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# Stochastic Phonological Knowledge: The Case of Hungarian Vowel Harmony

### 1. Acknowledgments

- This talk is based on a research project done in collaboration with **Zsuzsa Londe**, a graduate student in the UCLA Department of Applied Linguistics.
- We would like to thank our Hungarian-speaking consultants and experimental subjects for their enthusiastic help in providing data.

# 2. Theme

- Linguists commonly focus on clean, systematic areas of the grammar.
- Not all areas of the grammar are clean and systematic—others show lexical variation: *sing* ~ *sang*, *cling* ~ *clung*, *ding* ~ *dinged*
- What should linguistic theory say about these areas?

### 3. "Exceptions" are Often Patterns Themselves (Pinker and Prince 1988)

- English past tense: *cling* ~ *clung*, *fling* ~ *flung*, *sling* ~ *slung* 
  - This is productive (tests by Bybee and Moder 1983, Prasada and Pinker 1993, Albright and Hayes 2003)
- Hungarian: sometimes two patterns compete so closely we can't tell which one is the dominant one—see later on

# 4. A Commonly-Adopted Analytic Approach

- Designate one pattern as "regular", and somehow deal with the rest:
  - > Assign diacritics so words will undergo minor rules (Halle and Mohanan 1985)

thus sat [sæt] is: /sit/[+past, +Lowering Ablaut]Lowering Ablaut:  $V \rightarrow [+low]$ 

Lexically list them, relegating the productivity of their pattern to an analogical mechanism such as a connectionist network (Pinker and Prince 1988).

thus: *sat* is simply: /sæt/[+past]

### 5. Claims

- Neither of the above approaches does justice to what the native speaker knows.
- Language learners do their work *effectively*, learning
  - the various rival patterns
  - their relative representation in the lexicon (i.e., numbers of forms)
- In novel situations, when required to inflect a novel stem, speakers behave stochastically, producing outputs in numbers that *match the lexical frequencies*.

# 6. Plan

- Describe a gradient, semi-systematic area of Hungarian vowel harmony
- Demonstrate, using data from a nonce-probe ("wug" test) experiment, that speakers do indeed project lexical variation into stochastic knowledge, which guides their behavior.
- Propose an analysis using stochastic Optimality Theory, following the general approach of Zuraw (2001).

# HUNGARIAN VOWEL HARMONY: BACKGROUND

# 7. Some of the research literature on Hungarian vowel harmony

 Esztergár (1971), Arlotto (1972), Kiparsky (1973), Ringen (1975), Vago (1976, 1980), Kontra and Ringen (1986), Hare (1990), Ringen and Vago (1998), Dienes (1997), Siptár and Törkenczy (2000)

# 8. Hungarian vowels

	IPA		Orthog	raphy (use	d here)
Front Unrounded	Front Rounded	Back	Front Unrounded	Front Rounded	Back
i, it	y, y:	u, u:	i, í	ü, ű	u, ú
er	Ø, Ø:	0, 01	é	ö, ő	0, Ó
ε		o, a:	e		a, á

**Remember**: "e" is a lower vowel than "é".

# 9. Nomenclature

- N = front unrounded; mnemonic for "neutral"
- F = front rounded; mnemonic for "pure front"
- B = back

#### **10. Our Illustrative Suffix**

• We focus on a common and representative suffix, the dative:

> -nak/-nek, depending on vowel harmony

### 11. Vowel Harmony: The Simple Generalizations

• If the last vowel of the stem is B, the stem takes back suffixes:

BB	abl <b>a</b> k-nak	'window-dat.'	
NB	bír <b>ó-</b> nak	'judge-dat'	(despite preceding /í/)
BFB	amőb <b>á-</b> nak	'amoeba-dat.'	(despite preceding /ő/)

• If the last vowel of the stem is F, the stem takes front suffixes:

F	<b>ü</b> st-nek	'cauldron-dat.'	
BF	kosztűm-nek	'woman's suit-dat.'	(despite preceding /o/)

#### 12. Slightly More Complicated Generalizations

• If the stem consists entirely of N-type (front unrounded vowels), usually it takes front suffixes:

N kert-nek 'garden-dat.' N cím-nek 'address-dat.'

