

Is speech production organized for robust
and efficient information transfer?

Esteban Buz

BCS lunch talk — 3/26/2014



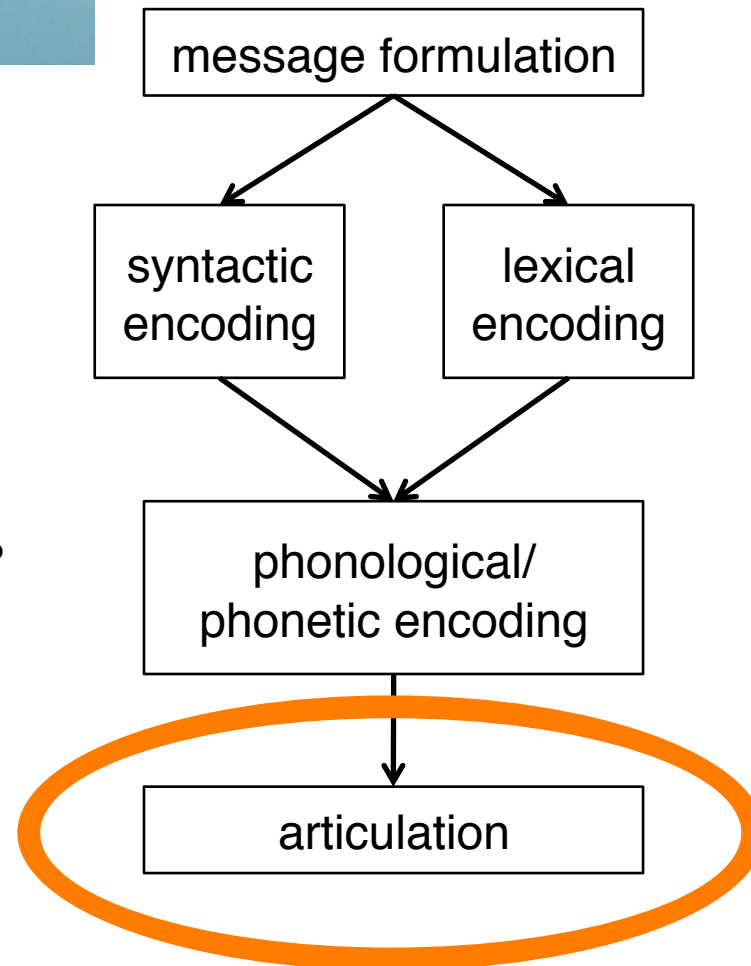
patient: HUCKLEBERRY HOUND
agent: DOG
action: CHASE

active or passive?
dog chase hound
hound chased by dog

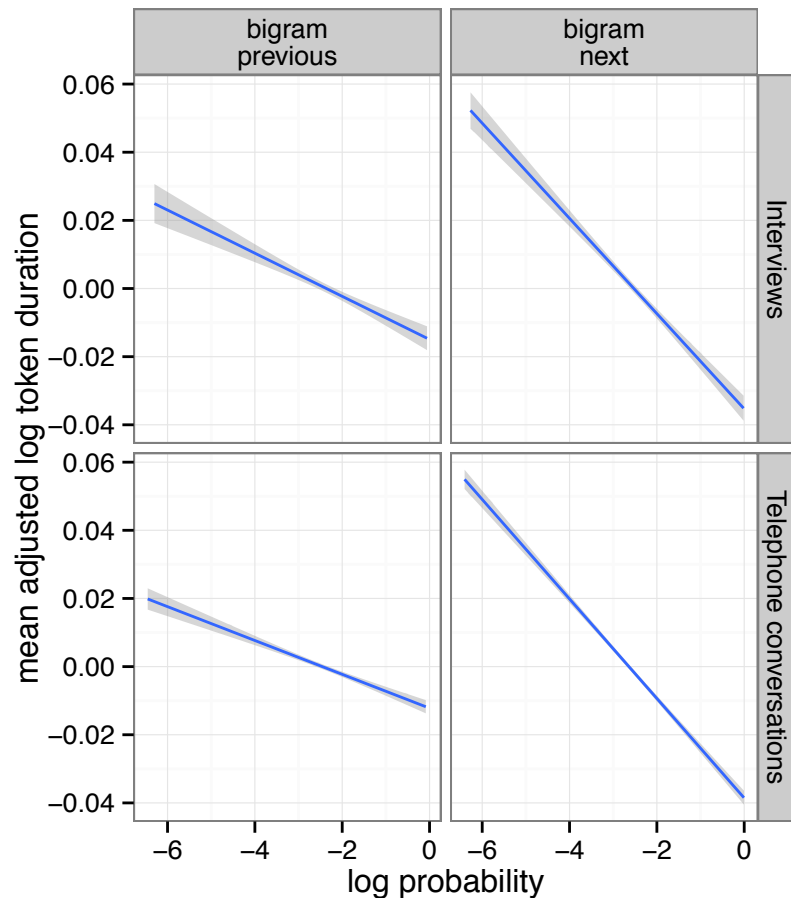
stress/syllabification?
/ˈhʌk əl bɛ ri/
or
/hək əl bɛ ri ˈhaʊnd/

Lexical choice?
dog
or
bulldog
or
English bulldog

speech rate?
hyper-articulation?



Articulation, according to most psycholinguists



Jaeger, Seyfarth, & Buz, in prep

- Predictable words are **shorter** (Aylett & Turk, 2004; Bell et al., 2009; Pluymaekers et al., 2005)
- Predictable → easier to plan → reduced articulated form (Bard et al., 2000; Gahl et al., 2012)
- **Production ease drives articulation**

Articulation: goal-directed (my view)

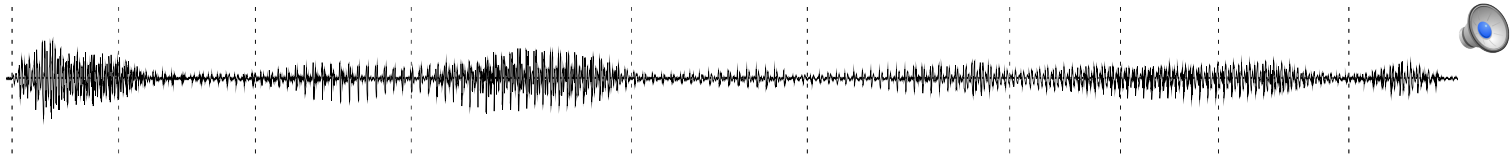
- Production planning *is* important
- **But**, being understood is also important, faithfully transmitting a message is the goal

Articulation: Parallels with motor theory

- Parallels arguments made in the motor control literature: behavior is best understood via reducing **task-relevant** error (Todorov & Jordan 2002)
- If articulation is similar to other motor systems we can view it as including a forward model plus **learning** from past task-relevant error (cf. perspective discussed in Jaeger & Ferreira, 2013)

Articulation is *fast*

In casual speech speakers utter ~5-7 syllables per second



eg. 1 second of speech: 10 syllables, 21 segments, completely incomprehensible out of context.

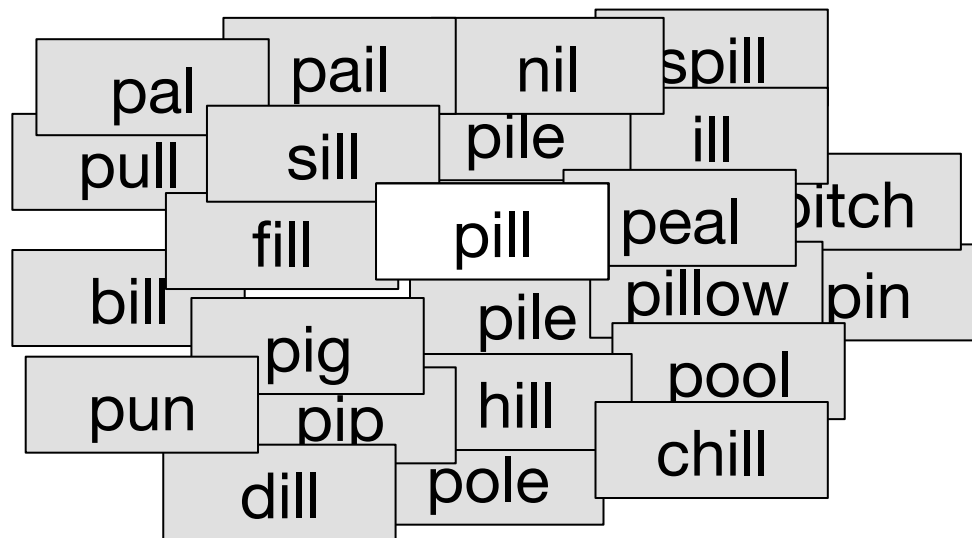
Can we see modulations of behaviors like this?



