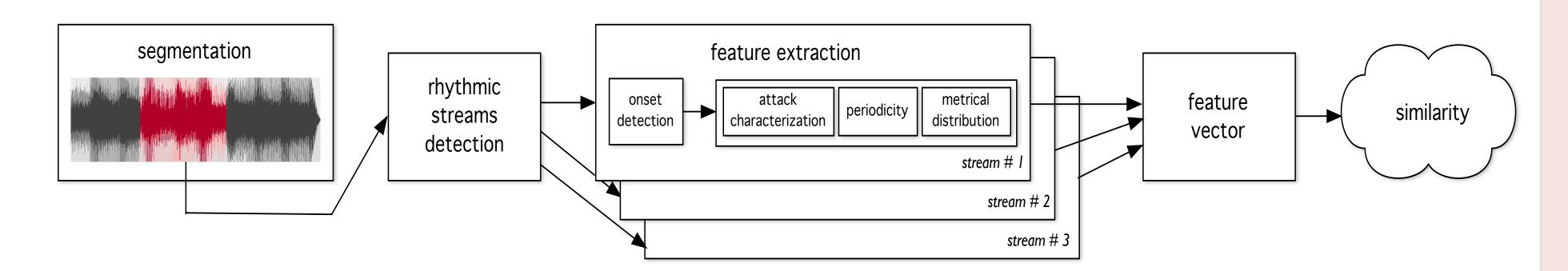


# Modeling Rhythm Similarity for Electronic Dance Music

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## Introduction

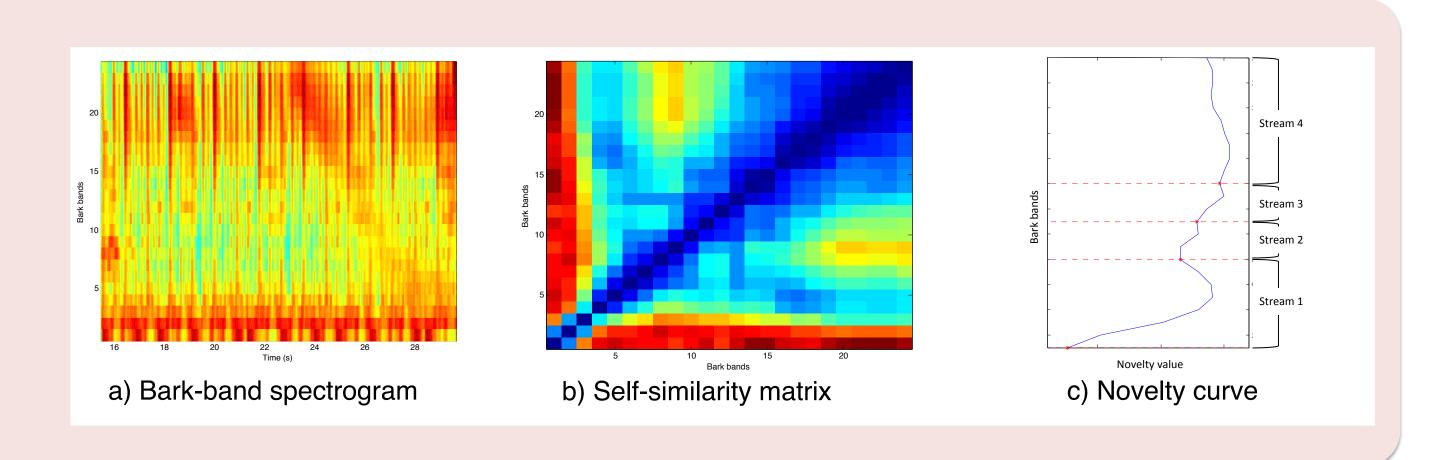
Inter-segment rhythm similarity in EDM [1]

- audio segment [2] split in rhythmic streams
- streams characterized by features; attack phase, periodicity, metrical distribution
- similarity evaluated with perceptual ratings

## **Rhythmic Streams**

Detection of rhythmic streams using the novelty approach

- a. compute Bark-band spectrogram: FFT, Bark Bands, Log, Masking (spreading function [3], smoothing window 50 ms)
- b. get self-similarity matrix using cosine distance
- c. apply novelty [4]; peaks define the stream boundaries



