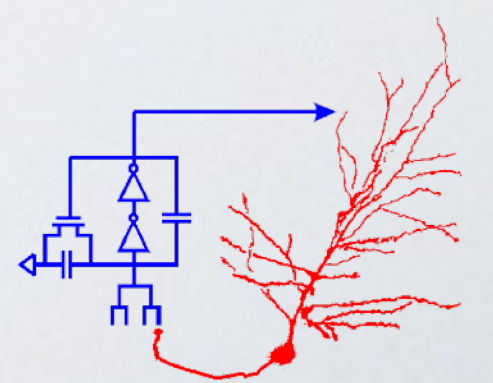


Rapid Time-Locked Lexical Processing of Attended but Not of Unattended Continuous Speech

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Speech processing of continuous speech

- ▶ Different levels observed with magnetoencephalography (MEG) / electroencephalography (EEG)
 - Acoustic processing
 - Phonetic features (e.g. Di Liberto et al., 2015, but also see Daube et al., 2019)
 - **Lexical processing of phonetic information?**
 - Semantic processing (e.g. Broderick et al., 2018)

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Lexical processing

- ▶ Information from phoneme level information is integrated in a time-locked fashion for word perception (cohort theory)

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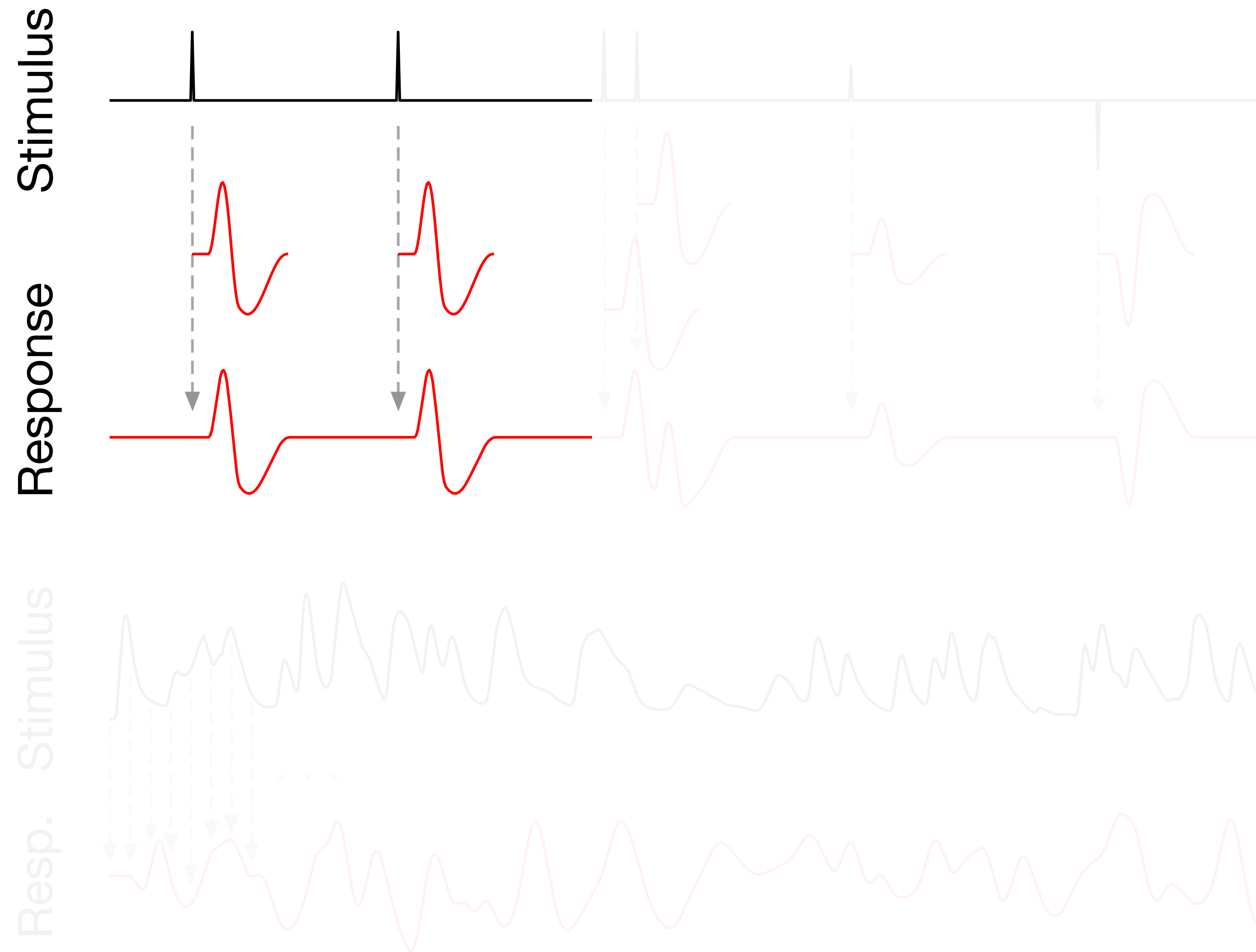
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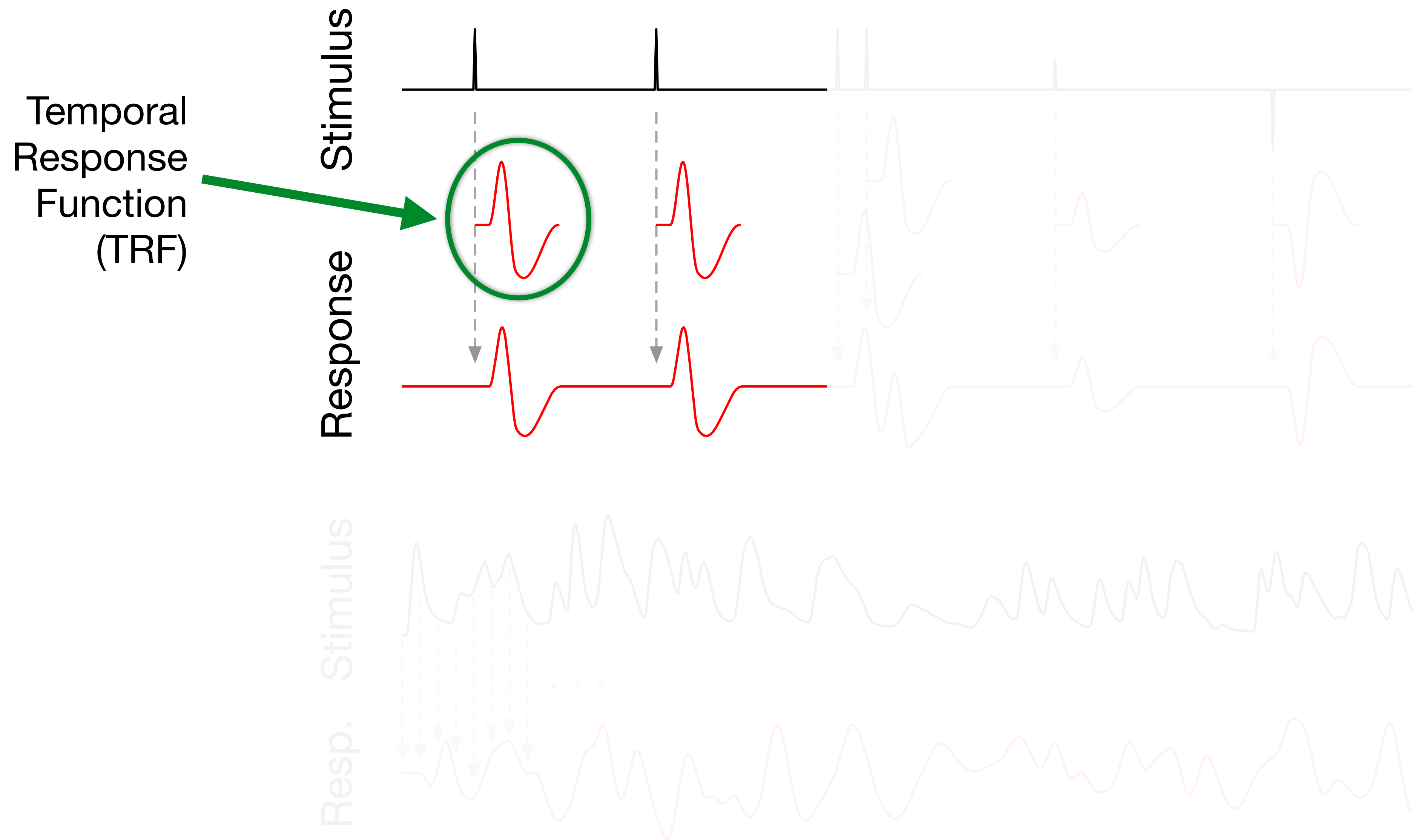
This presentation

- ▶ Measure lexical processing of phonetic information with MEG
- ▶ Lexical processing in cocktail-party stimuli