• But there is a set of exceptional stems (about 25, in our data set) that take back suffixes even though they contain no back vowels at all; for example

Ν	híd-nak	'bridge-dat.'
Ν	síp-nak	'whistle-dat.'

These are often called the *hid* stems, after a common one. Most *hid* stems are monosyllabic.

• All words of the form ...FN, ...FNN, ...FNNN, etc. take front harmony:

FN	fűszer-nek	'spice-dat'
FNN	őrizet-nek	'custody-dat.'

### 13. Core Cases for This Paper: ...BN and ...BNN

- Here, lexical idiosyncrasy is greatest.
- Individual words can require back suffixes, or require front suffixes, or allow both ("doublets"; Vago 1976).

• For example, here are three words whose last two vowels are /... a é/:

BBN	mut <u>agé</u> n-nek	ONLY	7	'mutagen-dative'
BN BN	farmer-nak <u>a</u> rz <u>é</u> n-nak	OR OR	farmer-nek <u>a</u> rz <u>é</u> n-nek	'jeans-dative' 'arsenic-dative'
BN	p <u>a</u> ll <u>é</u> r-nak	ONLY	r	'foreman-dative'

• A learner of Hungarian would be well advised to memorize the behavior of each word—though there are good ways to guess; see below.

### 14. Terminology

mutagén	is a	front-inducing stem
farmer, arzén	are	doublets
pallér	is a	back-inducing stem

(Many stems are inherently front- or back-inducing due to the vowels they contain.)

### **15. Statistical Patterning**

Idea: look at the Hungarian lexicon and count the front-inducing, doublet, and back-inducing stems for each vowel pattern.

Earlier work:

- Kontra and Ringen (1986)—a study of harmony in loan words
- Siptár and Törkenczy (2000)

### 16. Two Crucial Statistical Generalizations

- Height Effect: In [...BN], e (= [ε]) takes front suffixes more often than é (=[e:]), which takes front suffixes more often than i, í. (= [i, i:]).
- Count Effect: BNN words take front suffixes more often than comparable BN words do.

These generalizations have hitherto been collected by hand—can we do better with a systematic search?

### **17.** How We Searched the Hungarian Lexicon

- Assess the harmony behavior of the Hungarian language community by **Googling** large numbers of Hungarian words.
- Validate: Locate all the crucial cases (BN, BNN) and have three native speakers rate them all.

# A GOOGLE SURVEY OF HUNGARIAN VOWEL HARMONY

### 18. Basic Method (Zuraw 2001)

• Example. Recall earlier data (coauthor's native speaker intuition):

mut <u>agé</u> n-nek	'mutagen-dative'
<u>a</u> rz <u>é</u> n-nak OR <u>a</u> rz <u>é</u> n-nek	'arsenic-dative'
p <u>a</u> ll <u>é</u> r-nak	'foreman-dative'

• We Google both possibilities and count hits:

Word	Hits	Percent
mutagénnak	0	0%
mutagénnek	31	100%
arzénnak	12	67%
arzénnek	6	33%
pallérnak	10	91%
pallérnek	1	9%

- A caution: this counts *pages that contain* the target word, not *tokens* of the target word. For relative estimates of words that are not too common, this probably is not a large distortion.
- Googling facilitated by a computer program, "Query Google," which Googles about 2000 words/minute.<sup>1</sup>
- We undertook a number of controls, mostly not reported here, to minimize random garbage in the Google data.

# 19. Sorting the Data: A Noise-Averting Criterion

More than 97% back:	counted as all back
Less than 3% back:	counted as all front
Otherwise:	counted as a "doublet"

Then, for simplicity, all values were reduced to a number (all back = 1, all front = 0):

 $\frac{\text{total back} + .5 \text{ x total doublet}}{\text{total front} + \text{total doublet} + \text{total back}}$ 

<sup>&</sup>lt;sup>1</sup> "Query Google" is implemented as a Web applet at www.linguistics.ucla.edu/people/hayes/QueryGoogle/.

#### 20. Results (11,000 stems)



- Straightforward cases:
  - ➤ Words ending in F take front harmony (.000 back in Google data)
  - Words ending in B take back harmony (.997 back)
- Words with all N: just a few are of the *hid* type described in (12) (.018).
  - A monosyllable is more likely to be a *hid* stem than a disyllable (N = .106; NN = .003).
- Words ending with [...BN]: there is indeed a **Height Effect**, of the type described in (16). The lower the vowel, the less transparent it is.

