

# Exceptions

## *Class 8: Phonotactic probability*



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# Taking stock

- So far: examined predictability of specific features/properties, and distribution of exceptions
  - Morphological regularity
  - Phonological feature values
- Although final segments show expected frequency distribution (exceptional = higher token frequency), properties elsewhere show a tendency in the opposite direction
- Tentative suggestion: phonotactically improbable items are avoided
- A more powerful test: low global phonotactic probability



# Bigram probability and acceptability

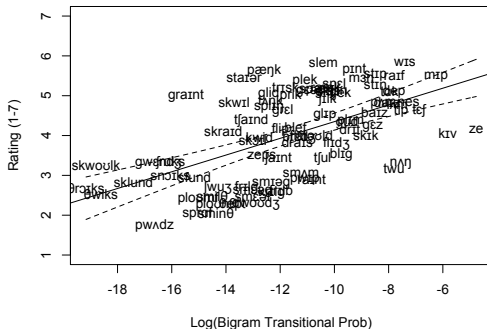
- We're interested in the distribution of words that speakers treat as *exceptional*
  - Exist, but disallowed/penalized by the grammar
- Such words should be phonotactically *unacceptable*
- It's hard to ask speakers about the acceptability of existing words, but we can estimate it using existing models
- First step: a holistic measure of phonotactic probability
  - Transitional bigram probability in the English lexicon

# Modeling phonotactic acceptability

- Transitional bigram probability  $P([abc...x_n]_{wd}) = P(a|[wd])P(b|a)P(c|b)...P(x_n|x_{n-1})P([wd]|x_n)$
- Calculated over segments, or featurally defined natural classes (Albright, 2009)

## Transitional bigram probability models acceptability

- Phonotactic acceptability judgments (Albright & Hayes, 2003)



- Transitional bigram probability from CELEX
- Not a perfect estimate of acceptability, but one of the best available for attested combinations
- For similar results, see Hayes & Wilson (2008), Albright (2009)

# Testing this for two languages

- English
- Korean
  - Nouns
  - Verbs



# English: restricting to monosyllables

- Transitional probability decreases rapidly with the length of the string
  - Hard to compare predictions for words with different numbers of syllables
- A restricted test: monosyllables
- Various choice points
  - Bigram probabilities calculated over monosyllables, or all words
  - Sensitive to syllabic role or not
  - Segments or features (natural classes)
- Report here on segmental bigrams, calculated on syllabified monosyllables



# Approximating the English lexicon

- Frequency data: Open American National Corpus (OANC), second release<sup>1</sup>
- Combined inflected forms of lemmas, single entry with sum of counts
  - 23,451 distinct lemmas

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<sup>1</sup><http://www.anc.org/data/anc-second-release>

- Spoken portion: 3.8M tokens, mostly from SWITCHBOARD Godfrey & Holliman (1993)
- Automated tagging and lemmatization
- 41,463 distinct wordforms



# Phonetic transcriptions

- American English transcriptions from CMU pronouncing dictionary
  - First ('primary') CMU pronunciation, converted to IPA
  - First pass: no POS or homophone differentiation
  - 19,367 transcribed entries, of which 4,657 are monosyllables
- Automated syllabification
  - Goal: distinguish onset vs. rhyme/coda consonants
  - Coda consonants given diacritic
- I will largely ignore stress here, except as reflected indirectly through vowel reduction



## Probable and improbable monosyllables (C = coda)

<i>you</i>	ju	-6.417	<i>frisked</i>	fɹ <u>ɪ</u> skt	-15.205
<i>for</i>	fɔ <u>ɹ</u>	-6.669	<i>swooshed</i>	swu <u>ʃ</u> t	-15.224
<i>see</i>	si	-6.720	<i>valve</i>	væ <u>l</u> v	-15.278
<i>hoe</i>	ho <u>ʊ</u>	-6.790	<i>garbed</i>	gɑ <u>ɹ</u> bd	-15.290
<i>rue</i>	ɹu	-6.809	<i>briefs</i>	bɹ <u>ɪ</u> fs	-15.320
<i>core</i>	kɔ <u>ɹ</u>	-6.850	<i>oomph</i>	u <u>m</u> f	-15.364
<i>do</i>	du	-6.881	<i>dweeb</i>	dw <u>i</u> b	-15.428
<i>why</i>	wɑ <u>ɪ</u>	-6.907	<i>tongs</i>	tɑ <u>ŋ</u> z	-15.453
<i>be</i>	bi	-6.934	<i>glimpse</i>	gl <u>i</u> mps	-16.002
<i>coo</i>	ku	-6.946	<i>sixth</i>	s <u>i</u> ksθ	-16.195
<i>co.</i>	kɔ <u>ʊ</u>	-6.953	<i>midst</i>	m <u>i</u> dst	-16.352
<i>we</i>	wi	-6.967	<i>length</i>	lɛ <u>ŋ</u> kθ	-17.103
<i>too</i>	tu	-7.010	<i>depths</i>	dɛ <u>p</u> θs	-17.834
<i>ray</i>	ɹe <u>ɪ</u>	-7.012	<i>strength</i>	st <u>ɹ</u> ɛŋkθ	-18.187

