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Production-perception relationship of Mandarin tones as revealed by critical perceptual cues

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Abstract: The relationship of lexical tone production and perception has not been well studied. Using Mandarin tone, this research tests the hypothesis that a production-perception link is revealed by critical perceptual cues. The critical status of perceptual tonal cues was determined by perceptual cue weights, showing fundamental frequency (F_0) contour as being more critical than height. Then, tone production features were examined for critical F_0 contour (slope, curvature, turning-point location) and non-critical F_0 height (mean, onset) cues. A production-perception correlation was found for F_0 contour but not height cues, suggesting that critical perceptual cues dictate the relationship between production and perception.

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1. Introduction

Speech perception theories predict a link between speech production and perception (e.g., Diehl *et al.*, 2004; Galantucci *et al.*, 2006), and have been tested by segmentally-based studies which have revealed a production-perception correlation (e.g., Beddor, 2015; Fox, 1982; Newman, 2003). However, it is not yet clear whether certain cues are more pertinent than other cues in establishing production-perception links. The current study examines the extent to which a production-perception correlation can be established based on the critical status of perceptual cues using Mandarin tones.

One proposal states that production-perception relationships exist in critical perceptual cues based on the finding that, among the three fricative acoustic cues (peak frequency, frication centroid, and skewness), only peak frequency can reveal a production-perception correlation (Newman, 2003). The relative importance of peak frequency was inferred from the goodness rating results, supported by acoustic modeling (Jongman *et al.*, 2000). However, the critical status of these cues was not determined independently. In another study, Shultz *et al.* (2012) correlated the cue weights given to the production and perception of voice onset time (VOT), the primary cue of English stop perception, and onset F_0 , the secondary cue. Although the two cues did not reveal a statistically significant production-perception correlation, VOT displayed a trend of positive correlation, whereas onset F_0 did not. The difference was attributed to the non-critical status of onset F_0 . These findings are informative for additional research on the influence of perceptual cues' critical status on production-perception relationship.

Based on the aforementioned findings, the current study examines whether the Mandarin tone production-perception relationship is driven by critical perceptual cues. As reviewed earlier, the issue of a production-perception relationship as a function of the critical status of perceptual cues has not been thoroughly studied or consistently concluded (Newman, 2003; Shultz *et al.*, 2012). Studying the production-perception relationship of lexical tones has an advantage, because the critical status of tone perception cues has been well established by the fact that native Mandarin listeners consistently weight F_0 contour cues more strongly (i.e., reflecting a more critical status) than F_0 height cues (Francis *et al.*, 2008; Gandour, 1983; Guion and Pederson, 2007; Massaro *et al.*, 1985). Moreover, systematic variations in F_0 contour (relative to height) cues can better modulate Mandarin tone perception (Chang *et al.*, 2016; Moore and Jongman, 1997; Shen *et al.*, 1993), indicating the critical nature of the F_0 contour cues. However, the critical nature of the F_0 contour and height cues may change in different Mandarin tone contexts. For instance, Mandarin listeners weight F_0 contour more strongly than F_0 height only in resynthesized tones with low-to-mid F_0 height levels (Massaro *et al.*, 1985). Taken together, following Newman

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(2003), the F_0 contour should show a stronger production-perception relationship than the F_0 height. Little previous research has attempted to relate lexical tone production and perception in terms of the relative critical status of individual cues. Thus, the uniqueness of this study is to test this proposal using critical and non-critical cues.

As a lexical tone language, Mandarin has four tone categories differing in F_0 height and contour. The four tones are high-level (T1), high-rising (T2), low-dipping (T3), and high-falling (T4). The perceptually critical F_0 contour cue is usually represented by the overall F_0 slope of the tone contour (Jongman *et al.*, 2017). The F_0 curvature, as modeled by a quadratic function, can also capture Mandarin tone contour shapes acoustically (Shih and Lu, 2015; Tupper *et al.*, 2018). Moreover, the temporal location of the F_0 turning point (TP) and the F_0 decrease from onset to TP (ΔF_0), which influence tone contour shape, have been shown to be critical in T2 and T3 perception (Moore and Jongman, 1997). In addition, varying TP alone has been shown to influence T2 and T3 perception (Shen *et al.*, 1993). A tone with a TP also has a greater F_0 curvature value than a tone with a linear contour (Shih and Lu, 2015). These two cues are thus considered critical F_0 contour cues. On the other hand, cues characterizing F_0 height, the secondary (non-critical) cues, usually refer to F_0 mean (Jongman *et al.*, 2017), and F_0 onset (Massaro *et al.*, 1985).

