

# Exceptions

*Class 7: Predictability without alternations*



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CreteLing 2024



[creteling2024.phonology.party](http://creteling2024.phonology.party)

# So far

- Focused on predictability of alternating features
- K&K hierarchy also implicitly focuses especially on alternating features
  - What values a UR may contain, when surface allomorphs differ from each other
  - Wang and Hayes learning model mainly explores abstraction for alternating properties
- Wording is quite general, however: “idiosyncratic (unpredictable) properties”
- Question: to what extent do speakers predict ‘static’ properties of morphemes?

# Place in English

- In general, English allows coda clusters ending in labials, coronals, and dorsals

<i>limp</i>	<i>lɪmp</i>	<i>lisp</i>	<i>lɪsp</i>
<i>lint</i>	<i>lɪnt</i>	<i>list</i>	<i>lɪst</i>
<i>link</i>	<i>lɪŋk</i>	<i>risk</i>	<i>rɪsk</i>

- However, after tense vowels and diphthongs, only coronals are allowed
  - *paint* [peɪnt], *pint* [paɪnt], *point* [poɪnt]
  - *least* [lɪst], *roost* [rʊst], *paste* [peɪst], *roast* [rəʊst], *hoist* [hɔɪst]
- Predictability: C → [+cor] / [+tns]C\_
- Exceptions: *oink*, *boink*, *yoink*

# Place in English

- More generally: place is predictable to varying extents, depending on...
  - Manner
  - Position
  - Segmental context
- A grammar that encoded these regularities could do (much) better than chance at predicting place
  - Parallel to Ernestus & Baayen (2003), Becker et al. (2011), etc. for voicing
- Morphemes that go against these general trends are exceptions

- Employed the Minimal Generalization Learner (Albright & Hayes, 2002) to learn grammars predicting features of morphemes in Dutch, English, and Korean
- Tested grammar on existing words, to determine which are correctly derived, and which are exceptions
- Hypothesis: exceptional words will have higher token frequency

# Applying the MGL to phonological features

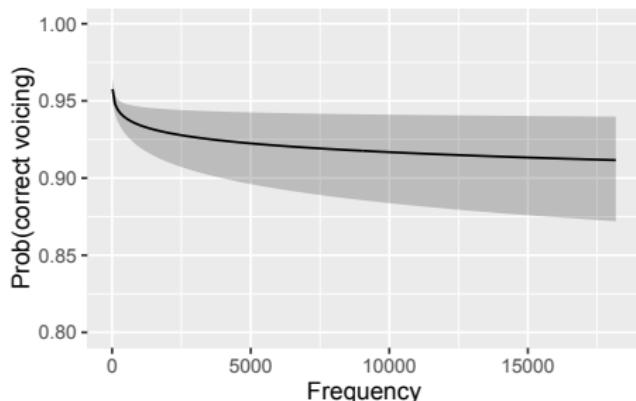
- Given a pair: [ʊə:rəlT<sub>[∅ voice]</sub>], [ʊə:rəlT<sub>[+voice]</sub>] 'world'
- Learn a word-specific rule: [∅ voi] → [+voi] / ʊə:rəl  $\begin{bmatrix} t \\ - \end{bmatrix} \#$
- Comparison with [χεlT<sub>[+voice]</sub>] 'money', [be:lT<sub>[+voice]</sub>] 'image', [sxylT<sub>[+voice]</sub>] 'fault', etc.

- [∅ voice] → [+voice] / [+lat]  $\begin{bmatrix} -son \\ -cont \\ +cor \\ - \end{bmatrix} \#$
- This rule works in  $186/209 = 89\%$  of cases

- By contrast: in general, only  $7779/15553 = 33\%$  of final obstruents are voiced in Dutch
- Wug testing the model: [ʊə:rəlT<sub>[+voice]</sub>] has higher reliability, so is preferred output

- Trained Minimal Generalization Learner on 5151 obstruent-final Dutch nouns, from CELEX (Baayen et al., 1993)
- ‘Wug tested’ the resulting grammar on all 5151 nouns, compared output to actual output
- Model accuracy: is the model more likely to be correct for low frequency words?
  - That is, are low frequency words more regular w.r.t. final obstruent voicing?

Result for Dutch: significant effect of frequency ( $p < .0001$ )



- As Ernestus and Baayen observe, final obstruent voicing is overall very predictable (>90%)
- Significantly more predictable at lower frequencies
- Expected pattern of regularization of low frequency items, if rules concerning final voicing are in the grammar

# Alternations vs. static phonotactics

- Albright, Fullwood and Jun (2016) compared three languages, with three patterns of word-final neutralization