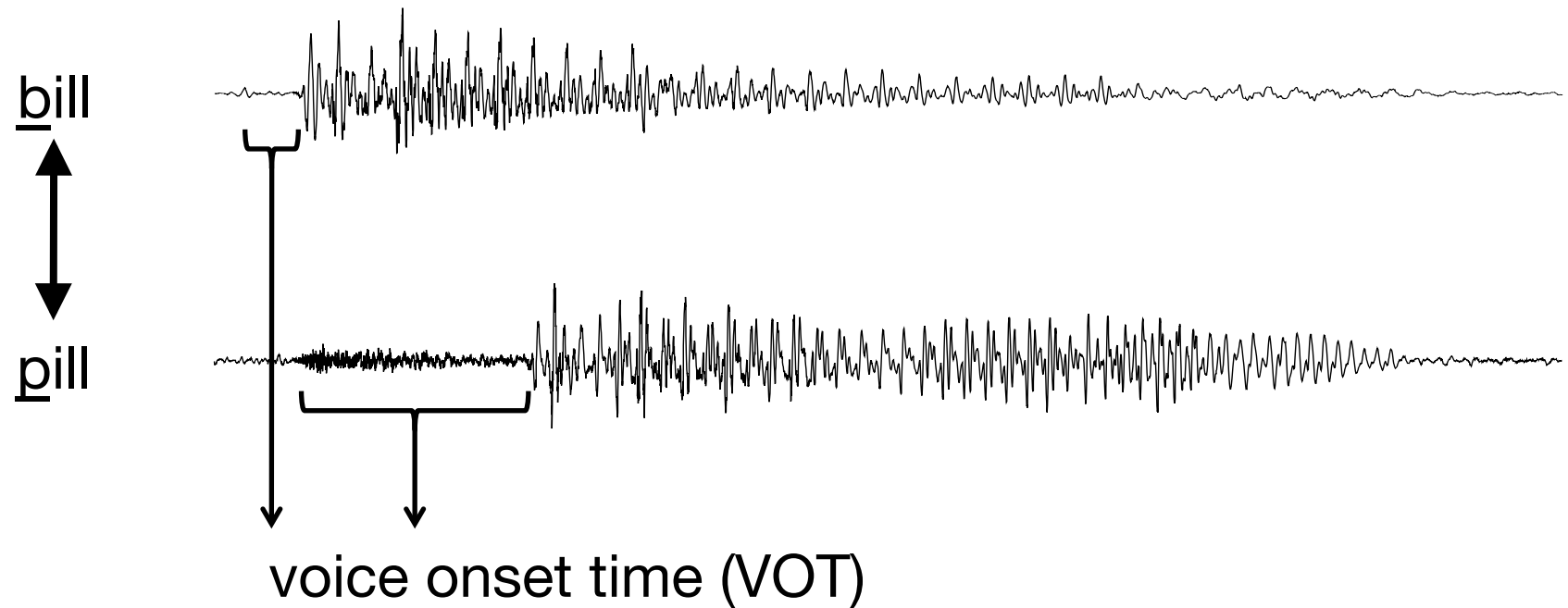
Talk overview

- Prior evidence, two views, and mine
- Three (or four) properties of articulation
- Preliminary data from a (large (partially complete)) study
- Conclusions

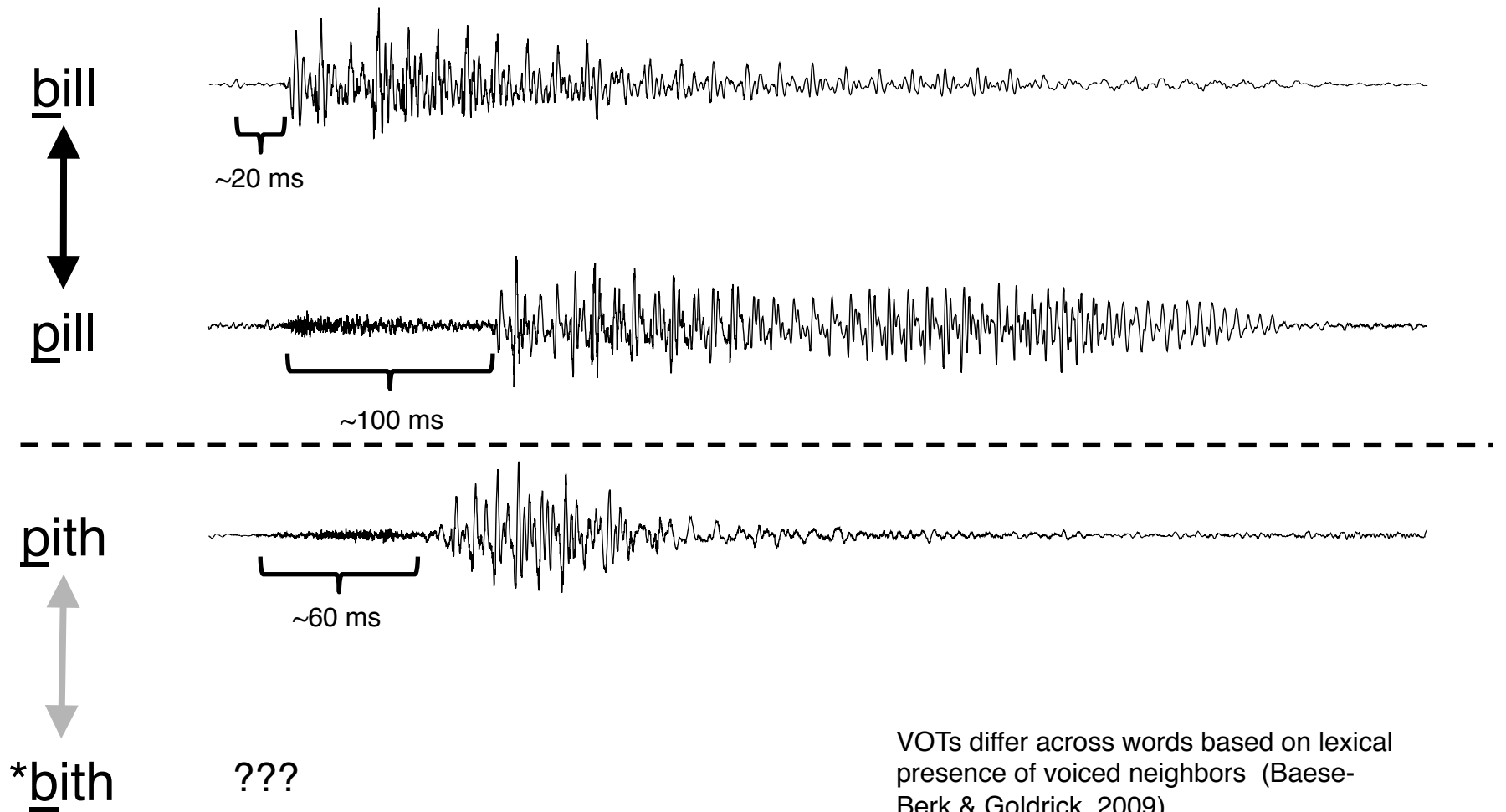
Communication and confusability



Communication and confusability



Communication and confusability



Two standard accounts of these effects

- Word specific phonetics (Pierrehumbert, 2002)
 - acquired
 - not due to decisions
 - **All lexicalized**
- Dynamics of production processes (Baese-Berk & Goldrick, 2009; Goldrick et al., 2013)
 - encoding difficulty
 - not due to communicative pressures
 - **Production ease drives articulation**

Task-relevant modulation



How can we (I) differentiate these views?

