

¹ Holland Bloorview Kids Rehabilitation Hospital; ² Institute of Biomaterials and Biomedical Engineering, University of Toronto;

³ Sunnybrook Health Sciences Centre; ⁴ Rehabilitation Sciences Institute, University of Toronto; ⁵ Department of Speech Language Pathology, University of Toronto

Introduction

- Real-time digital tracking of children's formants is difficult to achieve accurately [1].
- Audapter is a commonly-used research software application for real-time tracking and manipulation of adults' [2, 3] and children's [4, 5] formants.
- Audapter's accuracy has not previously been validated, but is important to establish.

Objectives

- To assess the accuracy and margin of error with which Audapter tracks formants in natural and synthesized samples of children's speech.
- To determine the speech signal parameters correlated with tracking accuracy.

Methods

Process:

- Speech samples were processed in Audapter.
- Formants were extracted and compared to reference values to determine accuracy.

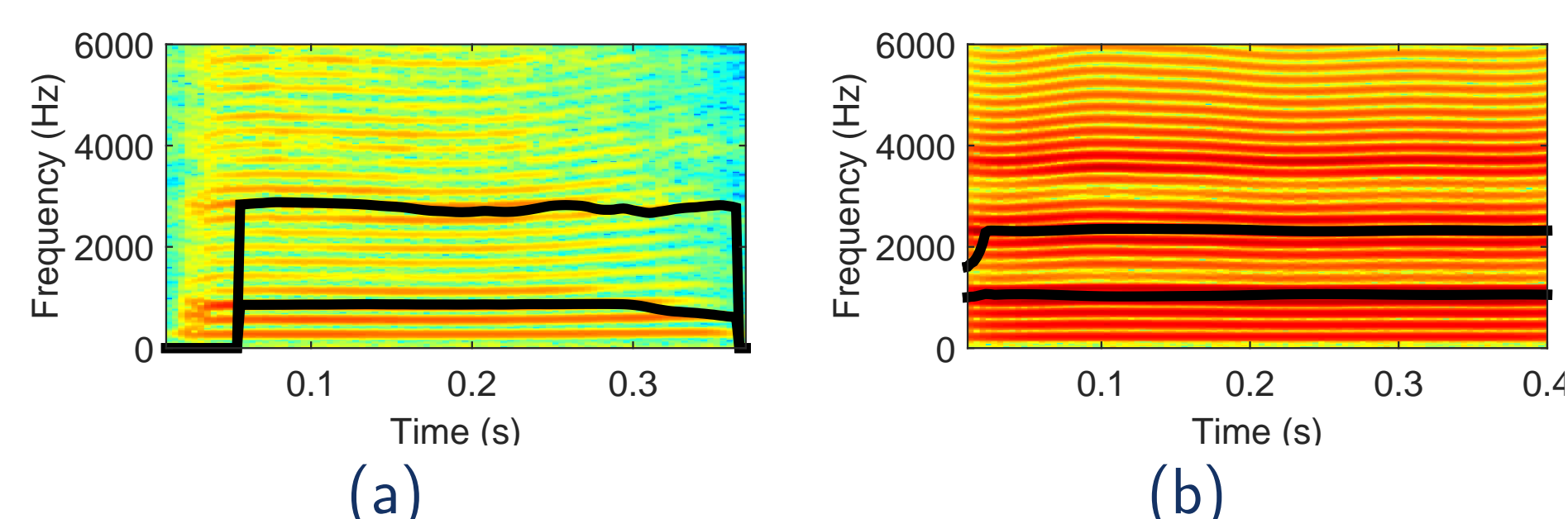


Figure 1: Spectra for (a) natural and (b) synthesized samples with Audapter-detected formants overlaid.

Natural speech samples:

- Obtained from North Texas Vowel Database [6].
- /hɛd/, /hæd/, and /hɪd/ spoken by 3-year-old, 5-year-old, and 7-year-old children.
- Reference values: Database formant values.

