The Music Annotation Pattern

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Abstract

The annotation of music content is a complex process to represent due to its inherent multifaceted, subjectivity, and interdisciplinary nature. Numerous systems and conventions for annotating music have been developed as independent standards over the past decades. Little has been done to make them interoperable, which jeopardises cross-corpora studies as it requires users to familiarise with a multitude of conventions. Most of these systems lack the semantic expressiveness needed to represent the complexity of the musical language and cannot model multi-modal annotations originating from audio and symbolic sources. In this article, we introduce the Music Annotation Pattern, an Ontology Design Pattern (ODP) to homogenise different annotation systems and to represent several types of musical objects (e.g. chords, patterns, structures). This ODP preserves the semantics of the object’s content at different levels and temporal granularity. Moreover, our ODP accounts for multi-modality upfront, to describe annotations derived from different sources, and it is the first to enable the integration of music datasets at a large scale.

Keywords

Semantic Web, Ontology, Music Information Retrieval, Computational Musicology

1. Introduction

Similarly to other forms of artistic expression, the analysis of music can be considered as a quest for meaning – a process driven by musical theories and perceptual cues attempting to shed light on the potentially ambiguous and intricate messages that artists have encoded in their music [1]. Starting from a composition or a performance, music analysis usually focuses on detecting elements related to harmony, form, texture, etc., along with the identification of potential interrelated functions they may exert in the piece (creating or releasing tension, evoking images, inducing emotions, etc.) [2].

At the core of this multifaceted process lies the ability to effectively annotate music. For example, if the goal of a harmonic analysis is to identify chords from a composition, a music annotation may correspond to a list of chords together with a reference to their onset (i.e. when they occur in the piece). Besides contributing to the more general goal of understanding
music, these annotations are also of pedagogic interest (e.g. teaching material for classrooms in analysis, harmony, or composition) and of musicological relevance. They also provide valuable data for training and evaluating algorithmic methods for music information retrieval (MIR) and computational music analysis (CMA), and for supporting performers studying scores and preparing their own interpretation [3]. This interdisciplinary interest in music annotations has also fuelled the development of novel applications and workflows focused on their collection [4], interaction [5] and sharing [3].

Nevertheless, annotating music has always been a challenging task in many respects [6]. Musical content is rich in components (voices, sections, etc.) and nuances (accents, prolongations, modulations) that are often difficult to represent and to consistently relate to the content of an annotation. Several types of musical notations have been introduced to address this problem, although primarily focused on representing musical scores (c.f. Section 2.1). Even the score itself is based on conventions and symbols that have evolved diachronically – as musical periods have changed, as well as stylistically – as musical genres vary [7]. This evanescent aspect of music is then more pronounced when focusing on representing music annotations. For example, when annotating chords, different notation systems have been used over the years, starting with the *basso continuo*, almost universally used in the Baroque era, to the modern *Leadsheet notations*, mainly used to annotate chords in Jazz music [8].

A multitude of notation systems have been developed, proposing different approaches on how to annotate music. This fragmentation is reflected in a vast heterogeneity of file formats and extensions, with consequent interoperability problems. When annotations are encoded within a score, software tools for music processing and computer-aided musicology, like *music21* [9] and *note-seq*¹, have rapidly evolved to parse a variety of symbolic formats ². When annotations are decoupled from the music content [10, 11], these are often encoded using dataset-specific standards and conventions. As a result, retrieving and integrating music annotations from different sources is a challenging, time-consuming task, which stems from the encoding problem and the lack of well-established standards for releasing music datasets [12]. This brings a cascade of effects: (i) it limits the ability to perform cross-corpora studies, especially in multi-modal settings – involving both audio and score annotations; (ii) it leaks ambiguity in the annotations due to the poor semantic expressiveness of the current approaches; and (iii) it confines users to familiarising with a multitude of standards.

