

## Class 5, 3/16/2018: Model Evaluation II; Knobs

### 1. Assignments

- Read:
  - Coetzee, Andries and Shigeto Kawahara (2013) Frequency biases in phonological variation. *Natural Language and Linguistic Theory*, 31: 47-89.
- Hand in homework on medial clusters.
- New homework on bias, due in class Monday April 23.

GO OVER THE NEW HOMEWORK

### 2. Look at homework printouts and explain

MORE ON MODEL EVALUATION; WILSON AND OBDEYN

### 3. What we have so far: empirical

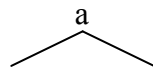
- The basics of consonant occurrence pattern: avoid similars in the same root.
- Defining “similar” is the toughie, and by now there are many approaches.

### 4. What we have so far: methodological

- A strong attack on statistical ad hockery: watch out for intuitively-plausible but mathematically ungrounded methods.
- Wilson Obdeyn concocted data:
  - Maxent fully recovers the “intent of the founders”
  - Observed/Expected introduces a phoney result, namely stricter cooccurrence for noncoronals.

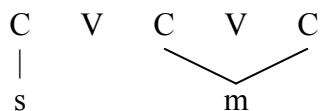
### 5. Back to the root-cooccurrence data: The curious override to the similarity-avoidance principle

- Arabic is a canonical case of avoiding similar consonants in roots, but it also loves “biliteral” roots with *identical* consonants.
  - /samam/ ‘to poison’
  - This was an elegant focus of John McCarthy’s 1979 Ph.D. dissertation,<sup>1</sup> where he used autosegmentalism to make such roots genuinely biliteral.



---

<sup>1</sup> *Formal problems in Semitic morphology and phonology*, [https://works.bepress.com/john\\_j\\_mccarthy/](https://works.bepress.com/john_j_mccarthy/)



- /samam/ is ok because of left-to-right “spreading”, \*/sasam/ would require right-to-left and is not ok.
- Autosegmental morphology is mostly gone, I think, due to contradictions: sometimes you want consonants on a separate tier, sometimes the same.
  - Nowadays we can use straightforward linear representation, Correspondence Theory to describe morphemes, and suppose Semitic languages are special in despising CONTIGUITY.

/s<sub>1</sub>m<sub>2</sub>/, /a<sub>3</sub>/  
[s<sub>1</sub>a<sub>3</sub>m<sub>2</sub>a<sub>3</sub>m<sub>2</sub>]

## 6. Modern views of the override

- Zuraw (2002) has found that speakers love to interpret roots as *reduplicated* if they can, and exaggerate the degree of resemblance through mispronunciation: [pampam] for *pompon*.
  - Zuraw, Kie (2002). Aggressive reduplication. *Phonology* 19. Pp. 395-439.
- So /samam/ looks perhaps like constraint ranking; it’s horrible for similarity, great for “be reduplicated”.
- Coetzee and Pater (2008) later noted, re. the same sort of override in Muna:
  - “In particular, in many cases the identical consonants do precede identical vowels, suggesting some form of reduplication”

## 7. A spectacular proposal

- Early version:
  - Frisch, S. A., Broe, M. B., and Pierrehumbert, J. B. (1997). Similarity and phonotactics in Arabic. Bloomington, IN and Evanston, IL: Indiana University and Northwestern University, ROA-223.
- Later:
  - Frisch, S. A., Pierrehumbert, J. B., and Broe, M. (2004). Similarity avoidance and the OCP. *Natural Language & Linguistic Theory*, 22(1):179–228.
- Key idea:
  - There is *one* mechanism for computing similarity in phonology, and you don’t even have to do phonetics to access it!
  - You need to make a list of all the natural classes in the language (often about 600, easy to do with computer)
  - Then, for two segments, compute

(shared natural classes) / ((shared natural classes) + (unshared natural classes))

- Dissimilarity is then predicted by taking this one single dissimilarity measure as a constraint.
- This amazingly simple and restrictive theory got quite a lot of empirical mileage!
- It got the special status of coronals for free: there are *more coronals* in virtually any language, and so more natural classes involving them, and so in general less similarity between them.
- People like me adopted the similarity metric for other purposes (e.g. Albright and Hayes 2001, *Cognition*).