The current study uses T2 as the target tone, since it has a low-to-mid F_0 height level and F_0 contour should have a more critical status than F_0 height in this context (Massaro *et al.*, 1985). Moreover, its contrast with T1 involves a change of F_0 contour in terms of direction (i.e., rising versus level), and a change of F_0 height in terms of the overall F_0 mean and F_0 onset (Chang *et al.*, 2016). In addition, the T2-T3 contrast involves a change in critical F_0 contour cues (F_0 curvature and TP), as well as non-critical F_0 height cues (F_0 onset) (Moore and Jongman, 1997). Therefore, this study can examine the production-perception correlation using critical (contour) and non-critical (height) cues separately.

In this study, F_0 slope, F_0 curvature, TP, F_0 mean, and F_0 onset were obtained from production and perception data. To examine a tone production-perception relationship as a function of the critical status of perceptual cues, this study performs a production-perception correlation for each cue, and expects to find a strong, positive correlation for critical F_0 contour cues (F_0 slope and F_0 curvature, and TP as a related temporal cue). In contrast, the non-critical F_0 height cues (F_0 mean and F_0 onset) should reveal a weaker correlation.

2. Method

2.1 Participants

Twenty-five native Mandarin female speakers who were undergraduate students at Simon Fraser University served as participants in this study (mean age: 22.2).

2.2 Production task

Participants produced four commonly used Mandarin monosyllabic words containing the syllable *zhu* with four tones, meaning “pig” in T1, “bamboo” in T2, “lord” in T3, and “pillar” in T4. The task was self-paced and conducted in a sound-attenuated booth. Each tone word was repeated 6 times. A total of 600 productions were recorded (4 tone words \times 6 repetitions \times 25 participants).

All T2 productions were analyzed acoustically in Praat (Boersma and Weenink, 2018). Two phonetically-trained native Mandarin listeners evaluated the accuracy of the stimulus tones. Five out of 150 T2 productions were error productions and were removed. F_0 values were then obtained at the 101 equidistant time points along a tone contour to provide data for the subsequent polynomial fits following Shih and Lu (2015) and Tupper *et al.* (2018). Equation (1) was used for F_0 normalization (Wang *et al.*, 2003),

$$T = \frac{\log x - \log L}{\log H - \log L} \times 5, \quad (1)$$

where x was F_0 value in Hz at any given point, L and H were the minimum and maximum F_0 , respectively, of all four tones produced by the speaker.

Equations (2) and (3) were used to estimate F_0 slope and F_0 curvature, the critical cues (cf. Tupper *et al.*, 2018),

$$F(t) = mt + k, \quad (2)$$

$$F(t) = at^2 + bt + c, \quad (3)$$

where t represented the time elapsed from the tone onset. The linear coefficient of Eq. (2) (m) and the quadratic coefficient of Eq. (3) (a) represented F_0 slope and F_0 curvature, respectively.

Another critical cue, TP, was obtained at the temporal location relative to the total duration.

For non-critical cues, F_0 mean was obtained by averaging the F_0 values obtained from all measurement points in Praat. F_0 onset in normalized frequency T was obtained at the starting time point of the tone contour.

2.3 Perception task

One female native Mandarin talker who did not participate in the other tasks of this study produced *zhu* with four tones which were judged as correct productions of the intended tones by two phonetically-trained native Mandarin-speaking research assistants. Based on these natural productions, the tone contours of the perception stimuli were resynthesized by separately manipulating TP and F_0 onset, creating a perceptual space that situated the T2-like stimuli between two end points that simulate a T1 and T3.

All the resynthesized tone contours were set at duration of 410 ms, the mean duration of the speaker's T1, T2, and T3 productions. The F_0 onset series (high to low bound) was created based on the talker's T1 (295 Hz) and T3 (159 Hz) (Left panel of Fig. 1). Intermediate steps were created at a step size of 8 Hz (Jongman *et al.*, 2017). As a result, the F_0 onset range encompassed the F_0 onset from T1 to T2, and to T3.

