# Tracking phoneme processing during continuous speech perception with MEG Christian Brodbeck<sup>\*1</sup> & Jonathan Z. Simon<sup>1,2,3</sup> <sup>1</sup>Institute for Systems Research, <sup>2</sup>Department of Electrical and Computer Engineering, <sup>3</sup>Department of Biology

## Introduction

- Aim: characterizing how information from phonemes is integrated for word perception in continuous speech comprehension
- Phonemes represent the continuous acoustic speech signal with discrete linguistic categories. However, brain responses to phoneme identity (/a/,  $\epsilon$ /,  $\theta$ /, ...) are hard to dissociate from acoustic responses because each phoneme is associated with a characteristic acoustic pattern
- Phonemes incrementally provide information about spoken words (e.g. Norris and McQueen, 2008); information theoretic measures like phoneme surprisal and lexical cohort entropy influence behavioral and MEG responses to isolated word stimuli (e.g. Gaston and Marantz, 2017)
- Here we analyze MEG responses to phoneme information properties in continuous, uninterrupted speech to determine how phonemes are processed as linguistically relevant stimuli

## **Predictor variables**

- Acoustic spectrogram: acoustic power in 8 logarithmically spaced bands
- Acoustic "onset": rising slope of acoustic power in the same bands
- **Cohort size**: number of word forms compatible with the current prefix
- Cohort reduction: number of words that the current phoneme excludes
- **Phoneme surprisal**: inverse of the conditional probability of the phoneme
- **Cohort entropy**: degree of uncertainty about the current word
- To account for the possibility that the first phoneme of each word is processed differently (Marslen-Wilson, 1987), word onset was modeled separately from the subsequent phonemes for each variable

## Stimuli

- **Solo:** one minute long audiobook segments
- **Two-speaker mix**: two audiobook segments mixed at equal loudness, task to attend to one while ignoring the other



Continuous MEG source estimates 11.5

## Analysis method

Linear kernel estimation predicts source localized continuous MEG responses from multiple concurrent predictor variables; predictors compete to explain variance (Brodbeck et al., 2018).

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## Results: single speaker

Responses to single speaker stimuli were modeled by iteratively excluding the least significant predictor until all remaining predictors were significant:

- Bilateral acoustic responses
- Responses to phoneme information more dominant in the left hemisphere







#### MEG data

-26 participants listened to one-minute long segments from A Child's History of England by Charles Dickens. In each of 4 blocks, subjects heard 4 repetitions of a mix of two segments, one spoken by a female and one by a male speaker. They were instructed to focus on one speaker while ignoring the other (counter-balanced across subjects). Then, each of the two segments was presented in isolation. After each presentation, subjects answered a comprehension question. -An average brain model ("fsaverage", FreeSurfer) was scaled and coregistered to each subject's head shape. MEG data were projected to source space with a distributed minimum norm inverse solution. Source dipoles were constrained to be





## Results: two speakers

Responses to two speakers modeled using variables significant in single speaker model: Responses reflect acoustic information from attended and unattended speech



## Methods

orthogonal to the cortical surface. Only source estimates in the temporal lobes were retained for analysis (~315 source dipoles per hemisphere).

#### **Predictor variables**

-Acoustic spectrogram predictors were based on an auditory brainstem model (Yang et al., 1992). Acoustic power representation: the spectrogram was averaged across frequency in 8 bands. Acoustic onset representation: positive slope of the acoustic power, 0 where the slope is negative. -Phonemes were labeled using the Gentle forced aligner (https://lowerquality.com/gentle/) and hand corrected

-Phoneme predictor variables were constructed using pronunciations from the Carnegie Mellon University Pronunciation Dictionary (http://

(Brysbaert and New, 2009).

#### **Response functions**

-Response functions were estimated separately for each virtual current source dipole using the boosting algorithm (David et al., 2007), using a response shape prior of Hamming windows of 50 ms width. Each predictor was tested by comparing prediction accuracy (correlation between predicted and measured response) of the full model to a model in which the predictor was temporally permuted. Model improvements and response functions were assessed using permutation tests based on threshold-free cluster enhancement (Smith and Nichols, 2009).



- Significant response to phoneme information in attended but not unattended speech
- Attended response peaks similar to single speaker case

## Conclusions

- Responses to phonemes can be disentangled from responses to underlying acoustic features
- Responses to phoneme surprisal and entropy suggest information from phonemes is used to constrain the lexical cohort within ~110-120 ms of phoneme onset
- Response to word onset suggests fast real-time lexical segmentation of continuous speech
- In two-speaker stimuli, only attended speech is processed lexically (cf. Broderick et al., 2017)
- Source localization suggests that lexical processing of phonetic information takes place in the lateral temporal lobe in or near auditory cortex

www.speech.cs.cmu.edu/cgi-bin/cmudict) and word frequencies from the SUBTLEX database

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