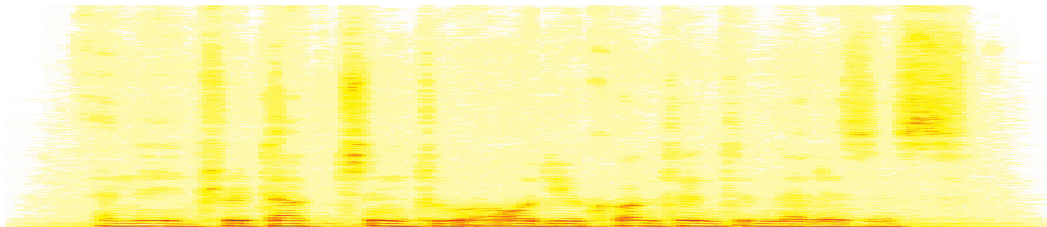


# Introduction to Audio Content Analysis

## Module 6.4: Rhythm Descriptors

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# introduction

## overview

### corresponding textbook section

Chapter 6 — Temporal Analysis: pp. 133–135

#### ● lecture content

- introduction of the beat histogram
- low level features used to describe rhythmic properties

#### ● learning objectives

- explain the terms beat histogram and beat spectrum and how they related to each other
- describe two low level features derived from the beat spectrum and discuss their musical meaning and limits



# introduction

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# rhythm description

## problem statement

- challenges for extracting rhythm descriptors from an audio signal
  - onset, beat, and downbeat detection error prone
  - varying tempo

⇒ need for robust low level descriptors

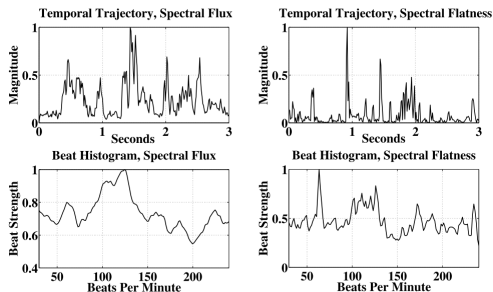
# beat histogram

## introduction

**beat spectrum/beat histogram:** compact representation of periodicities

- 1 compute novelty function
  - time domain features: envelope, rms
  - spectral differences: flux, ...
  - any other feature
- 2 compute transform
  - (resonance) filter bank
  - magnitude spectrum
  - pick onsets

→ compute histogram of Inter-Onset-Intervals (IOI histogram)



graph from<sup>1</sup>

<sup>1</sup>A. Lykartsis and A. Lerch, "Rhythm Features for Musical Genre Classification Using Multiple Novelty Functions," in *Proceedings of the International Conference on Digital Audio Effects (DAFX)*, Trondheim, Norway, 2015.

# beat histogram

## feature examples

- **statistical features**

- mean, centroid, standard deviation, kurtosis, ...

- **peak features**

- value and position of absolute max
- ratio (value and position) of strongest and 2nd strongest peaks

- **other features**

- flatness, crest, high frequency content, MFCCs (??), ...
- features from ACF of beat histogram

# beat histogram

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# beat histogram

## feature examples

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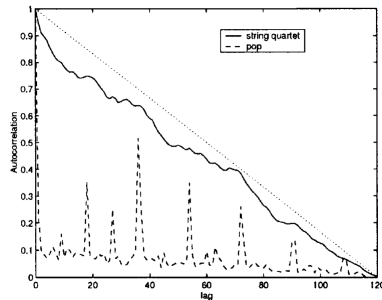
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- flatness, crest, high frequency content, MFCCs (??), ...
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plot from<sup>2</sup>

<sup>2</sup>J. J. Burred and A. Lerch, "Hierarchical Automatic Audio Signal Classification," *Journal of the audio engineering society (jaes)*, vol. 52, no.



# rhythm description

## general questions

- should a rhythm description be tempo dependent or not?
- what role does microtiming play?
- should rhythm descriptors be normalized to bar length?
- what rhythms are perceptually similar?

# summary

## lecture content

- **beat histogram or spectrum**
  - some frequency domain representation of onsets
  - usually characterizing the periodicities
- **beat histogram features**
  - low level features characterizing the beat spectrum
  - often statistical descriptors
  - easy to extract but limited meaning