In this article, we introduce the *Music Annotation Pattern*, an Ontology Design Pattern for modelling a wide set of music annotations. The *Music Annotation Pattern* is a reusable block for representing annotations of different types, from different sources, and addressing heterogeneous timing conventions. The ODP has been used in preliminary experiments integrating harmonic datasets (chord annotations from multiple sources) in the Polifonia project³. It is the first attempt at achieving interoperability of music annotations collected from multi-modal sources.

¹https://github.com/magenta/note-seq
²See, for example https://web.mit.edu/music21/doc/moduleReference/moduleConverter.html
³https://polifonia-project.eu
2. Related Work

The complexity of representing musical content is related to the manifold sources that are available when studying music. To contextualise this process, Vinet [13] introduces two different Representation Levels to categorise different types of music content: signal representations and symbolic representations. A symbolic representation is context-aware and describes events in relation to formalised concepts of music (music theory), whereas the signal representation is a blind, context-unaware representation, thus adapted to transmit any, non-musical kind of sound, and even non-audible signals.

In this paper, we focus on symbolic representation systems and how these can be semantically described to address the three challenges outlined in the introduction.4

2.1. Modelling scores and score-embedded annotations

Over the years, various representation systems have been developed, some of which are still used today. A notable example is MIDI (Musical Instrument Digital Interface) [14], which also provides a data communication protocol for music production and live performance. A MIDI file can be described as a stream of events, each defined by two components: MIDI time and MIDI message. The time value describes the time to wait (a temporal offset) before executing the following message. The message value, instead, is a sequence of bytes, where the first one is a command, often followed by complementary data.

The ABC notation [15] is a text-based music notation system and the de facto standard for folk and traditional music. An ABC tune consists of a tune header and a tune body, terminated by an empty line or the end of the file. The tune header contains the tune’s metadata, and can be filled with 27 different fields that describe composer, tempo, rhythm, source, etc. The tune body, instead, describes the actual music content, such as notes, rests, bars, chords, and clefs.

MusicXML [16] is an XML-based music interchange language. It is intended to represent common western musical notation from the seventeenth century onwards, including both classical and popular music. Similarly to MIDI, MusicXML defines both an interchange language and a file format (in this case XML).

The Music Encoding Initiative (MEI) [17] is a community-driven, open-source effort to define a system for encoding musical documents in a machine-readable structure. The community formalised the MEI schema, a core set of rules for recording physical and intellectual characteristics of music notation documents expressed with an XML schema. This framework aims at preserving the XML compatibility while expressing a wide level of music nuances.

Other systems of symbolic notation include the CHARM System, *kern, LilyPond and NIFF. All these formats differ dramatically in their syntax, which may exacerbate the interoperability problem and the consequent fragmentation of music data.

2.2. Modelling decoupled annotations

To overcome these problems, annotation standards have been proposed to decouple annotations from the scores, and to encode them in a separate yet unified format. The most notable example

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4This does not imply that a symbolic annotation cannot also refer to audio music (alias tracks, recordings).
is the Annotated Music Specification for Reproducible MIR Research (JAMS) [18, 19], a JSON-based format to encode music annotations. It is primarily used to train and evaluate MIR algorithms, especially in the audio domain. JAMS supports the annotation of several music object types – from notes and chords to patterns and emotions, unambiguously defining the onset, duration, value and confidence of each observation (e.g. "C:maj" starting at second 3, lasting for 4 seconds, detected with a confidence level of 90%). This standard also offers the possibility of storing multiple and heterogeneous annotations in the same file, as long as they pertain to the same piece. Notably, JAMS provides a loose schema to record metadata, both related to the track (title, artists, etc.) and to each annotation (annotator, annotation tools, etc.). Nonetheless, JAMS supports annotations collected from signal representation (audio), as it was not originally designed for the symbolic domain. This is due to a discrepancy between audio-based annotations – expressing temporal information in absolute times (seconds), and symbolic annotations – using relative or metrical temporal anchors (e.g. beats, measures). Also, from a descriptive perspective, it is not possible to disambiguate certain attributes in the metadata sections. For instance, the “artist” field in the current JAMS definition may refer to the composer or to the performer of the piece. Finally, JAMS is limited to the expressiveness of JSON, which does not allow for the semantic expression of concepts that are sometimes essential for describing musical content. For example, even if the specification of composers and performers was possible in the standard, this would still be insufficient to express the semantic relationships occurring between these concepts.

