

# Normative growth curves for phoneme articulation

## Analysis plan

## Considerations

- **Measure:** max (or 75th) percentile of expected phoneme probability ✓
- **Timing of measurement:** Time of given percentile ✓
- **Model(s)**
- **Differentiation between phonemes**
- **Variation within vs. between**
- **Age-specific quantiles**
- **Threshold for `acquisition'**

# Model

## Outcome:

$Y_{ijk}$  = Max probability of expected phoneme  $i$  for person  $j$  on instance  $k$

**Model:** Beta regression, whereby  $Y_{ijk}$  is Beta-distributed with mean  $\mu_{ij}$  and precision  $\phi_{ij}$  for each instance  $k$

*Consideration.* May need to aggregate outcome over instances. Easier to analyze aggregated outcome, but at the expense of interpretability.

## Mean model

$$\mu_{ij} = \text{Logit}(a_i(\theta_{ij} - b_i)) = \frac{1}{1 + \text{Exp}(-a_i(\theta_{ij} - b_i))}$$

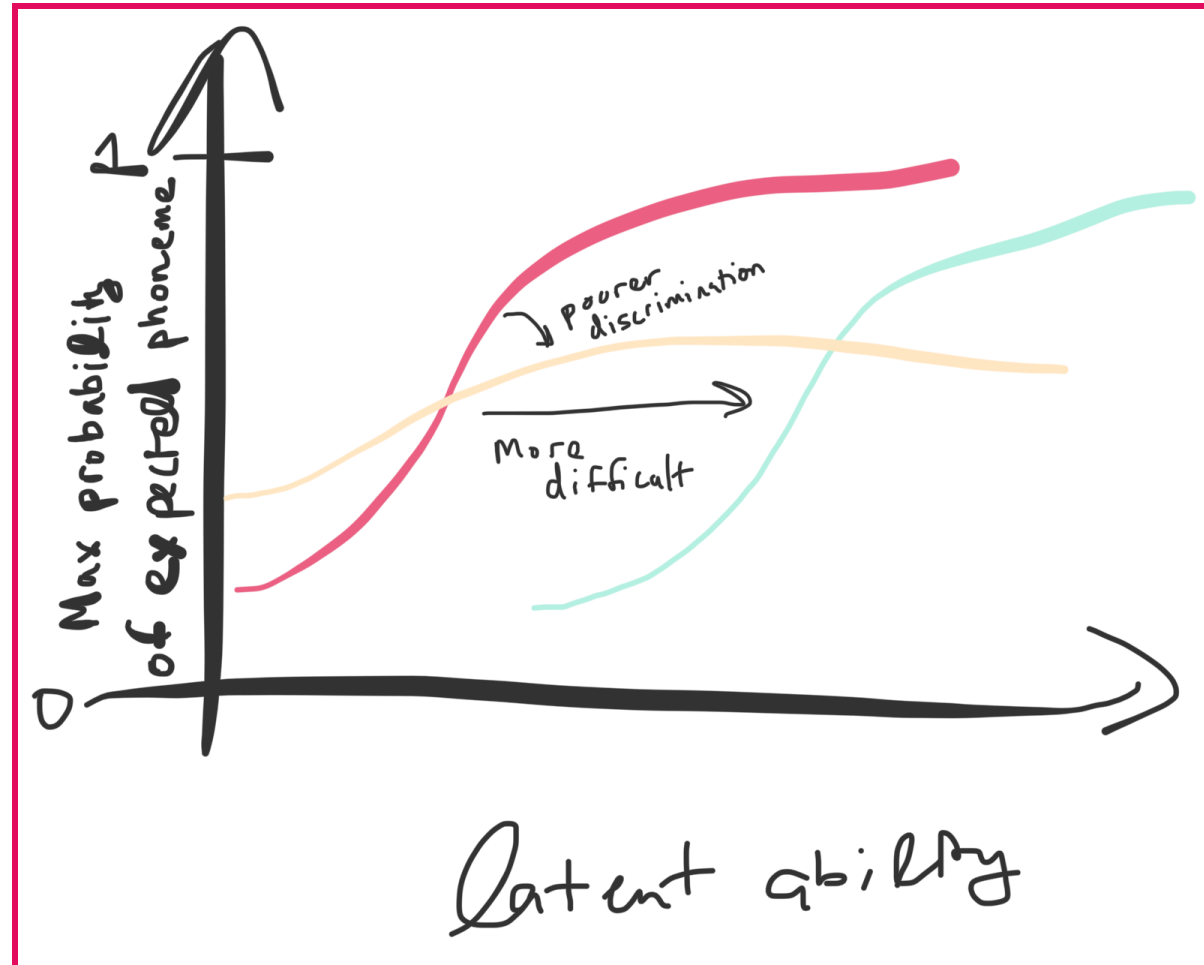
where

- $a_i$  captures how strongly phoneme  $i$  **discriminates** between different levels of articulation quality
- $b_i$  reflects the **difficulty** in articulating phoneme  $j$
- $\theta_{ij}$  represents the **latent ability** of person  $i$  to articulate phoneme  $j$

*Consideration.* May want to account for a ceiling effect on  $\mu_{ij}$  for certain phonemes, meaning their probability never exceeds some value like 0.9.