TP endpoints were based on the earliest and latest TP location of the talker's T2 and T3 productions (i.e., 0% and 60% of the total tone duration). Each F_0 onset had a TP series, except for the high bound F_0 onset endpoint (a level tone), with the interval of 10% of the total duration (Right panel of Fig. 1). The change in TP consequently alters tone contour shape and is thus expected to critically influence perception (Moore and Jongman, 1997; Shen *et al.*, 1993). ΔF_0 , another cue that can modulate T2-T3 perception (Moore and Jongman, 1997), was not varied since it would lead to a change in the relative position of F_0 onset—the other cue varied in this study.

As a result, an 18-step (F_0 onset) \times 7-step (TP) grid of stimuli was formed, so that each tone item had a distinctive set of critical F_0 slope, F_0 curvature, and TP values, as well as non-critical F_0 mean and F_0 onset values.

The procedures of the perception task followed the Method of Adjustment task (Johnson *et al.*, 1993), which required participants to select their preferred exemplars of T2. When the task began, a stimulus grid consisting of 126 boxes (18 F_0 onsets \times 7 TPs) and a rating scale was displayed on a computer screen. When the participant clicked a box, one of the 126 *zhu* stimuli was played over the headphones. Participants were instructed to first listen to each of the corner stimuli (i.e., the boundary tones) and rate each stimulus on a scale of 1 (poor exemplar of T2) to 5 (good exemplar of T2). Then, they had to find the box in the grid that best represented a T2 for them and rate their choice on the same rating scale. The rating data were used to examine whether a participant's preferred exemplar of T2 fell inside the stimulus grid (i.e., the preferred exemplar should be rated higher than the boundary tones). To ensure participants determined the location of the preferred T2 exemplar auditorily (not visually), the orientations of the two axes or position of the axes were switched for each repetition, forming 8 orientation combinations (2 F_0 onset orientations \times 2 TP orientations \times 2 axis positions). This task was repeated 16 times (8 orientation combinations \times 2 repetitions) for each participant.

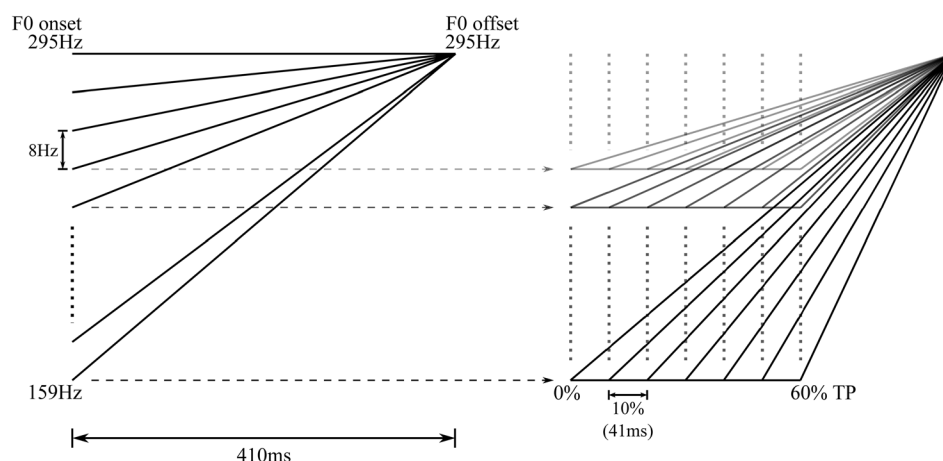


Fig. 1. Schematic representations of perceptual stimulus series of F_0 onset (left panel) and TP (right panel).

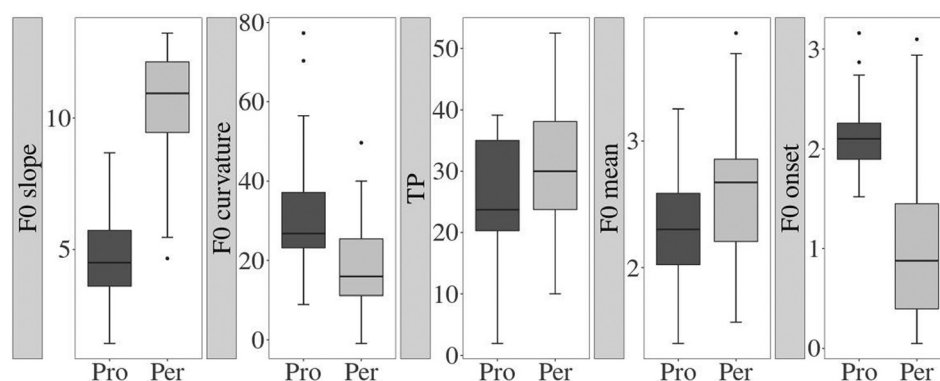


Fig. 2. Boxplots showing the distribution of the $F0$ slope (in T/s), $F0$ curvature (in T/s^2), TP (in % of total tone duration), $F0$ mean (in T) and $F0$ onset (in T) of T2 productions (Pro; in dark gray) and the preferred T2 exemplars perceived by all participants (Per; in light gray).