2.3. Modelling semantics in music data

To encode semantics in music data, and account for the ambiguity problem in music annotations, Semantic Web technologies can be useful, as shown in other domains such as Cultural Heritage [20]. Over the past two decades, several ontologies have been developed in the music domain. Some ontologies have been designed for describing high-level descriptive and cataloguing information, such as the The Music Ontology [21] and the DOREMUS Ontology [22].

Other ontologies describe musical notation, both from the music score and the symbolic points of view. For example, the MIDI Linked Data Cloud [23] models symbolic music descriptions encoded in MIDI format. The Music Theory Ontology (MTO) [24] aims to describe theoretical concepts related to a music composition, while The Music Score Ontology (Music OWL) [25] represents similar concepts with a focus on music sheet notation. Finally, the Music Notation Ontology [26] focuses on the core “semantic” information present in a score. The Music Encoding and Linked Data framework (MELD) [27] reuses multiple ontologies, such as the Music and Segment Ontologies, FRBR in order to describe real-time annotation of digital music scores. The Music Note Ontology [28] proposes to model the relationships between a symbolic representation and the audio representation, but only considering the structure of the music score and the granularity level of the music note.

Each of these ontologies covers a specific aspect of music notations. Our ODP reuses and extend their modelling solutions to provide a comprehensive, scalable and coherent representation music annotations.
3. The Music Annotation Pattern

The Music Annotation ODP addresses the goal of modelling different types of musical annotations. For example, this ODP can be used to describe musical chords, notes rather than patterns, both harmonic and melodic and structural annotations. The Music Annotation ODP also aims to represent annotations derived from different types of sources, such as audio and score. The ODP is available online at the following URI:

https://purl.org/andreapoltronieri/music-notation-pattern

The complete implementation and documentation of the pattern, as well as its documentation and all the examples presented in this paper are available on a dedicated GitHub repository. To be compliant with the practice of the Music Information Retrieval community, we reuse the terminology from JAMS [18]. The following terms are used for the ODP vocabulary:

- **Annotation**: an annotation is defined as a group of observations (see below) that share certain elements, such as the method used for the annotation and the type of object being annotated (e.g. chords, notes, patterns); an annotation has one and only one annotator, that can be of different types e.g., a human, a computational method, and which is the same for all its observations.

- **Observation**: an observation is defined as the content of an annotation. It includes all the elements that characterise the observation. For example, in the case of an annotation of chords, each observation is associated with one chord, and it specifies, in addition to the chord value, its related temporal information and the confidence of the annotator for that observation.

The structure of the Music Annotation ODP consists of the relations between an Annotation and its Observations.

An integration effort of a set of datasets containing chord annotations, in the context of the Polifonia project³, provided a useful empirical ground to define a set of Competency questions (CQs) to drive the design of the Music Annotation ODP. They are listed in Table 1. Each competency question is associated with a corresponding SPARQL query, they are all available on the project’s GitHub repository.

The ODP was modelled by following a CQ-driven approach [29], and by reusing a JAMS-based terminology.

**Annotation.** Addressing CQ1, CQ4, CQ10: an Annotation has to be intended as a collection of Observations about a MusicalObject. For musical objects, in this context, we refer to a concept generalising over audio tracks and scores. Annotations can be of two types: ScoreAnnotation and AudioAnnotation. These two types of annotation define the encoding to be used for representing time information.