Test case: articulation of voicing

- **Contextualized** modulations of articulation
 - Lexical account does not predict contextually driven differences

How can we (I) differentiate these views?

Test case: articulation of voicing

- **Production-ease** modulations of articulation
 - production-ease account predicts articulatory changes are solely the result of planning difficulties

How can we (I) differentiate these views?

Test case: articulation of voicing

- **Task-specific** modulations of articulation
 - to the extent that speakers learn from task-relevant error, modulations should be task-specific

How can we (I) differentiate these views?

Test case: articulation of voicing

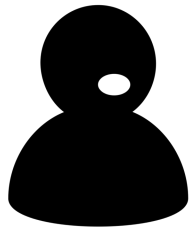
- **Learning drives** modulations of articulation
 - perceived miscommunications should result in task-relevant changes

Is the cloud's production system organized for robust communication?

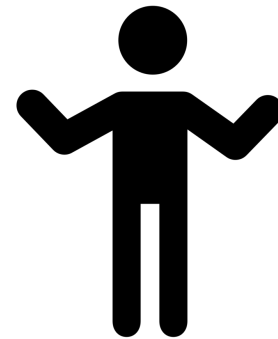
**IS IT ALL LEXICAL: DOES
CONTEXT MATTER?**

Web-based production

bill pill raft

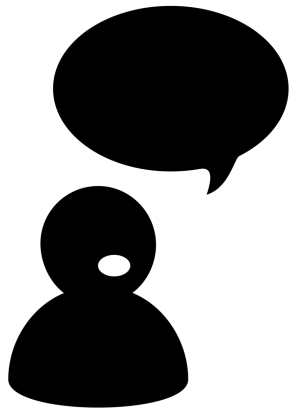


bill pill raft

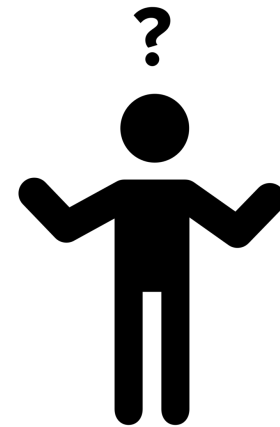


Web-based production

bill	pill	raft
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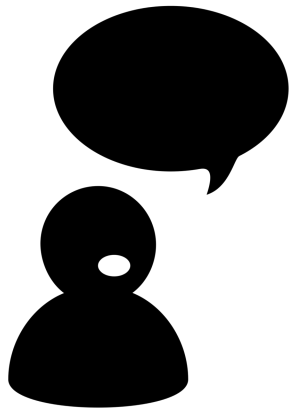


bill	pill	raft
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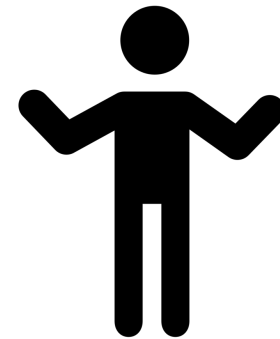


Web-based production

bill raft



bill raft

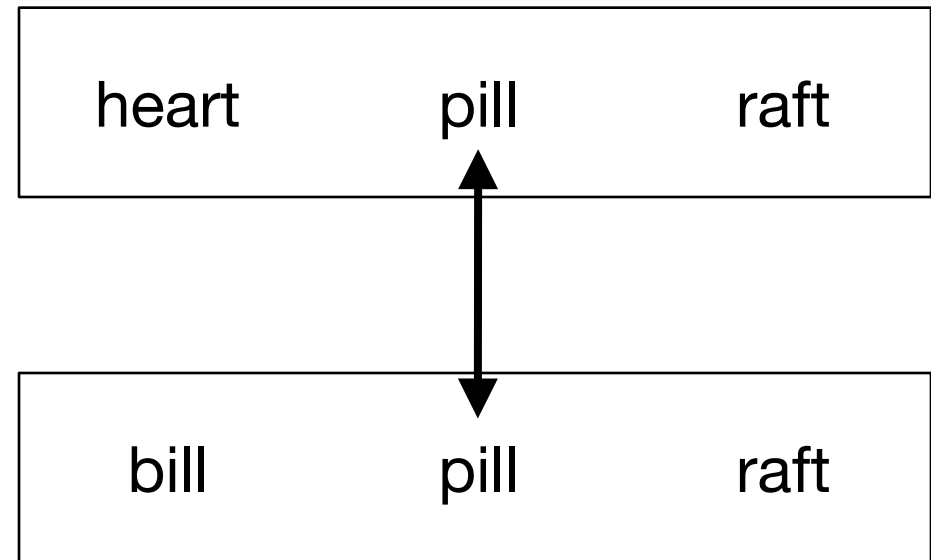


Demo

[speaker task demo](#)

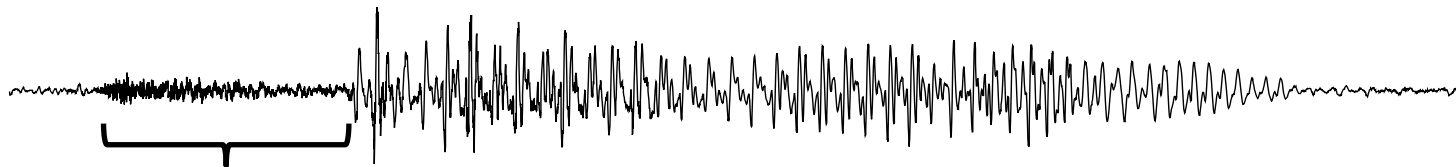
Study: context and specificity

- Interactive word reading
- 36 voiceless onset critical targets
- Context manipulation: target presented with or without voiced minimal pair
- **Question: do participants change target articulation based on visual context?**

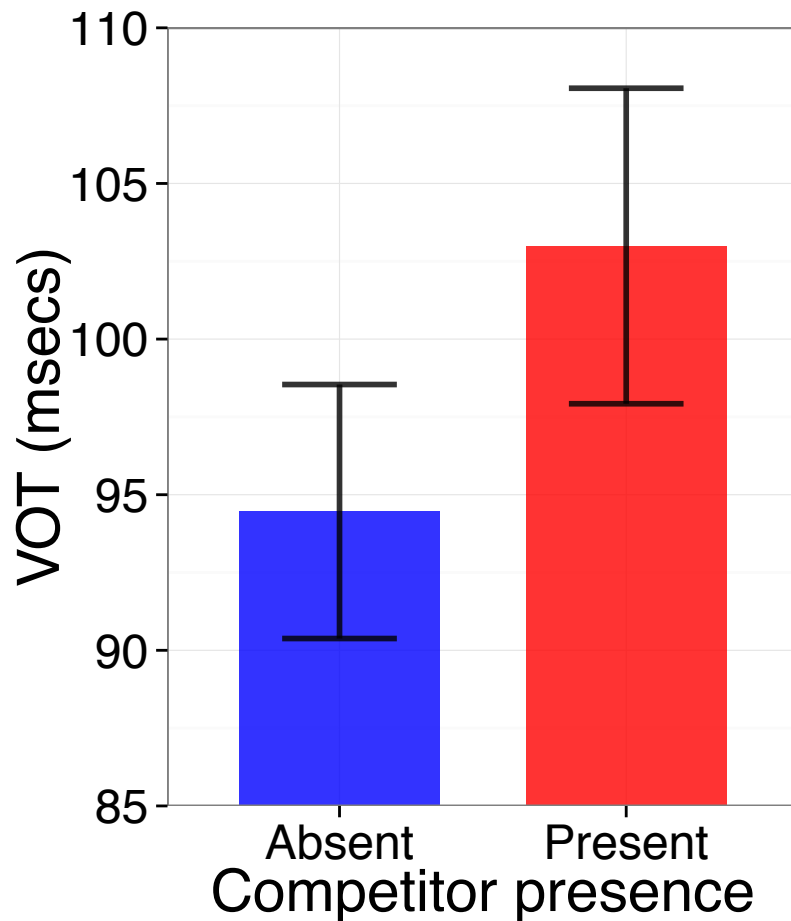


Annotations

pill



VOTs change across contexts



- VOTs are *longer* when a voiced competitor is co-present (linear mixed models, maximal RE structure, $n = 10$ speakers, $p < .01$)
- **Contextual confusable words produced /w more distinguishable signal (hyper-articulation)**
→ **robust communication hypothesis?**