3. Results

Participants' T2 productions and perceived preferred T2 exemplars had a mean $F0$ slope of 4.82 T/s and 10.52 T/s , representing a rising contour; a mean $F0$ curvature of 31.88 T/s^2 and 18.92 T/s^2 , indicating an upward opening parabolic shape; a mean TP of 25% and 30%; a mean $F0$ mean of 2.32 T and 2.56 T ; and a mean $F0$ onset of 2.14 T and 1.02 T , respectively. All production and perception data are presented in Fig. 2, which show that the participants produced and perceived T2 with comparable ranges of acoustic data for all cues. In addition, the polynomial fits showed that $F0$ curvature yielded a higher R^2 value than $F0$ slope in both production ($F0$ curvature: 96% vs $F0$ slope: 67%) and perception ($F0$ curvature: 97% vs $F0$ slope: 90%).

To examine the correlations among the five cues, Spearman's rank-order correlations were carried out for production and perception data separately. For production, TP was significantly correlated with $F0$ slope [$\rho(23) = -0.529$; $p = 0.007$], $F0$ curvature [$\rho(23) = 0.702$; $p < 0.001$], and $F0$ mean [$\rho(23) = -0.398$; $p = 0.049$], respectively. For perception, $F0$ slope and $F0$ curvature were significantly correlated [$\rho(23) = 0.436$; $p = 0.030$]. TP was significantly correlated with $F0$ curvature [$\rho(23) = 0.935$; $p < 0.001$] and $F0$ mean [$\rho(23) = -0.561$; $p = 0.004$].

In addition, paired sample t tests showed that the preferred T2 exemplars [Mean = 4.8, standard deviation (SD) = 0.52] were rated significantly higher than the four corner stimuli (Mean < 3.05, SD < 0.98) [$t(24) > 8.79$, $p < 0.001$], indicating that the participants' preferred T2 stimuli fell inside the stimulus grid.

The above data show that the participants produced and perceived T2 with comparable ranges of acoustic data for all cues, indicating that a parity between their production and perception was maintained, which paves the way for correlation analysis below. In addition, the correlation analysis among the five acoustic cues showed that only certain cues were highly correlated with each other (e.g., TP and $F0$ curvature), suggesting that it was possible to compare the coefficients of the production-perception correlations for the cues that were not highly correlated (e.g., $F0$ slope and $F0$ curvature).

To further quantify the relationship between production and perception, a Spearman's rank-order correlation was conducted to relate production data to perception data for each acoustic cue. Based on the assumption that the production-perception correlation would be positive, one-tailed correlation analysis was conducted.

A significant positive correlation was found for curvature [$\rho(23) = 0.402$; $p = 0.024$], slope [$\rho(23) = 0.378$; $p = 0.032$] and TP [$\rho(23) = 0.391$; $p = 0.027$] (Fig. 3). No significant result was found for $F0$ onset [$\rho(23) = 0.080$; $p = 0.352$] and $F0$ mean [$\rho(23) = -0.022$; $p = 0.543$]. These results suggest that even though all cues displayed comparable ranges of acoustic values from both production and perception results, only critical $F0$ contour cues (i.e., curvature, slope, and TP) displayed a significant production-perception correlation.

