PSYCHOACOUSTICALLY MOTIVATED AND BIOINSPIRED METHODS OF DIGITAL SIGNAL PROCESSING

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DSPA Conference

Introduction (a bit of history)

Thanks to the organizers for the invitation.

Викискпал

Элемент Викиданных

My scientific advisor: Petrovsky Alexander (1953-2019)



1989 г. защитил докторскую диссертацию на тему «Построение микропроцессорных систем обработки виброакустических процессов в реальном времени» (защита проходила в Институте проблем моделирования в энергетике им. Г. Е. Пухова, г. Киев) В 1990 г. избран завелующим кафелрой электронных вычислительных средств БГУИР которой руководил до 2017 года^[5]

Место рожден Дата см

ждения	1 января 1953
	д. Снов, БССР
ИЯ	
ерти	14 марта 2019 (66 лет)

Aim of this talk

To give an idea of the existing **bioinspired** and **psychoacoustically motivated** methods of audio signal analysis, and to show the areas of its application.



Two groups of methods

1) *Bioinspired methods* – aimed to modeling the work of the parts of the auditory system. Methods are based on parametric expressions fitted to the physiological data.

Examples of the **physiological data**:

- characteristics of the excitation of the auditory nerve;
- measured displacement of the basilar membrane;

2) Psychoacoustically motivated methods are based on patterns obtained in the study of auditory perceptions of sounds.

Examples of psychoacoustic patterns:

- critical bands;
- *pitch* and *loudness* of sound.

Auditory filters

The basilar membrane contains ~ 3000 internal hair cells. Each cell is responsible for a specific frequency range.



The mechanical movement of the cochlea basilar membrane is modeled using a **bank of digital filters**. These filters are called *cochlear* or *auditory* filters.

Bioinspired auditory filters: roex-filters

*Roex-filters*¹ (round exponential) are describes the auditory filters in the frequency domain using round exponential functions:

$$|H(f)|^2 = (1-r)(1+pg)e^{-pg} + r, \qquad g = |f - f_c|/2$$

where g – normalized deviation of frequency f from central frequency f_c .



¹ The deterioration of hearing with age: Frequency selectivity, the critical ratio, the audiogram, and speech threshold / R. D. Patterson, et al. // The Journal of the Acoustical Society of America. – 1982. – vol. 72, №. 6. – P. 1788–1803.



Bioinspired auditory filters: gammatone-filters

Gammatone filters² – description of the auditory filter in time domain:

$$h(t) = t^{(l-1)}e^{-2\pi b \text{ERB}(f_c)} \cos 2\pi f_c t, \qquad t > 0.$$

where b – bandwidth parameter, l – the order.



² An efficient auditory filterbank based on the gammatonefunction / R. D. Patterson, et al. // Proceeding of the IOC Speech Group on Auditory Modelling at RSRE. – 1987. – vol. 2, №. 7. – P. 1-34.



Bioinspired auditory filters: gammachirp filters

Gammachirp filters³ – refined description of the auditory filter in the time domain:

 $h(t) = t^{(l-1)}e^{-2\pi b \text{ERB}(f_r)} \cos(2\pi f_r t + c \ln t + \phi),$

where f_r – pick frequency, c – additional parameter.



³ Irino, T. A time-domain, level-dependent auditory filter: The gammachirp / T. Irino, R. D. Patterson // The Journal of the Acoustical Society of America. – 1997. – vol. 101, №. 1. – P. 412-419.



t > 0.

=	250~Hz
=	500~Hz
=	$1000\;Hz$
=	2000~Hz

Practical implementation of auditory filters

The *discrete-time impulse responses* of the auditory filters are designed by sampling and windowing the continuous-time infinite-length impulse responses



Main problem: impulse responses are very long.

Example ($f_s = 8000 \text{ Hz}$): \checkmark for f_c =500 Hz impulse response about 240 samples. \checkmark for f_c =80 Hz impulse response about 600 samples.

Digital time-domain model of the human cochlear (1)

J. Kates proposed⁴ to model the propagation of a traveling wave on the cochlear partition using a cascade of second-order IIR digital filters.



 $H_{hp,k}(z)$ – one-pole highpass filter that models the pressure-to-velocity transformation; $F_k(z)$ – is a notch filter by which the total response shows two resonance frequencies, which coincides with biological observations; $H_k(z)$ – is a single section of the traveling wave filter, which provides a gain for frequencies near the resonance frequency of the filter.



