

# The GlottHMM Speech Synthesis Entry for Blizzard Challenge 2010

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## Outline

- I. Introduction
- II. GlottHMM speech synthesis system
- III. Modeling of prosody
- IV. Speech in noise
- V. Results
- VI. Conclusions

## I. Introduction

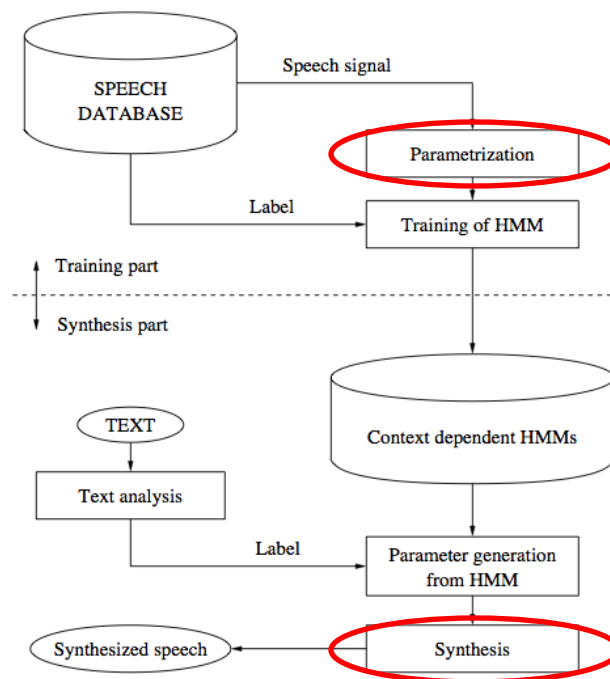
- Finnish speech synthesis has been studied in the University of Helsinki with a special emphasis on speech prosody
- Research on speech processing and acoustics has a long history in Aalto University (formerly known as Helsinki University of Technology, TKK)
- GlottHMM speech synthesis project begun in 2007 as a collaboration between TKK and University of Helsinki
- The aim was to develop a flexible high-quality HMM-based speech synthesis system

## I. Introduction

- This is our first entry for Blizzard Challenge motivated by
  - Extensive comparison with other systems
  - Building non-Finnish voices
  - Using our prototype English front-end
  - Testing our prominence based prosody model

## II. GlottHMM speech synthesis system

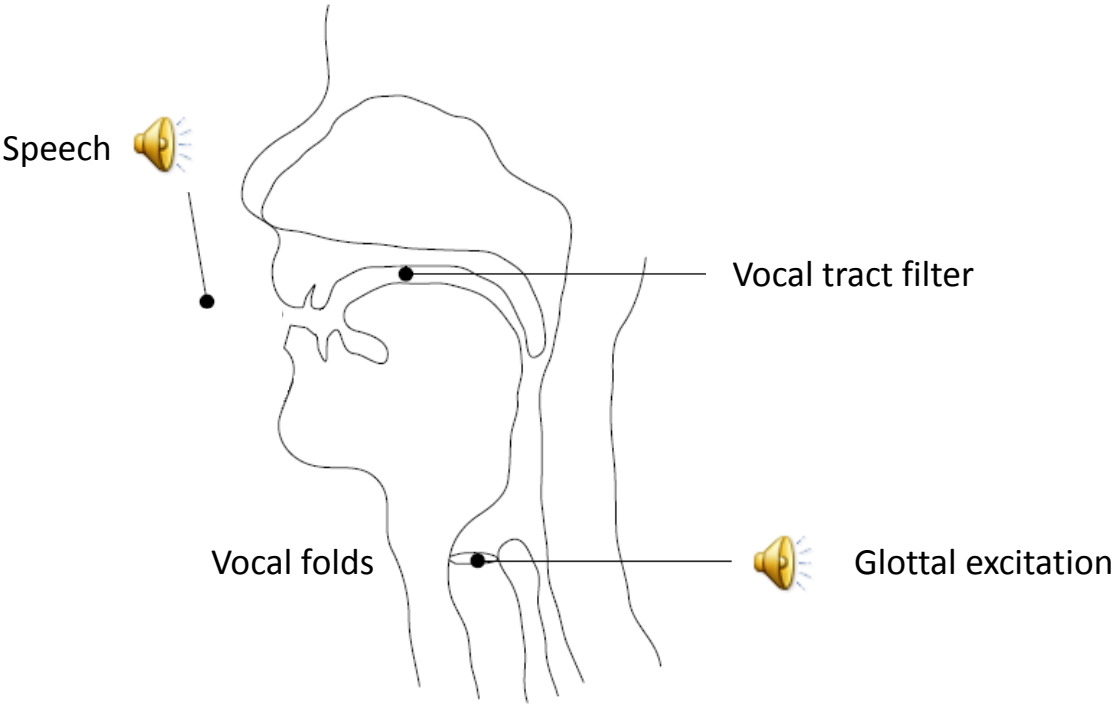
- GlottHMM is an HMM based speech synthesis system that uses a novel vocoding approach (Raitio *et al.*, 2010, in press)