➢ Be (.172) ≤ Bé (.858) ≤ Bi,í (.985)

- BN vs. BNN: as noted above in (16), there is indeed a Count Effect:
  ▶ BN (.842) > (.239).
- The Height effect is present in BNN words to a limited extent:
  - $\blacktriangleright$  BNe (.000) < BNN<sub>[-low]</sub> (.340).<sup>2</sup>

<sup>&</sup>lt;sup>2</sup> Chi square tests: for BNe vs. BN(other),  $\chi^2 = 8.98$ , p = .003; for all others  $\chi^2 > 40$  and my software returns zero as the p-value.



# 21. Checkup: Elicit 1129 Words from Three Native Speakers

### THE PRODUCTIVITY OF THE PATTERN: A WUG TEST

### 22. To Test

- Are these generalizations just random accidents of the lexicon, or are they actively apprehended and extended by Hungarian speakers?
- Test productivity by asking them to add *-nak* or *-nek* to made-up stems ("wug" test; Berko 1958)

### 23. Wug Words: Two Sets of 15 Forms

Basis of selection: test the generalizations noted above.

Туре	Set 1	Set 2
Bé	hádél, kolén	vuszék, vánél
Be	órel, bontel, kázen	ranyel, unyeg, csúltek
Bi	monyil, csádik	kánit, pozin
BNN	poribit, lányitég	lolivit, ányivél
BNe	fányedeg, luteker	álendel, móleter
F	gyülüt	hösög
Ν	híny	nyís
NN	zefét	petlér
В	szandat	bortog

- Each subject saw one set or the other.
- Words were chosen to be phonologically ordinary but not to evoke any particular existing word.

# 24. Frames

• Our wug-sentence frames gave consultants the nominative (no ending) and asked them to provide the dative (*-nak/-nek*).

# 25. Sample Frame (translated into English)

# hádél

Women in the Middle Ages used hádél to wash clothing. Back then, <u>(hádél)</u> grew abundantly in the fields. It is very hard to find nowadays, but it is said that <u>(hádélnek or hádélnek)</u> had a wonderful fragrance.

- Various controls used to avoid effects of test order or frame sentence.
- Test was a simple written questionnaire, distributed to 171 (fairly well educated) Hungarians in Budapest and Tiszafüred, Hungary, mostly friends and relatives of my coauthor.

# RESULTS OF THE WUG TEST

# 26. Matchup with the Lexicon as Measured by Google



# 27. Reviewing the Earlier Qualitative Findings—Do They Match with Wug Test Data?

- Words ending in F take front harmony (backness score 0).
- Words ending in B take back harmony (1).
- Words with all neutrals: they were occasionally treated as being of the *hid* type (.021), but normally given front suffixes. A monosyllable is far more likely to be a *hid* word than a disyllable (N = .043; NN = 0).

- Words ending with BN: **Height Effect**—the lower the vowel, the fewer the back suffixes: Be (.081) < Bé (.386) < Bi (.981).
- BN vs. BNN: Count Effect—number of neutrals matters.
  - ▶ BNi (.306) < (.981); BNe (.014) < Be (.182).<sup>3</sup>
- There is an overall **frontness bias**. Likely explanation:
  - Rarer words take front harmony more often (stem log frequency-backness correlation in Google data: r = .15), and wug words are felt to be rare.
- See Zuraw (2001) for a similar match-up in Tagalog.

# 28. Theoretical Conclusions

- Hungarian speakers are good stochastic learners.
- When given a wug word, Hungarians vacillate, following the pattern of their lexicon as a whole.
- Wug-testing behavior: they like to make a **representative** and **suitable** range of guess—rather than guessing the "best choice" every time.

# A THEORETICAL MODEL OF VARIATION IN HUNGARIAN VOWEL HARMONY

# 29. What Should a Model Accomplish?

- Permit the speaker to **list** lexical entries that indicate the form that is actually used for a particular BN or BNN stem (most such stems are *not* doublets).
- Model the speaker's **expectations** about what harmony a novel stem will take (thus accounting for our Wug test data).
- Characterize the native speaker's knowledge of what could in principle be listed.
  - Example: "bortog-nek", from our Wug test, is considered by native speakers to be impossible no matter what; yet "nyís-nak" seems imaginable but unlikely.