Interim summary

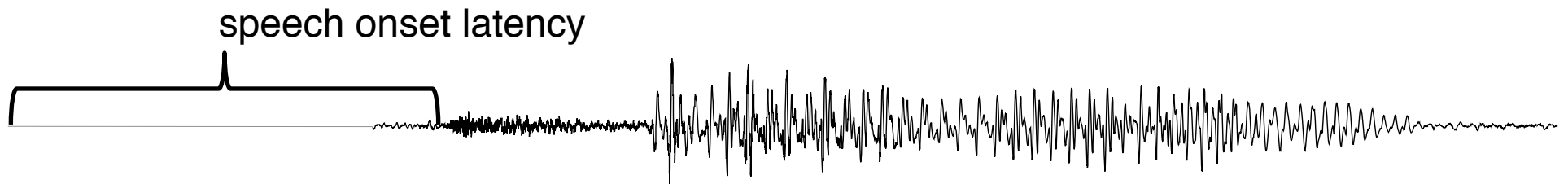
- Mirrors other confusability modulated articulatory changes
 - lexically based VOT changes (Baese-Berk & Goldrick, 2009; Kirov & Wilson, 2012)
 - nhd → increases vowel distinguishability, duration and co-articulation (Munson & Solomon, 2004; Munson, 2007; Scarborough 2010; 2012)
- Contextually driven affects rule out lexical account

IS IT PRODUCTION EASE?

But could this after all be due to production planning?

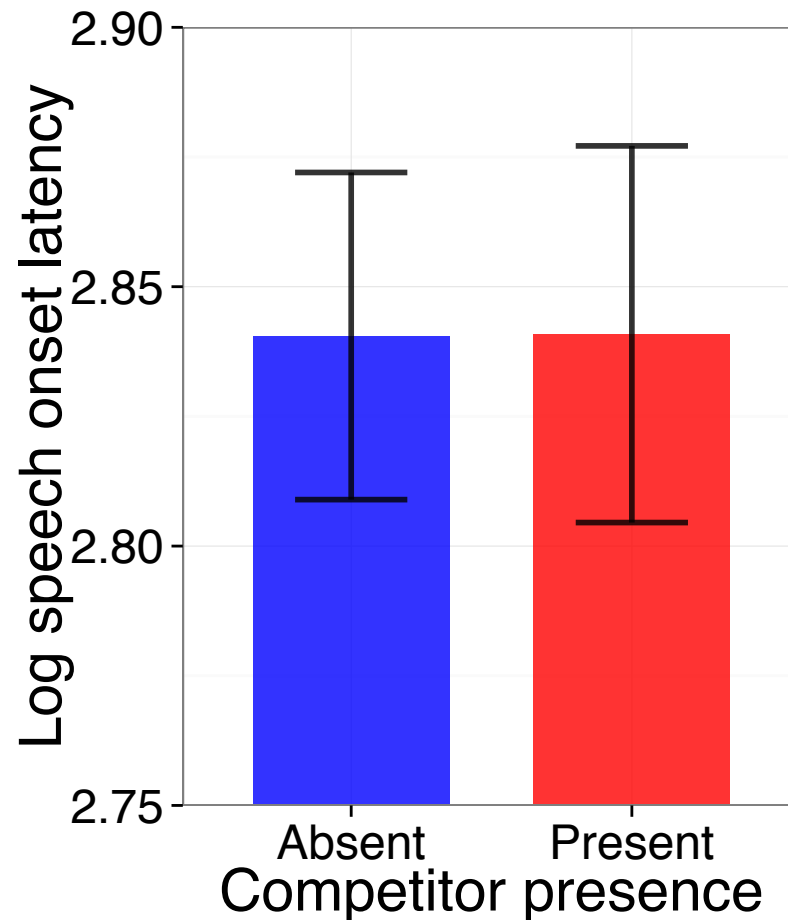
- Modulations of articulation are only driven by production ease (Baese-Berk & Goldrick, 2009; Bell et al., 2009; Gahl et al., 2012)
- Differences in VOTs are the result of differences in planning difficulty (Baese-Berk & Goldrick, 2009)

Speech onset latencies as a measure of planning difficulty



- **Predictions:** a) Speech onset latencies should be longer for more confusable targets and b) latencies should predict VOTs

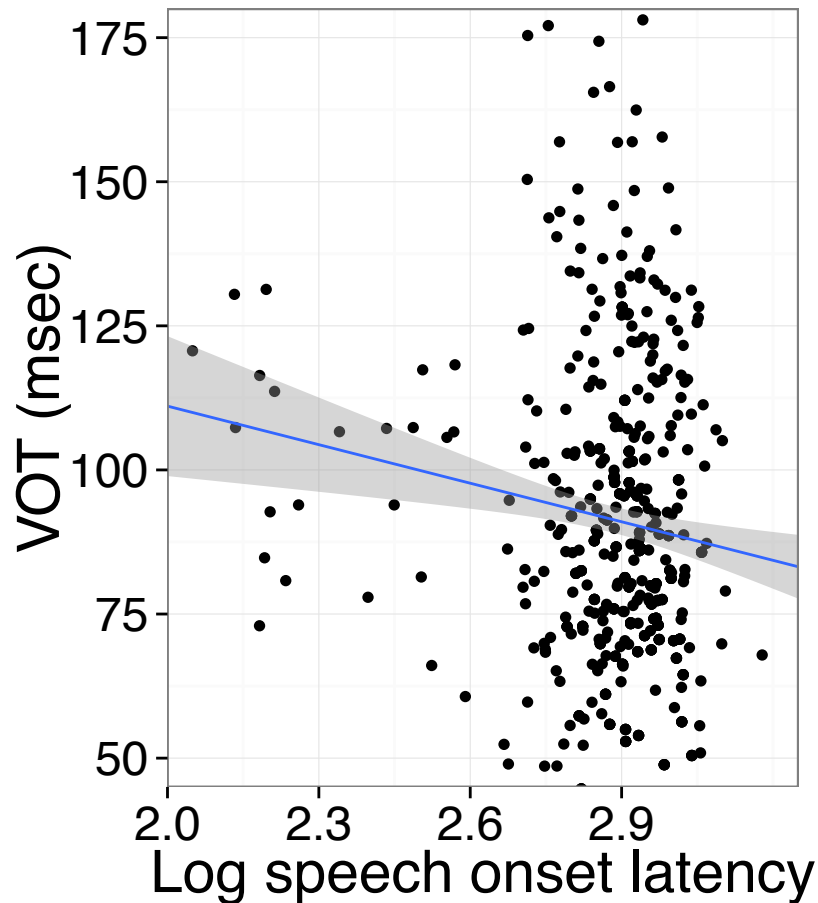
Production planning does not explain hyper-articulation



- Speech onset latencies **are equivalent** with or without competitor co-present ($p \approx .9$)