## 8. Coetzee and Pater's contributions

- Coetzee, A. W. and Pater, J. (2008). Weighted constraints and gradient restrictions on place co-occurrence in Muna and Arabic. *Natural Language & Linguistic Theory*, 26:289–337.
- Language specificity: What works for Arabic doesn't work for Muna (Western Austronesian)
  - “Arabic shows an overwhelming effect of sonorancy agreement in lowering attestedness, while Muna has a more balanced contribution of voicing, sonorancy and stricture.”
- We are in familiar territory: learning phonotactics with multiple constraints, using a data corpus.
- They also advocate a particular measure of phonotactic well-formedness:
  - “We argue for a definition of Harmony-based well-formedness in terms of the difference between the [harmony] score of an Input-Output mapping and the optimal distinct mapping for the same Input.”
  - For instance, for [t ... s] the best output candidate might be [p ... s].
- Constraints: they advocate a *very rich* model, in which constraints target specific combinations of place feature and manner feature.

“Assign a violation mark to a sequence of nonidentical consonants that both have place of articulation P and agree in specification for S; where  
 P is drawn from the set {Pharyngeal; Dorsal; Coronal; Labial}  
 S is drawn from the set {Sonorancy; Stricture; Voice; Emphatic; Prenasalization}”

- Summarizing:
  - Discovery of language-specific effects
  - Modeling of languages with inventories of phonotactic constraints and a Harmony-based framework.

## MODEL EVALUATION IN WILSON AND OBDEYN

### 9. The primary method

- Likelihood, as we have been working with.
- This is the metric of *accuracy*.

## 10. Accuracy is not enough

- Model complexity must also be determined.
- Simple example proving this: a model with these constraints:
  - \*p p, \*p t, \*p k, \*t p, \*t t, \*t k, \*k p, \*k t, \*k k (and so on for all possible pairs) cannot but succeed in provide a *perfect match to data*, but is worthless as an explanation.

## 11. Where they head with the math

- Laplacean approximation, which combines a measure of accuracy with a measure of model restrictiveness.
- I have not seen this used elsewhere but it might be nice if someone comes up with a shareable script for R.

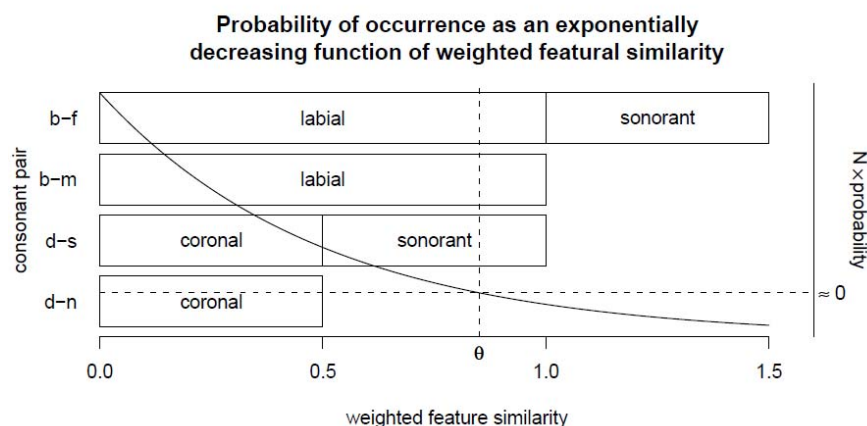
BY THE WAY, WHO WON?

## 12. The narrow question at hand

- Coetzee and Pater's claim to have improved on Pierrehumbert's team's account is refuted; it's more of a tossup.
- Wilson and Obdeyn's theory:
  - maxent and probabilities, of course
  - Constraints are a simplification of Coetzee and Pater's:
    - normal \*LAB LAB, \*COR COR, etc.
    - Role of manner:
    - “Don't agree in [voice], [son], etc., *if you agree in place*”
    - (so, simpler; not crossing every place and manner feature)
    - (the italicized bit perturbs me and I'd like to know how well we can do without it)
- The clear winner by the Laplace approximation criterion is this theory.
- I would love to know what happens if you do something even simpler: just weight all the features, punkt.