	Place	Continuancy	Laryngeal
English	✓	✓	✓
Dutch	✓	✓	*
Korean	✓	*	*

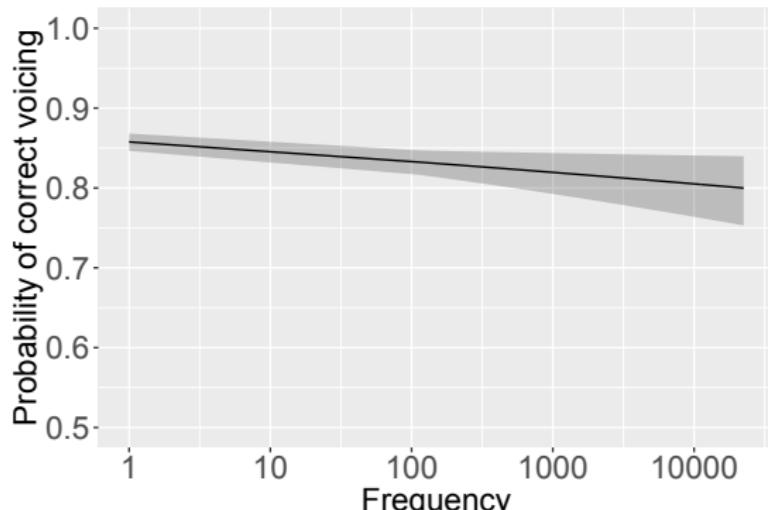
- Dutch and Korean neutralize features categorically in final position, with alternations
  - Korean: alternating features show same freq effect as Dutch
- Both languages also show gradient restrictions with no alternations for other features-e.g., place
- English: gradient phonotactic restrictions for all features finally
- All three lgs show gradient static restrictions in initial position
- Question: similar effects for static phonotactics?

# Modeling English

- Trained the Minimal Generalization Learner on all obstruent-initial/final words found in the OANC
  - Excluded clusters of obstruents
  - 7,896 items with final obstruents, 11,093 with initial obstruents
- Learning task: given all properties of the word except the voicing/continuancy/place of the final segment, try to predict that feature
- Tested the model on all existing words, tallying correct vs. incorrect
- Test: is probability of being correct greater at lower (or higher) frequencies?

# Features of obstruents in final position: English

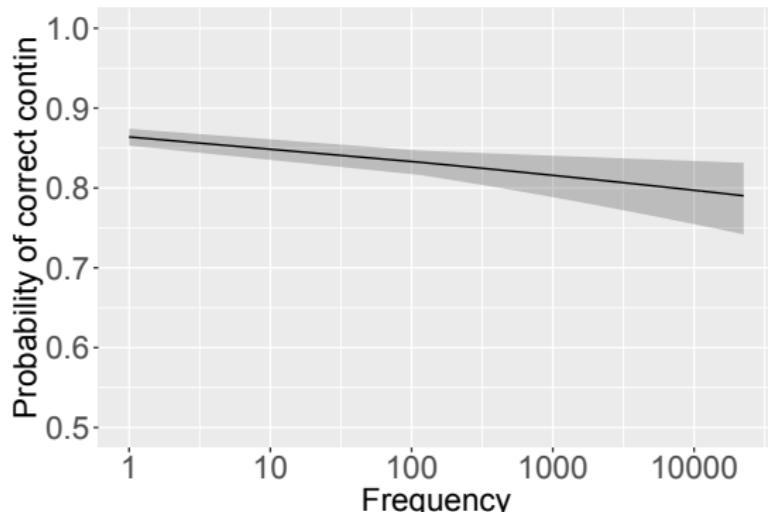
Voicing (two-way anova:  $p = .014$ )



- All features are surprisingly(?) predictable
- Consistent effect: low frequency words are more predictable

# Features of obstruents in final position: English

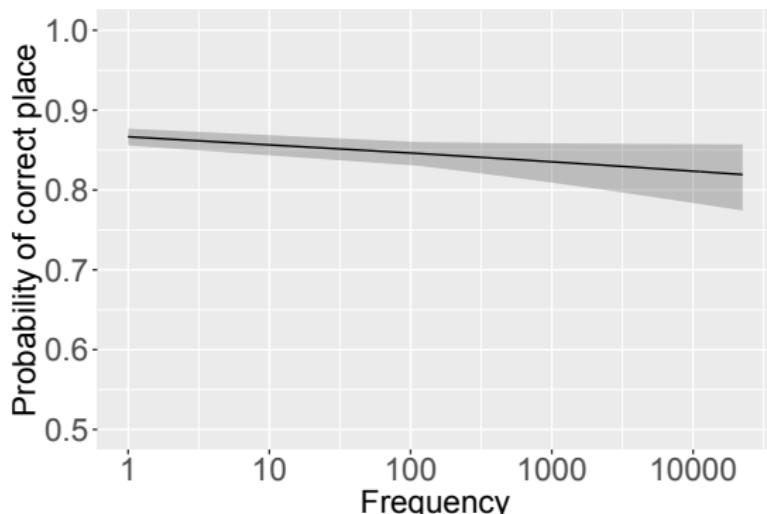
Place: (three-way anova:  $p = .037$ )



- All features are surprisingly(?) predictable
- Consistent effect: low frequency words are more predictable