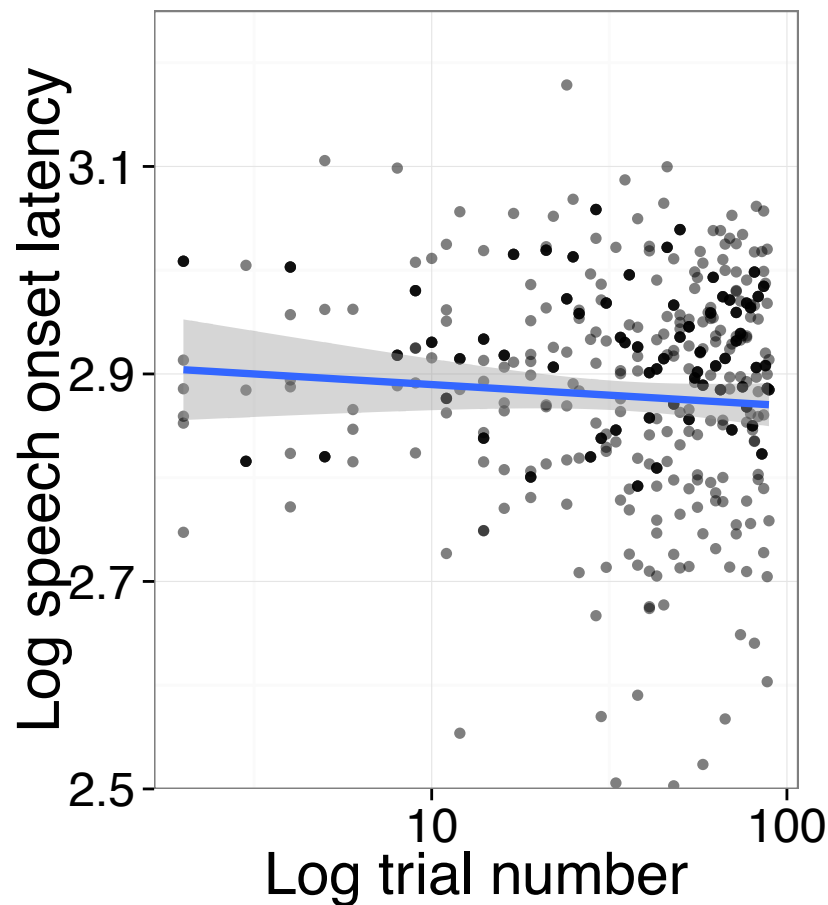
→ **NOT** production-ease account

Production planning *does not explain hyper-articulation*



- If anything, we find longer latencies predict *shorter* VOT

Latencies don't change over time



- Latencies are not significantly different
- Taken with VOT trial-data can't be accounted for by production-ease accounts

Interim summary

- Ruled out lexical account: context matters
- Ruled out production-ease: context doesn't affect planning difficulty (latencies)
- Tentative support for the idea that articulatory modulations are task-relevant
- Next, ...
- **Specificity:** To the extent that speakers can infer the task-relevant hyper-articulation that is informative?
- **Learning:** Does hyper-articulation change as a result of task-relevant error (perceived miscommunication)?

**HOW SPECIFIC IS HYPER-
ARTICULATION?**

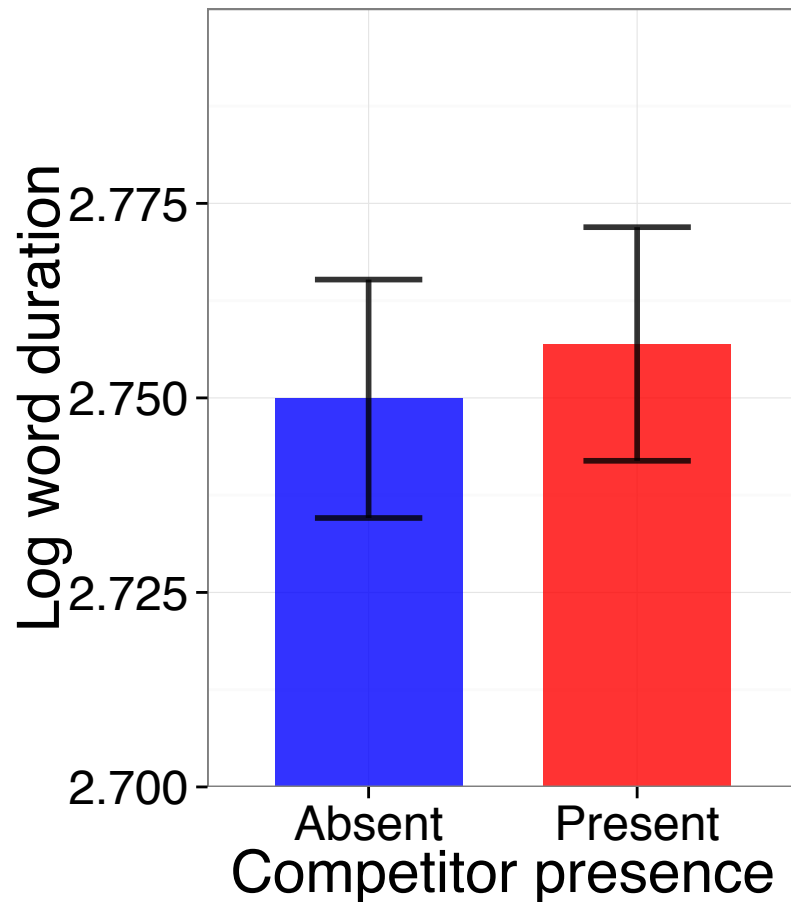
How specific is the hyper-articulation?

- Interestingly, both specific and coarse-grained measures of hyper-articulation have been found to correlate with (contextual) confusability
 - nhd → co-articulation (Scarborough, 2010, 2012)
 - nhd → vowel dispersion (Gahl et al 2012; Munson & Solomon, 2004; Munson 2007, Scarborough, 2010, 2012)
 - nhd → duration (Buz & Jaeger, 2012b, 2013; Gahl et al 2012; Munson & Solomon, 2004; Munson 2007)
 - predictability → duration (Buz & Jaeger, 2012a, 2012b)
- **But**, specific and coarse-grained measures tend to be correlated

So, how specific is the hyper-articulation?

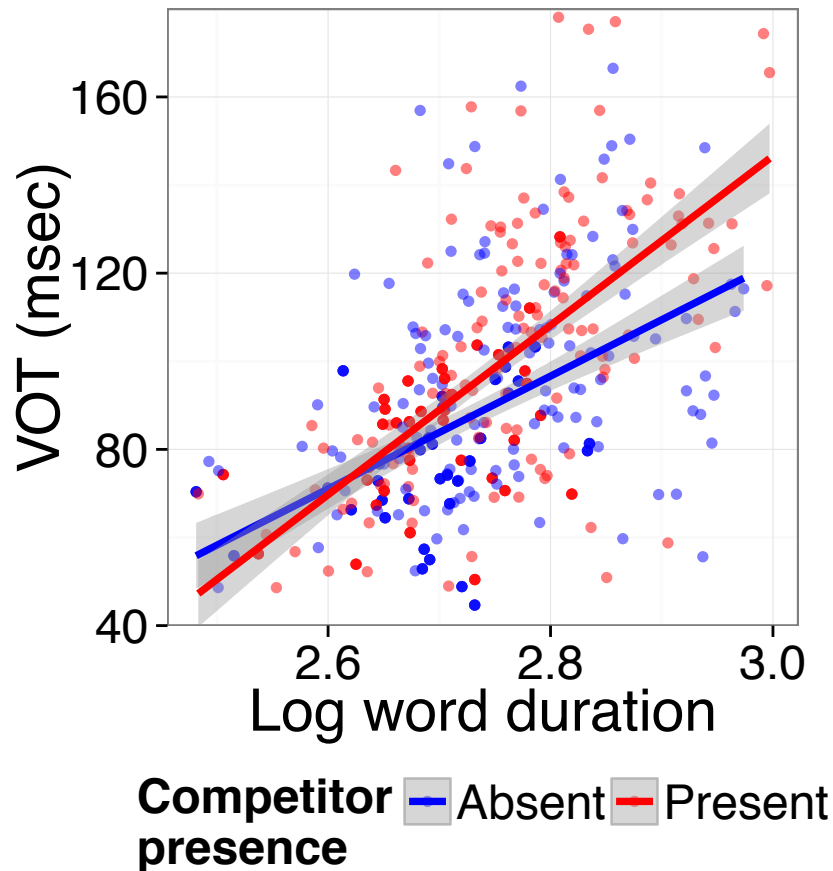
- To the extent that speakers infer (and learn from) the ***task-relevant*** error then modulations should be ***specific***: the part of the signal that carries contextually relevant contrastive information (/p/ in *pill* when *bill* is present) should be hyper-articulated