### 13. The explanation for indifference of labials and velars to manner

- It's really trivial, if Wilson/Obdeyn are right:
  - Saturation
  - Weights of OCP-lab and OCP-dorsal are high enough that further nuances from manner don't affect probability much, (remember the purposes of exponentiation in maxent).



## KNOBS

### 14. A primary crime in the study of free variation

- Give up and attribute to randomness what is not random.
- Editorial: Interestingly, the prosecution of this crime is the work of people who themselves are really naïve about the existence of variation! Variationists should be grateful to them.

### 15. Some possibilities for missing crucial things

- Obviously: **missed phonological contexts** (didn't solve the problem right).
- Genuine **dialect variation**, mixing invariant speakers to produce pseudo-variation imagined to occur in the linguistic competence of a single speaker.<sup>2</sup>
  - I'm really skeptical of this — how do we isolate these “dialects”?
  - Unless the dialects really do *sound* like dialects, Junior is likely to blend the ambient data, learning a free-variation grammar.
  - The other way these “dialects” could arise is if people are bad language-acquirers and leap to different conclusions from the same data.
- Knobs

<sup>2</sup> There's a literature on this, which I'm out of time for hunting down ...

## 16. Knobs

- This term is not part of formal linguistics but perhaps it ought to be.

## 17. Definition

- A **knob** is a scalar quantity which:
  - Is derived from some non-grammatical, non-lexical property of the world.
  - Is accessed by the grammar and influences quantitative outcomes.
- Feel free to imagine the phonology as a machine with four knobs, and the inner speech-homunculus twisting them back and forth purposefully.

## 18. The four great knobs<sup>3</sup>

- Speaking **style**
  - the subject of much sociolinguistics
  - who you are talking to, what kind of impression you want to make
- Speaking **rate**
  - See Lefkowitz (2017 UCLA dissertation), Flemming and Cho (*Phonology* 2017)
  - N.B. rate is not style! Subjects in sound booths asked to speak quickly will generally perform heroic efforts to keep the style knob high as the rate knob increases.
- Speaking **emphasis**
  - Liberman and Pierrehumbert, to be covered later, on pitch scaling in English
- **Lexical frequency**
  - readings, and much other work

The idea is that these have on-line varying values and the phonological grammar responds.

## 19. A connection to Faithfulness?

- Speakers tend to produce more Faithful representations when they speak formally, slowly, emphatically, saying rare words.

## 20. Phonology and phonetics

- Both plainly participate.
- If there are knobs, they drive the phonetic component at least as much as the phonology.

## 21. How quickly are the knobs turned?

- Lexical frequency: as fast as we move on to new words as we speak; i.e. fractions of a second.

---

<sup>3</sup> Are there others?

- Speaking emphasis: perhaps the same? Confounded with a structural notion, focus, which is not a knob but part of the linguistic representation.<sup>4</sup>
- Speaking rate: I'm not sure; probably can go up and down through a sentence.
- Style:
  - I sense it's pretty constant, but virtuosos swoop in and out of the vernacular for effect.

## 22. Some things that get studied but I suspect not knobs

- Speaker properties:
  - Age
  - Education
  - Ethnicity
- I am inclined to regard these as topics for dialectology/diachronic linguistics.

## 23. A Negative Example

- Suppose that in Brooklyn, Italian-Americans simplify their final consonant clusters more than people of Eastern European Jewish ancestry.<sup>5</sup>
  - N.B. they are all native speakers of English
- Is there a knob for ethnicity?
- This presupposes that Frank of Brooklyn perfectly knows the deletion pattern of Morris of Brooklyn and vice versa — this I doubt.

