# A LOW–DELAY ALGORITHM FOR INSTANTANEOUS PITCH ESTIMATION

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## Introduction

The paper presents an algorithm for instantaneous pitch estimation specifically designed for real-time applications.

The main features of the proposed algorithms are:

- high estimation accuracy and time resolution;
- low inherent delay;
- efficient processing scheme;
- good performance in noisy conditions;

The general idea:

- 1. the analysis scheme is based on the robust algorithm for instantaneous pitch tracking (IRAPT);
- 2. a non-linear phase analysis filter bank is applied to get a shorter inherent delay;

## **Pitch estimation schemes**



## **Analysis filter bank**

The signal s(m) is decomposed into overlapping bandlimited analytical signals linear-phase low-pass filter  $S_{F_{\Delta},F_{c}^{i}}(m)$ :  $S_{F_{\Delta},F_{c}^{i}}(m) = \sum_{n=-\infty}^{\infty} \frac{\sin(F_{\Delta}n)}{n\pi} w(n) e^{-jF_{c}^{i}n} s(m-n) = A_{F_{\Delta},F_{c}^{i}}(m) \cos\left(\varphi_{F_{\Delta},F_{c}^{i}}(m)\right),$ modulation function where  $2F_{\Lambda}$  - bandwidth and  $F_{c}^{i}$  - center frequency of the *i*-th band and

w(n) – an even window function. Then instantaneous parameters are evaluated as

$$\begin{array}{rcl} \text{instantaneous amplitude} & \longrightarrow & A_{F_{\Delta},F_{c}^{i}}(m) = \sqrt{R^{2}(m) + I^{2}(m)},\\\\ \text{instantaneous phase} & \longrightarrow & \varphi_{F_{\Delta},F_{c}^{i}}(m) = \arctan\left(\frac{-I(m)}{R(m)}\right),\\\\ \text{instantaneous frequency} & \longrightarrow & F_{F_{\Delta},F_{c}^{i}}(m) = \varphi_{F_{\Delta},F_{c}^{i}}^{'}(m),\\\\ \text{where } R(m) \text{ and } I(m) \text{ are real and imaginary parts of } S_{F_{\Delta},F_{c}^{i}}(m) \text{ respectively.} \end{array}$$

### Filter prototype 1 – minimal-phase design 4.

- 1) Calculate frequency response of the filter:  $H_{lv}(k, F_{\Delta}) = FFT(h_{lv}(n, F_{\Delta}));$
- 2) Calculate cepstrum  $C_{lp}(c, F_{\Delta}) = IFFT(\log |H_{lp}(k, F_{\Delta})|);$
- 3) Set zero for all  $c > \frac{N}{2}$  and multiply by 2 except the first:

$$\bar{C}_{lp}(c, F_{\Delta}) = \begin{cases} C_{lp}(c, F_{\Delta}), \ c = 1\\ 2C_{lp}(c, F_{\Delta}), \ 1 < c \le \frac{N}{2}\\ 0, \ c > \frac{N}{2} \end{cases}$$

- 4) Calculate minimum-phase freq. response  $\overline{H}_{lp}(k, F_{\Delta}) = e^{FFT(C_{lp}(c, F_{\Delta}))};$ 5) Calculate impulse response of minimum phase filter form its frequency
- response  $\overline{h}_{lp}(n, F_{\Delta}) = IFFT\left(\overline{H}_{lp}(k, F_{\Delta})\right).$



### 5. Filter prototype 2 – IIR approximation

1) Set  $\omega_c = 2.64\pi/M$ , where M = 360, L = 3

2) Using low-pass Chebychev filter of type 1 obtain first N samples of the impulse response

$$|H(j\omega)|^{2} = \frac{1}{1 + \varepsilon^{2}T_{L}^{2}(j\omega/\omega_{c})}$$

### where

- $T_L(x)$  the Chebyshev polynomial of order L,
- the cutoff frequency,  $\omega_{c}$
- passband ripple parameter. 8

N = 1080 produces a filter with no ripple in the stoppband



### **Comparing filter prototypes** 6.

IIR approximation has the shortest response time compared to all competitors.

Linear phase – a constant group delay 25ms Minimal phase – variable group delay from 16 to 19ms IIR approximation – variable group delay from 5 to 15 ms



## **Experimental results**

Artificial signals

The proposed technique is compared with other pitch estimation algorithms in terms of gross pitch error (GPE, %) and mean fine pitch error (MFPE, %).



<sup>4</sup> A. Camacho and J. G. Harris, "A sawtooth waveform inspired pitch estimator for speech and music", *Journal Acoust. Soc.* Am., vol. 123, no. 4, pp 1638-1652, Sep. 2008.

### Natural speech

	Female	
PE	GPE	MFPE
4	6.07	1.18
1	4.27	0.80
1	3.78	0.98
6	5.82	0.90
9	4.83	0.93