# **30.** Theories Employed

- Optimality theory (Prince and Smolensky 1993), with
- Variation due to free ranking of constraints (Anttila 1997a, 1997b)
- Match quantitative effect with stochastic rankings (Boersma 1997, Boersma and Hayes 2001)
  - Every constraint pair (A, B) associated with a probability (0-1), specifying how likely A >> B on any given speaking occasion.
- The dual listing/generation model of Zuraw (2001):
  - > Certain inflectional forms are listed.

<sup>&</sup>lt;sup>3</sup> For the comparisons just noted, results of a chi-square test are as follows: N vs. NN:  $\chi^2 = 6.664$ , p < .01; Be vs. Bé:  $\chi^2 = 104$ , p  $\cong 0$ ; Bé vs. Bi:  $\chi^2 = 245$ , p  $\cong 0$ ; BNi vs. Bi:  $\chi^2 = 247$ , p  $\cong 0$ ; BNe vs. Be:  $\chi^2 = 15.75$ , p = .00007.

- Faithfulness constraints force the use of a particular listed form even if it violates other constraints.
- A "subterranean grammar" of lower-ranked, normally-inactive constraints governs behavior in novel situations.

# 31. GEN

• GEN provides allomorphic variants ([ablaknak], [ablaknek]), based on the fact that the dative suffix has a dual lexical entry /{nak, nek}/.<sup>4</sup>

# 32. Markedness Constraints Governing Harmony

These are versions of the AGREE family (Lombardi 1999), relativized to distance.

• DISTAL B incurs a violation in every instance in which a front vowel is preceded by a back vowel anywhere in the word, e.g.



incurs four violations.

- Similarly DISTAL F.
- LOCAL B incurs a violation in every instance in which the closest vowel preceding a front vowel is back, e.g. just one violation for

mutagénnek | ∮

- Similarly LOCAL i; LOCAL é; LOCAL e
- > LOCAL í will be ignored, since we have no Wug test data on this vowel.
- One constraint with a "double trigger", analyzed in depth by Walker (2001), but just stipulated here: "LOCAL NN", violated when NN is followed by B.

# **33.** The Height Effect in BN Words

- Claim: in [...BN], both B and N are influencing harmony, and lower front vowels are stronger triggers.
- See Kaun (1995) for the general approach: harmony is triggered preferentially by perceptually-inferior vowels, lacking the extreme phonetic realization of their category.

<sup>&</sup>lt;sup>4</sup> Many suffixes have just one allomorph (e.g.  $-n\acute{e}k$  '1 sg. conditional'); these have only one entry.

- Lower front vowels have lower F2, and are thus inferior perceptually.
- They need more help, and get it by spreading.
- Posited universal ranking:

LOCAL e >> LOCAL é >> LOCAL i

# 34. Constraint Rankings: Strict

• LOCAL B strictly dominates DISTAL F (probability = 1), to obtain [amőbá-nak], not \*[amőbá-nek]:

/amőbá {-nak, -nek}/	LOCAL B	DISTAL F
൙ amőbá-nak		*
*amőbá-nek	*!	

• LOCAL F strictly dominates DISTAL B, to obtain [ʃofőr-nek], not \*[ʃofőr-nak]:

/jofőr { -nek, -nak }/	LOCAL F	DISTAL B
☞ ∫ofőr-nek		*
*∫ofőr-nak	*!	

# 35. Stems are Frequently and Stably Disharmonic

- Reason: IDENT-IO([back]) IN STEMS is undominated.
- For the frequent specially faithful character of stem material, see e.g. Casali (1997).

/farmer/	IDENT-IO([back]) IN STEMS	LOCAL B
🖙 farmer		*
*farmar	*!	

# 36. About Stochastic Rankings

- The stochastic rankings to follow are hand-created (hypothesized by the authors);<sup>5</sup> see later for the possibility of learning them by algorithm.
- In the formalism of stochastic OT, ranking is represented Gaussian probability distributions arrayed along a linear scale. I will simplify the presentation by just giving pairwise ranking probabilities.