Word durations do not change across contexts



- Word durations not significantly different with or without competitor co-present ($p \approx .4$)

Hyper-articulation is specific to segment that carries distinguishing information



- Word durations do predict VOTs ($p < .01$)
- But, **context effect holds beyond duration** ($p < .01$)
- Interaction: VOTs are increasingly longer for longer word durations ($p < .01$)

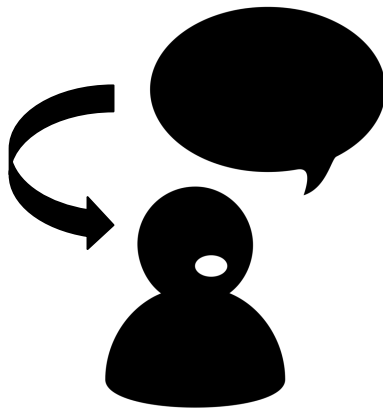
Interim summary

- Hyper-articulation is specific to the contextually relevant distinguishing segment
 - VOTs preferentially lengthened
 - Overall word length doesn't significantly differ across context

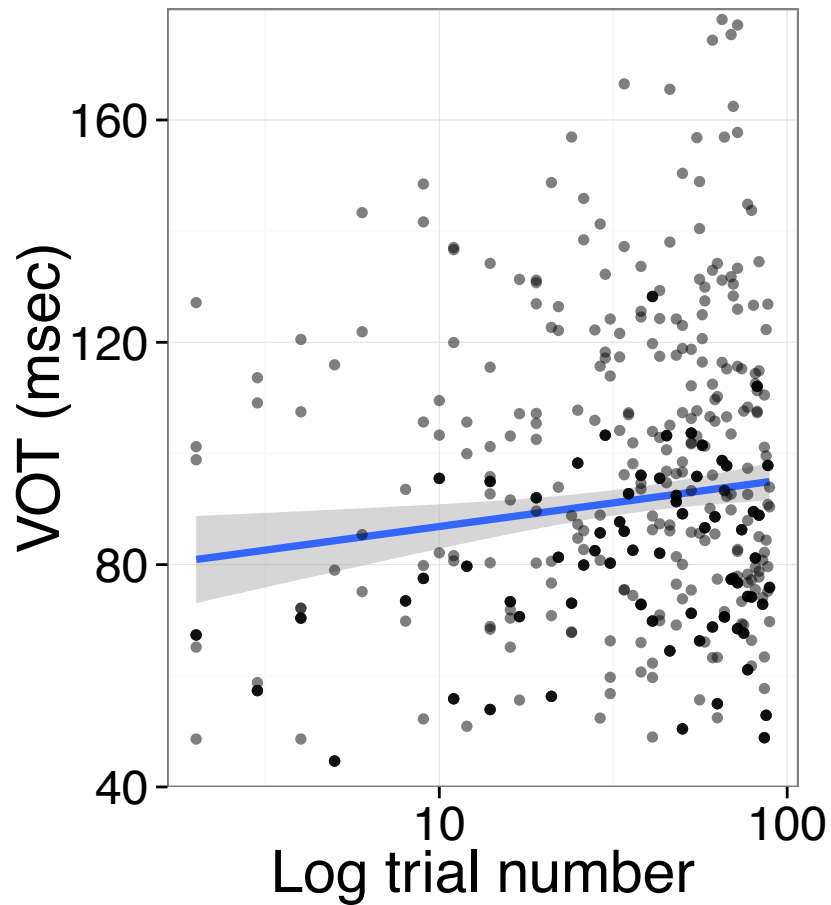
**DO WE *LEARN* WHEN AND HOW
TO HYPER-ARTICULATE?**

Feedback (speaker internal vs external)

- Speakers in previous study 'evaluate' their own speech



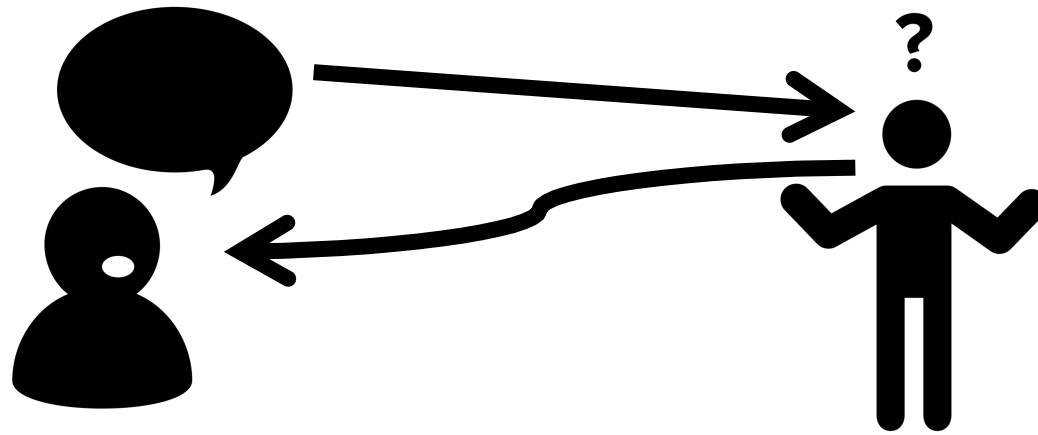
Case for learning?



- VOTs are longer at the end of the experiment ($p < .01$)

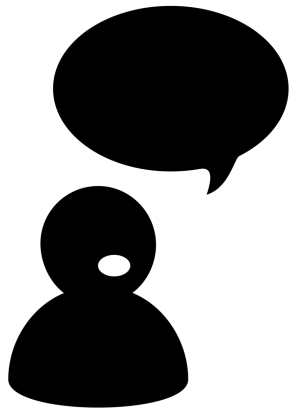
Feedback (speaker internal vs external)

