Exploring the Articulatory Perspective of Mel-Frequency Cepstral Coefficients: Unravelling the Link between MFCCs and Vocal Tract Features

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'work in progress' poster

In recent years, Mel-frequency cepstral coefficients (MFCCs; Davis and Mermelstein, 1980) have been widely used as the input features of semi-automatic (Nolan & Grigoras, 2005) forensic voice comparison (FVC) systems, and some studies have shown that MFCC features yield better speaker discriminatory performance (e.g., lower EER and/or $C_{\rm llr}$) than traditional acoustic phonetic features (e.g., vowel formants).

MFCCs capture the spectral characteristics of speech signal, and spectral characteristics are a function of vocal tract (Fant, 1971), e.g., oral cavity. It is claimed that MFCCs capture shape and features of the human vocal tract; however, no studies have attempted to investigate how MFCCs and vocal tract features, if there are any, are related. A recent study (Hughes et al., 2023) has partially discussed the correlation between MFCCs and formant values; however, the interpretability of MFCCs has rarely been properly discussed or investigated as well as the question of *why* MFCCs, despite a higher dimensionality, outperform traditional acoustic phonetic features.

In the current work-in-progress paper, we aim to investigate MFCCs from an articulatory perspective. We extracted the first 12 MFCCs and articulatory kinematics from three vowels (i.e., FLEECE, TRAP, FOOT) in single words. The data, obtained from Ji et al. (2014), contained the raw recordings of single words produced by 20 Midwestern standard American English speakers (10 male and 10 female) as well as the articulatory kinematics. The articulatory kinematics data was measured using electromagnetic articulography (EMA containing the movement of tongue dorsum (TD), tongue lateral (TL), tongue blade (TB), upper lip (UL), lower lip (LL), lateral lip corner (LC) measured in three dimensions (Figure 1, i.e., x: front and back, y: height, z: left and right). We will perform principal component analysis (PCA) on the first 12 MFCCs as well as 12 articulatory kinematics data (i.e., 6 sensors * x-axis * y-axis) aiming to explore to what extent the MFFCs and articulatory kinematics contribute to the first three components.

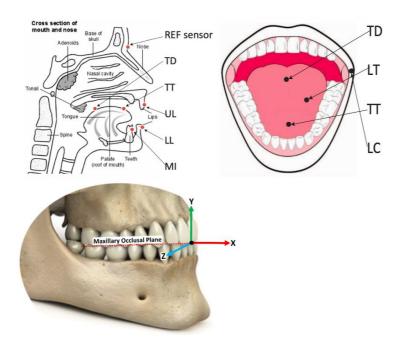


Figure 1. Leftmost and central panel: sensor placement (Figure 1 from Ji et al. 2014). Rightmost panel: Target anatomically-referenced coordinate system, Positive increases in sensor values denote forward, upward, and rightward movement along x, y, z, respectively (Figure 2 from Berry et al., 2016 EMA-MAE corpus User's Handbook).

References

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