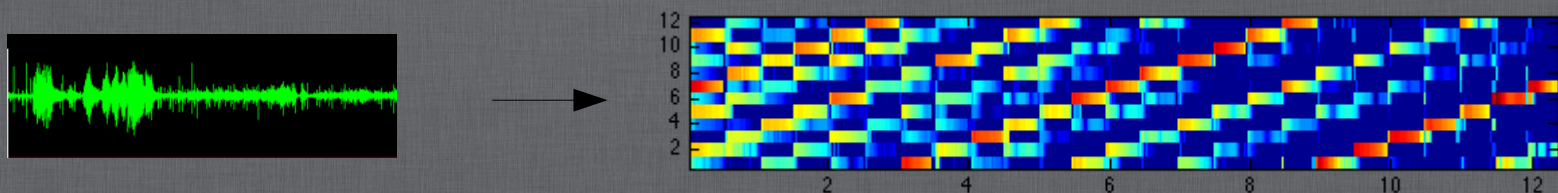
Audio → Spectrogram



Audio → MIDI

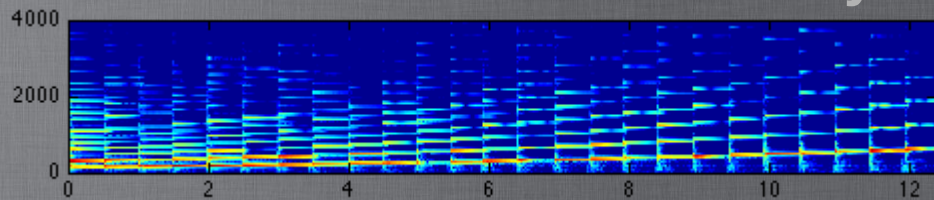
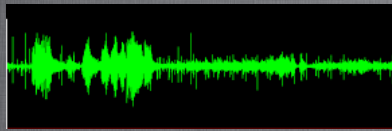


Audio → Chromagram



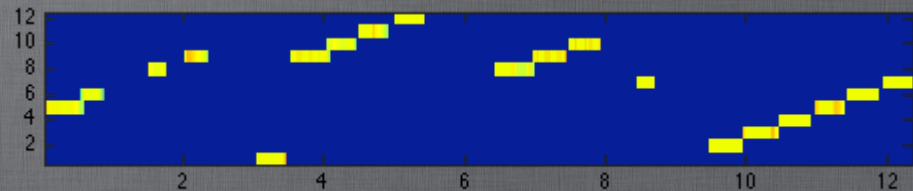
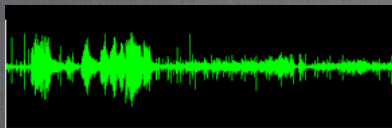
Categorization of techniques

Audio → Spectrogram



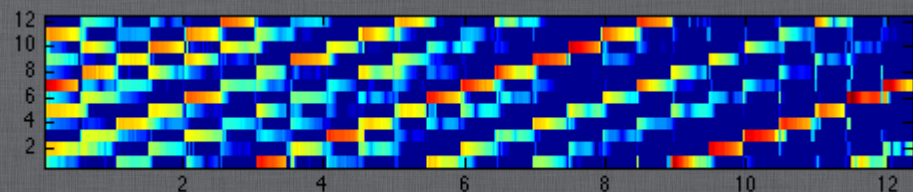
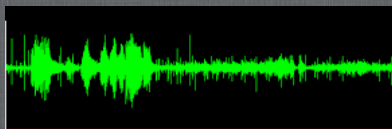
1. Audio Fingerprinting
4. Audio Similarity

Audio → MIDI



2. Whistle and Humming Queries

Audio → Chromagram



3. Cover song identification
4. Audio Similarity

Thank you for your attention