

# TOWARDS INCORPORATING THE NOTION OF FEATURE SHAPE IN MUSIC AND TEXT RETRIEVAL

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## 1. Introduction

In Music Information Retrieval (MIR):

- extracted feature data quantify specific aspects of musical structures or of audio signals
- MIR processes operate on feature data to provide mathematical approximations of musical or musicological concepts

Problems:

- These features may not be immediately accessible to end users in terms directly applicable to their studies, e.g. musicology
- A constant gap between
  - the mathematical approximations provided by feature data
  - The more meaningful domain-specific descriptions expected by users

## 2. Feature Shape

Definition:

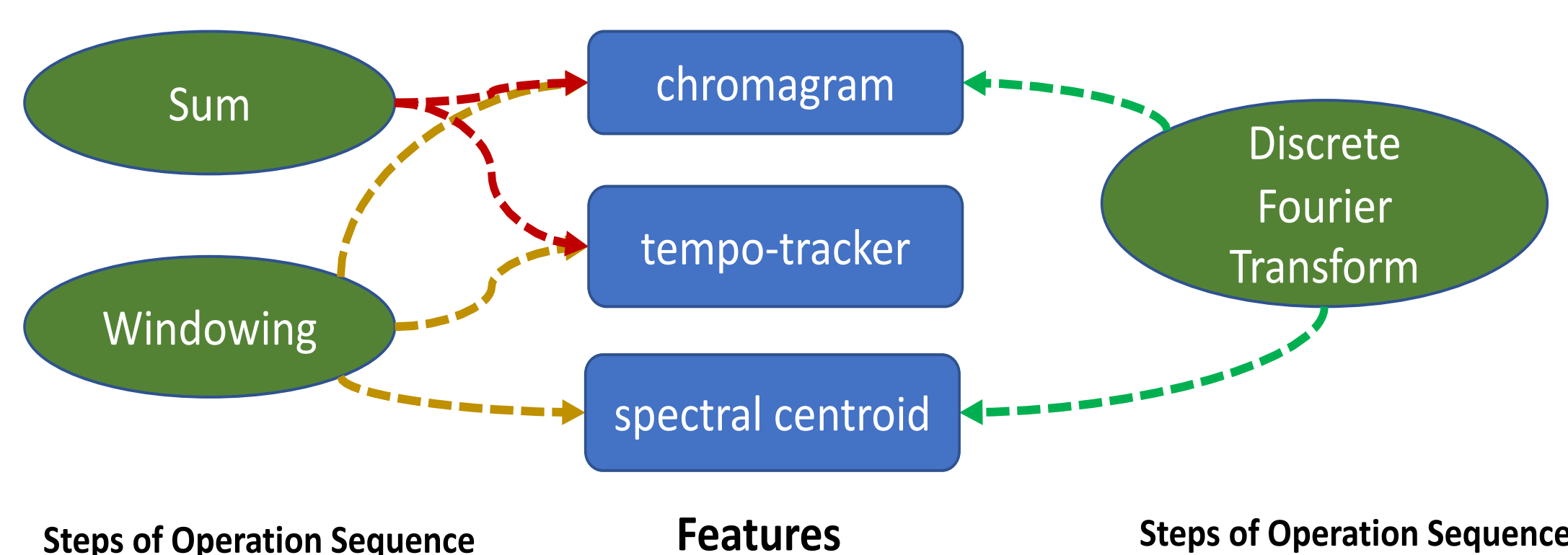
Higher-level abstractions of the characteristics shared between different subsets of features, intended to better reflect user expectations

Feature Shape as a solution:

By implementing the notion of feature shapes, we make the feature data more accessible and retrievable

Motivating example:

A musicologist wishing to conduct a harmonic analysis could be guided toward features sharing a *harmonic shape* (operating in the spectral domain), without requiring extensive signal processing background knowledge