## **Features**

#### **Onsets**

Onset function [5]:  $O_b(k) = (1 - \lambda) N_b(k) + \lambda N'_b(k)$  weighting factor  $\lambda < 0.5$ , bark band b = 1, ..., 24, frame k = 1, ..., K, normalized loudness  $N_b(k)$ , derivative  $N'_b(k)$ 

#### **Attack Phase**

Describes percussiveness
From attack phase [6] of onsets

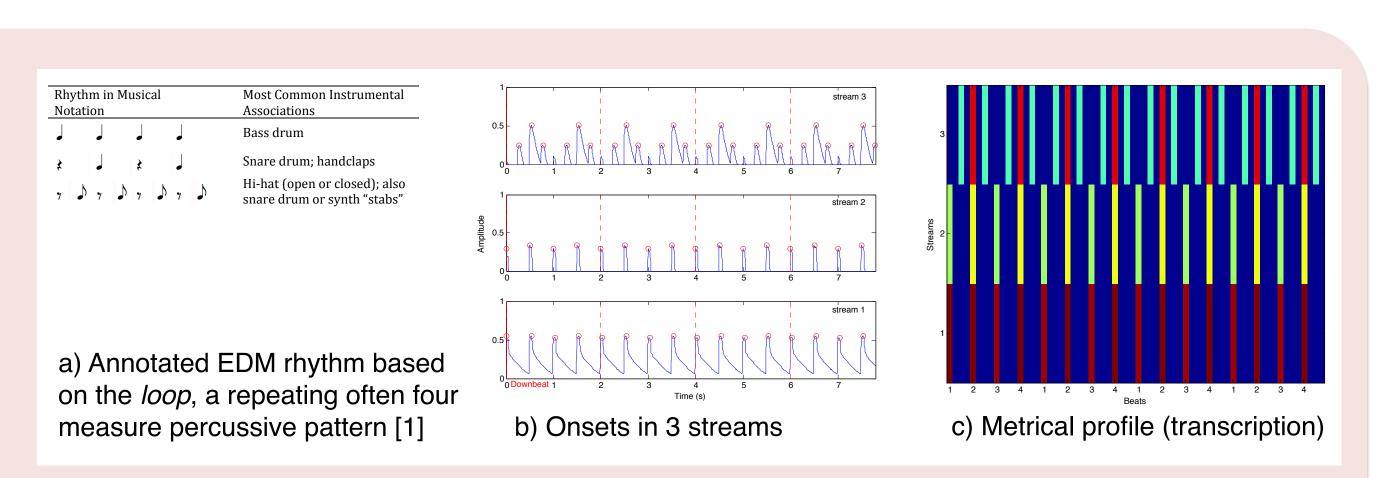
- Attack time (mean, std)
- Attack slope (mean, std)

#### **Periodicity**

Describes degree of repetition

From autocorrelation of onset function

- Max autocorrelation (lag time, strength)
- Peaks' harmonicity [7], entropy, flatness



#### **Metrical distribution**

correlation

Describes metrical relations of events

p-value

From onsets' quantization (incl. downbeat [8], bpm [2] detection)

- Metrical profile [9]: quantization (4 bars x 4 beats x 4 sixteenth)
- Syncopation, center of gravity, density, symmetry

### **Evaluation**

#### Listening experiment

Task rate perceptual rhythm similarity for a pair of EDM segments

Stimuli 18 segments with distinct rhythms, 28 pairs for evaluation

Participants 28 participants, age 27 ± 7, 50% formal musical training, 64%

familiar with EDM, 46% experienced EDM musician/producer

0.22 -0.17 attack phase 0.48 0.00 periodicity 0.33 0.01 metrical distribution excl. metrical profile 0.69 0.00 metrical distribution incl. metrical profile 0.70 0.00 all Table) Pearson's correlation and p-value between perceptual ratings and different sets of features.

feature set

#### Algorithmic steps

accuracy algorithmic step evaluation method

93% rhythmic streams compare with annotated perceived number of streams (t-test)

85% onsets 25 MIDI and corresponding audio excerpts (MIREX Onset Detection F-measure)

51% (59%) downbeat compare with annotated downbeat (also compare with strong beats of meter)

## Conclusion

A model for rhythm similarity of EDM audio segments

- Unsupervised detection of number and freq. range of rhythmic streams.
- Features extracted per stream benefit the analysis.
- Similarity predictions match perceptual ratings with high correlation.
- Future work: improve downbeat detection, tune features via regression

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