

# Positional variability of articulatory gestures: Effects of practice and linguistic proficiency

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## research question

does variability decrease in relation to a word's short term practice and increased lexical probability? → tested with articulography

## background

	hand movements	articulation
	[6, 5, 20, 8, 13, 15, 11, 12, 3, 16, 10, 14]	[26, 1, 4, 21, 18, 17, 19, 9, 7, 24, 25, 2]
reduction of effort	repetition	frequency (?)
faster gestural execution	repetition	repetition, frequency
smoother gestural transitions	repetition, lower spatial uncertainty	repetition, frequency
smaller gestural variability	repetition, lower spatial uncertainty	age

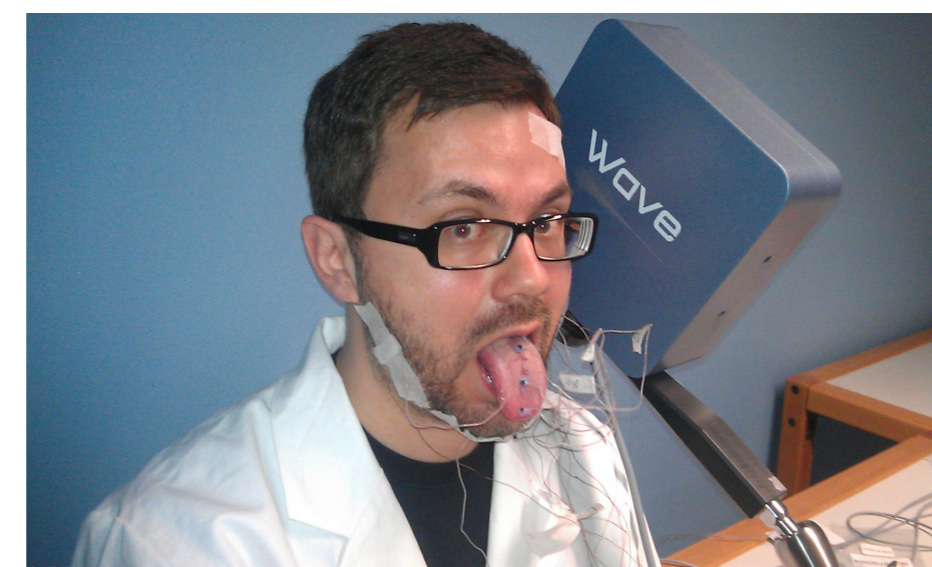
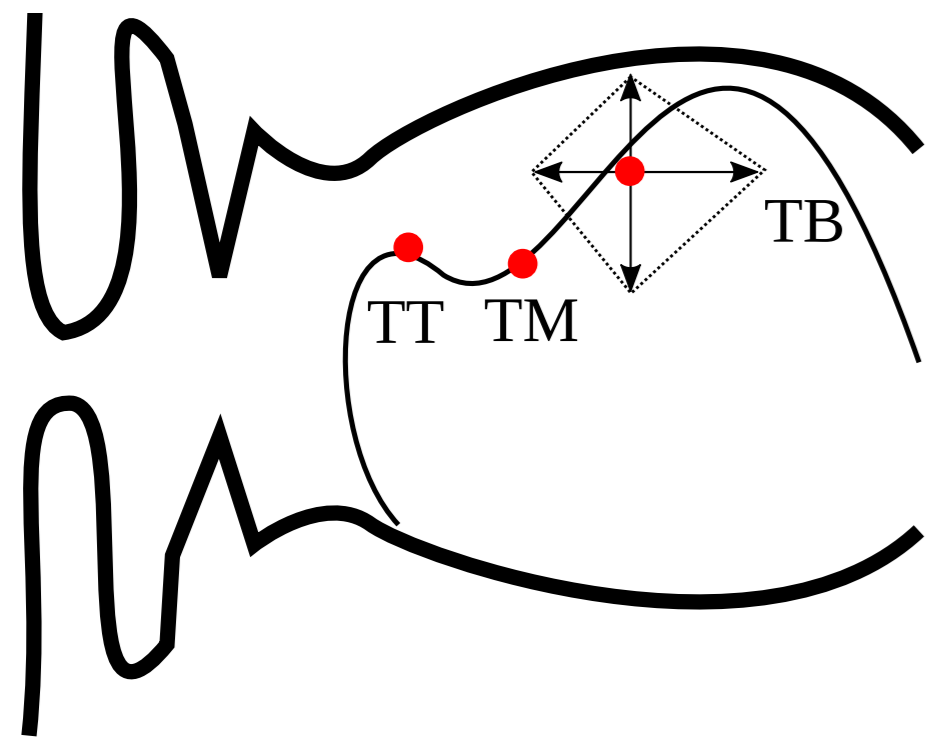
**question** will articulatory variability be smaller in relation to lower (spatial) uncertainty, assessed by means of conditional probability?