**Figure 1.** Multiple features sharing different steps of their operation sequence

## Feature Shapes in the Live Music Archive

Live Music Archive:

A large collection of extracted audio features and associated metadata describing recordings in the Internet Archive's Live Music Archive, provided as Linked Data

Mapping scheme:

We provided a mapping scheme (on GitHub) to align the AFO/AFV to RDF descriptions of Vamp [4] feature extraction plugins employed within the live music dataset

SPARQL queries:

- the steps of operation sequences tied to a given Vamp feature extractor
- how the Vamp features that share specific steps of their operation sequence are retrievable

**QUERY 1: Retrieve the operation sequence for the chromogram Vamp plugin**

```
SELECT distinct ?optype WHERE {  
  BIND(pluginbase:qm-chromagram as ?vamp).  
  ?opid a ?optype.  
  ?fopid afo:next_operation* ?opid .  
  ?seqid afo:first_operation ?fopid .  
  ?model afo:sequence ?seqid .  
  ?feature afo:model ?model .  
  ?vamp vamp:computes_event_type ?feature .  
  FILTER (?optype != afo>LastOperation).  
}
```

RESULTS:

optype
afv:Windowing
afv:DiscreteFourierTransform
afv:Logarithm
afv:Sum

**QUERY 2: Find all Vamp audio extractors to perform a 'Windowing' step**

```
SELECT distinct ?vamp WHERE {  
  BIND(afv:Windowing as ?optype).  
  ?opid a ?optype .  
  ?fopid afo:next_operation* ?opid .  
  ?seqid afo:first_operation ?fopid .  
  ?model afo:sequence ?seqid .  
  ?feature afo:model ?model .  
  ?vamp vamp:computes_event_type ?feature  
}
```

RESULTS:

optype
pluginbase:qm-tempotracker
pluginbase:qm-chromagram
pluginbase:spectral_centroid
pluginbase:zcr

## Feature Shapes in Text Information Retrieval

HathiTrust Extracted Feature Dataset (HTEFD) :

A collection of textual features derived from the content within the HathiTrust Digital Library. When parsing text, the process incorporates a sequence of sentence segmentation, tokenization, and part of speech tagging

Creating an RDF vocabulary for HTEFD analogous to AFO/AFV:

Based on our review of the features in Apache OpenNLP, Natural Language Toolkit (NLTK), and the Stanford CoreNLP, we created an RDF vocabulary to describe the operation sequences of a subset of the text features published by the HTEFD

**QUERY 1: Retrieve the operation sequence for OpenNLP LDA**

```
SELECT distinct ?optype WHERE {  
  BIND(opennlp:LDA as ?feature).  
  ?opid a ?optype .  
  ?fopid afo:next_operation* ?opid .  
  ?seqid afo:first_operation ?fopid .  
  ?model afo:sequence ?seqid .  
  ?feature afo:model ?model .  
  FILTER (?optype != afo>LastOperation)  
}
```

optype
htcr:Tokenization
htcr:POSTagMethod
htcr:TopKSequenceMethod
htcr:Lemmatization
htcr:StopListing

## 3. The Audio Feature Ontology and Vocabulary (AFO/AFV)

Description:

- A survey of existing MIR features
- Provides a generic semantic description of audio features
- Incorporates process descriptions specifying the **operation sequence** of each feature
- Comprises a series of discrete steps in the feature extraction process

Example of operation sequence in chromagram:

- Step 1:** Windowing
- Step 2:** Discrete Fourier Transform
- Step 3:** Logarithm
- Step 4:** Sum

## 4. Contributions

We have:

- Applied *operation sequences* to inform the notion of *feature shape* in feature-based information retrieval
- Used SPARQL queries to demonstrate the feasibility of our approach to both audio and textual retrieval
- Applied this approach to augment the Computational Analysis of the Live Music Archive dataset

We will:

- Build upon the conceptualization of feature shapes for ongoing work on information systems providing domain-agnostic, usable access to feature data

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