# Features of obstruents in final position: English

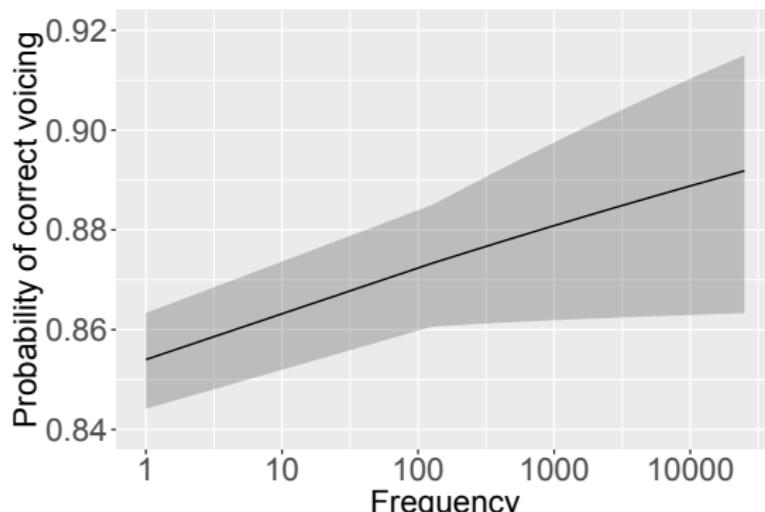
Continuancy: (two-way anova:  $p = .002$ )



- All features are surprisingly(?) predictable
- Consistent effect: low frequency words are more predictable

# Features of obstruents in initial position: English

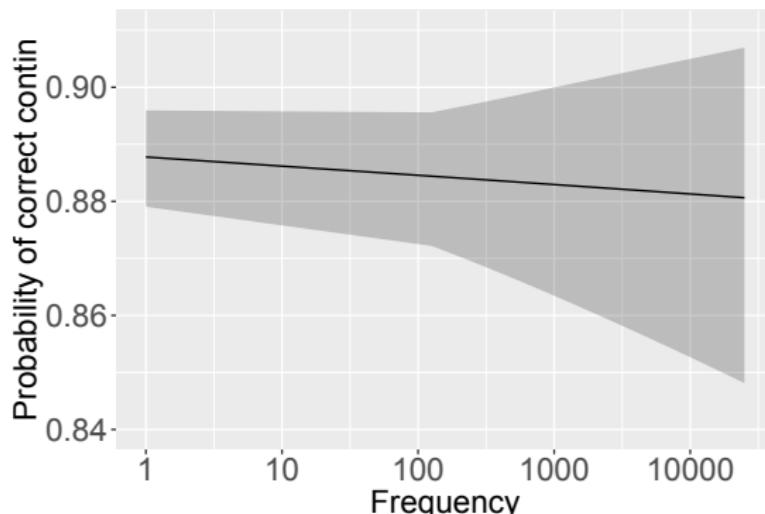
Voicing (two-way anova:  $p = .033$ )



- No consistent effect, and to the extent that anything significant effects emerge, they go in the opposite direction
  - Low frequency words are *less* predictable

# Features of obstruents in initial position: English

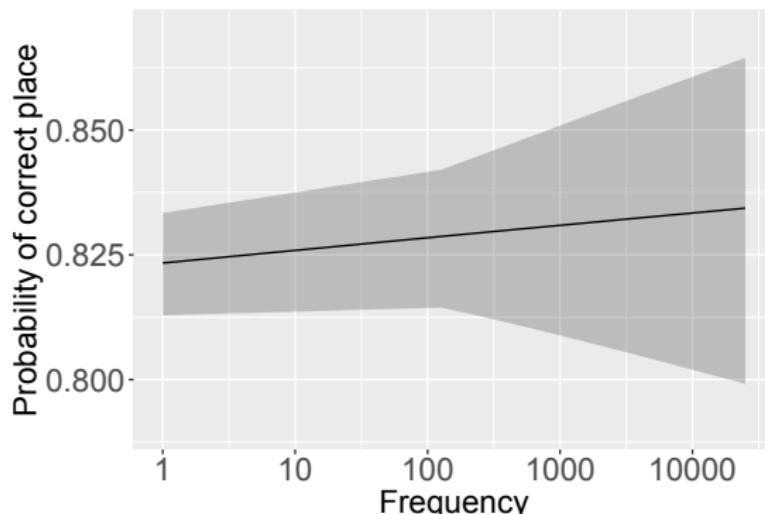
Place: (three-way anova:  $p = .598$ )



- No consistent effect, and to the extent that anything significant effects emerge, they go in the opposite direction
  - Low frequency words are *less* predictable

# Features of obstruents in initial position: English

Continuancy: (two-way anova:  $p = .682$ )



- No consistent effect, and to the extent that anything significant effects emerge, they go in the opposite direction
  - Low frequency words are *less* predictable

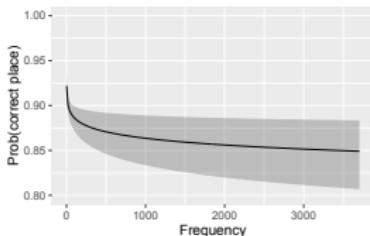
## Equivalent test for Korean

- Ran MGL on 5018 Korean nouns (Sejong corpus, dialect forms and errors removed by hand; Kim & Kang, 2000)
- Tested predictability of place, continuancy, and laryngeal features in stem-initial and stem-final position