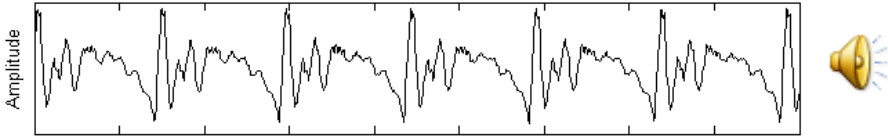
## II. GlottHMM speech synthesis system

- In speech **analysis**, speech signal is decomposed into the glottal excitation and the model of the vocal tract filter by using **glottal inverse filtering** (IAIF, Alku 1992)

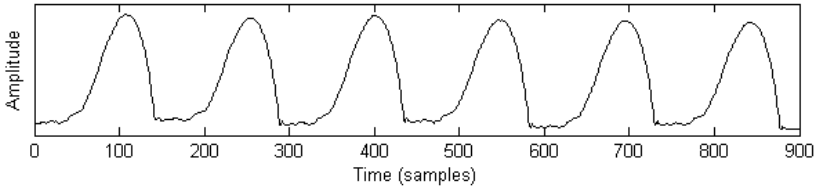
Glottal inverse filtering estimates the glottal flow and the vocal tract filter from a speech signal



Speech signal

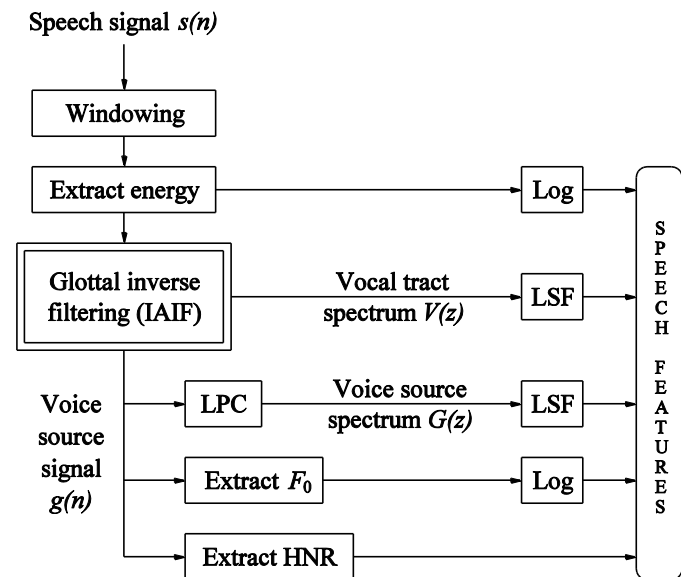


Estimated glottal flow signal



## II. GlottHMM speech synthesis system

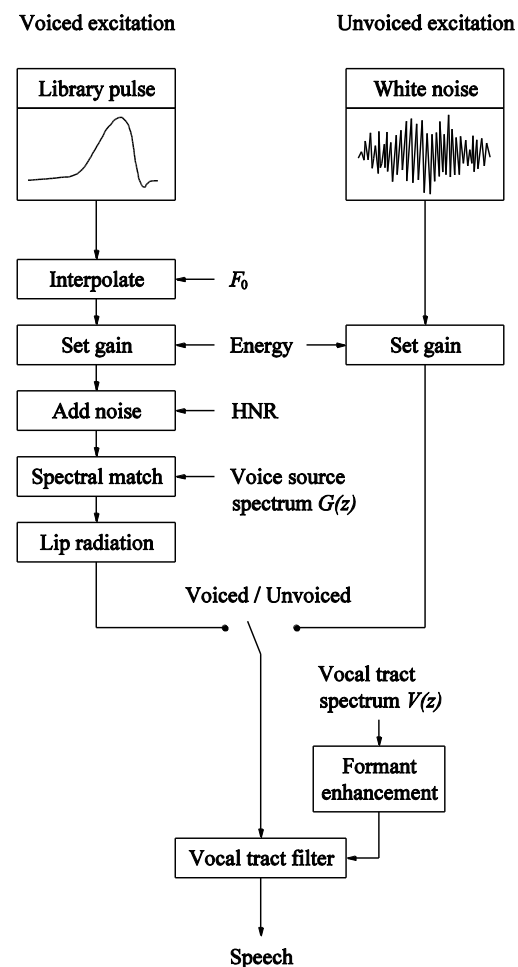
- Vocal tract is parameterized with line spectral frequencies (LSFs)
- Glottal flow signal is parameterized with
  - $F_0$
  - Harmonic-to-noise ratio (HNR)