- But the goal is transmit information to someone else, not yourself

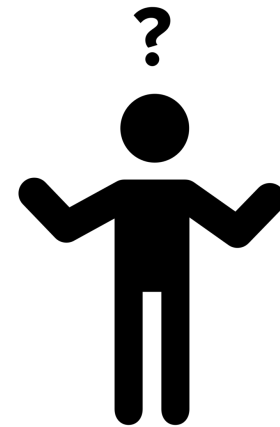


Web-based production w/ feedback

bill raft

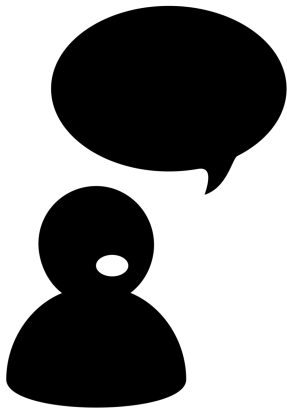


bill pill raft

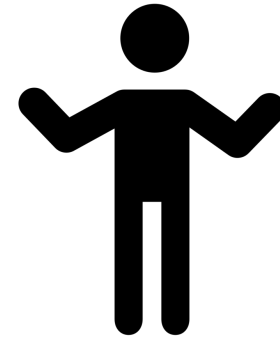


Web-based production w/ feedback

bill pill raft

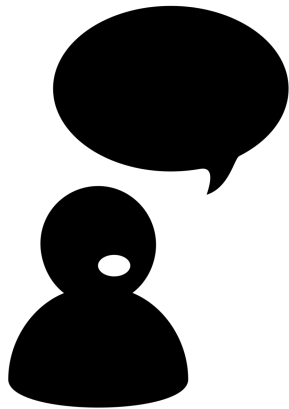


bill pill raft

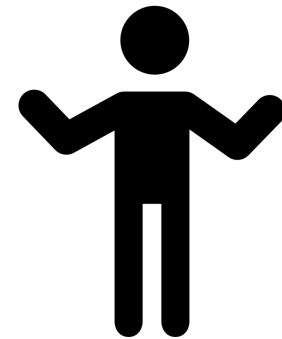


Web-based production w/ feedback

bill	pill	raft
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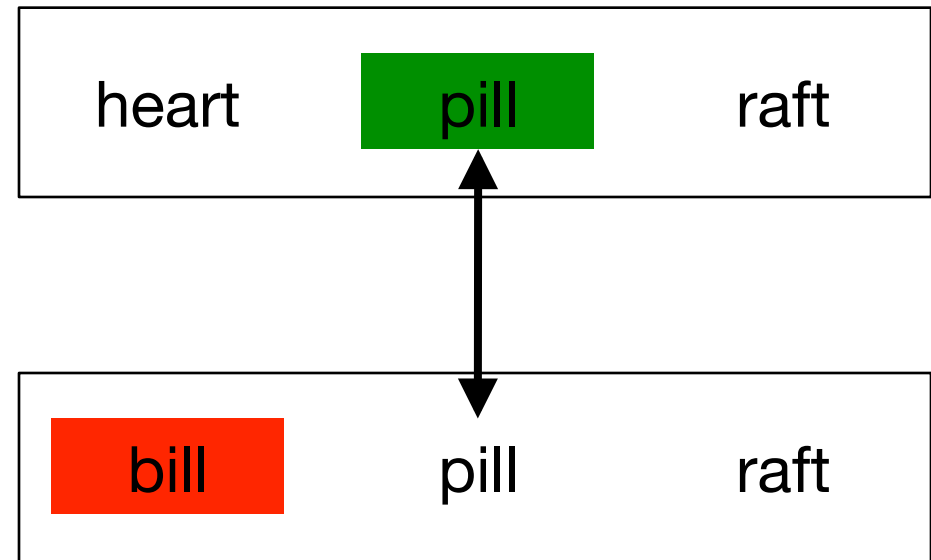


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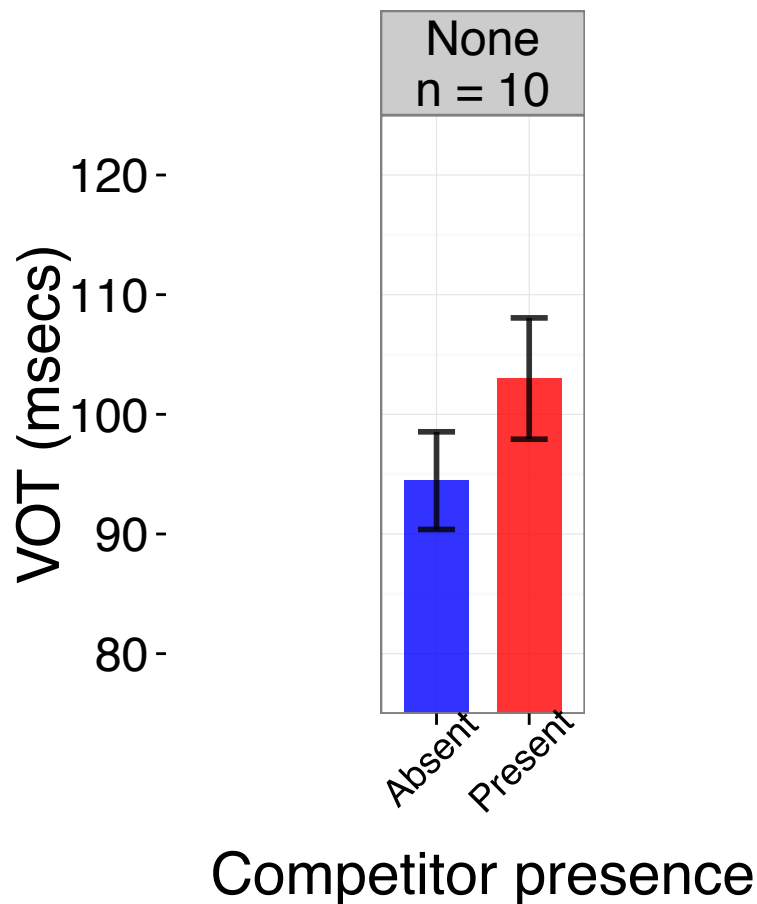


Study: Manipulating feedback

- Same stimuli as the prior study
 - Interactive word reading
 - 36 voiceless onset critical targets
 - Context manipulation: target presented with or without voiced minimal pair
- Participants split into two feedback groups: Positive and Mixed
 - Positive: partner was always right
 - Mixed: partner was occasionally wrong (5 critical trials; 1 filler)
- **Question: do participants change target articulation based on feedback?**

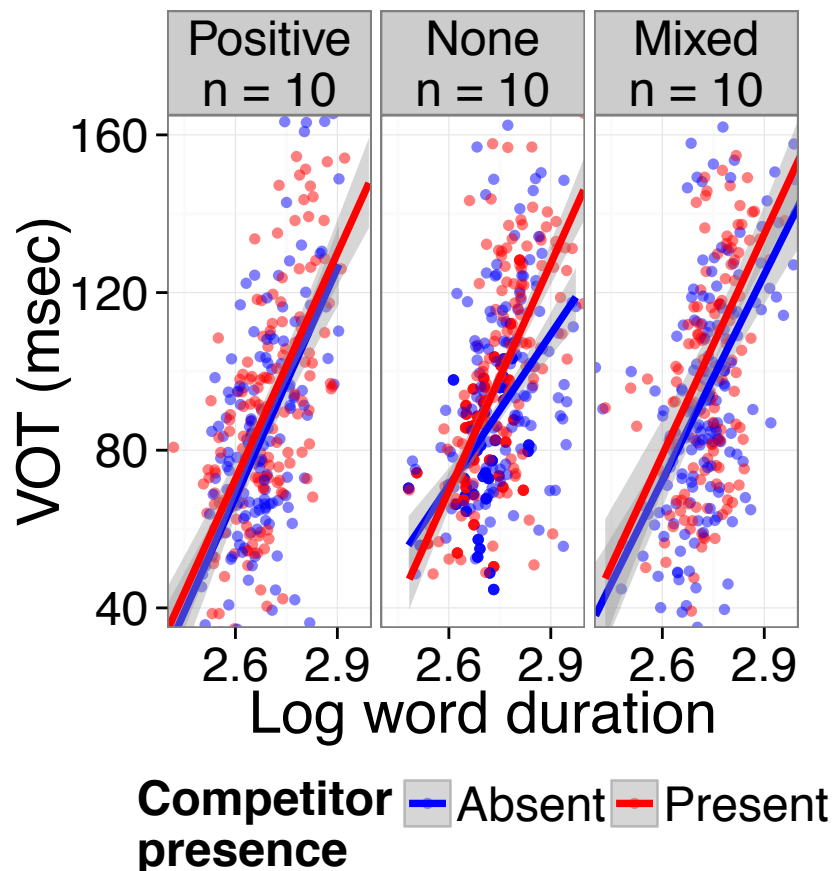


Preliminary VOT results



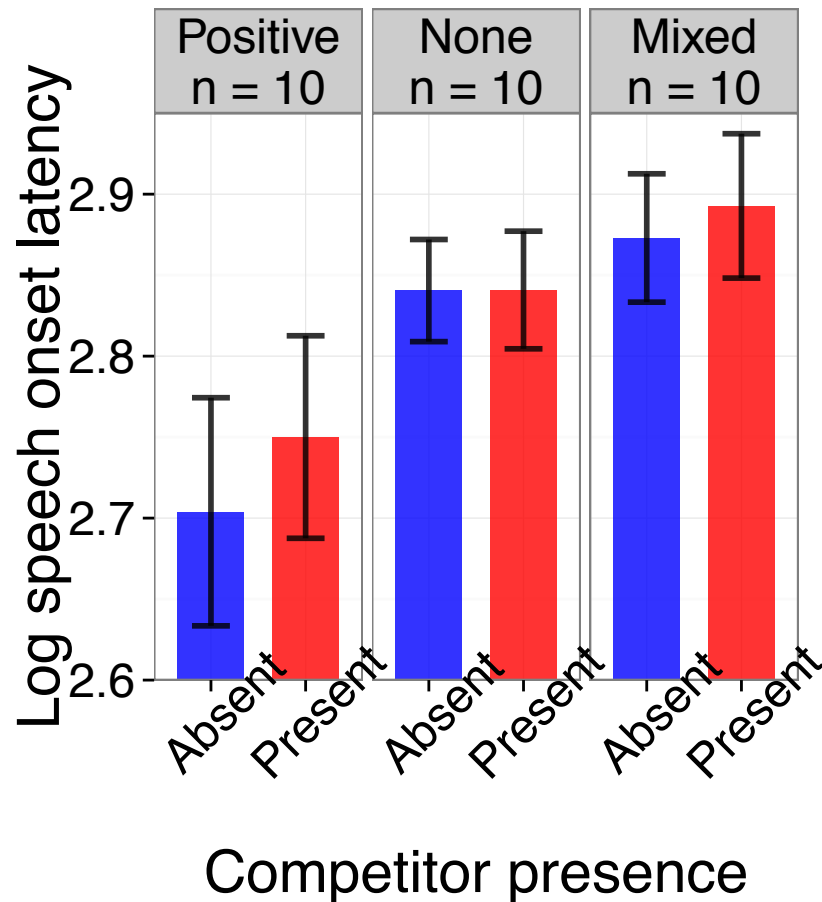
- Feedback nominally affects VOT, though not significantly ($p \approx .2$)
 - Slight interaction, speakers with mixed feedback show greater difference across context ($p \approx .2$)
- Participants adjust articulations based on **perceived** communicative success?
(not predicted by production-ease account)