³Music Annotation Pattern repository: https://github.com/andreamust/music-annotation-pattern
ID | Competency questions
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CQ1 | What is the type of an annotation/observation for a musical object?
CQ2 | What is the time frame within the musical object addressed by an annotation?
CQ3 | What is its start time (i.e. the starting time of the time frame)?
CQ4 | Which are the observations included in an annotation?
CQ5 | For a specific observation, what is the starting point of its addressed time frame, within its reference musical object?
CQ6 | For a specific observation, what is its addressed time frame, within the musical object?
CQ7 | What is the confidence of an observation?
CQ8 | Who/what is the annotator of an annotation/observation, and what is its type?
CQ9 | What is the musical object addressed by an annotation?
CQ10 | What is the type of an annotation/observation for a musical object?

Table 1
Competency questions addressed by the Music Annotation ODP.

**Time information.** Addressing CQ2, CQ3, CQ5, CQ6. An annotation has a time validity (hasValidityDuration) expressed as a xsd:float value. Similarly, an observation has a duration (hasDuration) expressed as a xsd:float value. They indicate the time frame, within the referenced musical object, addressed by an annotation/observation. These datatype properties can represent the duration of a score fragment (duration in beats) as well as the duration of the an audio fragment (duration in seconds).

The starting point of the time frame addressed by an annotation/observation is encoded differently depending on their type. For AudioAnnotation and AudioObservation, the starting time is

![Figure 1: The Music Annotation Pattern. We use the Graffoo notation: yellow boxes are classes, blue/green arrows are object/datatype properties, purple circles are individuals, green polygons are datatypes.](image-url)
defined as a \texttt{xsd:float} value (seconds) through the datatype properties \texttt{hasValidityStartingTime} and \texttt{startTime}, respectively. For \texttt{ScoreAnnotation} and \texttt{ScoreObservation}, the starting time is defined as a \texttt{Metrical Time} object, which is qualified in terms of:

- \textit{measures}, through the datatype property \texttt{hasMeasure} expressed as a \texttt{xsd:float} value. It indicates the cardinality of the measure at which the annotation or observation begins;

- \textit{beats}, through the datatype property \texttt{hasBeat} expressed as a \texttt{xsd:nonNegativeInteger} value. It identifies the beat within the measure at which the annotation or observation begins.

\textbf{Annotator.} Addressing CQ8. Annotations have one and only one \texttt{Annotator}, relation expressed through the object property \texttt{hasAnnotator}. Annotators are classified by their type (\texttt{AnnotatorType}), for example \texttt{Human}, \texttt{Machine}, \texttt{Crowdsourcing}, etc., which is exactly one.

\texttt{:hasAnnotator rdf:type owl:ObjectProperty ;}
\texttt{owl:inverseOf :isAnnotatorOf ;}
\texttt{rdfs:domain :Annotation ;}
\texttt{rdfs:range :Annotator ;}
\texttt{owl:propertyChainAxiom ( :isAnnotatorOf}
\texttt{ :includesObservation ) .}

\textbf{Observation.} Addressing CQ1, CQ4, CQ7, CQ9. Each \texttt{Annotation} includes a set of \texttt{Observation}s. \texttt{Observation}s can be of two types: \texttt{ScoreObservation} and \texttt{AudioObservation}. The type of an observation must be compatible with the type of the annotation that contains them. If the annotation is \texttt{ScoreAnnotation}, it contains \texttt{ScoreObservation}s, otherwise it contains \texttt{AudioObservation}s. The annotator (and its type) of an observation is the same and only from the annotation that includes it: this is formalised by means of a property chain in the ODP. However, the level of confidence of an annotator is associated to each observation (\texttt{hasConfidence}).

Each \texttt{Observation} has an \texttt{ObservationValue}, which characterises its content. The \texttt{ObservationValue} class is meant to be specialised depending on the subject being observed (and annotated), e.g. \texttt{Chord}, \texttt{Note}, \texttt{Structural Annotation}. For example, it can generalise over concepts from existing ontologies, such as the Chord Ontology\footnote{Chord Ontology documentation available at: \url{http://motools.sourceforge.net/chord_draft_1/chord.html}} for chord annotations. Musical object, annotation, observation, observation value, metrical time, annotator, and annotator type are disjoint concepts.

