## AN ANALYSIS OF ITERATIVE ALGORITHM FOR ESTIMATION OF HARMONICS-TO-NOISE RATIO IN SPEECH

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#### Abstract

Acoustic analysis of speech is a noninvasive technique that has been proven to be an effective tool for the objective speech assessment. In pathological speech (for example hoarseness) a harmonic-to-noise ratio is one of the most frequently used parameter because it can reveal an additive noise in voiced parts of speech. Additive noise is a result of leak of a glottal closure during phonation which can be a consequence of vocal edema or vocal polyps for example. This paper deals with an analysis of an iterative algorithm for the estimation of the noise component in speech.

## 1 Introduction

Pathological speech signals are commonly corrupted with additive noise and the energy of additive noise can be used as a parameter for determination of the level of speech pathology [1, 2]. Generally, the speech signal can be described as

$$x(k) = s(k) + w(k), \tag{1}$$

where x(k) is a speech signal, s(k) is a periodic part of speech generated by vocal folds and w(k) is a noise part of speech generated by airflow from lungs. In normal (healthy) speech the component w(k) is low and almost negligible compared to s(k). In a pathological speech the energy of w(k) increases due to an imperfect glottal closure which can be caused by, for example, vocal fold edema, polyp etc.

Well known and often used parameter harmonics-to-noise ratio (HNR) is defined as a ratio between s(k) and w(k)

$$HNR = 20 \log \left(\frac{En_{s(k)}}{En_{w(k)}}\right) \quad [dB],$$
(2)

where  $En_{s(k)}$  is the energy of the periodic component of speech and  $En_{w(k)}$  is the energy of the noise component of speech.

There is no consensus on how to separate speech signal x(k) to periodic and noise component. There are several ways: analysis in the time domain [1], frequency domain [2, 3], using wavelets [4] or cepstral analysis [5].

This article deals with an analysis of iterative algorithm for a noise component estimation in frequency domain published by [3] and its implementation in MATLAB.

### 2 Data

For testing purposes two signals were used – the first is a record of a healthy male and the second is a record of a male with functional dysphonia. Both signals contain a sustained phonation of vowel /a/ for cca 0.4 s.



Figure 1: Example of test signals: (a) healthy, (b) functional dysphonia.

### 3 Iterative algorithm description

As mentioned above, this algorithm has been developed by YEGNANARAYANA et al. [3] and operates in the frequency domain. An input speech signal is segmented into microsegments the length of M samples and weighted by the Hamming window of the same length. The Npoint DFT (N > M) is applied to every microsegment and spectrum X(k) is obtained. In the amplitude spectrum |X(k)| two types of regions are found, see Fig. 2:

- $P_i$  harmonic part of spectrum; contains both the periodic and the noise components of the input speech signal; the width of these regions corresponds to the length of DFT (N) and the length of Hamming window used for weighting of the microsegment (M): 2N/M
- $D_i$  dip between harmonic parts; it is assumed that this part contains only the noise component of the input speech signal; to obtain non-empty dip region  $D_i$  with d points, the Hamming window length M should satisfy

$$M \ge \frac{4N}{f_0 NT - (d+1)},\tag{3}$$

where M is the Hamming window length, N is the DFT length,  $f_0$  is the fundamental frequency detected in the analysed microsegment, T is the sampling period  $(1/f_s)$  and d is the demanded number of points in dip region  $D_i$ .

Regions  $P_i$  and  $D_i$  can be identified as

$$P_i = \left\{ k | k_i - \frac{2N}{M} \le k \le k_i + \frac{2N}{M} \right\},\tag{4}$$

$$D_i = \left\{ k | k_{i-1} + \frac{2N}{M} \le k \le k_i - \frac{2N}{M} \right\},\tag{5}$$

where k is spectral line order and  $k_i$  is a position of and *i*-th harmonic region  $P_i$ .

After locating the regions  $P_i$  and  $D_i$  the iterative algorithm computes IDFT from spectrum with zeros at harmonic regions  $P_i$  and actual values at noise regions  $D_i$ . Then the N-point DFT is computed again, harmonic regions  $P_i$  are zeroed and so on, see Fig 3. After a few iterations (8 to 10 iterations according to [3]) the noise component is reconstructed with sufficient precision. To get the harmonic component in the time domain the reconstructed noise component has to be subtracted from original signal in the time domain.