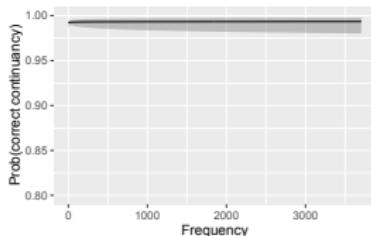
# Initial vs. final position: Korean

**Stem-final:** systematic frequency effects, where not at ceiling

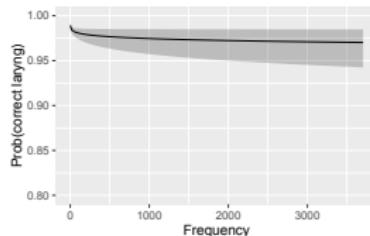
Place ( $p < .0001$ )



Contin. ( $p = .81$ )

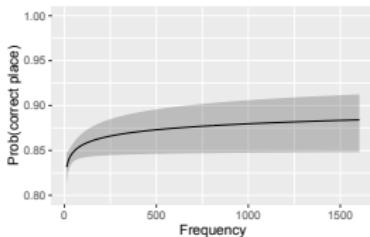


Laryngeal ( $p < .05$ )

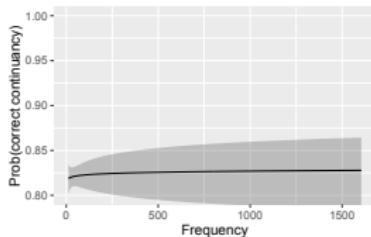


**Stem-initial:** significant inverse effects (!!)

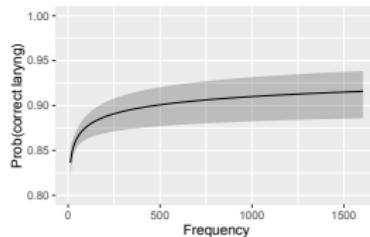
Place ( $p < .0001$ )



Contin. ( $p = .729$ )



Laryngeal ( $p = .03$ )



## Local summary

- In initial position, no real effect, but perhaps a trend towards greater predictability in high frequency words
- Something is special about morpheme-final position
  - Greater predictability in low frequency words, as expected through regularization
- Interestingly, this is where I do know of some historical changes over time (though often potentially involving morphological reanalysis)
  - Famously so, for Korean
  - Examples: *ostri[tʃ]* ~ *ostri[dʒ]*, *Texa[s]* ~ *Texa[z]*

## Exceptions to constraints



# From whole grammars to individual constraints

Two different theories of exceptionality

- Listed exceptions (e.g., Zuraw, 2000)
  - If the grammar is unable to select the correct output candidate for a form, the form is listed in ‘pre-compiled’ form
- Rule or constraint indexation (Pater, 2000; Becker, 2009)
  - If a specific highly ranked constraint selects the wrong output candidate for a form, the form is listed as an exception to that constraint

Both approaches predict a relation between frequency and the likelihood of listing a form as an exception, but the latter allows us to examine the distribution of exceptions on a constraint-by-constraint basis

# Strategy

- Identify violable (exceptional) constraints
- Compare frequency distributions of forms that obey vs. exceptionally violate
- Hypothesis: exceptional forms should be skewed towards higher frequency

Again: English vs. Korean (nouns, verbs/adjectives)

# Violable constraints of English

- Used Wilson's phonotactic constraint learner on the English lexicon
  - Similar to UCLA Phonotactic Learner (Hayes & Wilson, 2008)
  - Learns grammar of weighted constraints, penalizing underattested sequences
  - Uses likelihood ratio criterion instead of observed/expected ratio (Wilson and Obdeyn 2009)
- Training: 19,367 lemmas from OANC (all lengths)
  - Phonetic transcriptions from CMU, as above
  - Automated syllabification
  - Feature system from Hayes & White (2013), including feature for 'coda consonants'
- Cut off learning after 500 constraints

# Finding informative constraints

- Many of the 500 constraints rarely/never violated in the lexicon
  - 46 have 0 violations, 102 have 10 or less violations
  - E.g. \*Coda *h*, \* $\begin{bmatrix} +\text{strid} \\ +\text{ant} \end{bmatrix} [-\text{ant}]$ , ...
  - Not sensible to ask how violations are distributed by frequency
- Others are weak and general, violated many times
  - \* $\begin{bmatrix} -\text{cont} \\ +\text{voi} \end{bmatrix}$ : 9,660 violations
  - \* $\begin{bmatrix} +\text{stress} \\ -\text{back} \\ -\text{tense} \end{bmatrix}$ : 9,663 violations
  - Not strong enough to create much of an effect
- Sorted constraints by descending weight, searched for constraints with 50 or more violations
  - Ignored a handful of constraints ruling out sequences that arose to handle erroneous transcriptions and syllabification