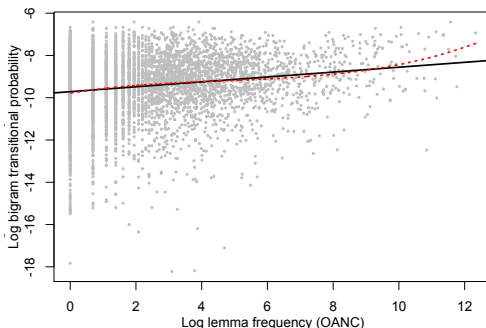


# The general strategy

- Now we have an estimate of how probable (phonotactically ordinary) vs. improbable (phonotactically 'exceptional') each word is
- Next step: examine frequency distribution
  - Do improbable ( $\sim$ exceptional) words tend to have higher token frequency?
  - Conversely, do more high frequency words tend to be more probable ( $\sim$ regular)?

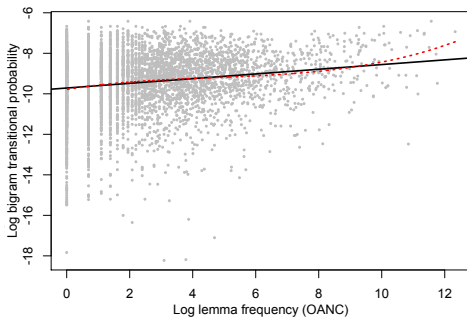


# Phonotactic probability and token frequency



- Small but highly significant effect: phonotactically less probable words tend to have *lower* token frequency
- Holds even when differences in segment count are taken in account

# Phonotactic probability and token frequency



- Model: Bigram trans. prob.  $\sim$  segment count + log lemma freq

	Est	Std Err	t val	P(>  t )
Intercept	-5.691	0.071	-80.69	<2e-16
segment count	-1.129	0.0187	-60.53	<2e-16
log lemma freq	0.047	0.007	6.66	3.05e-11

# Constructing a comparable test for Korean

- As with English, desirable to restrict comparisons to words of comparable length
- Ideally, test with a lexicon of comparable size, with comparable frequency distribution
- Significant phonotactic differences between nouns and verbs/adjectives in Korean, and also frequency differences
  - Potential confound: if there are many more nouns than verbs, but verbs tend to have higher token frequency, high frequency words could look phonotactically 'unusual' just because they are verbs
  - Approach: model nouns and verbs separately



# A Korean lexicon

- Started with the 90,257 lemmas in the Sejong corpus
  - Removed symbols, letter names, suffixes, entries in Hanja, etc.
- Nouns
  - Small number of monosyllables compared to English OANC corpus (only 587), so took 15,386 mono- and disyllables
- Verbs
  - Small number of verbs compared to English OANC corpus, so took all 3,750 verbs
- Within each set, calculated bigram transitional probability



# Phonetic transcriptions

- Converted Sejong entries to phonetic transcription
  - Transliterated and applied regular phonological processes
- Phonotactics of morphemes, or surface forms?
  - In principle, also curious whether morphemes ending in clusters are 'exceptional' and require high frequency
  - Retained coda clusters in phonetic transcription





## Nouns: probable and improbable monosyllables

이	i	-4.929	룸	ru <u>m</u>	-12.720
시	ʃi	-5.024	삿	sa <u>gd</u>	-13.077
지	ji	-5.197	렛	re <u>d</u>	-13.353
연	yə <u>n</u>	-5.423	램	rə <u>m</u>	-13.357
부	bu	-5.542	살	sa <u>lm</u>	-13.803
전	jə <u>n</u>	-5.546	몫	mo <u>gd</u>	-13.840
도	do	-5.562	흙	hɪ <u>lg</u>	-13.865
구	gu	-5.575	뽀	Bya <u>m</u>	-13.908
고	go	-5.577	괌	Gwe <u>m</u>	-13.997
영	yə <u>ŋ</u>	-5.602	삿	sy <u>ad</u>	-14.173
사	sa	-5.641	랩	rə <u>b</u>	-14.206
기	gi	-5.646	슛	sy <u>ud</u>	-14.432
수	su	-5.689	왈	al <u>m</u>	-14.458
정	jə <u>ŋ</u>	-5.724	넛	nə <u>gd</u>	-16.132