## synopsis

- articulatory variability is reduced due to repetition
- higher predictability
- reduction is strongest at vocalic target of [zi]

## methods

- electromagnetic articulography (NDI Wave)
- 100 Hz sampling rate
- automatic correction for head movements
- three sensors: tongue tip, tongue mid, tongue body



## recorded material

### participants

- 17 native speakers of German
- speaking rate conditions
- articulated in a 'fast' and a 'slow' speaking rate condition.

### target word

- articulation of Germ. 'sie' [zi] they
- 254 different 'sie + verb' phrases
- e.g. 'sie sagen', 'sie siegen'
- [i:], [ɪ], [a], [a:] as stem vowels in verb

## analysis

### statistical method

- generalized additive mixed-effects models [23]
- family: Gaussian location scale additive models (gaulss) [22]
- gaulss models allow to fit average trajectories and standard deviation
- articulatory variability ~ standard deviation

### predictors of interest for standard deviation

- inversed conditional probability of [zi]  $P(\text{sie}|\text{verb})$ , based on Google counts
- repetition during experiment
- travelled distance
- distance to target in verbal stem vowel

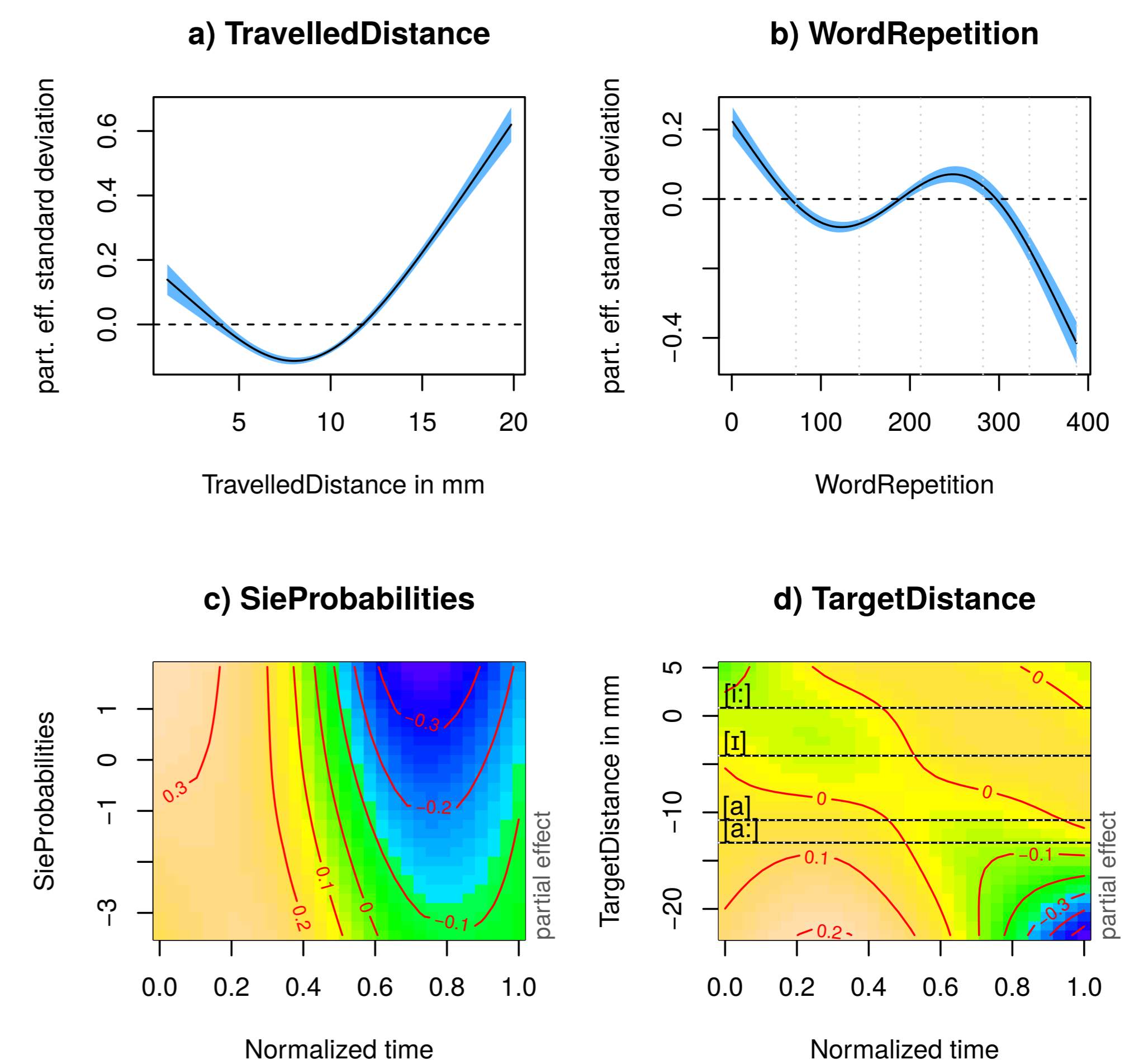
### average trajectory controlled for

- speaking rate condition
- word duration of [zi]
- anticipatory coarticulation of following consonant
- anticipatory coarticulation of stem vowel in verb
- repetition during experiment