Figure 2: Description of harmonic part  $P_i$  and noise part  $D_i$  of the spectrum of a windowed voice speech segment.



Figure 3: Block scheme of the iterative algorithm for noise component estimation.

## 4 Iterative algorithm analysis

An analysis of the algorithm focuses on the two main areas:

- $f_0$  detection and determination of harmonic and noise component in the frequency domain,
- the choice of M, N, d.

#### 4.1 Harmonic and noise regions detection

The first step in the detection of the harmonic and the noise regions  $P_i$  and  $D_i$  is a  $f_0$  detection  $-f_0$  is supposed to be the main harmonic component in the speech signal. For this purpose, an amplitude spectrum is used and the first dominant peak is assumed to be the fundamental frequency  $f_0$ . The position k of  $f_0$  is then used to determine  $P_i$  and  $D_i$  according to (4) and (5), see Fig. 4. Positions of the first harmonic regions in every microsegment are shown in Fig. 4.1.

### 4.2 Choice of M, N, d

Practically, the window length M is fixed for the whole signal and cannot be changed at runtime,  $f_0$  can be different in every microsegment, the only requirement on the parameter d is the nonzero size. The only parameter that can be changed during the calculation is the DFT length by zero-padding the input microsegment. Equation (3) has to be transformed to the following form

$$N \ge \frac{M(d+1)}{Mf_0 T - 4}.$$
 (6)



Figure 4: Determination of harmonic regions  $P_i$  in amplitude spectrum for 4(a) healthy voice and 4(b) voice with functional dysphonia.



Figure 5: Position of the first harmonic regions  $P_i$  in records with 4(a) healthy voice and 4(b) voice with functional dysphonia.

Equation (6) is not defined for

$$f_0 = \frac{4}{M_{\rm samples}T} = \frac{4000}{M_{\rm ms}} \tag{7}$$

which restricts the choice of the microsegment length. Fig. 6 shows the dependence of a critical  $f_0$  on the microsegment length according to (7).



Figure 6: Dependence of critical  $f_0$  on the microsegment length.

Fig. 7 shows dependence of DFT length N on detected  $f_0$  while d = 20, M=100 ms and  $f_s \in \{8, 16, 22.05, 44.1\}$  kHz. For  $f_0 > 50$  Hz the required N is in acceptable range for all  $f_s$ .

Fig. 8 shows a block scheme of a modified algorithm which respects a different DFT length N for different  $f_0$ . First,  $f_0$  with default N is estimated and if noise regions  $D_i$  in spectrum are empty due to the  $f_0$  being too low, the smallest suitable N is computed and used for iterative noise component estimation. This modification lets the algorithm use smaller N as default and in case of high pitched voices or in case of pathological voices with unexpected voice breaks the required DFT length is adapted.



Figure 7: Dependence of DFT length on  $f_0$ .



Figure 8: Block scheme of the modified iterative algorithm for noise component estimation.

## 5 Results

Examples of noise components estimated in the test signals are shown in Fig. 9; input algorithm parameters are the following:  $f_s=8$  kHz, M=80 ms (640 samples), d=20, default N=8192 samples.

Is is obvious that noise component energy of a healthy voice shown in Fig. 9(a) is smaller relative to overall energy than for a pathological voice depicted on Fig. 9(b). Also HNR is higher for the healthy voice, which is expected. A summary of results for both test records is shown in Tab 1.

Table 1: ESTIMATED HARMONICS-TO-NOISE RATIO IN TEST RECORDS.

	HNR [dB]		
healthy	22.84	±	4.29
functional dysphonia	2.88	$\pm$	5.05



Figure 9: Examples of estimated noise components for (a) healthy and (b) functional dysphonia in one microsegment.



Figure 10: Estimated HNR in test records.

# 6 Conclusion

An implementation of modified iterative estimation of noise component in voiced parts of speech was introduced. The modification reflects various settings of DFT length for various fundamental frequency. Two records of sustained vowel /a/ were used for testing purposes. The first record contains a healthy voice and the second record contains a voice with functional dysphonia. In accordance with the assumption the noise component in the healthy voice is smaller than in the pathological one.

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