## 24. A positive example: sex of speaker

- In Lakota, there are formalized, systematic differences between men's and women's speech.<sup>6</sup> Quoting (gaak!) Wikipedia on clitics:
  - *Yeló* (men) *ye* (women) mark mild assertions. *Kštó* (women only according to most sources) marks strong assertion. *Yo* (men) and *ye* (women) mark neutral commands, *yethó* (men) and *nithó* (women) mark familiar, and *ye* (both men and women) and *na* mark requests.
- Children obviously hear a lot of both men's and women's speech when they are growing up.
- The UCLA Field Methods consultant of yore, though female, used the men's forms as more appropriate to an academic context; there is a literature on this phenomenon.
- Generally: let's avoid miracles; kids acquire what is available to them as they learn to speak.

---

<sup>4</sup> An interesting paper discussing the emphasis knob is D. Robert Ladd (1994) "Constraints on the gradient variability of pitch range, or, Pitch level 4 lives!" in *Papers in Laboratory Phonology III*. The same volume has a rather knobby commentary on Ladd's paper by me.

<sup>5</sup> Decades ago, immigration created quite-modestly-distinct native-speaker dialects in NYC based on ethnicity; the same is true in California today.

<sup>6</sup> This goes way back; Edward Sapir wrote of a final-vowel-devoicing rule applied by just one gender in Yana.

## 25. Style and bidialectalism

- What a can of worms!
- When are we changing our style within a single idiolect, and when are we dialect-switching?
- Perhaps even so, this might help with troublesome cases.

### THE STYLE KNOB ON THE LOWER EAST SIDE

## 26. One source

- William Labov (1972) “The isolation of contextual styles,” in his book *Sociolinguistic Patterns*.

## 27. Labov’s earliest research

- He went all over the Lower East Side of New York City, studying people of all social classes and ethnicities.
- He was part of a research team including social scientists, and his subjects were prelocated to represent a great variety of people.
- He did his best to elicit across settings of the style knob.
  - Very high: “please pronounce these minimal pairs”<sup>7</sup>
  - High: “please read these sentences”
  - Less high: “please answer these questions”
  - Less high: “tell me about yourself”
  - Less high: the Danger-of-Death question, the “Were you ever unfairly accused of something you didn’t do?” question
  - Also less high: finish the interview, share the offered beer, keep listening.
  - Much lower: consultant leaves the room to take a phone call from kin, forgets linguist is there.

## 28. Optional phonological processes of New York City English

### R Dropping

*beard* is [biəd], r-less;

*beard* is [bi:ɪd], r-ful

- Notes:
  - Labov thinks /ɪ/ is underlyingly present, learned from nondeleted tokens in the ambient language
  - i.e. language learners can distinguish “always [sɔ]” from “sometimes [sɔ], sometimes [sɔ:ɪ]” (*saw/sore*)
  - This would *not* be true, I suspect, of people like Standard British speakers, who hear no variation in these forms during childhood.<sup>8</sup>

<sup>7</sup> This can be especially effective when the minimal pairs are merged in the consultant’s speech!

**/æ/ Diphthongization<sup>9</sup>***bad* [bɪəd]*bad* [bæd]**/ɔ/ Diphthongization***coffee* [ˈkʊɔ̃fi]*coffee* [ˈkɔfi]**/θ/ and /ð/ Hardening**

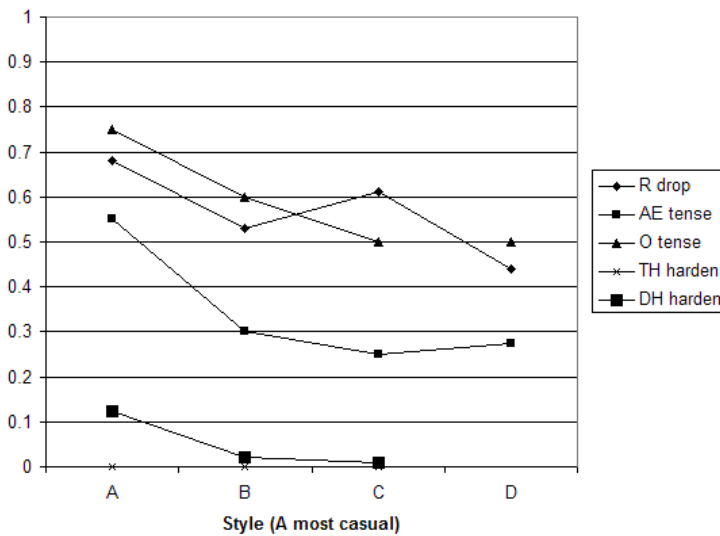
<i>thin</i>	[tɪn]	<i>this</i>	[dɪs]
	[t̪ɪn]		[d̪ɪs]
	[θn]		[ðs]

