#### Actuation without production bias

James Kirby, University of Edinburgh <j.kirby@ed.ac.uk>

Morgan Sonderegger, McGill University <morgan.sonderegger@mcgill.ca>

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# Introduction

- Change at the population level is often claimed to be based in phonetic variation at the individual level (e.g. Ohala, 1993)
- One source of variation: production bias (e.g., coarticulation)

WGmc	Pre-OHG	OHG (NHD)
*gasti	gesti	gest ( <i>Gäste)</i>
*lambir	Iembir	lemb ( <i>Lämme)</i>
*fasti	festi	fest ( <i>fest</i> )

Primary umlaut in West Germanic (after Iverson and Salmons, 2006).

 This conference: other types of bias (group membership, cognitive endowment...)

# Stability and change

- Existence of a bias does not mean change is inevitable: default is stability! (Weinrich et al., 1968; cf. Kiparsky's "non-phonologization problem")
- "Accumulation-of-error" approaches often criticized for this very reason (e.g. Baker, 2008)
- Adequate account of actuation must explain:
  - 1. Stability of limited coarticulation in the population;
  - 2. Stability of full coarticulation in the population;
  - 3. Change from stable limited to full coarticulation.

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# Roadmap

- First: summary of previous work showing that one way to get both stability and change at the population level is to assume both
  - 1. a force promoting contrast maintenance, to keep separate phonetic categories stable; and,
  - 2. an external force, such as a production bias, which induces change (cf. Pierrehumbert, 2001; Wedel, 2006).

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Kirby & Sonderegger (2013), Proc. CogSci

# Roadmap

- Then: today's questions
  - 1. Does using production bias as the external force have a unique dynamics?
  - 2. If not, will *any* kind of external force produce the same behaviour at the population level?
  - 3. Broader Q: can we safely assume that any proposed source of change *could* lead to change, iterated over time in a population?

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# Roadmap

• Our example scenario: phonologization of coarticulation

WGmc	Pre-OHG	OHG (NHD)
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• Simple models ⇒ potentially unintuitive outcomes

 Lexicon: {V<sub>1</sub>, V<sub>2</sub>, V<sub>12</sub>}, where V<sub>12</sub> represents V<sub>1</sub> in the coarticulation-inducing context of V<sub>2</sub>



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 Task: learn an offset parameter p: how much /a/ is produced like /i/ in the context of /i/ (/a\_i/)



 Data: F1 values for /a\_i/ tokens, potentially subject to production bias l (assuming fixed /a/, /i/)



• Learner's prior: (strength of) categoricity bias (CB)



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 Population structure: learners learn from (potentially) multiple teachers



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• Outcome: distribution of p in the population at time  $t(\pi_t(p))$ 



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# Effects of varying production bias (KS 2013, Model 3)



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- Only model with **both** production and categoricity biases could achieve all 3 goals:
  - ► stable limited coarticulation (low ℓ)
  - stable full coarticulation (high  $\ell$ )
  - ► change from one to the other (medium ℓ)
- In models with categoricity bias, dynamics are not linear and phonologization is not inevitable (cf. Baker, 2008)

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# Now

- Production bias is the external force most commonly invoked in models of sound change
- ... but clearly not behind **all** changes: many other factors invoked by (socio)phon(eticians), e.g.
  - Contact (between subpopulations)
  - Social weight (of variants, speakers, groups)
  - Interaction (convergence, divergence)
- Today's questions:
  - 1. Does using production bias as the external force have a unique dynamics?
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# Subpopulations in contact: background

- Linguistic features can spread through contact between different groups (e.g. Thomason, 2001)
- These may be different languages, dialects, or subpopulations of a single group
- Are both stability and change possible when heterogenous groups interact?