# Mean model

In a picture:



## Latent ability

$$\theta_{ij} = \eta_{c_i j} + \beta_{c_i} \times \text{Age}_j$$

where

- $c_i$  refers to a group of phonemes
- $\text{Age}_j$  is age of person  $j$
- $\eta_{c_i j}$  is latent ability of person  $i$  in articulating phonemes from group  $c_i$
- $\beta_{c_i}$  captures how much the latent ability in articulating phonemes from group  $c_i$  changes with age

*Considerations.* Will certainly need splines for age. May need to center age - if so, what is a good reference age? Age 0? Start with groupings driven by theory; later allow for data-driven groups

## Precision model

Variance for  $Y_{ijk}$  is

$$\frac{\mu_{ij}(1 - \mu_{ij})}{1 + \phi_{ij}}$$

To start, assume  $\phi_{ij} := \phi$  is constant.

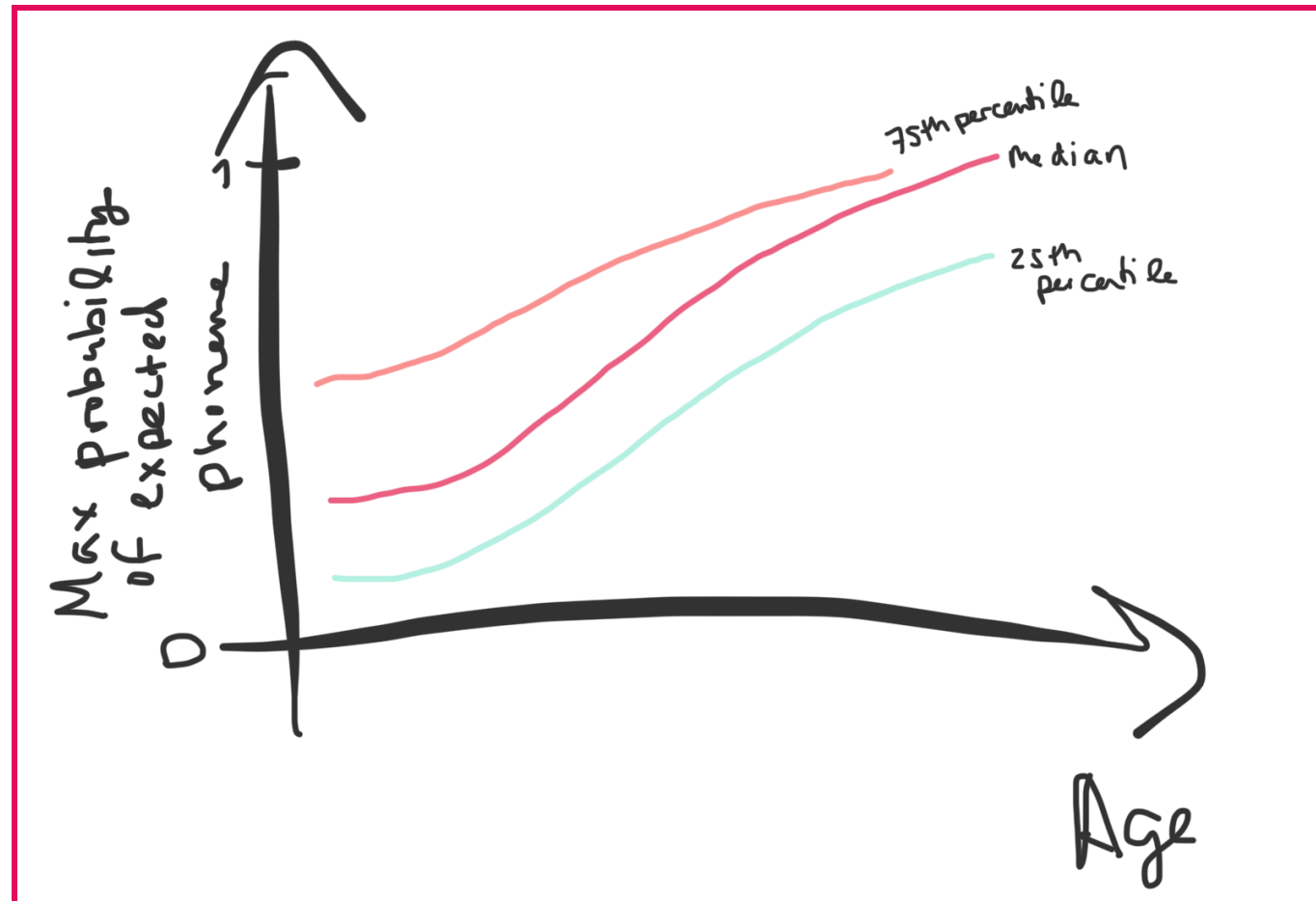
# What we can get from model

- **Age-specific percentiles.** For example:
  - The level of articulation for a given phoneme that 50% of TD children at age 4 are expected to surpass
  - The level of articulation for a given phoneme that 90% of TD children at age 6 are expected to surpass



# What we can get from model

In a picture:



# What we can get from model

- **Age's influence** on articulation for different phoneme groups:
  - Age when most TD children achieve a 90% level of articulation for a given phoneme group
  - Which groups of phonemes are mastered later in development
  - Age when greatest improvements in articulation are observed

# What we can get from model

- **Discrimination** and **difficulty** parameters for each phoneme. For example:
  - Which phonemes are the most difficult to articulate
  - Which phonemes are best suited for discriminating the latent ability in articulation

## What we can get from model

- How much variability in observed levels of articulation are attributable to differences in latent ability versus measurement noise