  - Source spectrum (LSF)
  - Gain





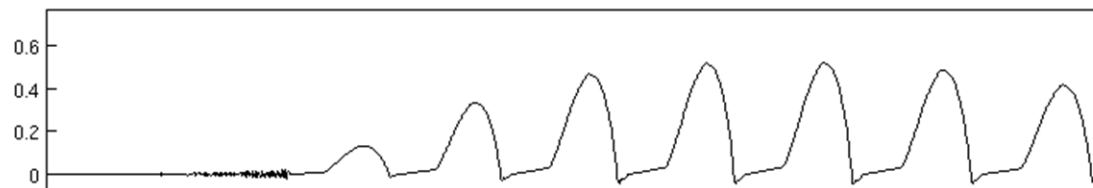
## II. GlottHMM speech synthesis system

- In **synthesis** stage, excitation signal is generated by interpolating in time ( **$F_0$** ) and scaling in magnitude (**Gain**) a natural **glottal flow pulse**
- Pulses are modified to match the **source spectrum** and **harmonic-to-noise ratio** by filtering and adding noise, respectively
- White noise is used as a unvoiced sound source

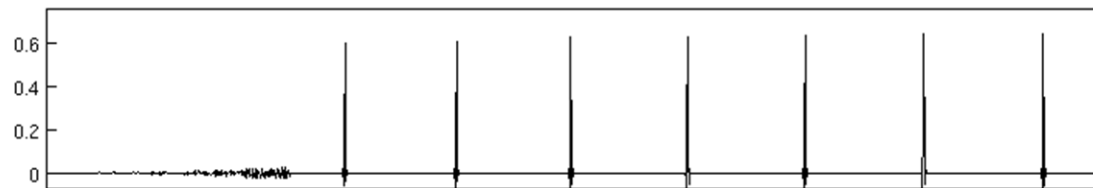


## II. GlottHMM speech synthesis system

- The detailed model of the excitation should potentially allow for better control and production of prosody, speaker characteristics and speaking style

