

## What is similarity? Approaches to the quantification to voice similarity

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Phonetic imitation or convergence is often defined as talkers or tokens becoming more “similar-sounding” as a result of auditory exposure [e.g., 2]. This presumes an understanding of what makes utterances more or less similar, in addition to having a method of quantifying that (dis)similarity. Listener judgments as the means of assessing phonetic imitation are the gold standard [11], as listeners are able to make global judgments that consider the multidimensional voice signal in a way that targeted acoustic measures (e.g.,  $f_0$ ; [3]) and global acoustic measures (e.g., [1]) may not. One aspect of what makes similarity a complex issue is that talkers and tokens can exhibit *linguistic similarity* or *voice similarity*. With respect to linguistic similarity, this can be informed and operationalized by phonological theory the established acoustic-phonetic cues [10; 8]. Voice similarity is a more challenging concept to coherently wrangle, but we approach it with the psycho-acoustic model of voice [6], and understand the voice as a rich signal that delivers biological, physiological, psychological, social, and linguistic meaning [12]. Crucially, voices have structure that can be queried and compared [9; 5].

The goal of our paper is to better understand similarity by comparing similarity metrics across acoustic analysis, perceptual judgments by human listeners, and automatic speaker verification systems. We focus on spontaneous speech from the English portion of the Speech in Cantonese and English (SpiCE) corpus [4]. In our comparison of vocal similarity, we compare (i) similarity scores generated from 24 acoustic dimensions [7]; (ii) speaker verification scores generated by seven pretrained speaker verification models using Wespeaker [13]; (iii) perceptual similarity from human listeners in an AX discrimination task, and (iv) perceptual (dis)similarity from an independent group of human listeners in a rating task.

The output of our Bayesian regression models suggests that when controlling for the specific talkers being compared, the speaker verification models correlate with the psychoacoustic similarity scores, but not with either listener-based measure. When the pairs of voices being compared are not controlled, there is a relationship between listeners and speaker verification models. We take this to suggest that assessments of similarity manifest differently when the focus is on the gross-versus fine-phonetic levels. We discuss these results in the context of quantifying similarity for measuring phonetic imitation and understanding it as a linguistic process.

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