⁴ Kates, J. M. A time-domain digital cochlear model // IEEE Transactions on Signal Processing. – 1991. – vol. 39, №. 12. – P. 2573–2592.

Digital time-domain model of the human cochlear (2)

Transfer function of auditory filters of Kate's model:





Psychoacoustically motivated analysis

Drawbacks of **bioinspired methods**:

- Iarge computational burden;
- \checkmark as a rule, resynthesize procedure is not defined;
- \checkmark do not based on fast and effective DSP transforms;

Psychoacoustically motivated method:

- \checkmark are based on the results of psychoacoustic experiments;
- \checkmark are simulate frequency (sometimes temporal) resolution of hearing;
- are based on well-known and effective DSP transforms.

Critical bands

Critical bands define the frequency ranges within which the interaction of sound energies is observed.

The *critical band* is a frequency range ("bark") with a width of 20% of the center frequency. The auditory range is covered by 24 barks.

$$z(f) = 13 \operatorname{arctg}\left(\frac{7,6}{10^4 f}\right) + 3,5 \operatorname{arctg}\left(\left(\frac{f}{7500}\right)^2\right) [\text{Bark}]$$





DFT with subband merging



defined in computational

resolution Of

Auditory filters based on wavelets





computational

 $f_c = \overline{250 \ Hz}$ $f_c = 750 \ Hz$ $f_c = 1500 \ Hz$ $f_c = 3000 \ Hz$ 3000 4000

Filter bank based on allpass transform

Allpass transform allows to obtain *nonuniform* filter bank from *uniform* filter bank⁵.

$$z^{-1} \rightarrow A(z) = \frac{z^{-1} - \alpha}{1 - \alpha z^{-1}}, \quad A(e^{j\omega}) = e^{j\theta(\omega)}.$$

$$x(n) \rightarrow z^{-1} \rightarrow z^{$$

⁵ Vary, P. Digital filter banks with unequal resolution // Short Communication Digest of European Signal Processing Conference (EUSIPCO), 1980. – pp. 41–42.

Filter bank based on allpass transform

Application of allpass transform to discrete-time system leads to frequency warp- $\theta^{-1}: \Omega \to \omega$. ing:



Filter bank based on allpass transform



Comparison of time-frequency localization

We compared 3 different approaches to auditory filters modeling

- ✓ Gammatone filters
- ✓ Wavelet filters
- ✓ Allpass based DFT filter bank

Heisenberg rectangular⁶



Time localization

$$\sigma_t^{(k)} = \int_0^\infty (t - \tau_k)^2 |h_k(t)|^2$$

Frequency localization

$$\sigma_{\omega}^{(k)} = \frac{1}{2\pi} \int_{-\pi}^{\pi} (\omega - \omega_k)$$

⁶ Вашкевич, М.И. Сравнение частотно-временных преобразований: Фурье-анализ, вейвлеты и банки фильтров на основе фазового преобразования / М.И. Вашкевич, И. С. Азаров // Цифровая обработка сигналов – 2020. – №2. – С. 13–26.

$|^{2}dt$

$_{k})^{2}\left|H_{k}\left(e^{j\omega}\right)\right|^{2}d\omega$

Comparison: gammatone filters

Auditory filters correspondent to first 12 critical bands.





Comparison: wavelet filters



Comparison: allpass based DFT filter bank

Auditory filters correspondent to first 12 critical bands.



Comparison of time-frequency localization



Voice pathology detection

Application of psychoacoustically motivated analysis:

Voice pathology detection based on critical band modulation spectra analysis⁷.



7 Вашкевич М. И., Азаров И. С. Определение патологии голосового аппарата на основе анализа модуляционного спектра речи в критических полосах / М. И. Вашкевич, И. С. Азаров // Труды СПИИРАН. – 2020. – Т. 19. – №. 2. – С. 249–276.

Modulation spectra: example



Two analysis scheams (feature extraction)



Classification results

Voice base: 30 recordings of patients with larynx pathology + 30 healthy controls.



Conclusion: parameters extracted using filter bank based on allpass transform is more effective.

Conclusion

1) Bioinspired methods of analysis:

- roex-filters;
- gammatone filters;
- gammachirp filters;
- Kates model.

2) Psychoacoustically motivated analysis:

- DFT with subband merging;
- Filter bank based on wavelets;
- Filter bank based on allpass transform;

3) Application: voice pathology detection based on psychoacoustically motivated analysis.

Thank you for attention!