<sup>&</sup>lt;sup>5</sup> However, the predictions of each proposed hand-ranked grammar were checked by machine, using OTSoft (Hayes, Tesar and Zuraw, 2003).

• DISTAL B is in gradient ranking relations with its local neutral-vowel competitors, producing free variation for Be, Bé, and Bi in appropriate proportions.



• This achieves a ideally-perfect frequency match to the varying BN forms. Here, we attempt to model the proportion of *-nak* forms in the Wug test data:

	Wug test	Model <sup>6</sup>
/Bi/	.981	.981
/Bé/	.614	.613
/Be/	.081	.081

• The perfect match is unsurprising we're specifying 3 relative rankings (only 3 cases of constraint conflict) to model 3 frequency values; tiny deviations result because grammar-testing is stochastic.

# 38. Adding in the Effect of LOCAL NN

• Comparing each case of BN<sub>i</sub> with BNN<sub>i</sub>: (proportion with *-nak*):

Wug test			Wug test	
/Bi/	.981	/BNi/	.306	
/Bé/	.614	/BNé/	.059	
/Be/	.081	/BNe/	.014	

In the analysis here, this is because the forms on the right violate LOCAL NN, which penalizes *-nak*.

- This will increase the fraction of *-nek* for each BNN<sub>i</sub> relative to BN<sub>i</sub>.
- We're now generating 6 frequencies with only 4 conflicting constraint pairs, so a perfect data match is unobtainable.
- Reasonably good results can be obtained as follows:

<sup>&</sup>lt;sup>6</sup> Grammar was tested by running it for 100,000 trials. Multiple runs yielded very similar results.



### **39. Results**

Numbers are the proportion of back -nak generated:

	Wug test	Model		Wug test	Model
/Bi/	.981	.981	/BNi/	.306	.212
/Bé/	.614	.613	/BNé/	.059	.142
/Be/	.081	.081	/BNe/	.014	.045

Results are quantitatively imperfect, but qualitatively correct in capturing relative comparisons:

Bi > Bé > Be BNi > BNé > BNiBi > BNi, Bé > BNé, Be > BNe

# 40. Letting Individual Lexical Items Have their Say

- The Hungarian variation is primarily word-by-word variation, and not token-by-token (the latter only in the doublets).
- Most suffixed words have an *invariant* suffix, not a statistical blend of the suffix choice predicted by the grammar given so far.
- Hence, evidence for memorization: the mature Hungarian speaker has internalized many lexical entries that specify for BN, BNN word types which suffixes a stem must take.

# 41. Zuraw's Theory (Zuraw 2001)

- Faithfulness constraints requiring that the phonological form of the listed entry be faithfully reflected in surface form.
- We assume here a strict ranking: IDENT-IO([back]) >> { LOCAL i, LOCAL é, LOCAL e, LOCAL NN, DISTAL B }.
- Here is how the form *matek-nak* 'math-dative' wins, despite having the less statistically likely suffix choice:

/matek-nak/	IDENT-IO([back]) <sup>7</sup>	LOCAL e	DISTAL B
🖙 matek-nak		*	
*matek-nek	*!		*

• Wug forms have no lexical entry for their datives—hence the inventory of stochasticallyranked "subterranean" constraints { LOCAL i, LOCAL é, LOCAL e, LOCAL NN, DISTAL B } have their say when a speaker takes a wug test (which, for a child, is every day).

### 42. Not Letting Individual Lexical Items Have their Say—Where Appropriate

- We don't want IDENT-IO([back]) to protect monstrosities.
- Hungarian has absolutely no:
  - ➢ F stems that take back suffixes (\*hűd-nak)
  - ▶ B stems that take front suffixes (\**hud-nek*)
  - >  $F(N)^*$  stems that take back suffixes (\**ühid-nak*)
- If LOCAL B, LOCAL F, and DISTAL F strictly dominate IDENT-IO(back), then *even if the speaker tried to internalize exceptional entries for such words*, the grammar would not permit her to utter them as disharmonic.<sup>8</sup>



• No \**hűd-nak*, even if the lexicon asks for one

/hűd-nak/	LOCAL F	IDENT-IO(back)
൙ hűd-nek		*
* hűd-nak	*!	

