

## Modeling universal and lexical influences on phonotactic judgments

James Myers and Jane Tsay  
National Chung Cheng University  
Lngmyers at ccu.edu.tw  
<http://www.ccunix.ccu.edu.tw/~lngmyers/>


TPC-4 – Taipei, Taiwan – May 4, 2013

## Overview

- Universality enhances lexical learning
  - Cooperative interaction
- Evidence from acceptability judgments
  - English
  - Southern Min
  - Mandarin (two separate tests)
- Implications for phonological theory
  - Optimality Theory makes the wrong predictions...
  - ... but there may be an OT-like solution

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## How do universals shape grammar?

- **Universal Grammar (UG)**
  - Experience arranges universal bits of grammar
  - E.g. learning OT ranking (Tesar & Smolensky 2000)
- **Learning biases**
  - Experience is filtered through universal biases
  - E.g. locality in constraint building (Hayes & Wilson 2008)
- UG and biases make distinct predictions
  - Strict vs. fuzzy universals (e.g. Mielke 2008)
  - **How universals and experience interact** 

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## Clues from acceptability judgments

- Native speaker judgments of nonwords reveal productive phonological knowledge
- **Lexical typicality** improves acceptability
  - English-like items sound better to English listeners
  - Likewise for many languages, including Chinese (e.g. Bailey & Hahn 2001; Myers & Tsay 2005)
- **Naturalness** also improves acceptability
  - Universally less marked items sound better (e.g. Frisch & Zawaydeh 2001; Hayes & White 2013)


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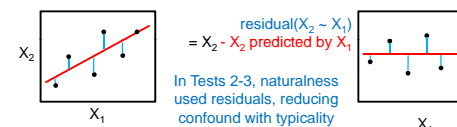
## Operational definitions

- **Lexical typicality:** Learned from experience
  - Highly analytical (e.g. constraint weights)
  - Sort of analytical (e.g. phonotactic probability)
  - Holistic (e.g. neighborhood density)
- **Naturalness:** Universally helps learning
  - Typology (by hunch, or quantitative)
    - Cross-linguistically common = easier to learn
  - Complexity (e.g. in terms of features)
    - Simpler = easier to learn

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## Reducing statistical confounds

- Naturalness & lexical typicality are correlated:
 
- A statistical trick: Replace one independent variable with residuals:



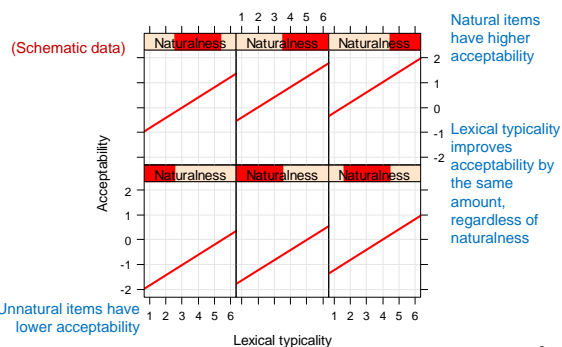
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## Three logically possible interactions

- **No interaction**
  - Judgments improve with lexical typicality equally strongly in natural and unnatural items
- **Competitive interaction**
  - Judgments show stronger lexical typicality effects in unnatural items
- **Cooperative interaction**
  - Judgments show stronger lexical typicality effects in natural items

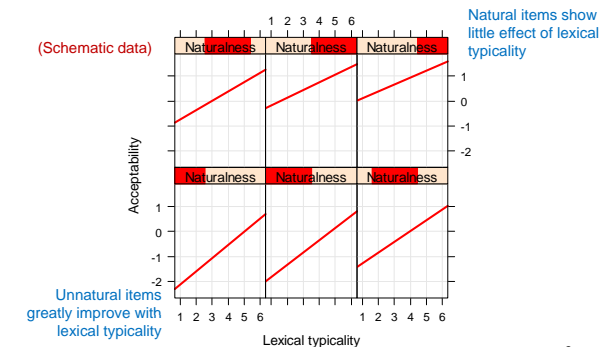
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## No interaction