Annotations of type \texttt{score} may only contain observations of type \texttt{score}:

\texttt{Class: ScoreAnnotation}
\texttt{SubClassOf: Annotation,}
\texttt{includesObservation only ScoreObservation,}
\texttt{includesObservation some ScoreObservation}

\texttt{Class: ScoreObservation}
\texttt{SubClassOf: Observation,}
Similarly, annotations belonging to type audio can only contain observations of type audio:

Class: AudioAnnotation
SubClassOf:
    Annotation,
    includesObservation only AudioObservation,
    includesObservation some AudioObservation

Class: AudioObservation
SubClassOf:
    Observation,
    isObservationOf only AudioAnnotation,
    startsAtTime only xsd:float,
    startsAtTime exactly 1 xsd:float

4. Usage Example

In this section, we describe two examples of usage of the Music Annotation ODP. We remind that this ODP addresses different types of annotations for different types of sources (e.g. score, audio). The examples show how the Music Annotation ODP can be used to describe: (i) musical chord annotations and (ii) structural annotations of a song.

4.1. Chord Annotations

The first example is an annotation of chords from a music score of Wolfgang Amadeus Mozart’s Piano Sonata no. 1 in C major (Allegro). The original annotation is taken from the Mozart Piano Sonatas Dataset [30]. Figure 2 depicts the resulting RDF graph using the Grafoo Notation. In all the examples, dummy prefix and namespace (ex: and http://example.org/) are defined for instances.

In this case, the MusicalObject is a musical score, defined by the ex:MozartPianoSonataScore instance, which has ex:ScoreAnnotation as its annotation. The annotation is linked to its annotator, in this case a human, its duration expressed in beats and its starting time. Being an annotation of type score, the starting time is expressed by means of the instance ex:MozartScoreStartTime that has defined beat and measure, via a xsd:float and an xsd:int, respectively.

The annotation then contains three different observations (the actual number has been reduced for demonstration purposes), namely ex:ChordObservation1, ex:ChordObservation2 and ex:ChordObservation3.

Each of these observations has a value, i.e. the chord per se, a duration and a start time. Similarly to the annotation, the duration is expressed with a xsd:float, while the start time is expressed through the MetricalTime class. In this example, observations have no Confidence, as this is not provided by the original annotation.

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8https://essepuntato.it/graffoo/
4.2. Structural Annotations

The second example is an annotation of segments from an audio track of The Beatles’ *Michelle*. The original annotation is available in JAMS format and is taken from the Isophonics\(^9\) [31]. Figure 3 depicts the example graphically using the Grafoo notation.

In this example, the *MusicalObject* is instead a track, defined by the *ex:BeatlesMichelleTrack* instance, which has an *ex:AudioAnnotation*, as it was annotated from the audio signal. The annotation has a human-type annotator, a starting time and a duration. The latter two values are both expressed by two *xsd:float*, as all time indications of an *ex:AudioAnnotation* are expressed in seconds.

The annotation then contains three different *SegmentObservation*, which define the structure of the track. Each observation has a starting time and duration, both expressed in seconds as well as a *Confidence*. Finally, the value of each observation corresponds to the structural segment itself, in this case *ex:Silence, ex:Intro* and *ex:Verse*.

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\(^9\)Isophonics dataset: http://isophonics.net/datasets
5. Conclusions and Future Work

We propose the Music Annotation ODP for modelling annotations of music scores and audio tracks. A distinction at the core of this ODP is the different encoding of time information, which depends on the type of the subject of observation (score or audio). The ODP is the result of the analysis of many relevant different existing formats used for music annotation (MusicXML, ABC, JAMS, etc.) and provides a template for supporting the integration of data from such heterogeneous sources. This work demonstrated the use of the ODP for modelling harmonic and structural annotations (chords, segments) collected from symbolic and audio sources. We plan to follow up with a large scale integration experiment on a selection of MIR datasets, and the extension of our pattern to model additional types of music annotations.

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