• No \*hud-nek, even if the lexicon asks for one

/hud-nek/	LOCAL B	IDENT-IO(back)
൙ hud-nak		*
* hud-nek	*!	

<sup>&</sup>lt;sup>7</sup> Note: this is *general* IDENT-IO(back), not IDENT-IO([back]) IN STEMS. Suffixes must harmonize with preceding B and F, but stem vowels need not do so.

<sup>&</sup>lt;sup>8</sup> This is the Richness of the Base idea (Prince and Smolensky 1993), applied to alternations.

• No \**hűdi-nak*, even if the lexicon asks for one

/hűdi-nak/	DISTAL F	IDENT-IO(back)
൙ hűdi-nek		*
* hűdi-nak	*!	

• However, for all Markedness constraints ranked below IDENT-IO(back) (cf. (41)), an invariant listed form violating that constraint *can* assert itself in the output.

### 43. Summary

The analysis has:

- Ruled out monstrosities like \*hűd-nak.
- Accounted for stochastic behavior when it is observed, e.g. our wug test data.
- Permitted the lexicon to dictate an outcome, where no monstrosity would arise.

### 44. Full Hasse Diagram



### 45. Comparison: Model against Wug Test Data



LEARNING THE GRAMMAR

### 46. Higher Aspirations for Linguistic Theory?

• The ultimate test for a theory of UG: couple it with a learning algorithm and representative data, and see if the right grammar is learned.

#### 47. Using Current Ranking Algorithms as a First-Pass Effort

• **Step I**: use Low Faithfulness Constraint Demotion (Hayes 2004) to determine what is a *possible* harmony pattern.<sup>9</sup> This is done by ranking Faithfulness appropriately:

LOCAL F, LOCAL B >> DISTAL F >> **IDENT-IO(back)** >> LOCAL e, LOCAL NN, LOCAL é, LOCAL B, LOCAL i

• **Step II**: Ignore Faithfulness, and determine the *statistical details* by using the Gradual Learning Algorithm (GLA; Boersma 1998, Boersma and Hayes 2001), constrained to respect the rankings already discovered

### 48. Result

• This learns a grammar rather like (44), differing only slightly in the details. Here are its predictions,<sup>10</sup> together with the learning data and the Wug test data:

<sup>&</sup>lt;sup>9</sup> Biased Constraint Demotion (Prince and Tesar 2004) works just as well.

<sup>&</sup>lt;sup>10</sup> Average of ten runs; standard deviation across runs is moderate.



### 49. How to Learn Patterns That are Nicer than the Input Data

- Note the odd glitch in the Google data: too many *-nak* for BNé.
- This was almost certainly accidental, due to there being so few stems of this type in the corpus (4 -*nak*, 2 doublet, 6 -*nek*).
- GLA learning "smooths" this out a bit, by making use of information from the Bé forms.
- Native speakers smooth it out even more—how?

# TWO ISSUES FOR FURTHER STUDY

### 50. Intersuffix Agreement

• If a stem takes *-nek* instead of *-nak*, then for the inessive singular it probably takes *-ben* instead of *-ban*. What explains this? (Quick answer: extension of OO-correspondence; but more data needed before proceeding.)

# 51. Further Refinement of the Trigger Distance Constraint System

- BFN vs. FBN not treated under our mere "local-distal" distinction.
- Needed: a replacement for the (now widely doubted<sup>11</sup>) autosegmental theory of longdistance assimilation effects, which will do equally well at characterizing the notion "closest trigger".
- Families like AGREE B\_\_\_\_ >> AGREE BX\_\_\_\_ >> AGREE BXX\_\_\_\_ ... seem a possibility but need further working out...

<sup>&</sup>lt;sup>11</sup> See Frisch, Broe, and Pierrehumbert (1997), Hansson (2001, Rose and Walker (2001).

### CONCLUSION

### 52. What have we learned?

- Lexical variation (word-by-word) is accurately projected by Hungarian speakers into behavioral variation (guessing the pattern of new words).
- Stochastic Optimality Theory offers a model that can describe this ability on the part of speakers, while retaining the essence of earlier phonological analyses.
- Current learning algorithms support a first-pass effort at learning the rankings from data.
- Many issues, particularly involving learning, remain...

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