# MIREX 2011: AUDIO KEY DETECTION SYSTEM BASED ON PROBABILITY DENSITY FUNCTIONS

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## ABSTRACT

This extended abstract details a submission to the Music Information Retrieval Evaluation eXchange (MIREX) 2011 for the Audio Key Detection task. The algorithm named "cbmirex2011\_pdfs" is a novel method that performs the key and mode detection. The main innovation is the use of two set of probability density functions (PDFs), computed by the experimental data.

# 1. INTRODUCTION

The goal of this task is the recognition of the key from polyphonic music in audio format. There is a lot of research done in this area because the key of a music piece is a very important aspect to take into account in any analysis of tonal music: musical form analysis, structural segmentation, pitch detection, automatic transcription, chrod recognition, automatic harmonization, etc.

In recent years, many researchers have taken as a starting point the key profiles defined by Krumhansl *et al.* [6] and Temperley [7] to develop new tonal models and to optimize the key profiles. In [4], Izmirli compared the key estimation results obtained by analyzing spectral or chroma representation. He used three different chroma profiles, the ones by Krumhansl, the ones by Temperley and the flat diatonic profiles. Later, Izmirli presented in [5] two models for key detection, the first one was based on the template based correlation and the second one used a lowdimensional tonal representation.

Gómez [3] developed other similar method for key recognition based on a modified Pitch Class Profile (PCP) called *Harmonic Pitch Class Profile* (HPCP). The PCP was originally proposed by Fujishima [2]. In her method, Gómez studied machine learning methods for key estimation using HPCP. Due to the difficult task of key detection, other works were focused on audio tonality mode classification [1].

# The development can be divided into two stages. The first one is the process of calculation of the two sets of 12 probability density functions (PDFs) that will replace the common key profiles, and in the second stage a music piece is analyzed and the main key is detected. In figure 1, a general flowchart of the system is shown.

2. DESCRIPTION OF THE SYSTEM



**Figure 1**. Flowchart of the of the key detection method developed.

The first stage is carried out only once, to fit the two sets of PDFs to the experimental data extracted from the polyphonic music database (Section 2.1). The second stage performs the key detection employing the PDFs (Section 2.2). This second stage is the algorithm called "cbmirex2011pdfs" and submitted to the "Audio key detection" task.

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#### 2.1 Key characterization

The first requirement is to have a database music pieces labeled with the corresponding key. These music pieces are pre-processed before the PCP computation. The first 30 seconds of the audio signal are cutted, in order to avoid possible modulations, then the windowing process starts and the spectrum is calculated and analyzed obtaining the PCP vector.

The key mode (major or minor) of the musical piece is extracted from the key label and determines if the PCP is stored in the PCP matrix of the major or minor keys. When the whole database has been analyzed, the data in each pitch class (each row of the matrix) are statistically analyzed in order to fit a probability density function (PDF) according to the specific data.

This process is carried out twice, for the major and minor keys. The results are two sets of 12 PDFs, one to represent the contribution of the pitch classes to the major keys and the other one for the minor keys.

### 2.2 Key detection

This section describes the key detection model submitted to the "Audio key detection" task in MIREX 2011. The main steps are represented in the  $2^{nd}stage$  area of the Figure 1. The previous steps to calculate the PCP vector are the same as in the first stage (Section 2.1), windowing and preprocessing.

The target of this stage is the estimation of the main key of an input audio signal. For each temporal window, the PDFs previously calculated, are used to estimate the pseudolikelihood that the current PCP belongs to each of the 24 keys of the western tonal music. The most probable key of the temporal window is stored in a vector and its mode is selected as the predominant key of the music piece. Note that this vector is the tonal behavior of the music piece over the time, and can be employed as a relevant feature for modulations analysis.

#### 3. REFERENCES

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