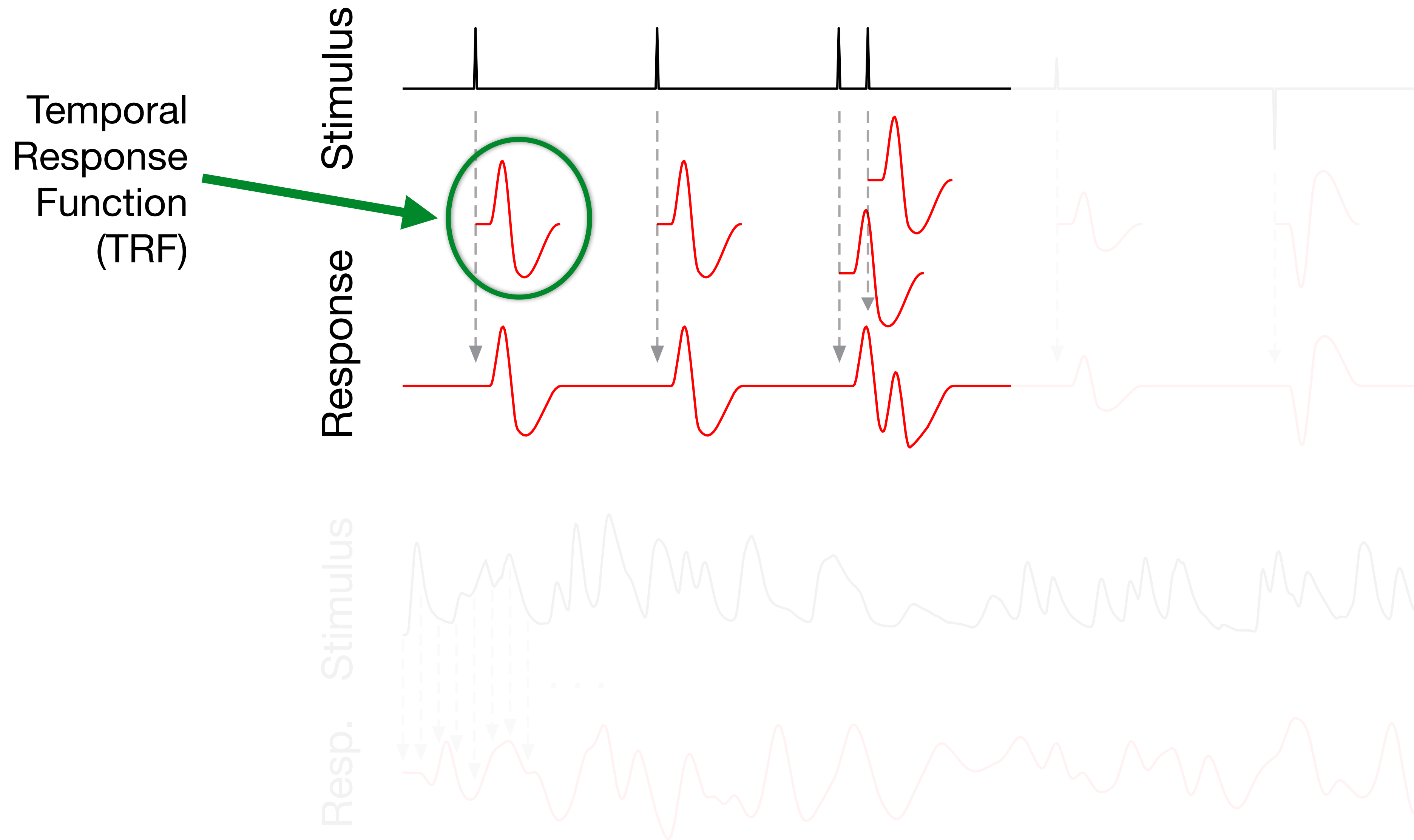
Linear convolution model



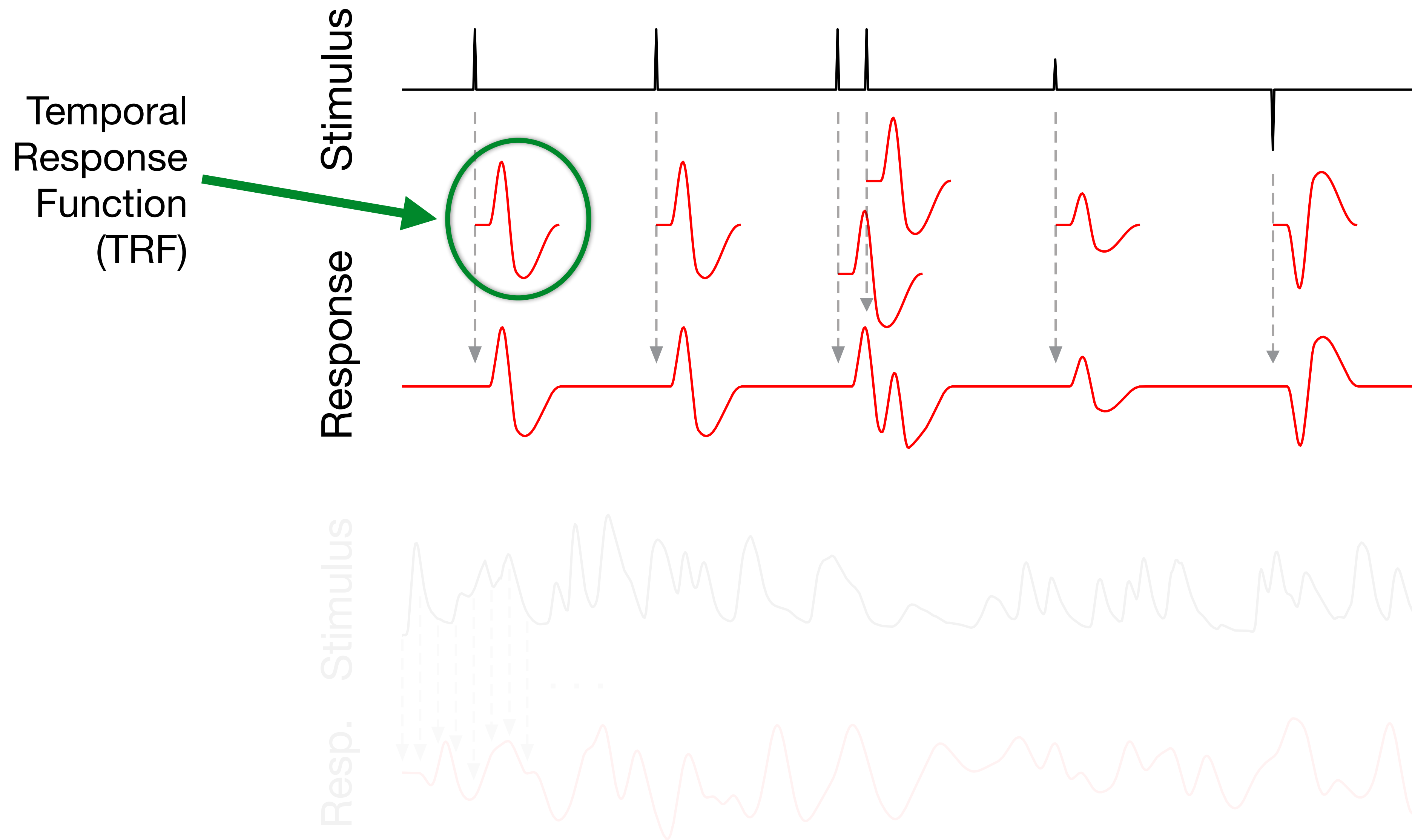
Linear convolution model



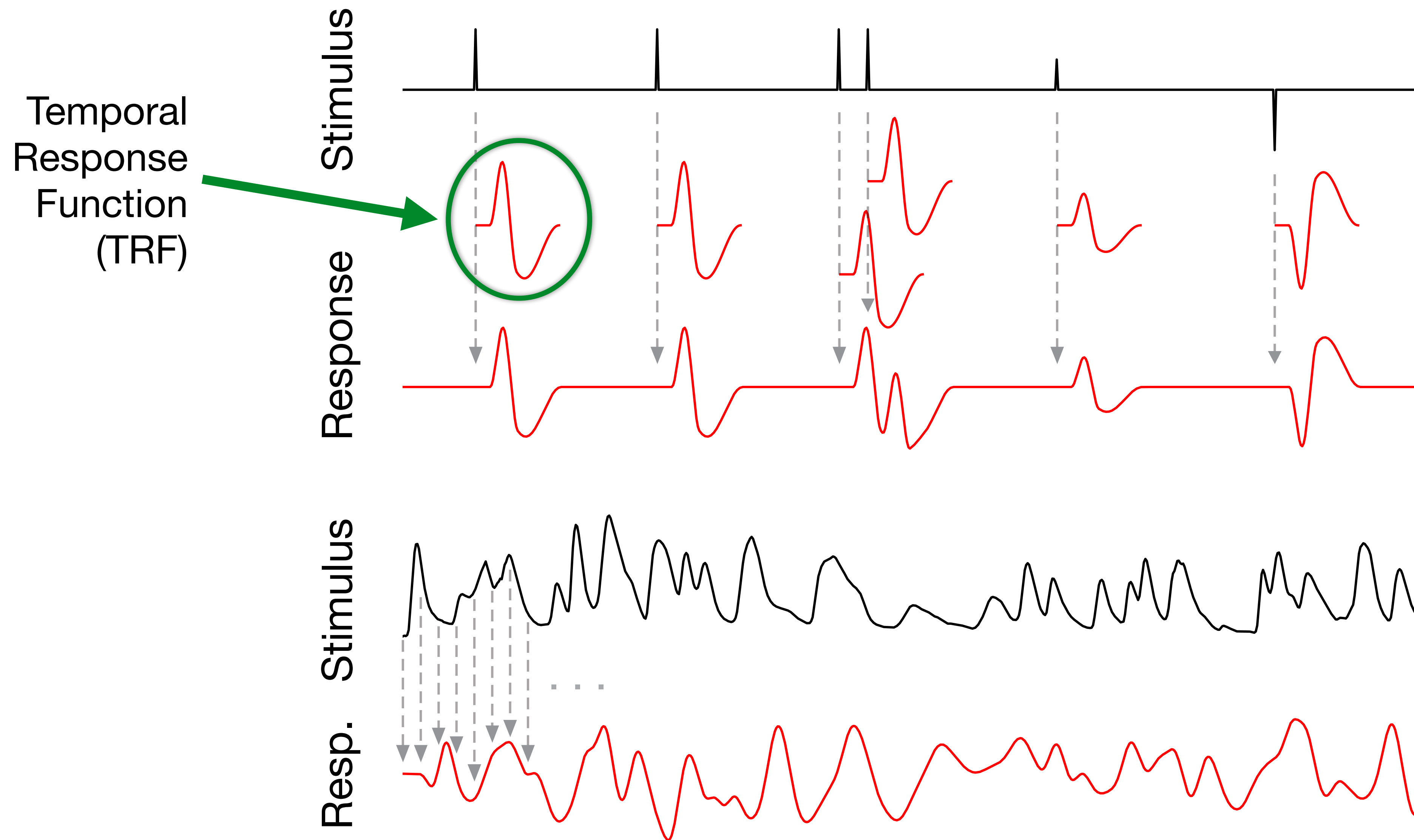
Linear convolution model



Linear convolution model



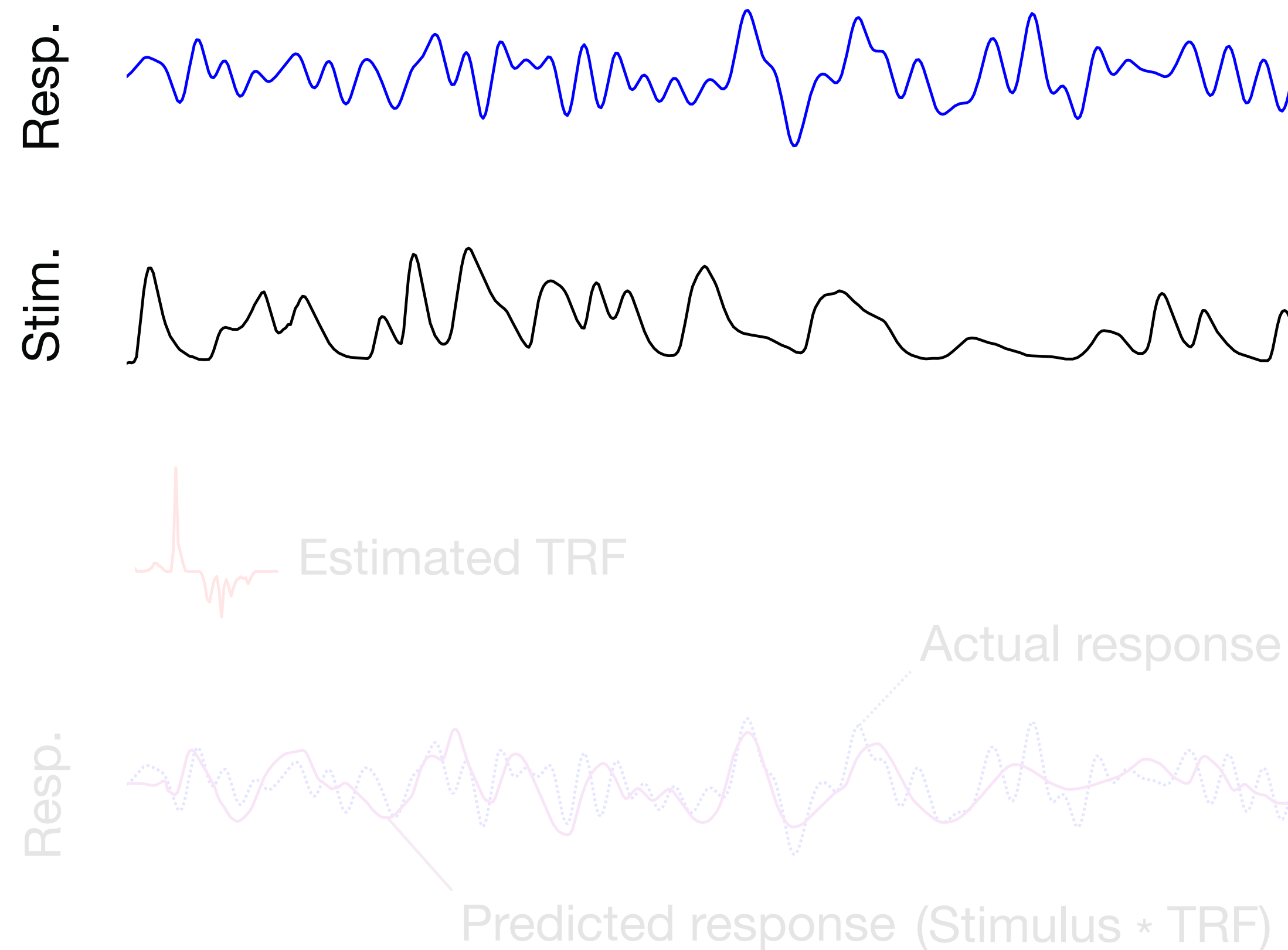
Linear convolution model



Linear convolution model

Temporal Response Function (TRF) estimation:

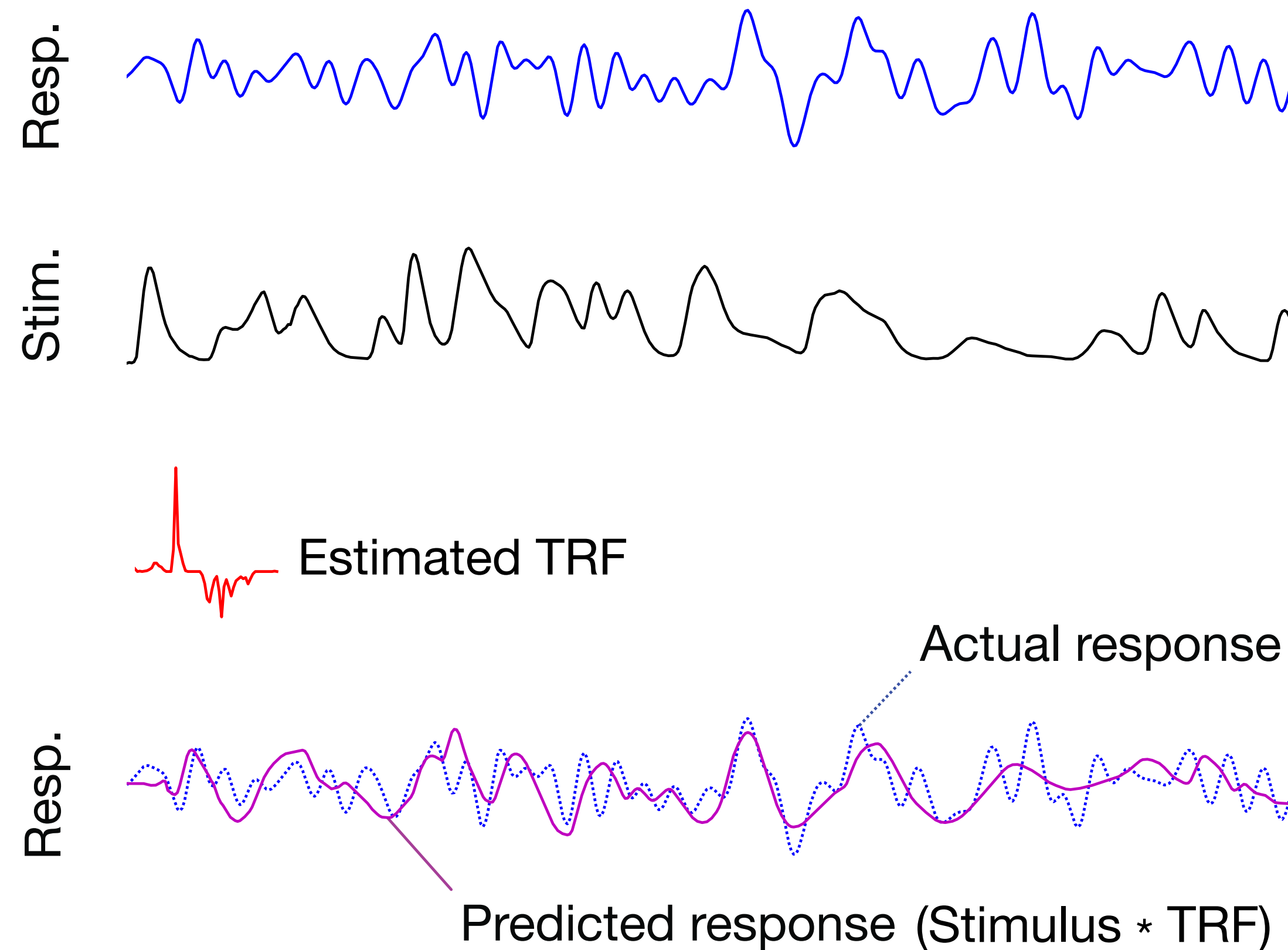
Stimulus and response are known; find the best TRF to produce the response from the stimulus:



Linear convolution model

Temporal Response Function (TRF) estimation:

Stimulus and response are known; find the best TRF to produce the response from the stimulus:



Evaluate model:

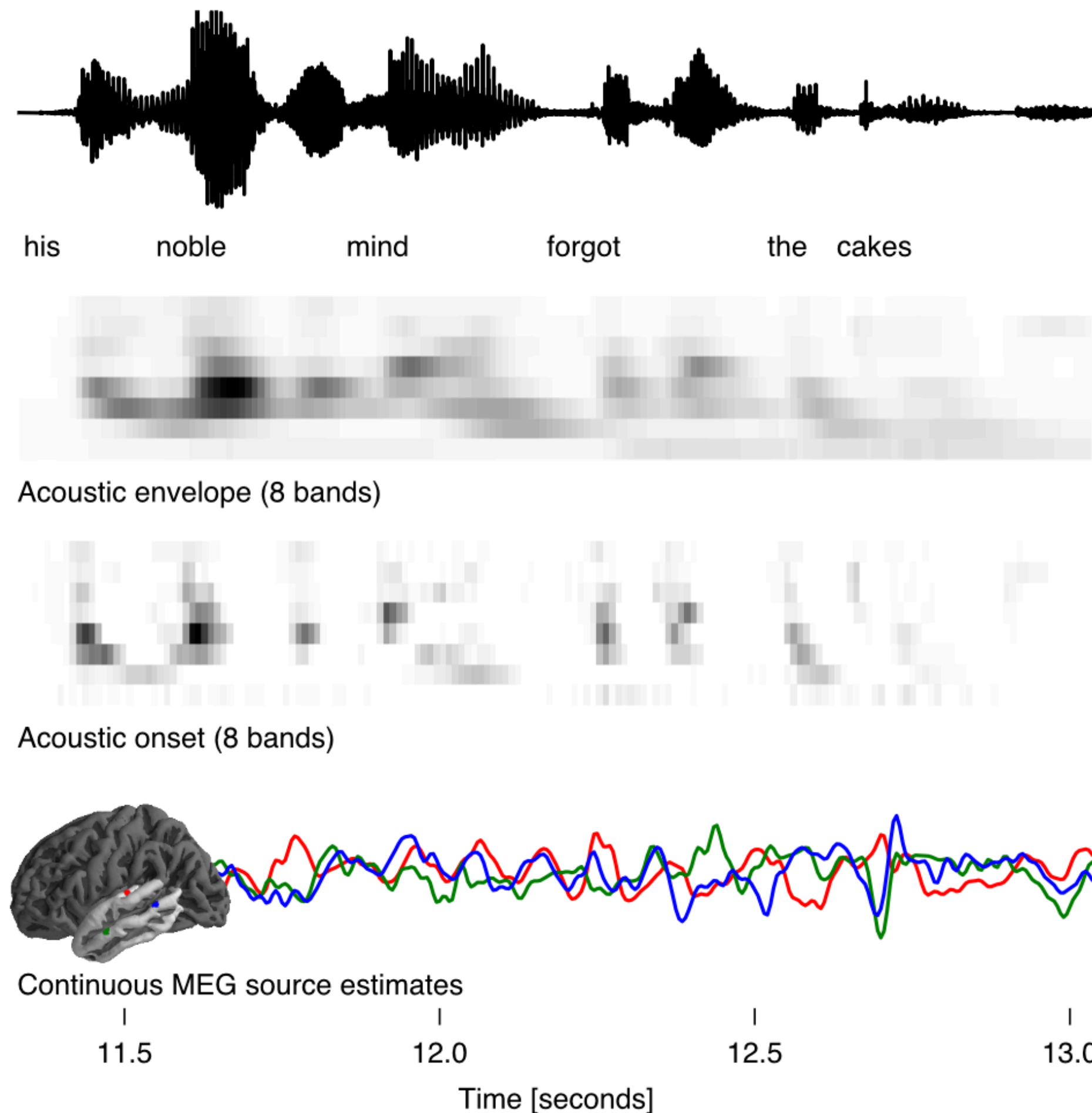
- ▶ Pearson correlation:
 $r(\text{predicted response}, \text{measured response})$

Evaluate a predictor, bias-corrected (e.g., word frequency):

- ▶ R of the full model
Envelope + Word frequency + Semantic composition
- ▶ R of a model with word frequency permuted
Envelope + Permute(word frequency) + Semantic composition
- ▶ Test for significant improvement across subjects

Significance test:

- ▶ Mass-univariate t -test
- ▶ Threshold-free cluster enhancement
- ▶ Max statistic distribution with 10,000 permutations



Stimulus

- ▶ Audiobook excerpt (8 minutes)