4. Discussion and conclusion

This study examines whether a production-perception relationship is revealed through perceptually critical acoustic features (Newman, 2003), by comparing the Mandarin tone production-perception correlations established by $F0$ contour (critical) and $F0$ height (non-critical) cues (Gandour, 1983). The results of the current study revealed a significant positive production-perception correlation for $F0$ curvature, $F0$ slope, and TP, but not for $F0$ mean or $F0$ onset. This study defines the more strongly weighted $F0$ contour cues as perceptually more critical than the

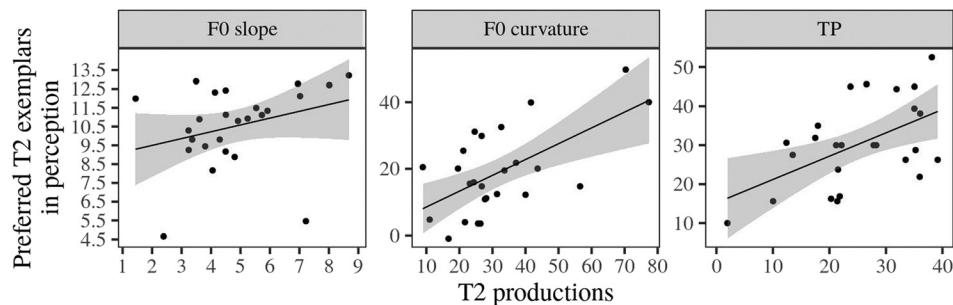


Fig. 3. Scatterplots of the mean $F0$ slope (in T/s), $F0$ curvature in (T/s^2), and TP (in %) of all participants' T2 production and perceived preferred T2.

less strongly weighted $F0$ height cues (Francis *et al.*, 2008; Gandour, 1983; Massaro *et al.*, 1985). Therefore, more critical perceptual cues contribute to a stronger a production-perception link compared to less critical perceptual cues, supporting the hypothesis of this study (Newman, 2003).

The current results further show that the strength of the production-perception relationship may differ among the critical cues. Among the two possible acoustic correlates of the $F0$ contour, the polynomial fits yielded a higher R^2 value for $F0$ curvature than for $F0$ slope, and it was the case for both participants' T2 productions and their preferred T2 exemplars in perception. Therefore, $F0$ curvature explains the variance of T2 contours better than $F0$ slope, presumably because $F0$ curvature captures greater details of the T2 contour shape than $F0$ slope (Shih and Lu, 2015; Tupper *et al.*, 2018). Future perception studies should also consider $F0$ curvature to be a representative cue for $F0$ contour of Mandarin tones. More importantly, the $F0$ curvature yielded a stronger production-perception correlation than the $F0$ slope ($\rho = 0.402$ versus 0.378). In addition, our production data did not show a significant correlation between $F0$ curvature and $F0$ slope. Therefore, this finding further extends the previous hypothesis, in that the strength of production-perception relationship may depend on the level of critical status of cues.

Likewise, the temporal feature TP was another critical cue that showed significant correlation strength. The critical status of TP can be attributed to its close relationship with other $F0$ contour cues. Note that TP showed significant correlation with $F0$ contour cues in both production and perception, and is also linked to the magnitude of $F0$ curvature in tone modeling (Shih and Lu, 2015). As a result, the current study shows that critical perceptual cues are adopted from both temporal and spectral domains in establishing production-perception links.

This study also supports our hypothesis that perceptually relevant but non-critical cues exhibit a weak production-perception relationship, as demonstrated by the results for non-critical $F0$ height cues: $F0$ mean and $F0$ onset. Their non-critical status is supported by perceptual weighting studies, but $F0$ mean has been shown to be the second perceptual dimension of a Mandarin tone perceptual space next to the $F0$ contour (Gandour, 1983). Additionally, the $F0$ onset also contributes to the perception of T1 and T2 in addition to the primary $F0$ contour cues (Chang *et al.*, 2016; Massaro *et al.*, 1985). These findings thus suggest that production-perception links are not likely established through non-primary, non-critical cues, even though these cues may contribute to perception to some degree (Jongman *et al.*, 2000; Newman, 2003; Shultz *et al.*, 2012).

Finally, this study focused on the production-perception relationship of one target tone, T2. However, the critical status of $F0$ contour cues versus height cues may change in different Mandarin tone contexts (Massaro *et al.*, 1985), which may then lead to different production-perception relationship patterns for different Mandarin tones. Such patterns may further demonstrate how the effects of the critical status of perceptual cues on the production-perception relationship can be aligned with the intrinsic characteristics of individual speech sounds.

Taken together, this study showed that critical tone perceptual $F0$ contour cues yielded a positive production-perception correlation, whereas non-critical $F0$ height cues did not, supporting our hypothesis and the previous segmentally-based predictions (Newman, 2003). In addition, the critical status of tonal cues applies in both spectral and temporal domains. These findings extend our understanding of the cues that are pertinent to production-perception links, thus informing the relationship of speech production and perception in general.

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