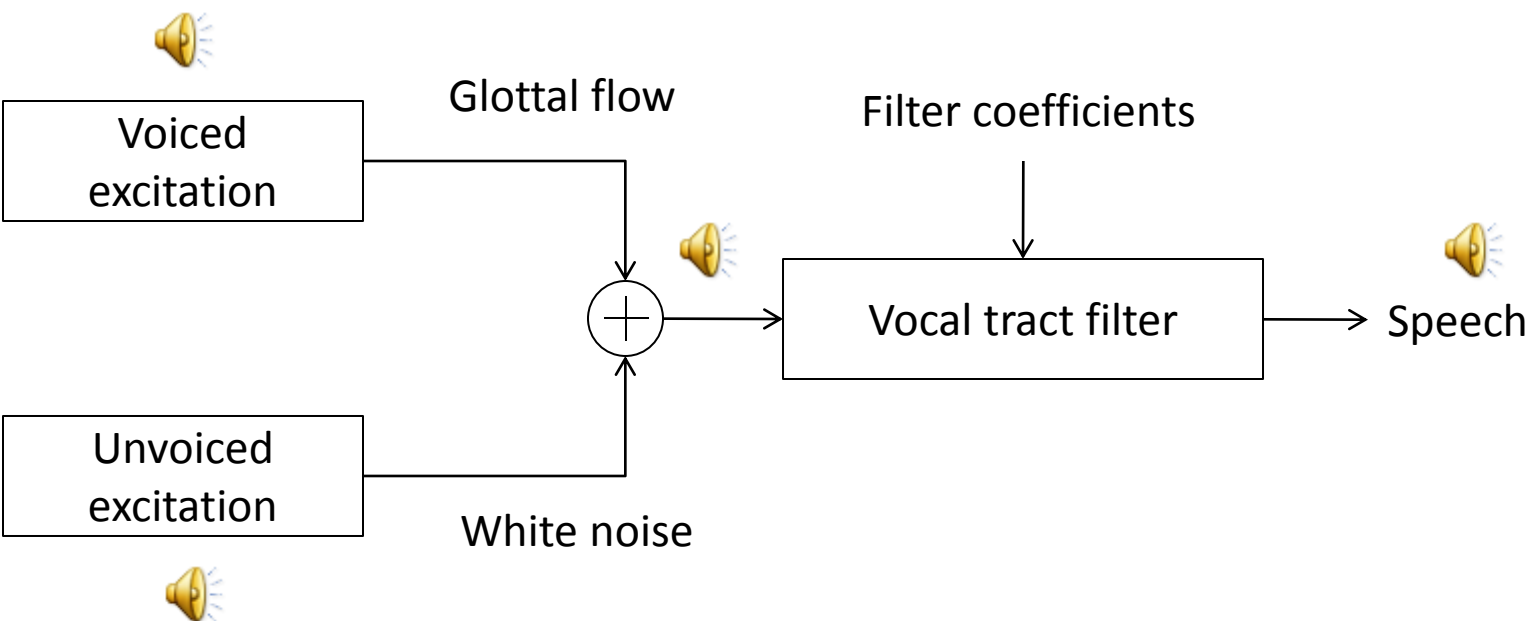


Glottal inverse filtering based excitation



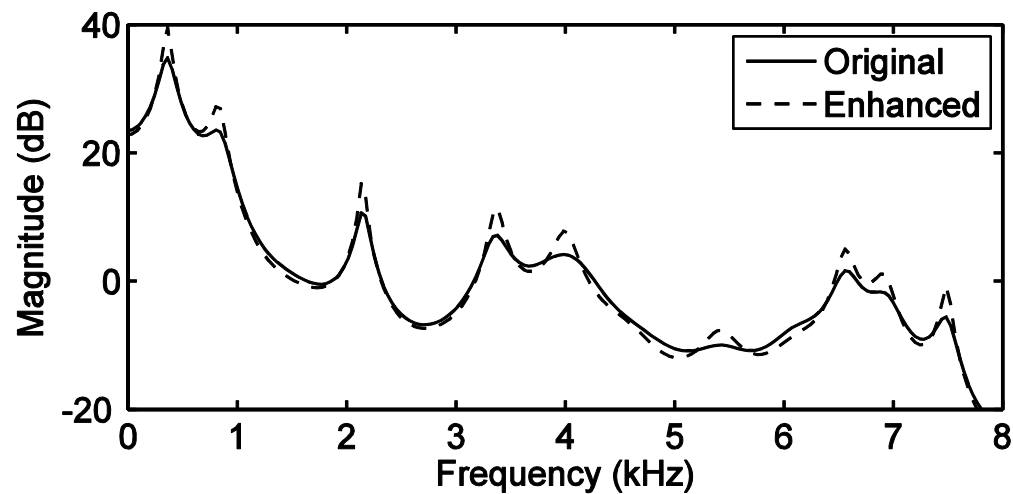
Conventional impulse excitation

## II. GlottHMM speech synthesis system



## II. GlottHMM speech synthesis system

- Other special solutions:
  - Enhancement of vocal tract information with a new method (Raitio *et al.*, SSW7)