## An example

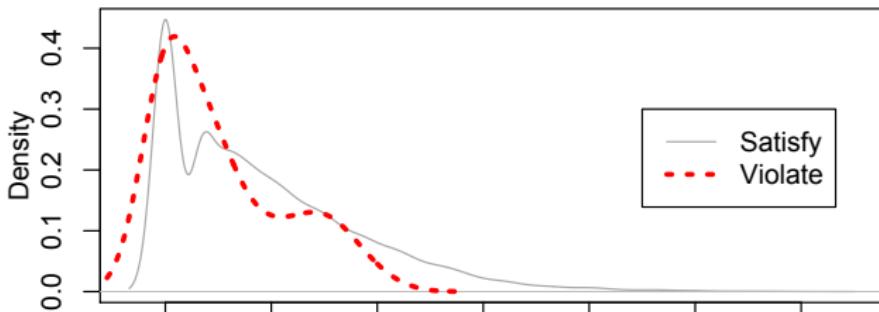
- $*[+dorsal] \left[ \begin{array}{l} +\text{consonantal} \\ +\text{labial} \end{array} \right] (=*[k,g,\eta][p,b,m,f,v])$ 
  - 64 violations, weight = 3.909
  - Most exceptions are compounds or derived forms
  - Most monomorphemic exceptions are /gm/

*eggplant, bagpipe, bagpipes, backbone, backfire, backfield, backpacker, backpack, backpack, backpedal, bookmobile, blackberry, blackball, blackmail, blockbuster, breakfast, dogfish, jackpot, embankment, **figment, fragment**, gangbuster, gangplank, hummingbird, kickback, kingpin, cookbook, **quagmire**, lakefront, logbook, **magpie**, meaningful, milkman, **augment, pigment**, pickpocket, ping-pong, **pigmentation**, pragmatic, wrongfully, **rugby, segment, sigma**, springboard, stockbroker, **stigma**, checkbook, checkmate, workbench, workman, workmanship, workplace, workplace, wingback, walkman, thankfully, thankful*

# Are exceptional words more frequent?

- Goal: compare frequency distribution of violating ('irregular') vs. satisfying ('regular') constraints
- Calculated kernel density estimates over log OANC frequencies for violators and satisfiers
- Result: for this constraint violators tend to have somewhat **lower** than average frequency
  - Possibly also related to the fact that violators tend to be compounds?

\*[+DORSAL][+consonantal,+LABIAL]



## Another cluster constraint

- $* \left[ \begin{array}{l} +\text{consonantal} \\ +\text{coronal} \end{array} \right] . \left[ \begin{array}{l} -\text{continuant} \\ +\text{labial} \end{array} \right] (=*[COR].[p,b])$ 
  - 216 violations, weight = 3.406

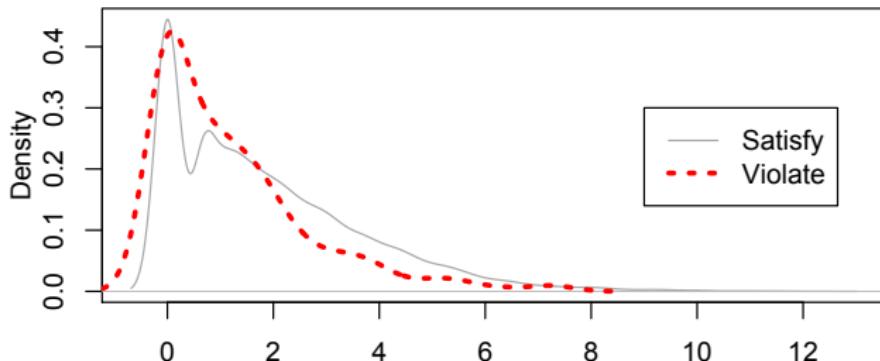
*album, icebox, outback, output, oddball, oxbow, able-bodied, ex-boyfriend, elbow, eastbound, inboard, input, unborn, alpaca, asbestos, basketball, baseball, bedpan, billboard, bullpen, bulb, busboy, dashboard, downpour, disbelief, unplug, fastball, feedback, fishbowl, fallback, foolproof, football, footprint, full-blown, floodplain, frisbee, frostbite, gallbladder, gunpoint, good-bye, grandparent, grasp, hatchback, houseboat, hodgepodge, hardback, heartburn, hotbed, headband, help, henpecked, hornbill, husband, cardboard, cornbread, culprit, cusp, crisp, kielbasa, lesbian, mailbox, needlepoint, needlepoint, nitpick, newsprint, nonprofit, albeit, pocketbook, potpie, pulp, raspberry, rainbow, roadblock, rollback, rosebush, sandbagged, sandpaper, sagebrush, sailboat, setback, seatbelt, softball, sunburn, scalp, sculpture, smallpox, smorgasbord, standby, switchblade, tidbit, tollbooth,*