**29. Key claim: lockstep**

- The above processes vary in lockstep by speaking style, due (I suggest) to the Style knob.
- This emerges from Labov's reporting on individual people (accompanied in the original with rather affectionate verbal portraits of each.)

**30. Phonological free variation in the speech of Miriam**

- Miriam is 35 years old, graduated Hunter College and St. John's law school, works as lawyer.

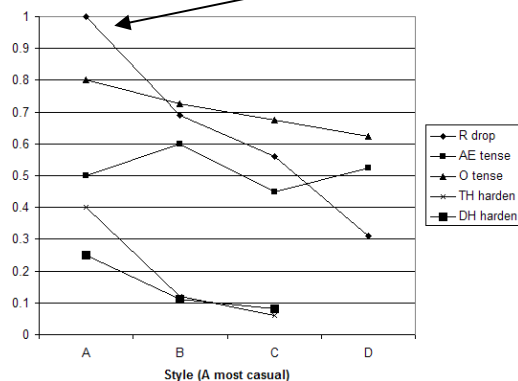


<sup>8</sup> Except perhaps on TV and in movies? Can such input influence acquisition?

<sup>9</sup> Many of us have a similar diphthongization in a more restricted environment, / \_\_\_\_ {m,n}.

### 31. Variation in the speech of Doris

- Doris is 39, homemaker, African-American.
- She doesn't have perfect lockstep
- Labov thinks that for Doris, and others, r-dropping is more sensitive to style than other processes.



### 32. Why is Doris not lockstepped? A conjecture

- Unlike the others described, she is likely bidialectal (African-American Vernacular English)
- Conceivably she is switching dialects as well as styles when she speaks?

### 33. Is there more?

- Sociolinguistics gets frustratingly fuzzy for me a lot of the time.
- But this sort of data — careful tracking of application rates of multiple processes across style-controlled elicitation — seems potentially very informative about the systems people internalize.