### III. On Modeling of prosody

- Due to statistical averaging effect, accurate prosodic labels are crucial for expressive parametric synthesis
- In order to model sentence-level prosody, we used **perceptual prominence** (on 0-3 scale)
  - automatic annotation using acoustic features:  
F0, energy, harmonics, HNR, duration
  - prominence prediction with CART using shallow features + syntactic phrases

### III. On Modeling of Prosody, Example

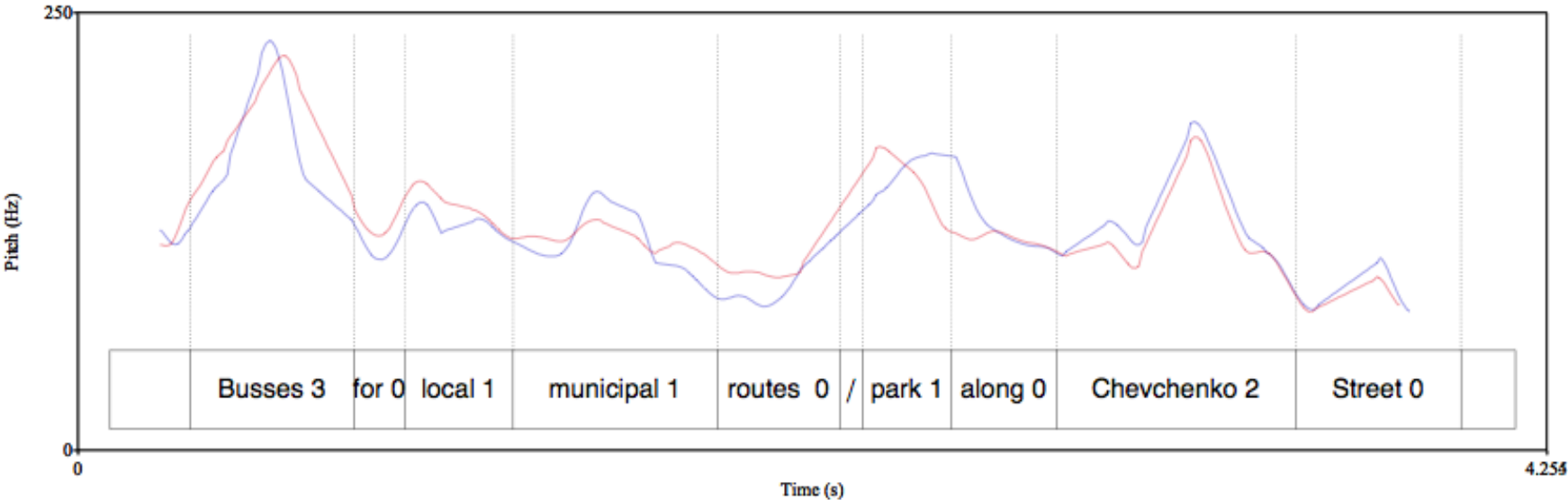
Synthesizer can reproduce the intended prominences fairly well, allowing controlled production of emphasis, nuclear and pre-nuclear accents



original (blue)



synthesis with hand-labelled prominences (red)









## IV. Speech in noise

- Special voices (ES2 and MS2) were built by utilizing several aspects observed in the **Lombard effect**. Modifications were made on several levels of synthesis:
  - **Phonological**: Prominence of stressed syllables of content words was increased and intra-utterance silences were removed
  - **Parameter generation**: Rate of speech was lowered, pitch was raised and pitch range compressed
  - **Vocoder**: More post-filtering was used to produce clearer formant information

