# **MULTIPLE F0 ESTIMATION IN POLYPHONIC MUSIC (MIREX 2008)**

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#### ABSTRACT

This paper describes our method for the MIREX 2008 "Multiple Fundamental Frequency Estimation & Tracking" task in which the goal is to identify the active F0s in each time frame and to track notes and timbres continuously in a complex music signal. The introduced method is based on subharmonic summation pitch estimation met-hod and a spectrum cancelation algorithm. Our algorithm concentrates on the frame-level transcription, so the submission is only for "Task 1".

### **1 INTRODUCTION**

The MIREX (Music Information Retrieval Evaluation eXchange) framework provides a common platform to compare and evaluate a vast variety of MIR systems. And the MIREX 2008 "Multiple Fundamental Frequency Estimation & Tracking" task aims to evaluate state-of-the-art multiple F0 estimation and tracking algorithms.

Musical signals are natural candidates for the problem of multiple-F0 estimation since multiple instruments are played simultaneously often and chords are very familiar in polyphonic music. However, it is not easy to estimate the instruments' fundamental frequencies in the existence of other simultaneous sounds.

The proposed multi-F0 estimation system is based on a spectral cancelation mechanism with the subharmonic summation(SHS) pitch estimation method. For simplicity, we extract five F0 candidates for every frame, followed by a pitch verification algorithm. F0 candidates that are verified non-valid will be removed from the candidates pool.

#### 2 SYSTEM DESCRIPTION

#### 2.1 Pitch Estimation Method

Subharmonic-summation algorithm used here is generally based on Dik J.Hermes' pitch-determination algorithm [1], which can be basic concluded in the formula below:

$$H(f) = \sum_{n=1}^{N} h_n P(nf) \tag{1}$$

where, H(f) is the subharmonic-summation spectrum of the hypothetic pitch value f, P(\*) is the STFT power spectrum and  $h_n$  the compression factor (usually  $h_n = h^{n-1}$ ).

Here in our method, we introduce a spectral normalized factor in the form described below:

$$H(f_0) = \sum_{n=1}^{N} h^{n-1} Q_{f_0}(nf_0)$$
(2)

where,

$$Q_{f_0}(f) = P(f) / \left(\frac{1}{2\rho f_0} \int_{f-\rho f_0}^{f+\rho f_0} P(w) dw\right)$$
(3)

where,  $\rho$  is the spectral normalized width factor which can reduce octave errors effectively, compared to the original one in (1). This modified version shows good performance on a test set of about 300s speech data with pitch reference. For convenience, we note SHS shortly for the spectral normalized SHS in the following text.

#### 2.2 Cancelation Mechanism

We use a spectrum cancelation mechanism to remove the predominant harmonic structure and then iteratively estimate the fundamental frequencies of the residual sound. The algorithm can be concluded as procedures:

- 1. Calculate the SHS spectrum from the STFT spectrum.
- 2. Choose the  $F_0$  with the following constraints and then add it into the candidates pool:

$$F_0 = \operatorname*{argmax}_{f} SHS(f) \tag{4}$$

- 3. Terminate the circulation if enough F0 candidates have been extracted, or else go to step4.
- 4. Cancelation the STFT spectrum with: STFT(f) = w(f) \* STFT(f), for  $f = nF_0$  and n=1,2,3..., and then go to step 1.

 $nF_0$  in the step4 refers to the  $n^{th}$  harmonic frequency of the hypothetic fundamental frequency  $F_0$ , and w(f) is a weight function which is proportional to the distance between the

center frequency of the STFT bin and the cancelation frequency  $nF_0$ . In reality, for the spectral leak of STFT analyze, we not only change the value of  $STFT(nF_0)$ , but also that of the STFT(f) with the f near  $nF_0$ .

As referred above, we iteratively extract five F0 candidates for every frame, and add them into the candidates pool. Since the candidates simply stem from the *SHS spectrum* maxima, a F0 verification procedure is needed.

#### 2.3 Verification of F0 Candidates

We use a spectral-based method here for F0 verification. Generally speaking, for a specific F0 candidate, we check the existence of the spectral peak for all of its harmonics and then assign a saliency score for this F0 candidate, which can be concluded as follows:

$$S_{F_0} = \sum_n W_n,\tag{5}$$

$$W_n = \begin{cases} 0.9^{n-1}, & \text{peak exists around } nF_0 \\ 0, & \text{else} \end{cases}$$
(6)

Then candidates with saliency small than  $\theta_s$  is removed from the pool and the final output multi-pitch stream is formed with the surviving F0 values at every frame.

### **3 IMPLEMENTATION**

The algorithm is implemented in C++ and is for Windows platform. The execution time on a P4 3.2G CPU with 1GB RAM is about 4 times of the real-time without any particular optimizations.

## **4** ACKNOWLEDGEMENTS

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## References

 D. Hermes, "Measurement of pitch by subharmonic summation," *Journal of Acoustic of Society of America*, vol. 83, pp. 257–264, 1988.