

# MIREX 2016 AUDIO DOWNBEAT TRACKING SUBMISSIONS: KB1, KB2

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## ABSTRACT

In this submission we use the hybrid RNN-HMM model [13] to identify the downbeat positions within an audio signal. First, two feature streams are extracted: A spectral flux with 45 logarithmically spaced frequency bins, and the 12 bin CLP chroma feature [16]. These audio features are synchronized to the beat, which is extracted by a beat trackler [3, 15]. The beat-synchronized features are then fed into two parallel RNNs, which output a probability that indicates whether a beat is a downbeat or not. This output activation is then further post processed with an HMM that finally yields the most probable downbeat-beat sequence.

## 1. MODEL DESCRIPTION

The model structure is identical to the one published in [13]. Please see the paper for further details.

## 2. SUBMISSIONS

We submitted two versions of the model (KB1 and KB2). The two submissions use the same number of parameters, but differ in the data they were trained on. The used training sets for each submission are listed in Table 2. Note that we train the beat tracking RNN separately from the downbeat tracking RNN. As training the beat tracking RNN takes approximately one week, we trained it with only two configurations.

## 3. ACKNOWLEDGMENTS

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Submission	beat train set	downbeat train set	supported meters	min_tempo	max_tempo
KB1	beat1	db1	3/4, 4/4	55	215
KB2	beat2	db2	3/4, 4/4	55	215

**Table 1.** Overview of submitted systems and their parameters

Identifier	# files	meters	contents
beat1	1124	2/4, 3/4, 4/4, 6/8	Ballroom [8, 14], Hainsworth [9], SMC [11]
beat2	3472	2/4, 3/4, 4/4, 6/8	Ballroom [8, 14], Beatles [4], Hainsworth [9], RWC [7], Rock [5], Böck [1, 2], Turkish [17], SMC [11], Simac <sup>1</sup> , Klapuri [12], Hjdj [10], Cuidado [19], Carnatic [18]
db1	1371	3/4, 4/4	Ballroom [8, 14], Hainsworth [9], RWC pop [7], Robbie Williams [6], Rock [5], Böck [1, 2]
db2	1328	3/4, 4/4	Ballroom [8, 14], Beatles [4], RWC pop [7], Robbie Williams [6], Rock [5], Böck [1, 2]

**Table 2.** Training datasets

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