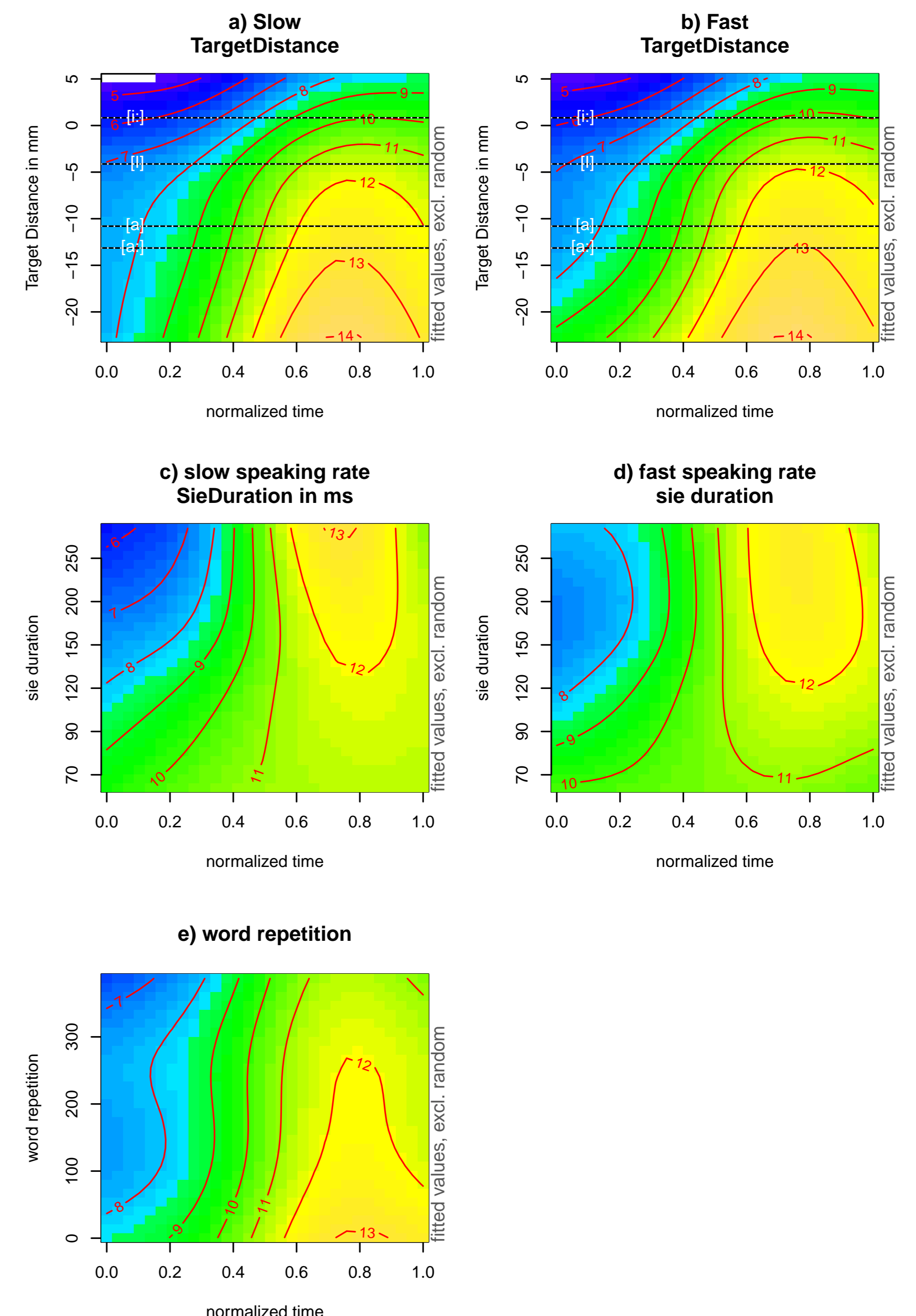
### standard deviation controlled for

- tongue's travelled distance
- anticipatory coarticulation of stem vowel in verb

## results: standard deviation



## results: average trajectory



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