Synthesized speech samples:

- Generated with Children's Vowel Synthesizer [7].
- /ɑ/, /æ/, /ʌ/, /ɛ/, /e/, /ɪ/, /i/, /o/, /u/, /u/ for a preschool and school-aged child.
- Reference values: Ground truth formant values.

Analyses:

Table 1: Analyses performed to assess software performance.

Analysis	Nat.	Syn.
Detection rate and magnitude of error	✓	✓
Correlation between detected and reference formants	✓	✓
Correlation between error and signal features (F ₀ , duration, and F ₂ :F ₁ ratio)	✓	

Results: Natural samples

- Formants were continuously tracked in 77% of samples, but discontinuously tracked in 6%. Audapter was unable to detect the presence of formants in 17% of samples (Table 2).

Table 2: Detection of the presence of formants in natural speech samples using Audapter

Sample	Continuous	Discontinuous	Undetected	Total
/hɛd/	N = 65	N = 3	N = 12	N = 80
/hæd/	N = 66	N = 10	N = 16	N = 92
/hɪd/	N = 50	N = 2	N = 12	N = 64
All	N = 181	N = 15	N = 40	N = 236

- There is no apparent relationship between Audapter's ability to detect the presence of formants and F₀, sample duration, or F₂:F₁ ratio (Figure 2).

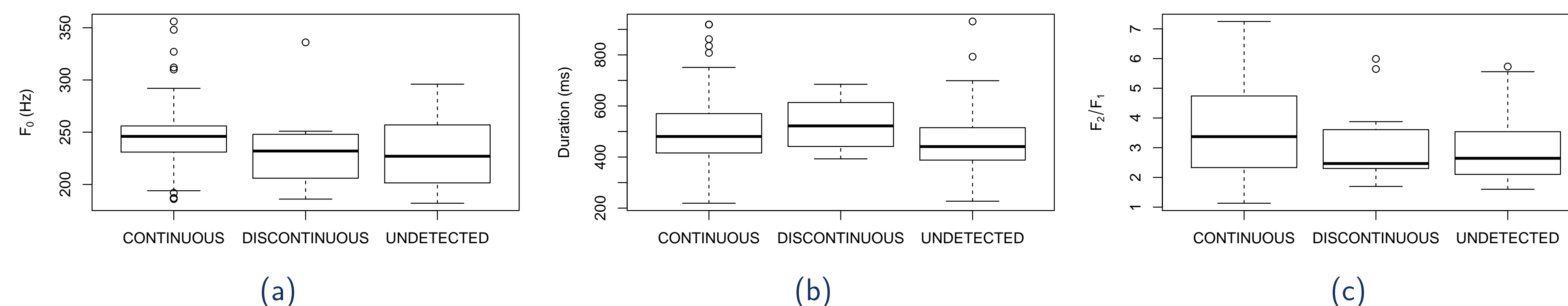


Figure 2: Box plots show the range of (a) F₀, (b) sample duration, (c) F₂:F₁ ratio for continuously-tracked, discontinuously-tracked, and undetected formants.

- Audapter formant measurements were highly correlated with database reference values for F₁ ($r = 0.98, p < 0.01$) and F₂ ($r = 0.96, p < 0.01$). RMS error was 58.03 Hz for F₁ and 183.00 Hz for F₂.
- Only weak correlations were found between F₁ detection error and duration, and F₁ detection error and F₂:F₁ ratio (Table 3).

Table 3: Correlations between Audapter absolute error and database reference values for sample acoustic characteristics. Highlight denotes $p < 0.05$.

	F ₀	Duration	F ₂ :F ₁ ratio
F ₁ error	$r = -0.02$	$r = 0.15$	$r = -0.21$
F ₂ error	$r = -0.03$	$r = 0.04$	$r = 0.08$

Results: Synthetic samples

- Absolute error in Audapter's detection of F₁ and F₂ varied between synthesized vowels (Table 4, Figure 3).
- Formants in the vowel /ɪ/ were not detected, while open-front vowel formants were better tracked.