# Nouns: probable and improbable disyllables

사이	sai	−10.132	뒤곶	dwiGyəd	−22.830
연시	yənʃi	−10.259	흙밭	hɪlgBad	−22.966
이지	iji	−10.283	흙물	hɪlŋmul	−23.005
도시	dofi	−10.322	칼숨	kaɫsyum	−23.076
구이	gui	−10.331	링겔	ringel	−23.219
부시	buʃi	−10.335	벨벳	beɫbed	−23.257
고시	gofi	−10.337	캡프	kɛɸpɪ	−23.462
이리	iri	−10.373	딛컨	dwidkyən	−23.507
지시	jifi	−10.375	튜브	tyubi	−23.783
전시	jənʃi	−10.381	룸펜	rumpen	−24.001
연지	yənʃi	−10.385	귀땀	gwiDyim	−24.346
영시	yənʃi	−10.431	헬멧	helmed	−24.474
바이	bai	−10.446	뽀틀	Dwimtɪɫ	−24.581
사시	safi	−10.454	캡슐	kɛbsyul	−24.978

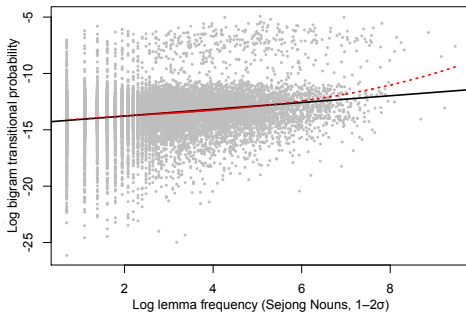


# Same strategy as for English

- Examine relation between n-gram probability and token frequency
  - Do improbable ( $\sim$ exceptional) words tend to have higher token frequency?
  - Conversely, do more high frequency words tend to be more probable ( $\sim$ regular)?



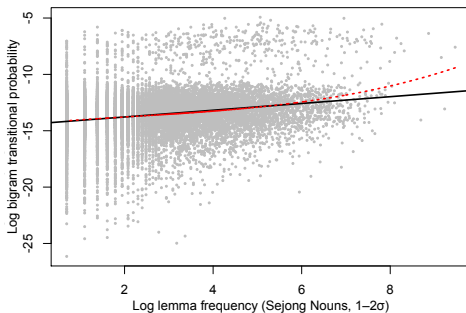
# Phonotactic probability and token frequency



- As for English, phonotactically less probable words tend to have *lower* token frequency
- Holds even when differences in segment count are taken in account



# Phonotactic probability and token frequency

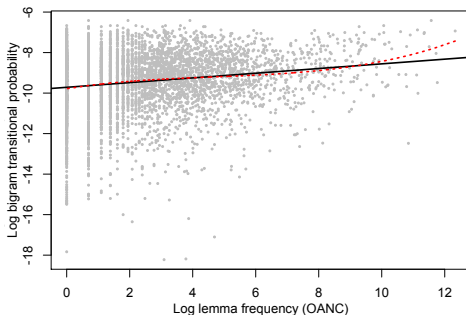


- Model: Bigram trans. prob.  $\sim$  segment count + log lemma freq

	Est	Std Err	t val	P(>  t )
Intercept	-9.275	0.0788	-117.7	<2e-16
segment count	-0.940	0.0136	-69.1	<2e-16
log lemma freq	0.228	0.009	24.8	<2e-16



# Phonotactic probability and token frequency



(Comparison with English)



# Phonetic transcriptions for verbs

- A perennial problem for calculating well-formedness in highly inflected languages: what form to use?
- Interest here is really on the ‘stem’, but not pronounceable in isolation
  - Stem-final simplifications and irregular allomorphy
- Abstraction: stem+“V”
  - That is, a faithful surface form of the stem, as it would occur before a vowel
  - Ignores allomorphy due to irregularity, hiatus resolution, glide formation etc.