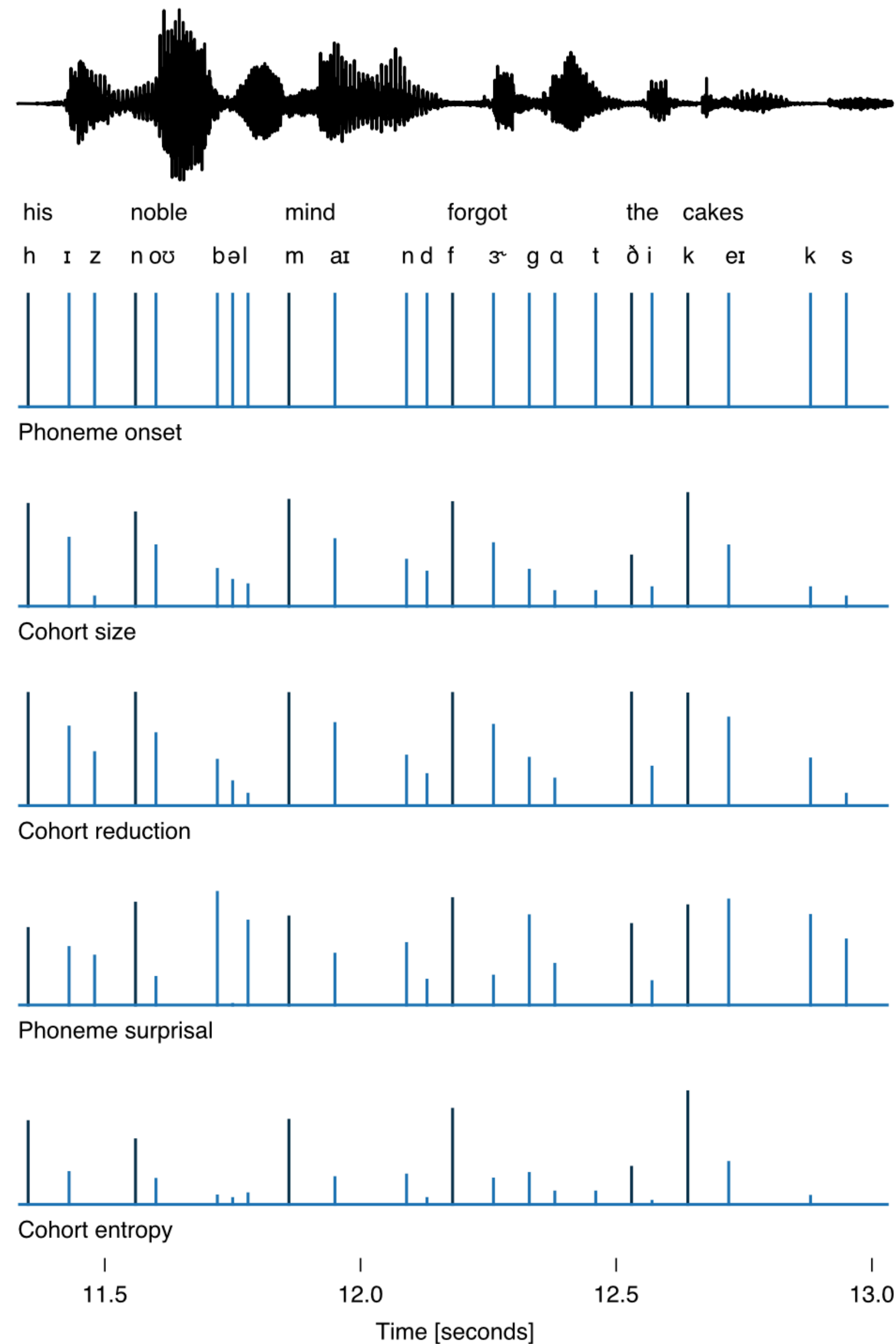
Predictors:

- ▶ Acoustic spectrogram (8 bands)
- ▶ Acoustic onsets (8 bands)
- ▶ Phonemes (next slide)

Predicted:

- ▶ Continuous, *source-localized* MEG responses

Model: Phonemes



Phonemes

- ▶ Modeled as impulses at phoneme onset

Phoneme processing

- ▶ Impulses *scaled by relevant variable*

Word onset

- ▶ Separately from word-internal phonemes

/k.../

Graphs	Pronunciation	SUBTLEX Count
ca	K AH	109
	K AA	
cab	K AE B	1826
caba	K AA B AH	2
cabal	K AH B AA L	13
caballero	K AE B AH Y EH R OW	21
cabana	K AH B AE N AH	46
cabanas	K AH B AE N AH Z	2
cabaret	K AE B ER EY	115
cabarets	K AE B ER EY Z	13
cabbage	K AE B AH JH	148
	K AE B IH JH	
cabbages	K AE B IH JH IH Z	37
cabbie	K AE B IY	71
...		
4447		1811951

/keɪ.../

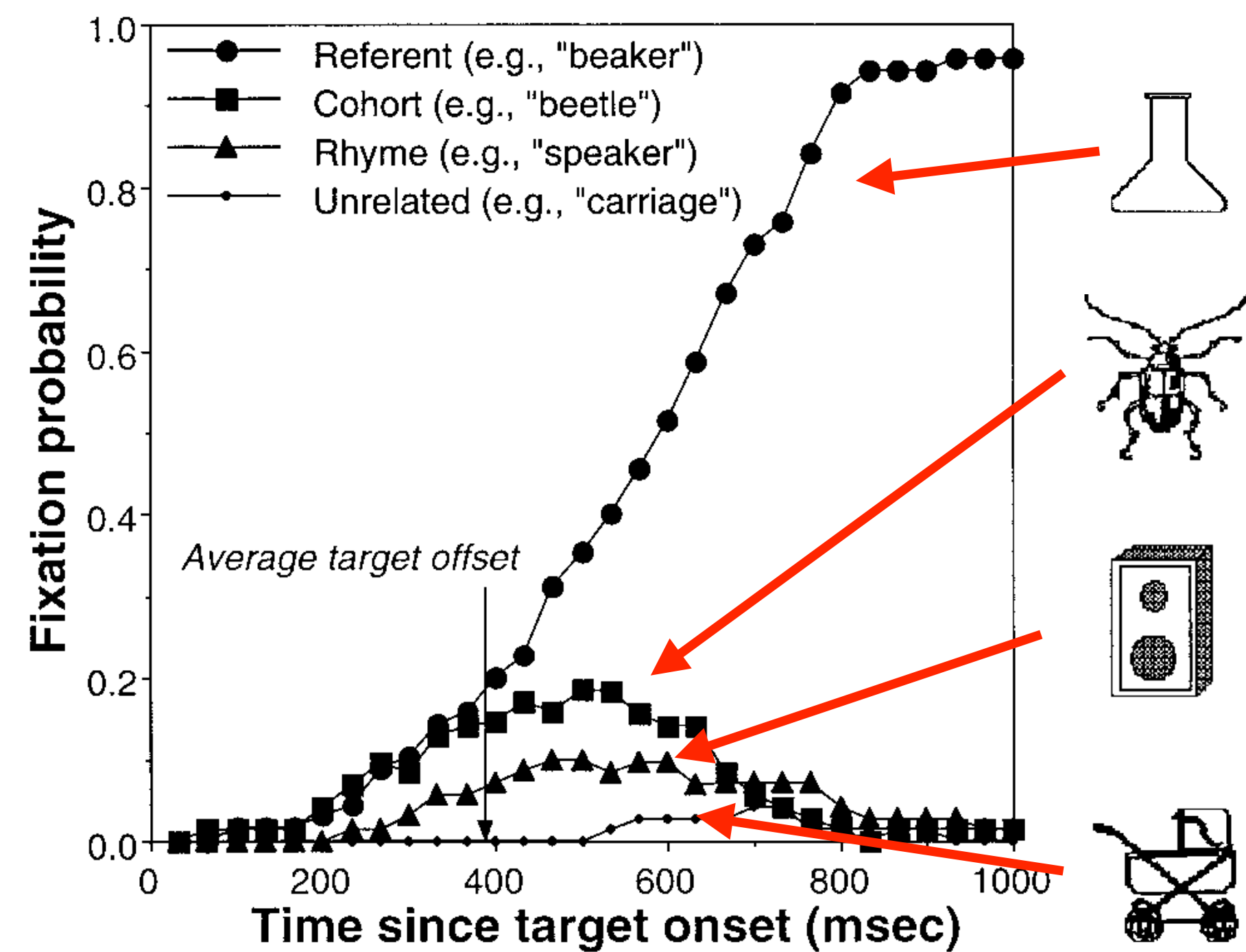
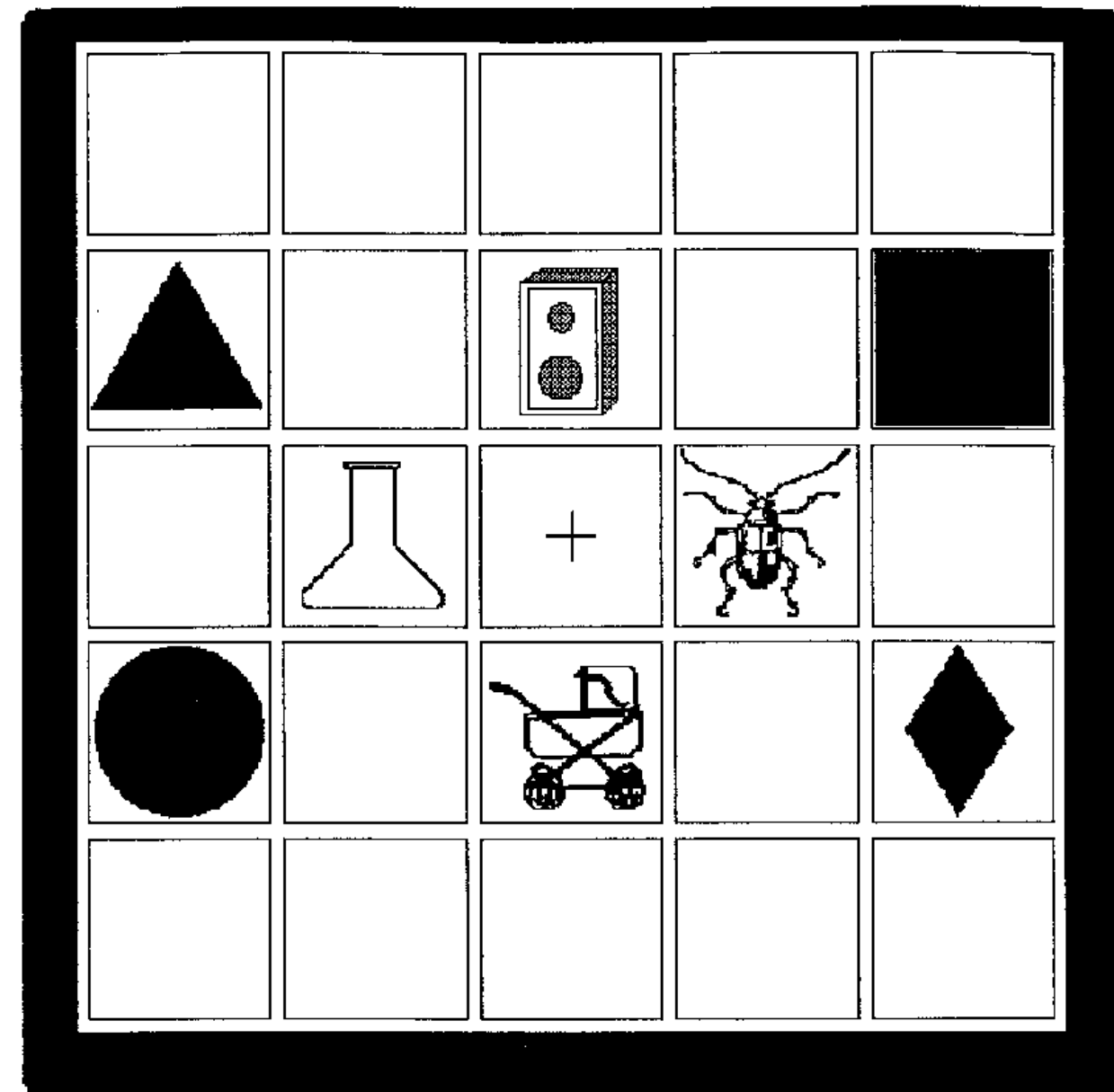
Graphs	Pronunciation	SUBTLEX Count
cable	K EY B AH L	1108
cabled	K EY B AH L D	19
telegram	K EY B AH L G R AE M	10
cables	K EY B AH L Z	110
cade	K EY D	11
cadence	K EY D AH N S	15
cadences	K EY D AH N S IH Z	1
cady	K EY D IY	64
caesarean	K EY S ER IY N	10
caesareans	K EY S ER IY N Z	1
cage	K EY JH	1034
	K EY JH IH	
caged	K EY JH D	83
...		
90		52908

/keɪk.../

Graphs	Pronunciation	SUBTLEX Count
cake	K EY K	2298
caked	K EY K T	9
cakes	K EY K S	291
3		2598

Cohort model

- ▶ Activation of multiple candidates
- ▶ Competition for recognition



“Pick up the beaker. Now put it above the diamond.”