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Simple instantiation: population divided into two groups:



- Simple instantiation: population divided into two groups:
  - Group a has little/no coarticulation



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- Simple instantiation: population divided into two groups:
  - Group b has extreme coarticulation



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- aProb: P(Group B agent learns from Group A agent)
- bProb: P(Group A agent learns from Group B agent)



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# Model 1: Results



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# Model 1: Discussion

- All three outcomes possible
- Stability can be preserved in both groups even when there is some interaction between them
- But: obtaining just 5% of training examples from a different group can be enough to induce the entire population to converge to a single group's mean

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# Social weighting: Background

- From the pool of synchronic variation, certain linguistic features can spread due to association with
  - particular variants
  - individuals
  - groups

(e.g. Labov, 2001)

 Are both stability and change possible in the presence of social value associated with:

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- more coarticulated variants (nearer to [i])
- speakers who coarticulate more
- ▶ groups ″″

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# Models 2-4: social weighting

- Each token  $y_i$  has a social weight  $w_i \in [1, w_{max}]$
- Higher social weight associated with:
  - Model 2: more coarticulated tokens (nearer to [i])
  - Model 3: tokens from teachers who coarticulate more
  - Model 4: tokens from high-coarticulation group
- Learner estimates p using weighted average of the y<sub>i</sub>
  - tokens which are {more coarticulated, from teachers/group which coarticulate more} have more influence

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### Model 2: social weighting by variant

- Start with a single population, little coarticulation
- Parameter: *w<sub>max</sub>* (preference for coarticulated variants)



# Model 2: Results

Varying *w<sub>max</sub>*:



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# Model 2: Discussion

- All three outcomes possible
- Stability can be preserved even when coarticulated variants are socially valued
- But: social value of coarticulated variant just 10% more than uncoarticuated variant can be enough to induce change to full coarticulation in the whole population!

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# Model 3: social weighting by group

• Same architecture as Model 1:



but with additional parameters: weight of

- data from group A for learner in group B: aWeight
- data from group B for learner in group A: bWeight

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# Model 3: Results

Fix aProb = bProb = 0.03



# Model 3: Discussion

- All three outcomes possible
- Stability can be preserved even when group with high coarticulation socially valued
- But: even a small preference for tokens from coarticulating group can be enough to induce change to full coarticulation in the whole population.

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# Interim summary: Models 1–3

- Question 1: does driving force = production bias give unique dynamics?
- No: very similar dynamics when driving force is
  - 1. extent of contact
  - 2. social weighting of variants
  - 3. social weighting by group
- Question 2: will any kind of driving force produce the same behavior?

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# Model 4: social weighting by individual

- Setup: every teacher in generation *t* has
  - a social weight
  - a value of p
- If these happen to be positively correlated (i.e., data from teachers who coarticulate more is more highly valued):
  - more coarticulation in generation t + 1
  - could accumulate and lead to change
  - (cf. Baker, Archangeli & Mielke 2011)
- Parameters:
  - *w<sub>max</sub>*: maximum social weight
  - ρ: correlation between teacher's prestige and degree of coarticulation

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### Model 4: Results



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# Model 4: Discussion

- Stability: default
- Change: not really
- Driving force is much weaker than Models 1–3! "Change":
  - 1. requires near-perfect coarticulation/social weight correlation, individuals who coarticulate weighted 100-1000x higher than individuals who don't.
  - 2. is very slow (1000s of generations)
- Compare: change in < 200 generations for small increases in driving force in Models 1–3

# Model 4: Discussion

- Models 2– 4: all implementations of social weight. Why are dynamics of Model 4 different?
- Social weight on individuals (M4):
  - correlation between w and observations: weak
- Social weight on groups (M3):
  - correlation between w and observations: stronger
- Social weight on variants (M2):
  - correlation between w and observations: perfect
- Question 2: will any kind of driving force produce the same behavior?
  - No

#### Conclusions

- different external forces + categoricity bias = similar population dynamics
  - Implication: a similar dynamics may underlie actuation of changes initiated from different sources
  - Good: sound change can have different sources, and doesn't show radically different dynamics by source (?)
- But not all external forces give both stability and change
  - Some intuitively plausible mechanisms "too noisy" to have an effect iterated over time in a speech community.
  - Population dynamics as partial solution to the "non-phonologization problem"

# Thanks!

- Ideas/comments:
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