Table 4: Absolute error in detection of synthesized vowel formants.

	/ɑ/	/æ/	/ʌ/	/ɛ/	/e/	/ɪ/	/i/	/o/	/u/	/u/
Preschooler F ₁ error	5	66	73	28	9	69	N/A	48	120	182
Preschooler F ₂ error	210	56	51	85	103	2	N/A	12	12	92
School-aged F ₁ error	28	6	10	11	1	2	N/A	65	39	68
School-aged F ₂ error	35	41	97	91	89	19	N/A	57	46	14

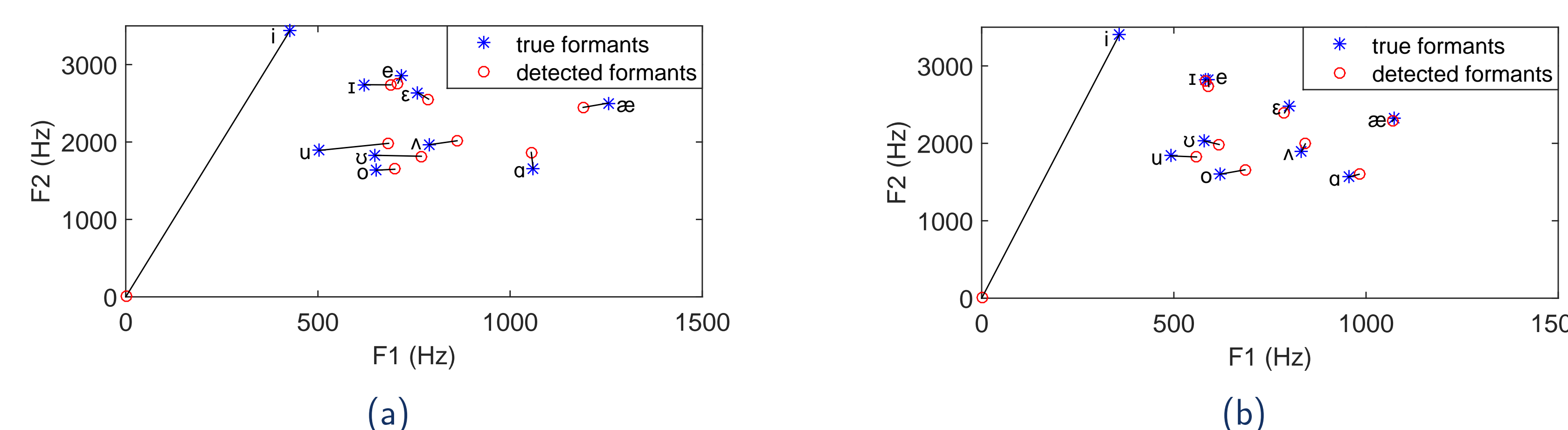


Figure 3: True and detected formant values for (a) preschool and (b) school-aged children's synthesized vowels.

Conclusions

- Some vowels may be more accurately processed (e.g. /æ/) than others (e.g. /ɪ/). This may be a concern when precise tracking is necessary for experimental manipulation of vowel sounds.
- Error margins of 100 Hz for F₁ and 200 Hz for F₂ may be reasonable for most auditory perturbation protocols that shift /hɛd/ to /hæd/.
- Audapter was initialized to search for the exact reference formant values in each sample. For a child whose formants are unknown, error may be higher.
- The relationship between signal features and accuracy is unclear. Other software parameters or unexplored signal features may better explain performance.

Next steps

- Further assessment is needed with additional synthetic samples, as well as natural samples of other vowels.
- The effects of other software parameters and signal features on detection will be explored.
- Audapter's performance should be compared to the performance of offline solutions.

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Acknowledgements

- Dr. Joyce Chen
- Dr. Andrea Bandini
- Keelia Quinn de Launay
- This work is supported by NSERC Discovery Grant RGPIN-2015-05803 and the Ward Family Foundation.