Surprisal

Number of
times a word
that starts
with this
sequence
occurs in
SUBTLEX

K EY ...
52908
(90 words)

Number of
words that
start with
this sequence

K EY **M** ...
23875 (45%)
(4 words)

K EY **S** ...
16048 (30%)
(13 words)

K EY **K** ...
2598 (5%)
(3 words)

K EY **N** ...
1337 (3%)
(13 words)

⋮

“came”, “Cambridge”, ...

“case”, “cases”, “caseworker”,
“casein”, ...

“cake”, “caked”, “cakes”

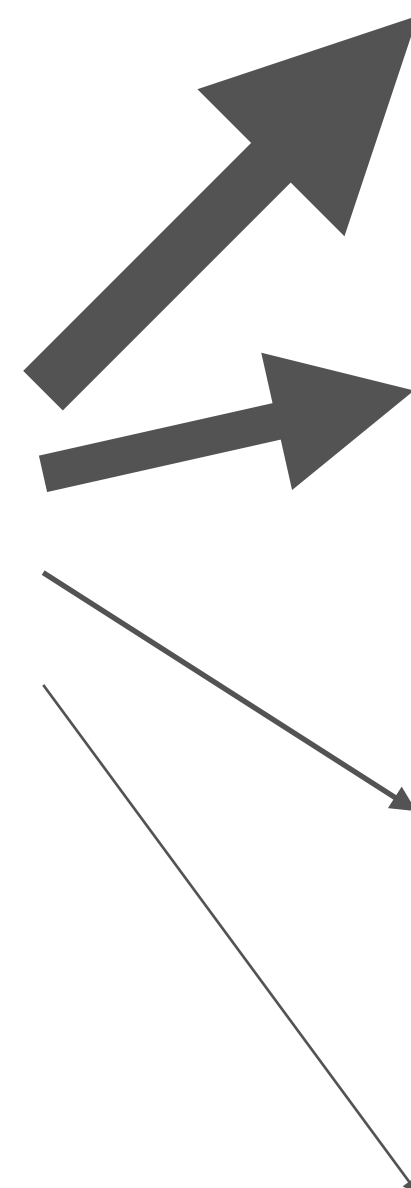
“cane”, “canine”, “Canaan”,
“Kane”, “Keynesian”, ...

Surprisal

Number of
times a word
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K EY ...
52908
(90 words)

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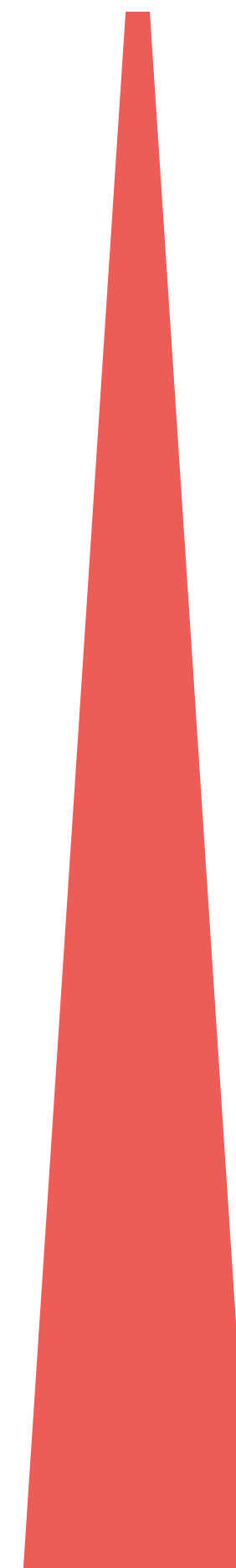
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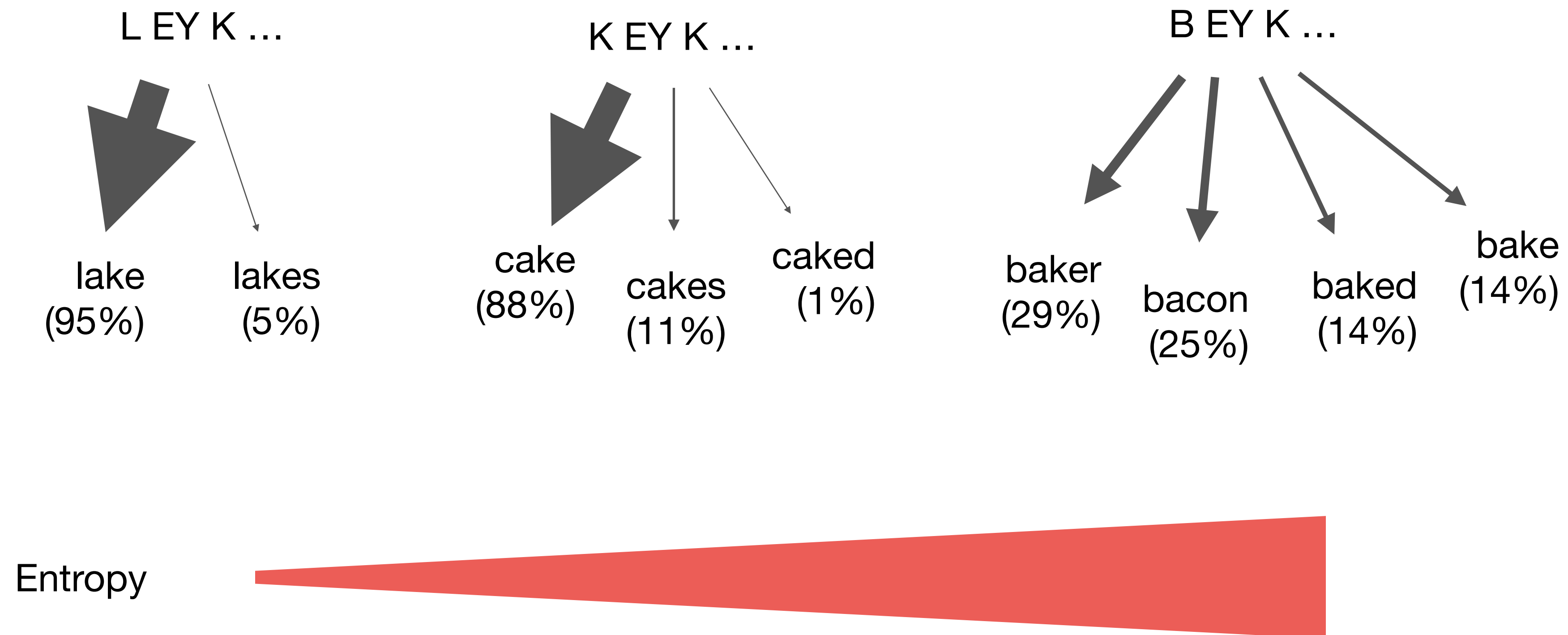
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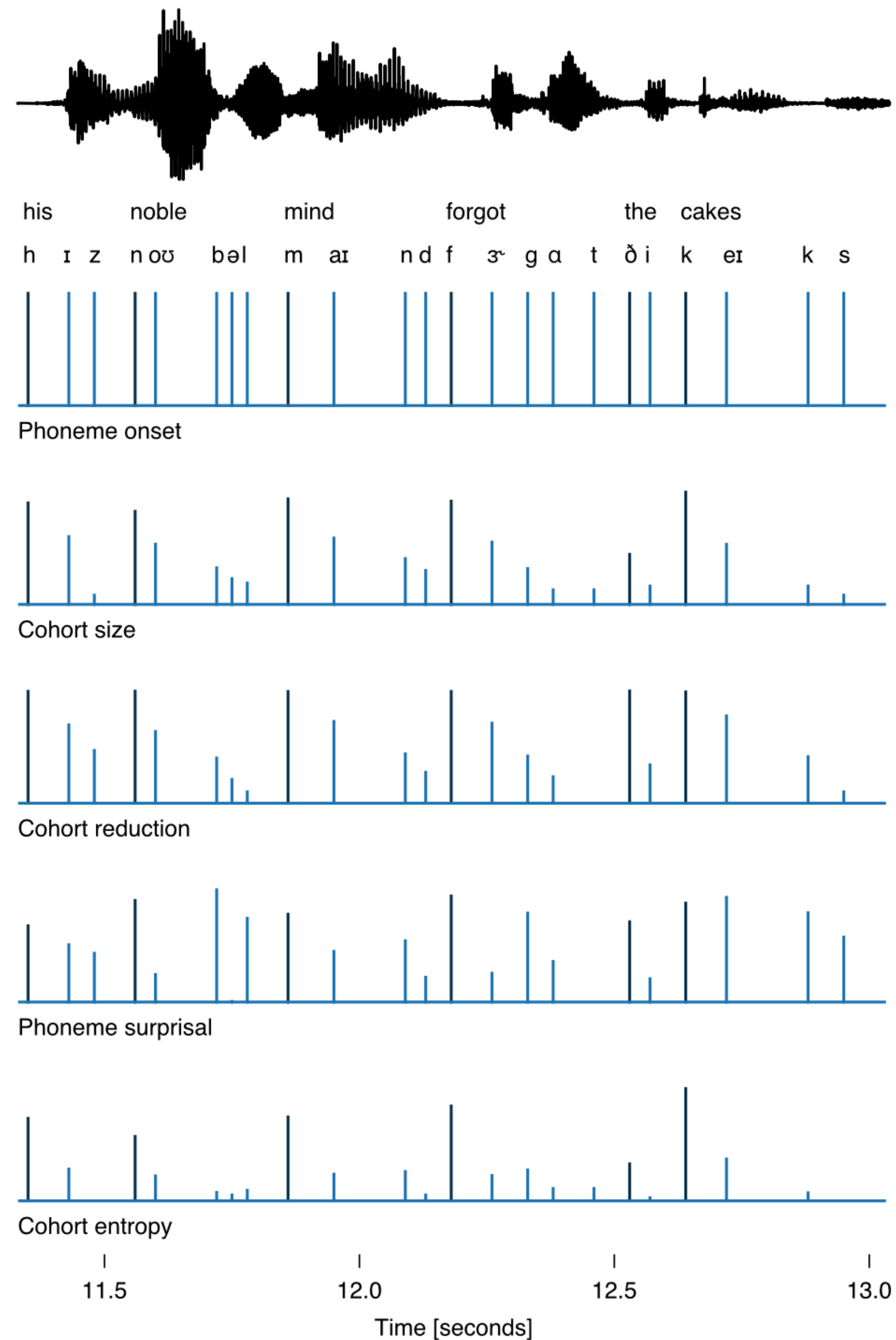
“cane”, “canine”, “Canaan”,
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Cohort entropy

- How unpredictable is the current word?