## Verbs: probable and improbable monosyllables

지	ji-	-3.981	꺾	GəG-	-12.887
이	i-	-4.435	굶	gol.m-	-12.909
기	gi-	-4.479	삼	sal.m-	-12.919
시	ʃi-	-4.578	깎	GaG-	-12.925
하	ha-	-4.705	벌	bɛt-	-12.997
치	ci-	-4.731	점	jəl.m-	-13.033
가	ga-	-5.024	짹	Jaɫ.b-	-13.050
달	da-	-5.070	섞	səG-	-13.101
나	na-	-5.129	얹	yaɫ.b-	-13.503
마	ma-	-5.171	숙	soG-	-13.560
드	dɪ-	-5.280	좃	joc-	-13.766
비	bi-	-5.375	읊	ɪɫ.p-	-13.902
자	ja-	-5.667	훑	huɫ.t-	-13.944
피	pi-	-5.771	쫓	Joc-	-14.092



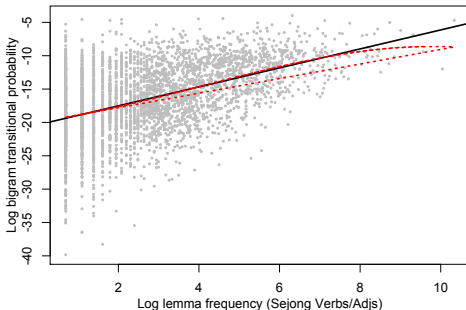


## Verbs: probable and improbable disyllables

들이	d̥iri-	-6.321	벗삼	bə(t̪).sam-	-20.418
어리	əri-	-6.999	헛짚	hə(t̪).jip-	-20.459
거리	gəri-	-7.034	점찍	jəm̩.jig-	-20.519
그리	giri-	-7.059	멤돌	mɛm̩.dol-	-20.562
부리	huri-	-7.540	객적	gɛg̩.jəg-	-20.670
여리	yəri-	-7.556	뒤쫓	dwi.joc-	-20.796
우리	uri-	-7.574	끝맷	ɡ̩t̪.mɛj-	-20.855
꺼리	ɡəri-	-7.574	홍보	hyuŋ̩.bo-	-21.080
가리	gari-	-7.778	짱박	ʃaŋ̩.bag-	-21.126
서리	səri-	-7.787	설쌔	səl̩.səl̩.m-	-21.279
달이	dari-	-7.824	손쉽	son̩.swib-	-21.635
쓰리	ʃiri-	-7.923	쌔몯	sɛm̩.sos-	-22.389
별이	bəri-	-7.947	있잖	it̪.jyan-	-22.828
오리	ori-	-7.952	꼭넙	poŋ̩.nəl̩.b-	-23.671



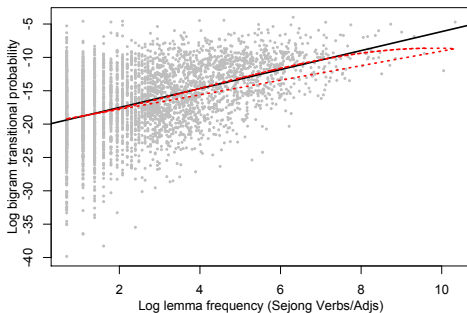
# Phonotactic probability and token frequency



- A consistent result: phonotactically less probable words tend to have *lower* token frequency
- Similar trends for both verbs and adjectives



# Phonotactic probability and token frequency



- Model: Bigram trans. prob.  $\sim$  segment count + log lemma freq

	Est	Std Err	t val	P(>  t )
Intercept	-3.302	0.193	-17.10	<2e-16
segment count	-1.963	0.020	-95.85	<2e-16
log lemma freq	0.278	0.026	10.73	<2e-16



# Summary of whole-word probability

- Contrary to predictions, low frequency words are not phonotactically more probable, at least as measured holistically by transitional bigram probability
- This runs contrary to the expectation that low frequency words should be more 'regular'
- In fact, low frequency words tend to be phonotactically more unusual/improbable
  - Similar effect seen for English, and Korean (nouns, verbs/adjs)
- Cannot be reduced to independent effect of high frequency words having fewer segments
- May still be consistent with other types of 'reduction' among high frequency words



# From acceptability to grammaticality

- Result in this section focuses on bigram probability as a proxy for *phonotactic acceptability*
- Indirectly linked to grammatical exceptionality
  - Unacceptable  $\Rightarrow$  improbable  $\Rightarrow$  grammatically dispreferred
- If grammar regulates the distribution of specific features in specific contexts, then perhaps we need a more pinpointed test
  - Exceptions to the distribution of specific features
  - Exceptions to specific grammatical constraints



# References

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