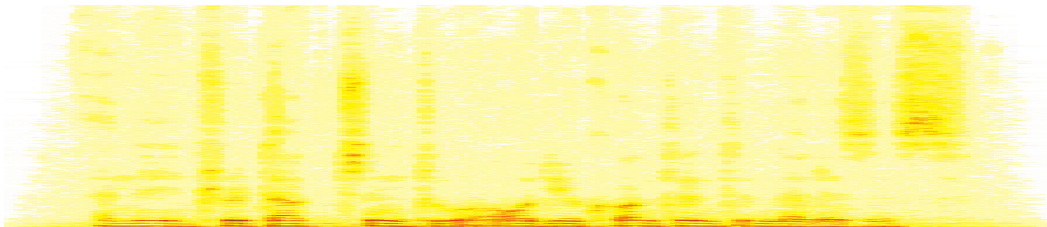


Introduction to Audio Content Analysis

Module 1.0: Introduction to MIR/ACA

alexander lerch



introduction

overview

corresponding textbook section

Chapter 1 — Introduction: pp. 1–6

- **lecture content**

- audio content analysis
- typical applications
- audio content
- processing steps in a typical ACA system

- **learning objectives**

- list goals and applications in ACA
- discuss typical forms of content in an audio signal
- describe the typical signal flow in an ACA system



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introduction

audio content analysis — terminology

- **goal**

- analyze audio signal to extract information on musical content

- **terminology**

- *music information retrieval (MIR)*:
 - analysis and retrieval of music data
 - includes both audio and symbolic data
 - machine listening & computer audition
 - focus on the recognition and understanding of music
 - computational auditory scene analysis (CASA)
 - focus on human perception & cognition, understanding of the auditory scene

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audio content analysis — research field

● interdisciplinary

- digital signal processing
- machine learning / data mining
- musicology
- psycho-acoustics
- ...

● ISMIR community

- annual conferences
- conference papers & Transactions
- ISMIR-Community mailing list
- MIREX: MIR Evaluation eXchange

● related publication outlets

- *conferences*: ISMIR, ICASSP, ICME, SMC, DAFx, ACM MM, ...
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ISMIR

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ISMIR

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applications

- **organization** in large databases
 - search & retrieval, classification, similarity
- **interfaces** to search and retrieval
 - fingerprinting, query-by-humming systems
- **music visualization**
 - symbolic (bars, harmony, score, ...), similarity mappings
- **adaptive processing**
 - adaptive effect parametrization or algorithm selection
- **adaptive interaction**
 - playlist generation, recommendation

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introduction

(commercial) examples

- **recommendation**, playlist generation



lost.fm

PANDORA

- **fingerprinting**



- **score following**



- (multi-) **pitch detection**

melodyne



audio content

sources

what are the sources of (musical) audio content?



audio content

sources

what are the sources of (musical) audio content?



1 score:

- definition of musical ideas
- “blue-print” of the music
- *examples*: melody, key, harmony, rhythmic patterns, ...

audio content

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- information in the score is interpreted, modified, added to
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3 production:

- aesthetic choices
- editing & processing
- *examples*: sound quality (EQ, microphone positioning), changes in timing and pitch

audio content

technical categories

audio content can be structured into **5 technical basic categories**:

- 1 **timbral**: related to sound quality
 - *examples*: instrument(ation), playing technique, venue, audio processing, ...
- 2 **intensity-related**: related to musical dynamics
 - *examples*: accents, loudness, ...
- 3 **tonal**: related to pitch
 - *examples*: melody, chords, intonation, vibrato, ...
- 4 **temporal**: related to rhythm and tempo
 - *examples*: timing, meter, rhythmic patterns, ...
- 5 **statistical & technical**: related to signal properties
 - *examples*: amplitude distribution, number of zero crossings, ...

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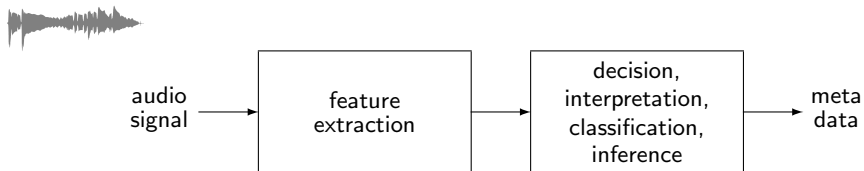
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audio content analysis

system overview



feature extraction

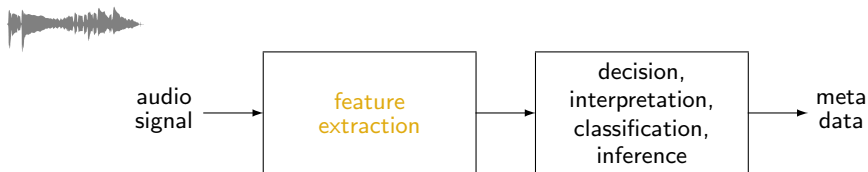
- dimensionality reduction
- meaningful representation

classification

- map or convert feature to comprehensible domain

audio content analysis

system overview



feature extraction

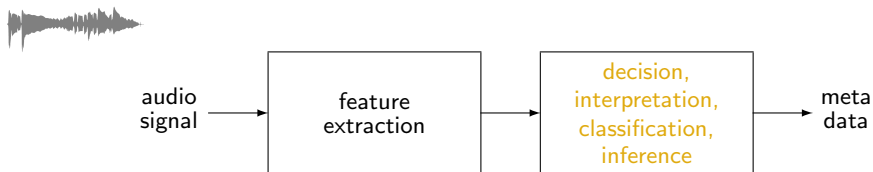
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audio content analysis

system overview



feature extraction

- dimensionality reduction
- meaningful representation

classification

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summary

lecture content

- music information retrieval and **audio content analysis**
 - aim at extracting data about the musical content from the music signal
- **audio content**
 - can relate to timbre, pitch, intensity, tempo and rhythm (but there is both lower level and higher level content)
 - is shaped by the musical ideas (score), the music performance, and the (studio) production
- the **flow chart of an ACA system** at its most fundamental level shows
 - a feature extraction step to extract meaningful descriptors
 - a classification or inference step to produce a “human” result