## Another cluster constraint

- $* \left[ \begin{array}{l} +\text{consonantal} \\ +\text{coronal} \end{array} \right] . \left[ \begin{array}{l} -\text{continuant} \\ +\text{labial} \end{array} \right] (=*[COR].[p,b])$ 
  - 216 violations, weight = 3.406
- Again, violators tend to have lower frequency, contrary to the 'frequent exceptions' hypothesis
  - Reduction in high-frequency exceptions involving /d/: *goodbye*

$*[+\text{consonantal}, +\text{CORONAL}, +\text{coda}][-\text{continuant}, +\text{LABIAL}]$



## More disagreeing clusters

- $$\begin{bmatrix} +\text{sonorant} \\ +\text{labial} \end{bmatrix} \begin{bmatrix} -\text{sonorant} \\ +\text{coronal} \end{bmatrix}$$
  - 70 exceptions, weight = 2.612

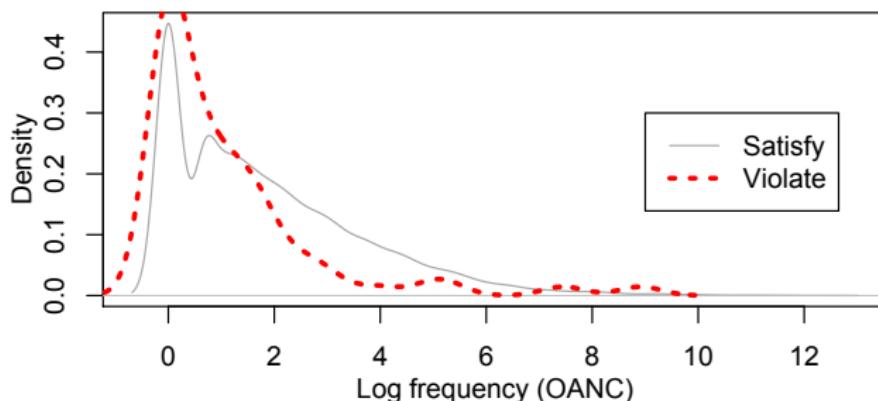
*armed, armchair, informed, unaccustomed, uninformed, bmw, bummed, bloomed, damned, dammed, **damsel**, doomsday, themself, drummed, accustomed, acclaimed, unarmed, unharmed, assumed, ashamed, farmed, fumes, **flimsy**, flimsiest, gummed, groomed, **hamster**, hamstring, hamstring, hemmed, homesick, homesteaded, homestead, hometown, **humdrinker**, **humdrum**, himself, inflamed, uniformed, camshaft, **clumsy**, **lambda**, limestone, monogrammed, maimed, malformed, perfumed, plumbed, proclaimed, circumspect, circumstance, seamstress, seems, someday, sometime, sometime, something, circumstantial, sometimes, skimmed, storms, swimsuit, times, tamed, temptation, charmed, volumes, whimsical, warmth*

- Violations are largely affixed (-ed) or compounds

## More disagreeing clusters

- $\left[ \begin{array}{c} +\text{sonorant} \\ +\text{labial} \end{array} \right] \left[ \begin{array}{c} -\text{sonorant} \\ +\text{coronal} \end{array} \right]$ 
  - 70 exceptions, weight = 2.612

\*[+sonorant,+LABIAL][-sonorant,+CORONAL]



## A glide/vowel constraint

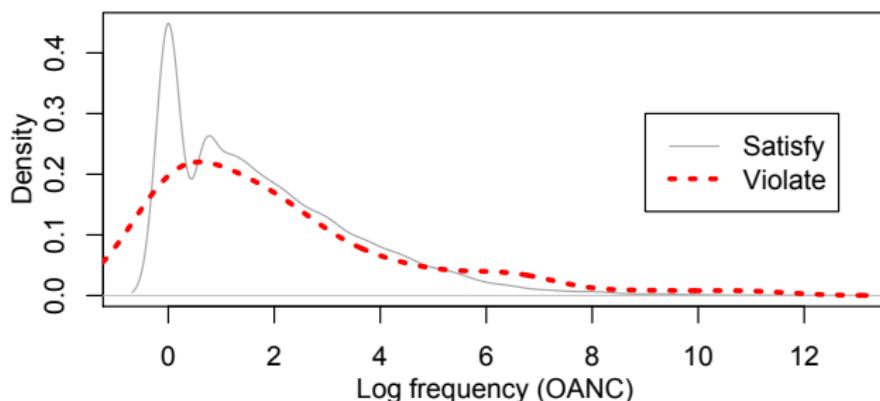
- $*j \begin{bmatrix} +\text{stress} \\ -\text{high} \end{bmatrix}$ 
  - 64 exceptions, weight = 3.146

*backyard, barnyard, dossier, junkyard, familiarity, graveyard, yeah, yack, yam, yang, yankee, yank, yap, ya, yadda, yahoo, yon, yonder, yardage, yard, yarn, yacht, yay, urine, urethane, yellow, yell, yep, yesterday, yet, yo, yodel, yogurt, yoyo, yolk, yawn, yaupon, your, yuck, yummy, yum, young, yuppie, yup, urinalysis, carryover, courtyard, seniority, schoolyard, vignette*