Model: Phonemes



Phoneme onset

- Impulse at every phoneme onset

Cohort size

- Number of words in cohort (log)

Cohort reduction

- Number of words that are removed from the cohort

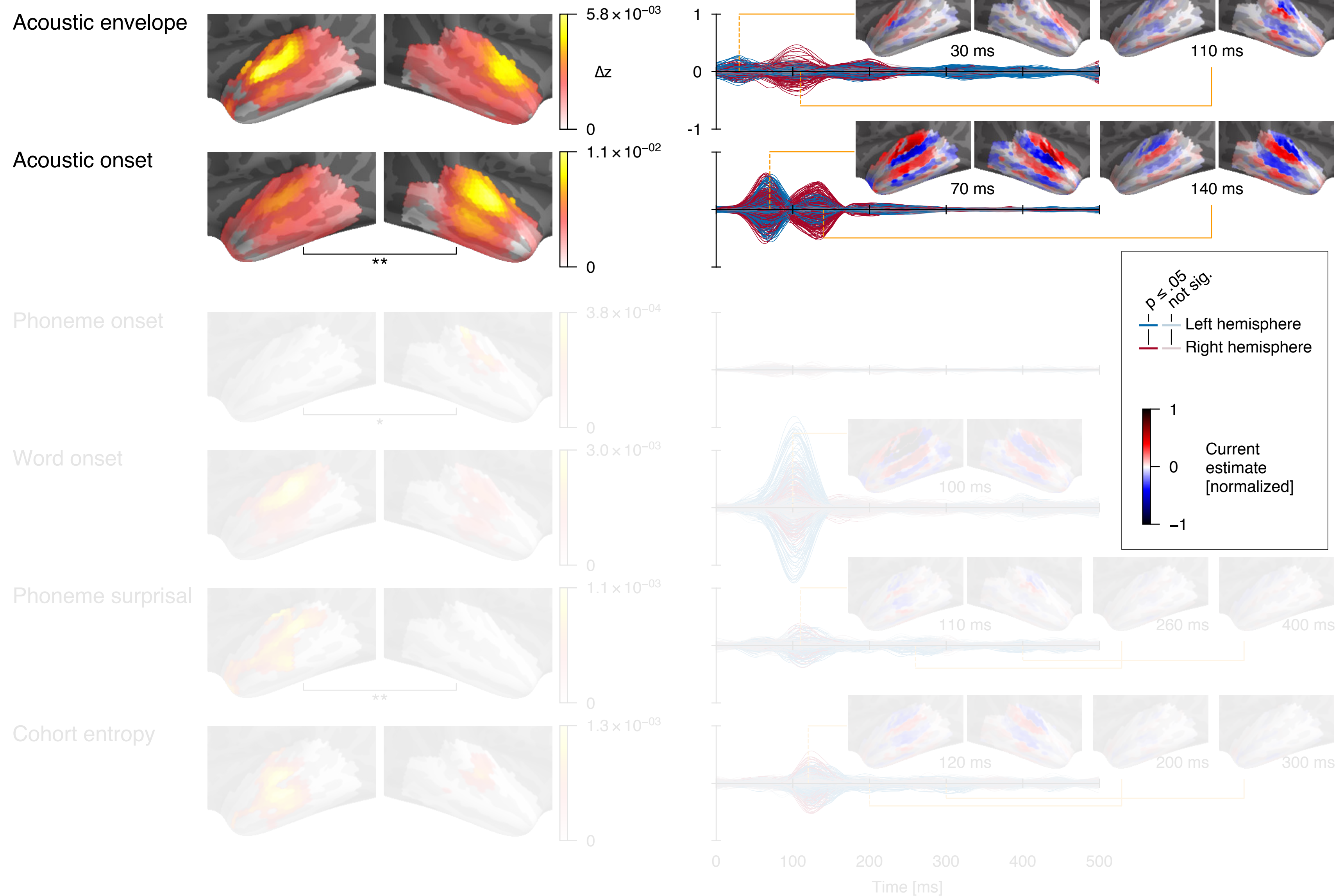
Phoneme surprisal

- Related to prediction error

Cohort entropy

- Related to lexical competition

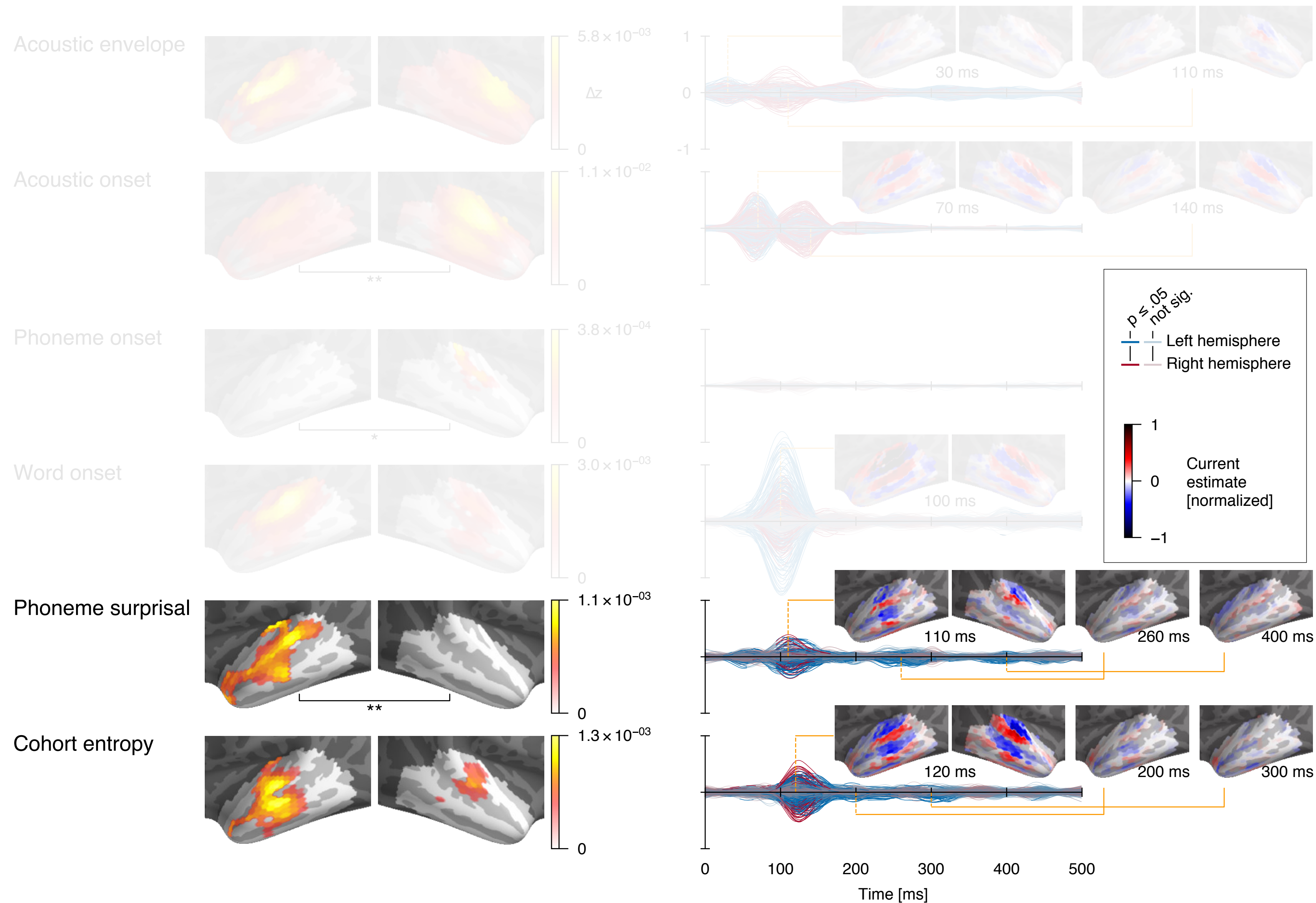
Results: Acoustics



Acoustic features

- ▶ Strong bilateral responses
- ▶ Two main response peaks (as expected)
- ▶ Strong responses to acoustic onsets

Results: Phonemes



No significant effect:

- Cohort size
- Cohort reduction
- Any modulation of word-onset

Phoneme surprisal

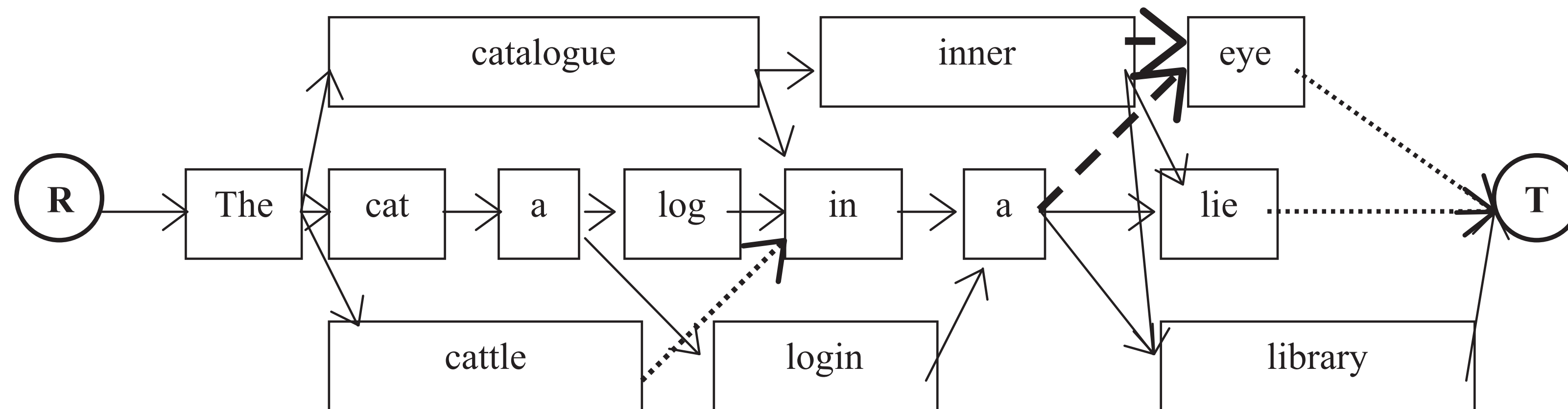
- Left-lateralized
- Related to prediction error

Cohort entropy

- Left-lateralized after excluding right-handers
- Slightly longer latency than surprisal (2 stages?)
- Related to lexical competition

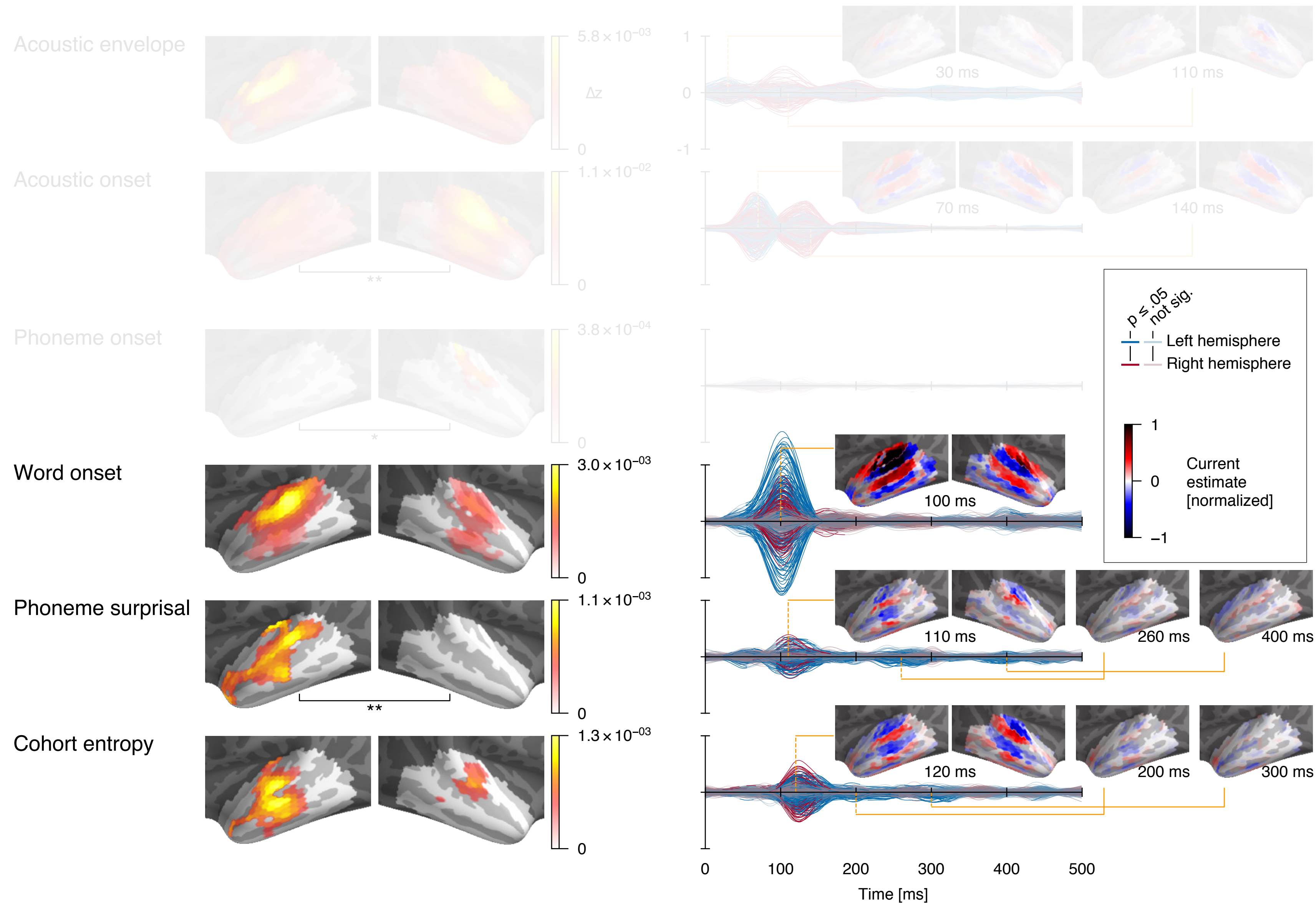
Do we...