### 34. Free variation in society is structured as well

- Fig. 4.2 from William Labov (1972) *Sociolinguistic Patterns*

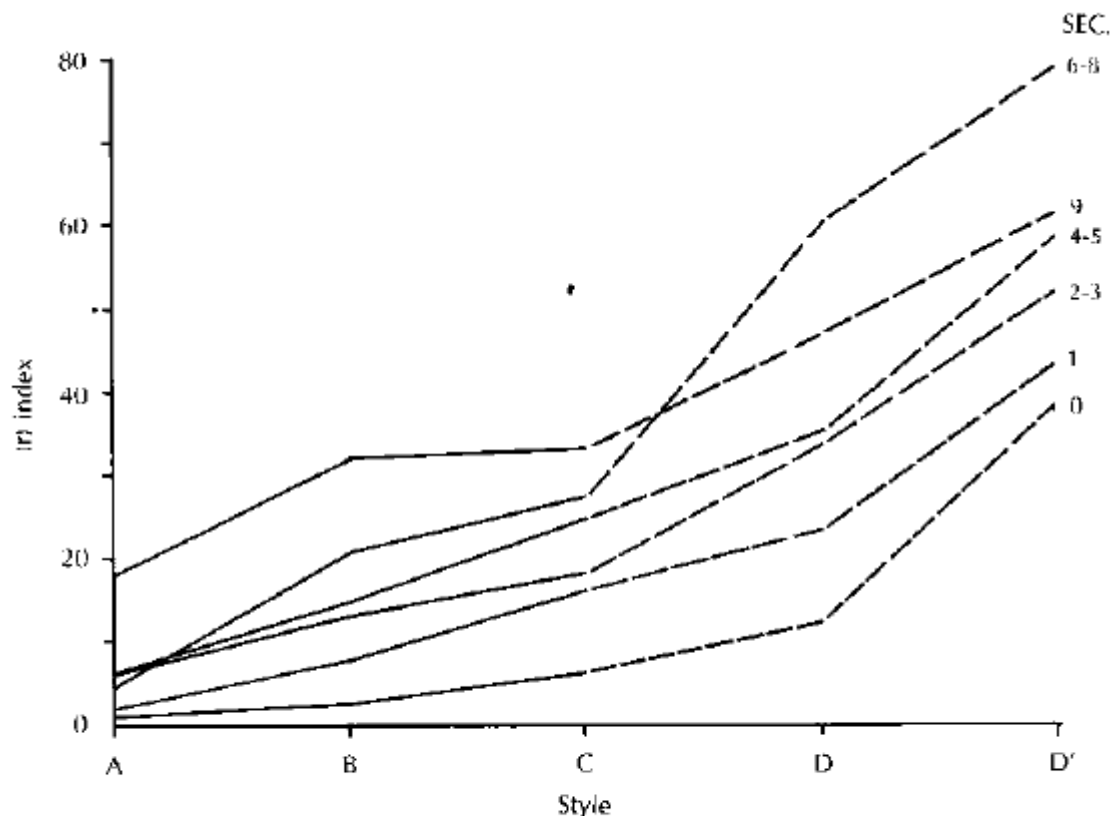


Fig. 4.2. Class stratification of a linguistic variable in process of change: (r) in *guard, car, bear, beard, board*, etc. SEC (Socio-economic class) scale: 0-1, lower class; 2-4, working class; 5-6, 7-8, lower middle class; 9, upper middle class. A, casual speech; B, careful speech; C, reading style; D, word lists; D', minimal pairs.

- from 81 native speakers of New York City English
- Vertical axis: what percentage of underlying /r/ are retained in the output?
- An independent investigation sorted the speakers into their social classes.
- The “leaping up” of the lower-middle-class speakers in the formal styles is found in other studies, and is claimed to reflect a social insecurity independently diagnosed by other tests.<sup>10</sup>
- As already noted, I think these fascinating patterns are modelable but only diachronically, with a theory of who people talk to and who they pay attention to as they learn their grammars.

### 35. The research challenge

- Do knobs exist as entities, so that multiple processes really do vary in lockstep?
- If so, how can we implement knobs in a formal phonological grammar?
  - Can Harmonic Grammar/maxent help?

<sup>10</sup> For example: series of questions: “how do you say this word? ... how should this word be said?”, total cases of difference.

- In empirical work, are there rigorous ways for us to track how knobs are set?

### THE FREQUENCY KNOB

#### 36. Effects of frequency in phonology more generally

- Acquisition effects: the rare is hard to memorize.
  - Hence irregular forms tend to get regularized when frequency goes down.
  - Work of Joan Bybee: old irregular pasts, like *chid* got regularized in this way.<sup>11</sup>
- Nativization effects
  - Foreign word becomes more common in usage.
  - It starts to feel ever more strange to give it its faithful foreign rendition.
  - Thus, regularization.
  - In my lifetime: *croissant*, *cappuccino*, *gazpacho*
- Online production effects (focus here)
  - Psycholinguistics has firmly shown that the listener knows the frequencies of words, and weights their probabilities in perception.
  - Greater Faithfulness in speaking gives your hearer a better chance on rarer words.

#### 37. Coetzee and Kawahara's hypothesis: Faithfulness variability

$$H(cand) = \sum_{i=1}^n (w_i + nz_i) M_i(cand) + \sum_{j=1}^m (w_j + nz_j + sf) F_j(cand)$$

- This is the Harmony formula, plugged into Noisy Harmonic Grammar.
- We sum up Markedness and Faithfulness
- Since it's NHG, we have noise ( $nz_i$ ), added into every constraint weight.
- The scaling factor is the same for all Faithfulness constraints (lockstep), and its value comes from another equation relating it to frequency (for next time).

---

<sup>11</sup> Bybee, Joan (1985) *Morphology: a study of the relation between meaning and form*. Philadelphia: Benjamins.