## IV. Speech in noise

- **Vocoder:** Vocal tract length was shortened slightly to match the raised pitch and raised formant frequencies
- **Vocoder:** The spectral tilt of the glottal source signal was decreased, concentrating more energy in formant frequencies
- **Finally,** the resulting signal waveform was companded in order to make the loudness of the speech as high and uniform as possible

| EH1   | ES2   |
|---|---|
|              |    |
|              |    |
| (*EH2)<br> |  |



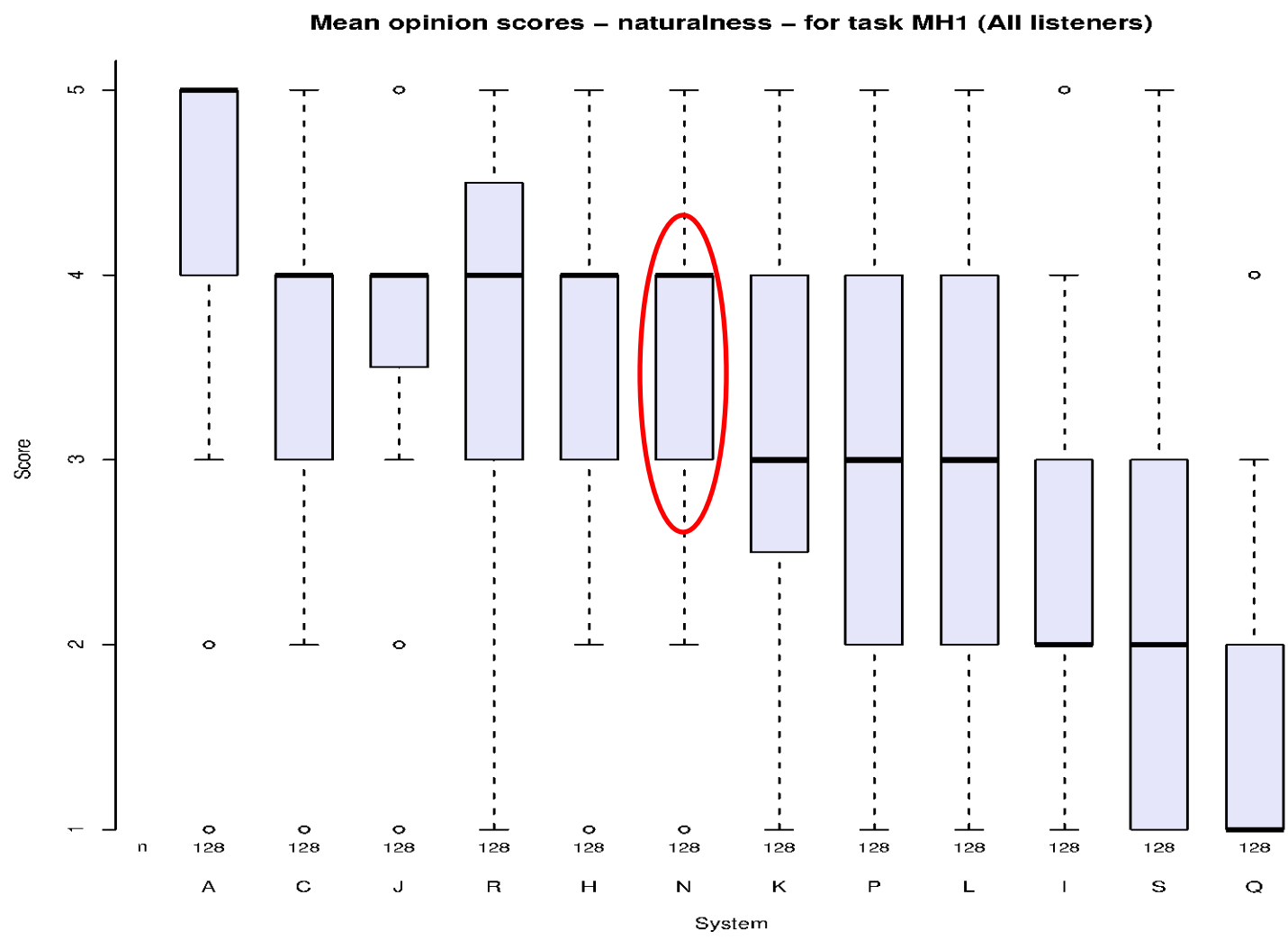
## V. Results

- English
  - MOS scores were consistently higher than STRAIGHT-based HTS baseline systems, but we could not compete with the best voices
  - Only average intelligibility and low similarity scores
  - Problems: artefacts and unstable F0 contour, voicing problems in stop consonants, low similarity due to the use of single glottal pulse
  - Prominence modeling was not advantageous with short sentences