- ▶ Anticipate word boundaries based on preceding context?
- ▶ Infer them later based on consistency with subsequent context?



“The catalogue in a library”

Results: Word onsets



Response at word onsets

- Suggests that on average, word onsets are processed immediately
- Localization similar to acoustic responses
- Opposite current direction of surprisal

Two speakers (“Cocktail Party”)

Lexical processing of unattended speech?

- ▶ Hearing your name attracts attention (Cherry, 1953)
- ▶ Attending to a conversation is easier when you don't know the language in the background
- ▶ Do we process words in unattended speech?

Two speakers (“Cocktail Party”)

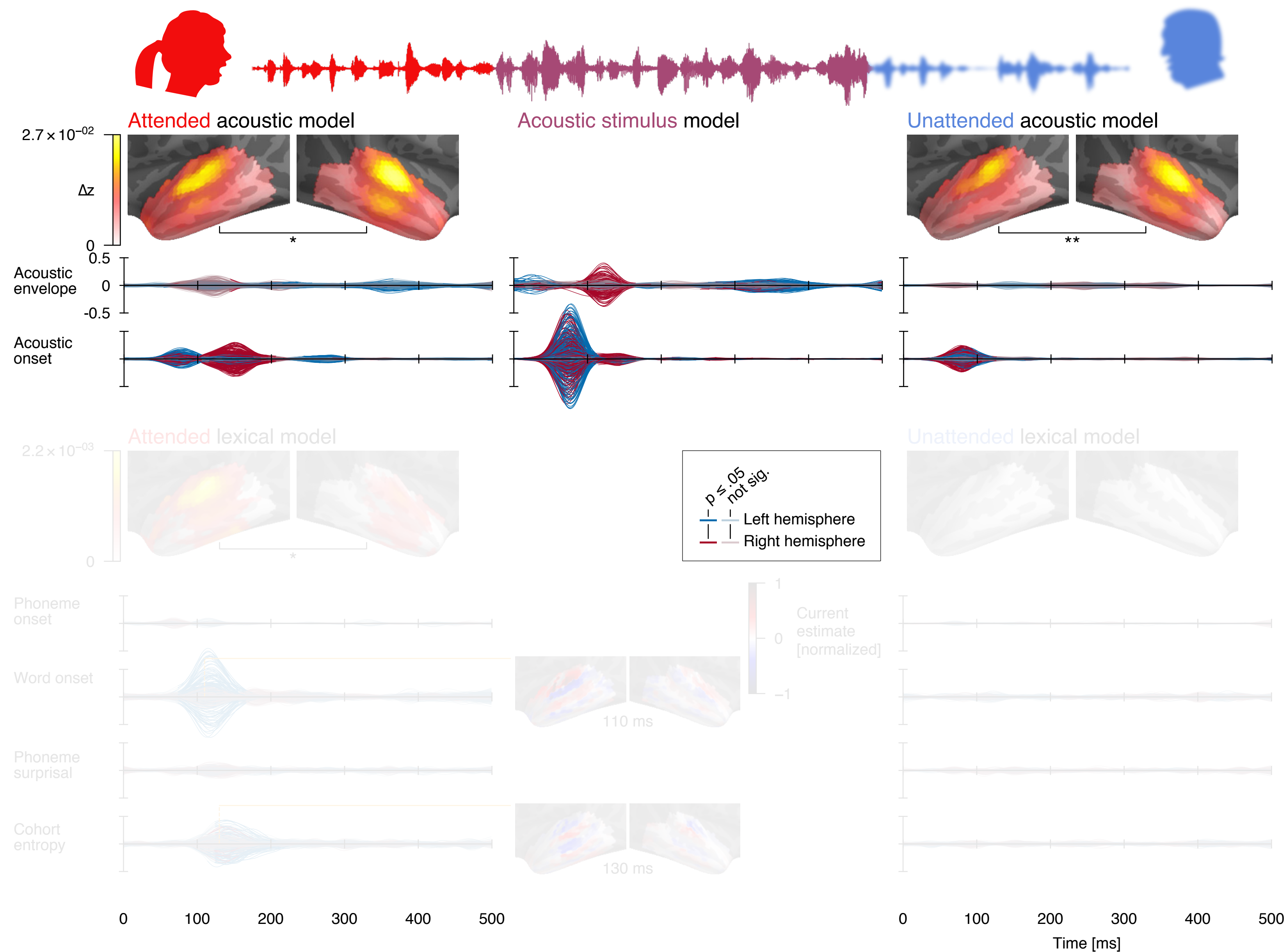
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Stimuli

- ▶ Two speakers, equal loudness
- ▶ Instructions: Attend to one, ignore the other
- ▶ After each segment, answer a question about the content of the attended stimulus

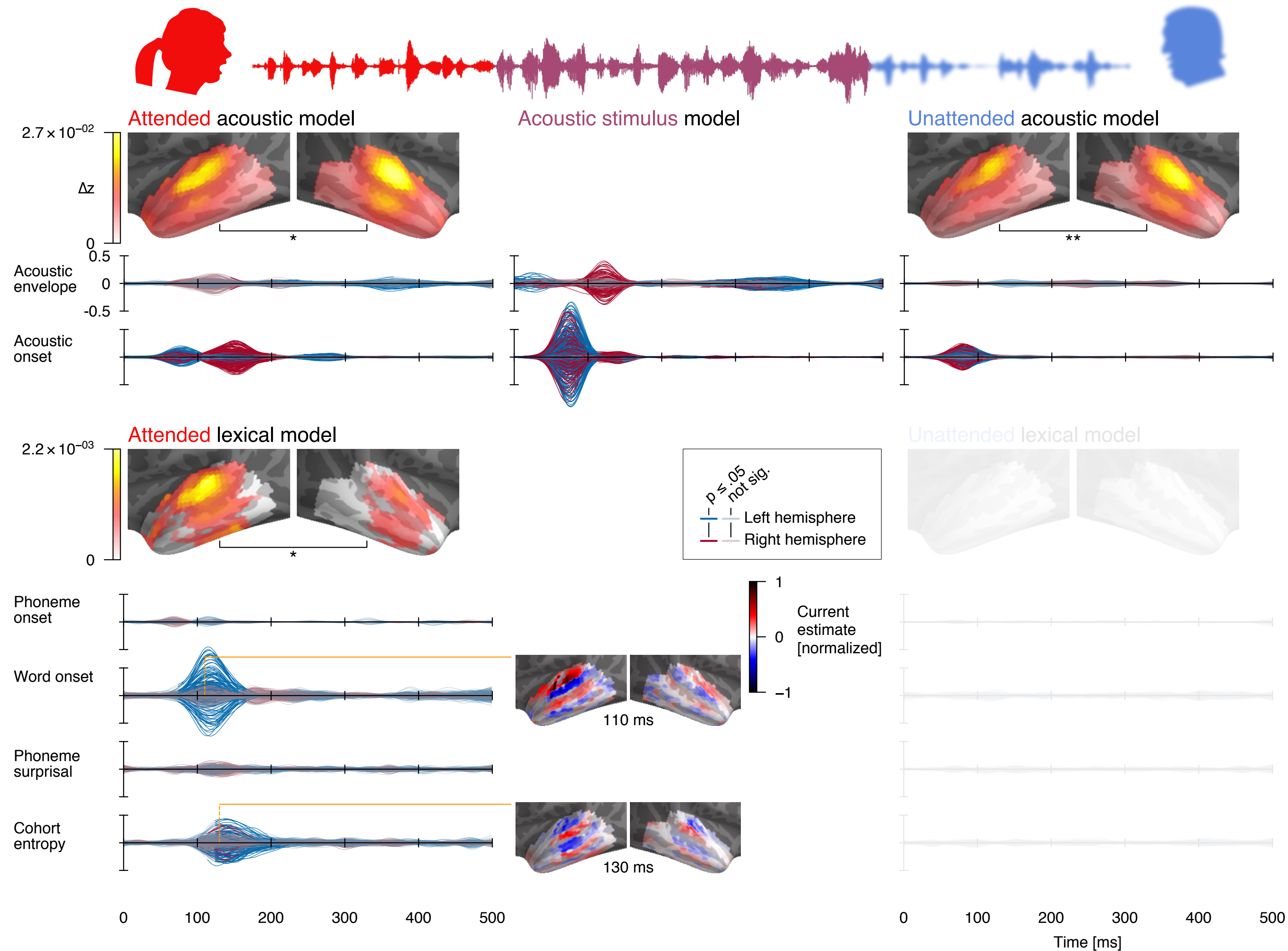
Results: Two speakers



Acoustic responses

- ▶ Neural representation of attended and unattended speech
- ▶ Amplification of attended features (M100)