## A glide/vowel constraint

- $*_j \left[ \begin{array}{l} +\text{stress} \\ -\text{high} \end{array} \right]$ 
  - 64 exceptions, weight = 3.146

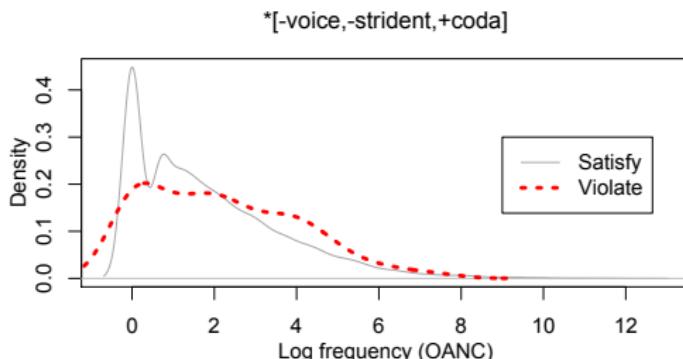
$*[-\text{syllabic}, -\text{back}][+\text{stress}, -\text{high}]$



More generally: weight>1.5, violations>50

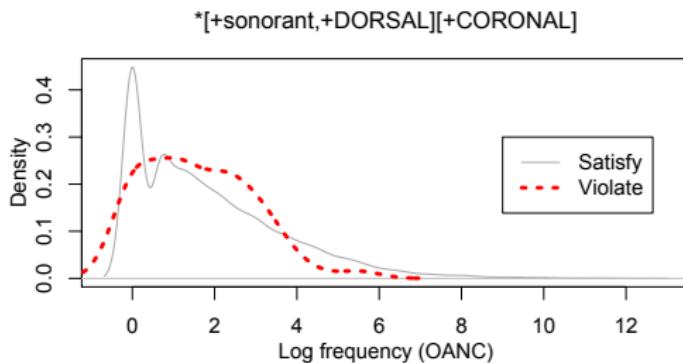
- A small number of constraints show slight skewing of violators to higher frequencies
- No constraint shows anything like a frequency distinction like English irregulars for violators vs. satisfiers

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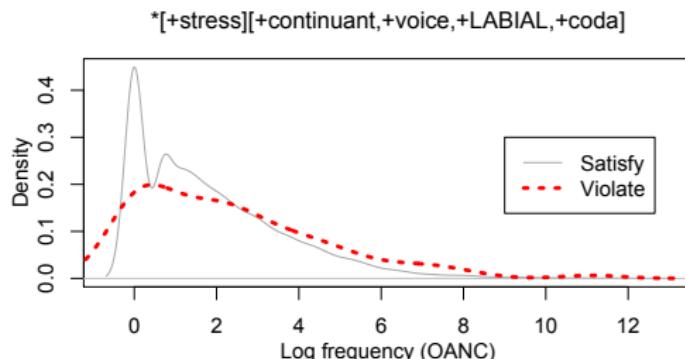
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## The same exercise for Korean

- Same datasets as for bigrams
  - 1- $2\sigma$  nouns, all verbs/adjectives
  - Syllabified phonetic transcriptions
- Submitted to MaxEnt Phonotactic Learner, to learn grammars of 500 constraints
- Examined resulting grammars for constraints with  $>50$  violations, and weights  $> 1$

## Results: Korean nouns

Numerous violable constraints reflecting gradient trends

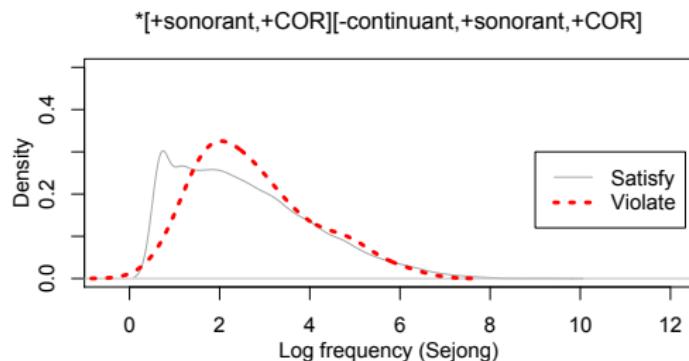
- \*[<sup>-</sup>continuant,<sup>+</sup>sonorant][<sup>+</sup>tense]
  - No tense obstruents after nasals ( $w=2.92$ , 62 violations)
- \*#[<sup>-</sup>continuant,<sup>+</sup>tense]
  - No initial tense stops ( $w=2.58$ , 203 violations)
- \*[<sup>-</sup>high,<sup>-</sup>back][<sup>+</sup>coda,<sup>+</sup>sonorant,<sup>+</sup>COR]
  - No e/ɛ before l,r,n ( $w=1.84$ , 103 violations)

(Related to constraints observed by Cho, 2012 and others)