## V. Results

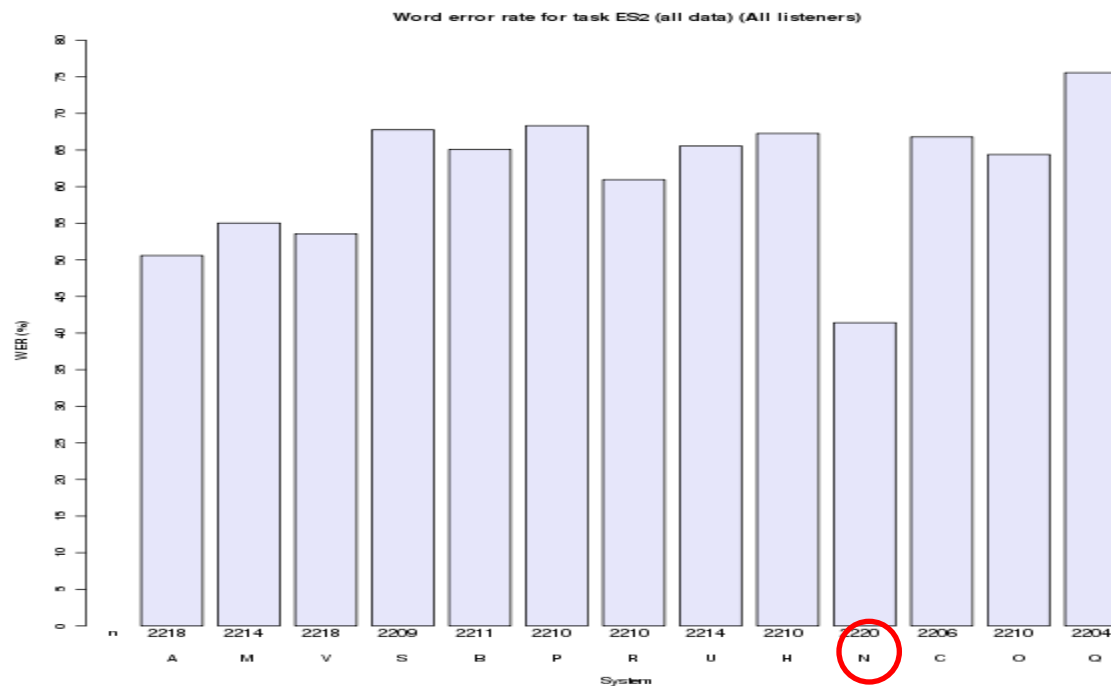
- Mandarin:
  - Our system ranked among the best on MOS on task MH1
  - Again, similarity scores were not good
  - On intelligibility test, only the original speaker ranked significantly higher than our system





## V. Results

- Speech in noise:
  - Our voices had the lowest word error rates by a clear margin, even compared to natural speech



## VI. Conclusions

- Separation of glottal source and vocal tract filter characteristics enabled large modifications in speech in noise task
- On other tasks, MOS scores were generally good
- Similarity scores low; current source modeling with single glottal pulse insufficient → ongoing work with speaker specific multiple pulse techniques



Thank you! Questions?

## References:

- Raitio, T., Suni, A., Yamagishi, J., Pulakka, H., Nurminen, J., Vainio, M. and Alku, P., “HMM-based speech synthesis utilizing glottal inverse filtering”, IEEE Trans. Audio, Speech, and Language Processing, (in press).
- Alku, P., “Glottal wave analysis with pitch synchronous iterative adaptive inverse filtering”, Speech Commun., 11(2–3):109–118, Jun. 1992