Results: Two speakers



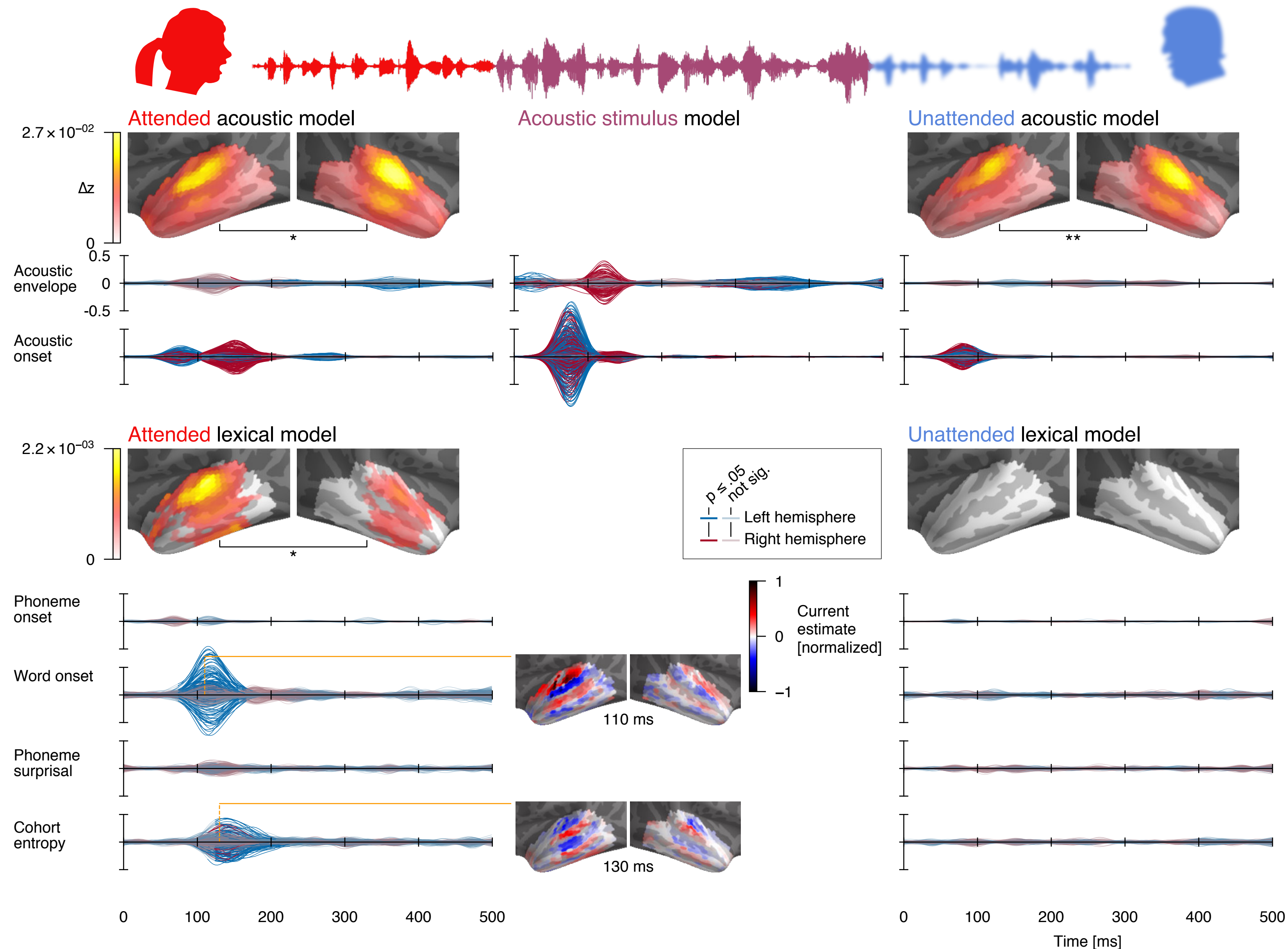
Acoustic responses

- ▶ Neural representation of attended and unattended speech
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Attended: Lexical processing

- ▶ Response patterns consistent with single speaker responses
- ▶ Delayed responses (~15 ms)

Results: Two speakers



Acoustic responses

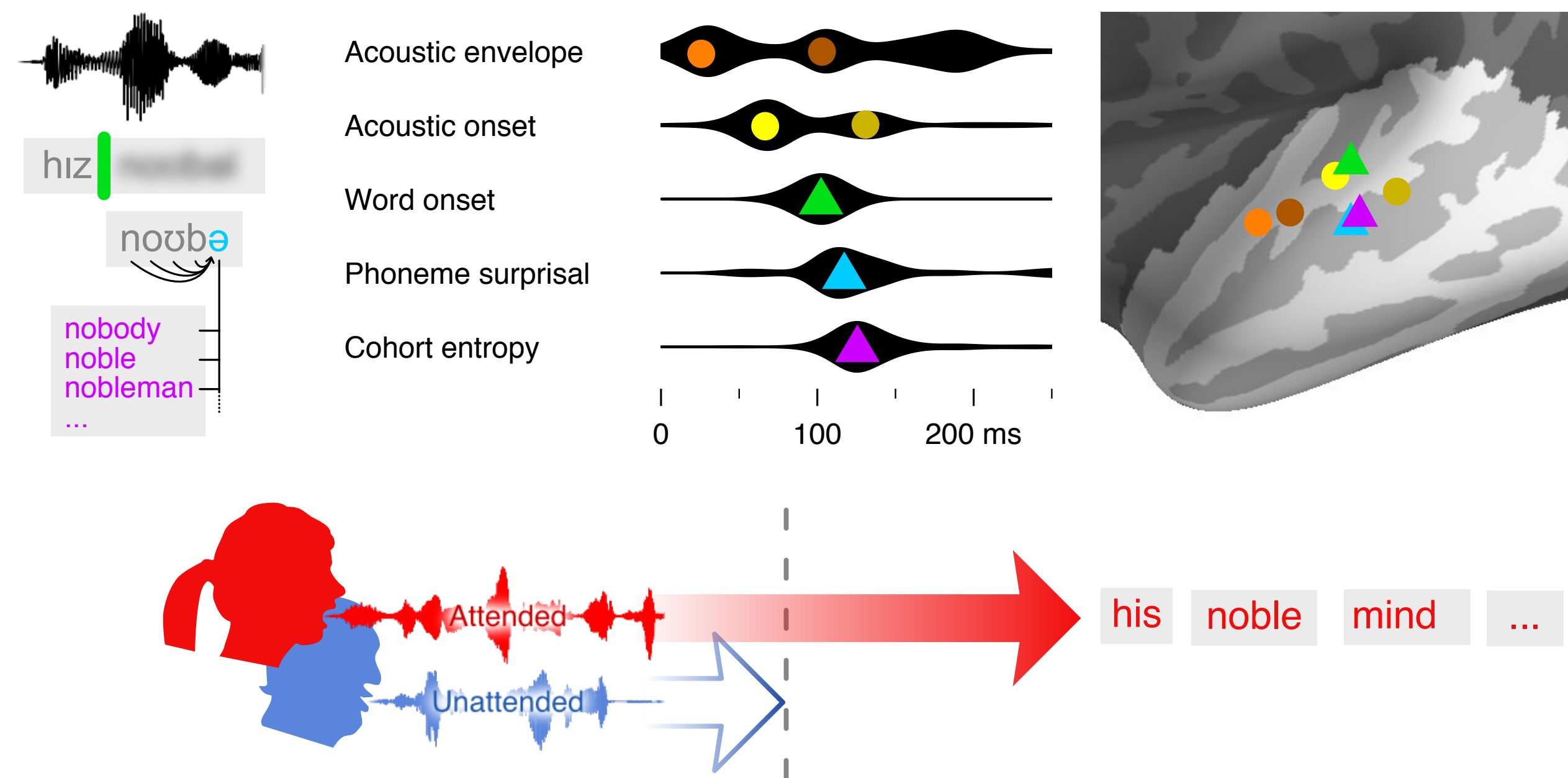
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Attended: Lexical processing

- ▶ Response patterns consistent with single speaker responses
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Unattended: No time-locked lexical processing

- ▶ Lexical processing could still happen but in non time-locked fashion



Levels of speech

- Acoustic features (acoustic envelope, onsets)
- Phonemes: categories or features
- **Lexical processing** of phonemes: transformation from phonemes to words
 - Cohort-model: activate multiple words compatible with phonemes that are perceived

Time-locked lexical processing of phonetic information

- Modeled as information content of individual phonemes
 - Word onsets (lexical segmentation)
 - Phoneme surprisal (phoneme information content, predictive coding) ~110 ms
 - Lexical entropy (lexical competition) ~130 ms

“Cocktail party”

- Two concurrent speakers, attend to one and ignore the other
- Time-locked lexical processing of only the attended speech

Thank you!

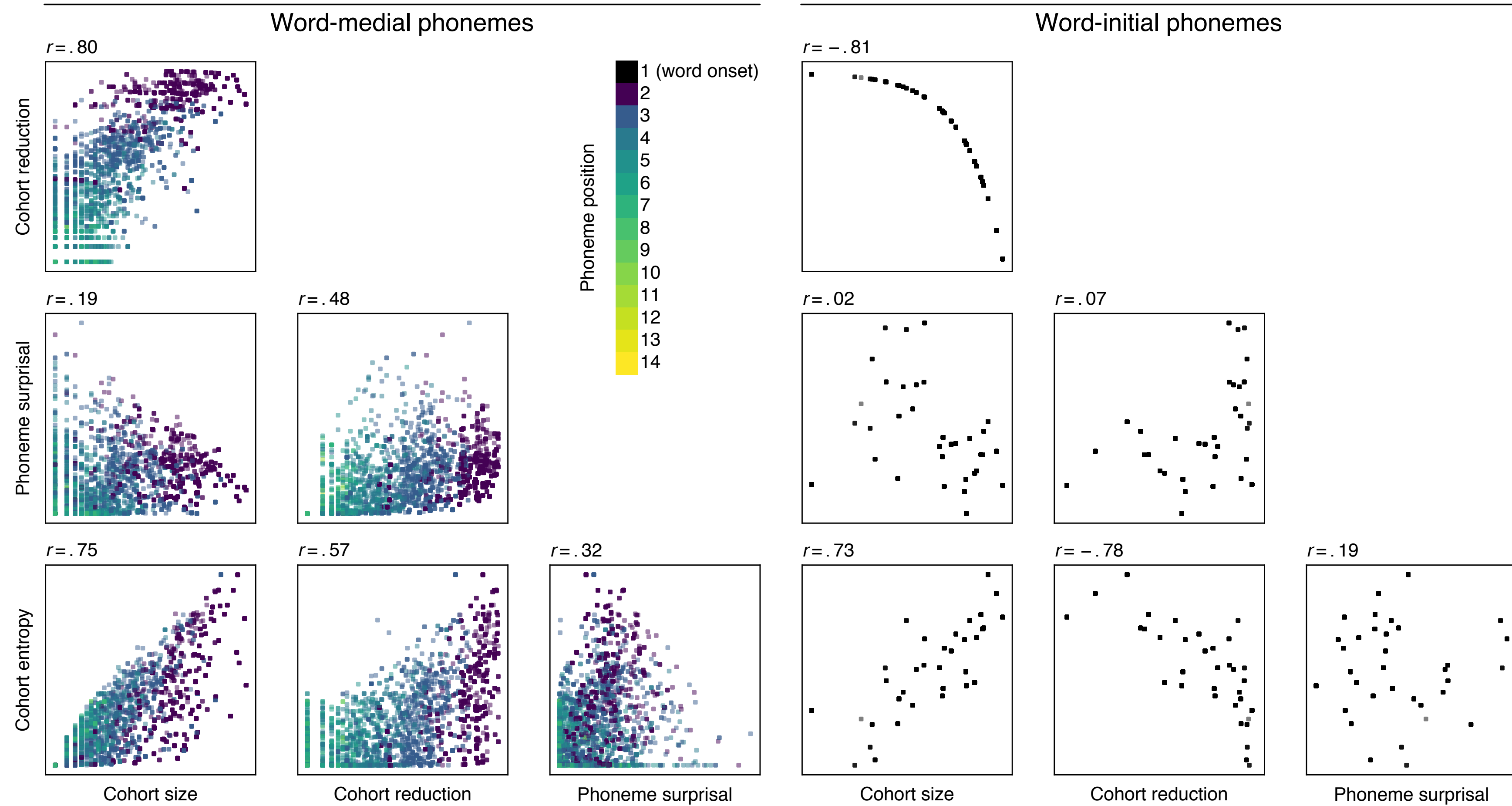
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Data collection
- ▶ NIH, University of Maryland
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Pairwise Correlations



Spatial Separation