## Distribution of violators: Korean nouns grammar

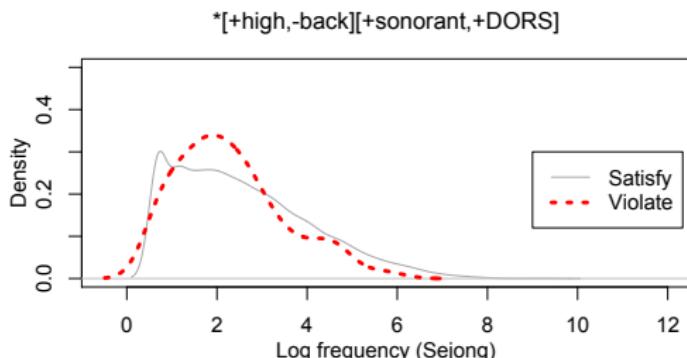
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# Distribution of violators: Korean nouns grammar



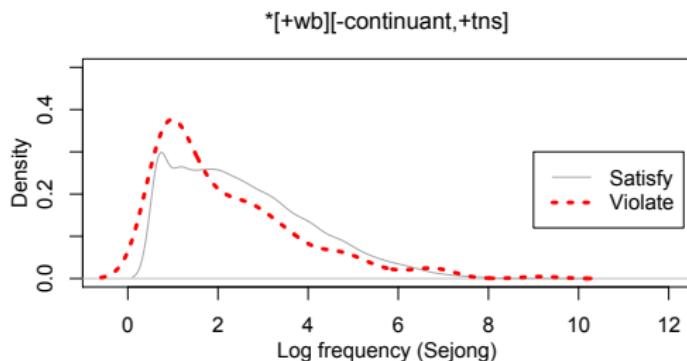
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# Distribution of violators: Korean nouns grammar



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## Results: Korean verbs

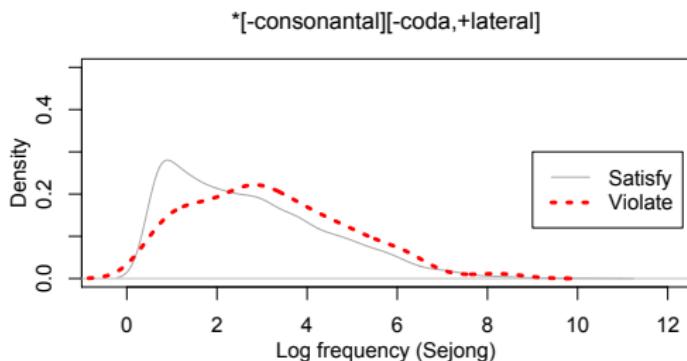
Numerous violable constraints reflecting gradient trends

- \*[**-consonantal**][**-continuant, +sonorant**][**-coda**]
  - No medial nasal onsets, \*VNV ( $w=2.985$ , 601 violations)  
(Similarly, no medial fricative onsets,  $w=2.75$ , 358 violations)
- \*[**-syllabic**][**-sonorant, +LAB**]
  - No labial obstruents as the second member of a cluster  
( $w=1.271$ , 136 violations)
- \*#[**+syllabic**]
  - No initial vowels ( $w=1.131$ , 375 violations)  
(Same constraint is weaker for nouns;  $w=0.32$ )

## Distribution of violators: Korean verbs grammar

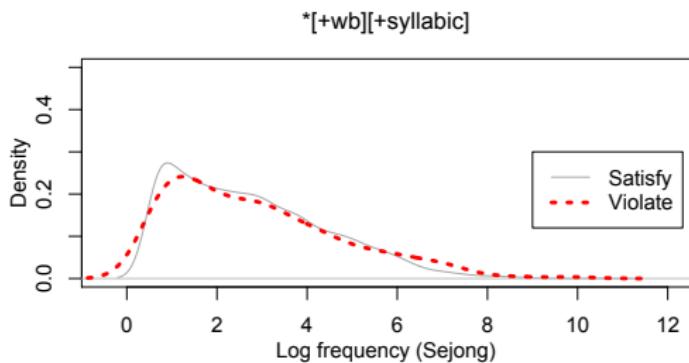
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# Distribution of violators: Korean verbs grammar



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# Distribution of violators: Korean verbs grammar



- As for English, a few specific constraints do show skewing towards higher frequencies, but no general trend

# Discussion



- Final segments show a fairly reliable frequency effect
  - For features that alternate (neutralization)
  - And also, features that don't (phonotactics)
- By contrast, non-final segments don't show a reliable frequency effect
  - Initial segments, specific features: trend towards reverse effect, items with dispreferred value are rarer
  - Throughout the word, constraint violations: similar tendency for exceptions in rarer words

# Interpretation?

- Not consistent with the idea that all predictable features are removed from the lexicon and predicted by grammar
  - At least, not gradiently predictable features
- Perhaps an effect of position, not predictability
  - Final segments more weakly represented than initial segments?
- Not strictly linked to alternations, either
  - Final segment predictability high across languages, regardless of neutralization
  - Consistent frequency effect in final position, regardless of neutralization

## Lower frequency for exceptional items

- Perhaps an avoidance effect?
- Frisch (1996): learners are reluctant/slower to learn improbable words
- Martin (2007): speakers produce phonotactically dispreferred items less frequently than expected

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