Hyper-articulation is specific to segment that carries distinguishing information



- Word durations predict VOTs ($p < .01$)
- But, **context effect holds beyond duration** ($p < .01$)
- plus marginally significant interaction: VOTs are increasingly longer for longer word durations

Preliminary latency/production difficulty results



- Speech onset latencies **are equivalent** with or without competitor co-present
- Again, no evidence that context causes production difficulty
- Argues production-ease account of VOT differences

Feedback study summary

- Replication of context effect across feedback groups
 - Participants hyper-articulate VOTs of voiceless target words in the presence of voiced competitors
- Suggestive evidence for the role of feedback
 - Participants across feedback groups had nominal differences in *overall* VOTs and possible interaction
- all tentative (!!)

Conclusions

- Context specific articulations
 - rejects other accounts
- argues for task-relevant modulations of articulation to achieve communicative goals

Potential account for predictability → reduction

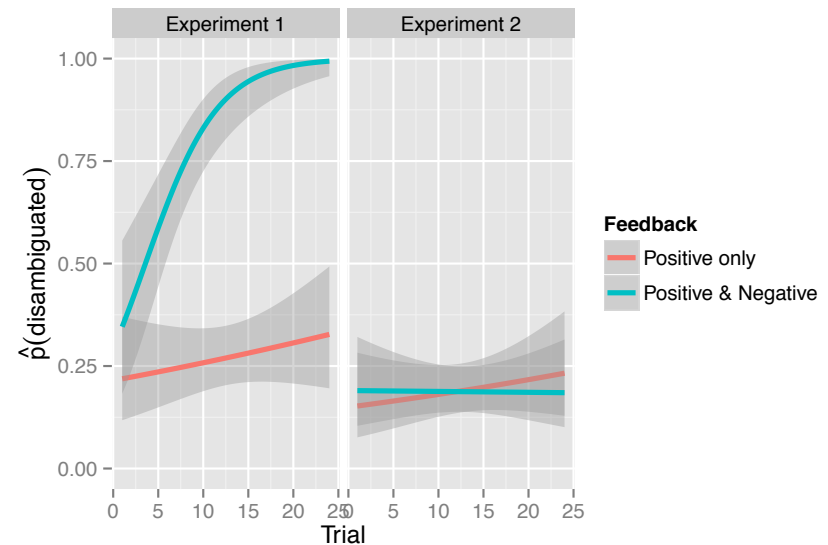
- Speakers provide the input for the next generation of learners
- Production biases toward efficient communication may affect what is learned (see also communicative biases in acquisition, Fedzechkina et al., 2012; 2013)
- Possible route toward generating communicatively efficient properties of language structure
 - Lexical evidence for efficient communication (Piantadosi et al., 2011)
 - Phonetic/phonological (Graff & Jaeger, 2009)
 - Language entropy (Qian & Jaeger, 2012)
 - Dependency length (Gildea & Temperley, 2010)

Open questions: feedback

- Role of feedback on learning
 - What kind?
 - How much?
 - How often?

Open questions: feedback

- Our findings are consistent with other evidence of the role of feedback on syntactic choice in production



Roche, Dale, Jaeger, & Kreuz, under revision

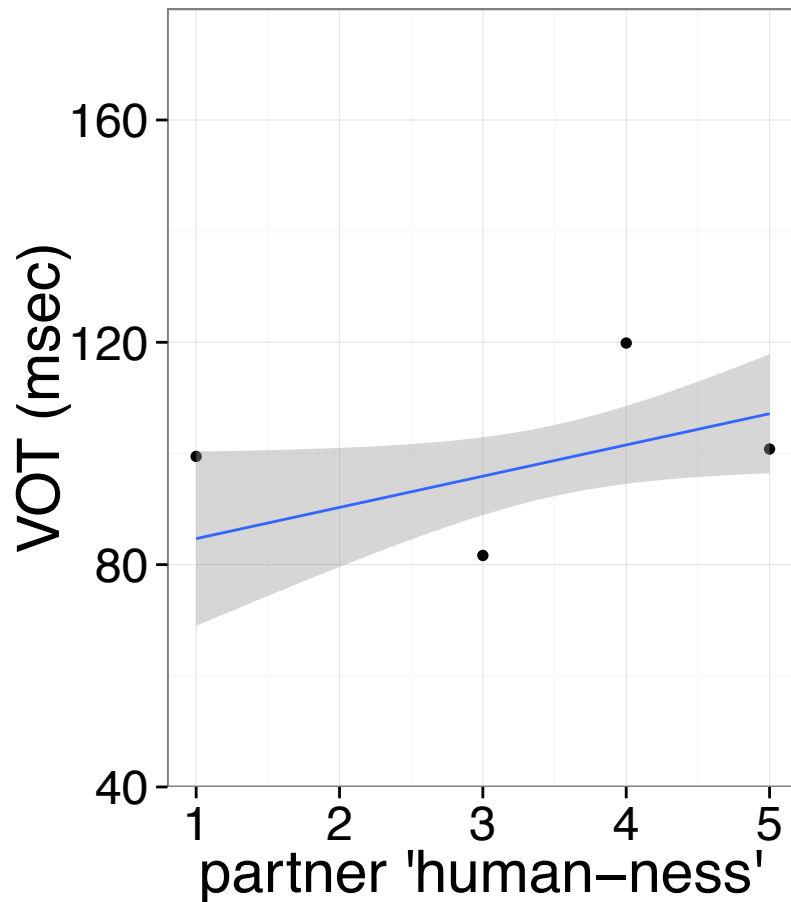
Open questions: speaker behavior

- Speaker-internal
 - What contexts result in articulatory changes?
 - Do speakers make 'arbitrary' articulatory changes?

Open questions: comprehension

- How do these differences affect comprehension?
 - ‘Clear’ speech does improve comprehension (Smiljanic & Bradlow, 2004)
 - Evaluating effects of feature specific modulations on comprehension like the ones presented today is as of yet un-explored
 - Two pilots run by myself have thus-far failed to find comprehension differences

Open questions: comprehension



- Do participants believe our paradigm?
 - Unprompted, majority do not say they noticed anything odd
 - Caveat: when participants are asked to rate how 'human' their partner is, many give relatively low ratings
 - Interestingly, this rating is mildly predictive of VOTs

Evidence for robust communication at other levels of production

- Lexical ‘choice’: lab/laboratory usage varies based on predictability (Mahowald et al., 2013)
- Reference choice supports communication (Arnold, 2008; Clark & Murphy, 1982; Tily & Piantadosi, 2009)
- Inclusion of optional words based predictability (Jaeger, 2006)
- Optional argument omission based on predictability (Kravtchenko, 2013)
- Syntactic structure results mixed: speakers do not avoid syntactic ambiguities (cf. Ferreira, 2008)

Thanks!

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