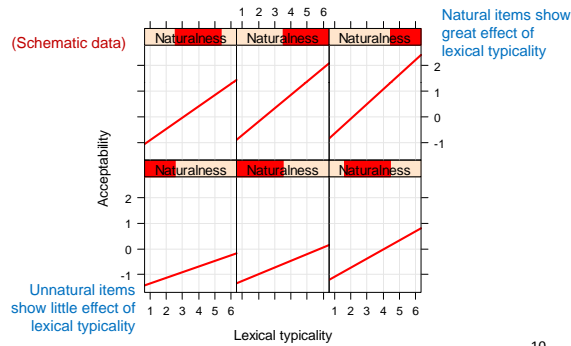
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## Competitive interaction



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## Cooperative interaction



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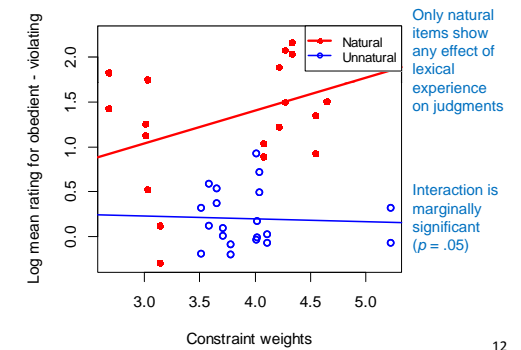
## Test 1: English

- Reanalyzing the constraint-violating nonword judgment data from Hayes & White (2013)
- **Lexical typicality:** Weights of computer-learned constraints (higher = less typical)
- **Naturalness:** Typological intuitions (albeit by experts)

		Naturalness of constraints	
		Unnatural	Natural
Constraint weights	Lower	oid (vs. oit)	trefk (vs. treft)
	Higher	ooker (vs. ocker)	jouy (vs. jout)

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## Result: Cooperation



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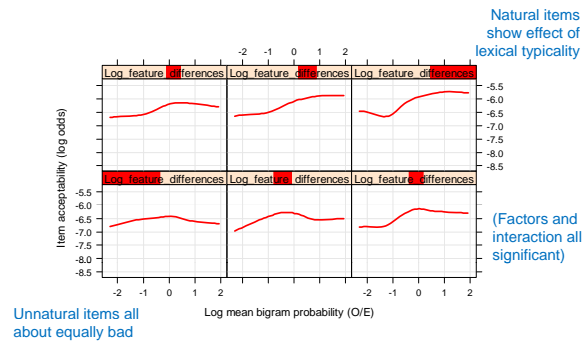
## Test 2: Southern Min

- 255 non-lexical syllables, one per each logically possible bigram of Southern Min phonemes
- 20 native speakers, binary auditory judgments
- **Lexical typicality:** Lexical bigram probability (observed / expected: Frisch & Zawaydeh 2001)
- **Naturalness:** Bigram feature differences (more differences = easier to distinguish perceptually; tone was ignored...)

Mean bigram probability (O/E ratio)	Mean number of feature changes	
	Lower	Higher
Higher	biem <sup>1</sup>	sot <sup>4</sup>
Lower	guon <sup>7</sup>	piok <sup>8</sup>

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## Result: Cooperation



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## Two tests in Mandarin

- A **mega-study** (see e.g. Balota et al. 2012)
  - All 3,274 non-lexical syllables that can be written in BPMF (Taiwan's phonetic orthography)
  - Binary judgments of BMPF syllables
- **Test 3:** Pilot (16 speakers)
  - Neighborhood density x onset typological frequency
- **Test 4:** Full mega-study (76 speakers)
  - Phonotactic probability within vs. across languages
- Both analyses ignore tone again

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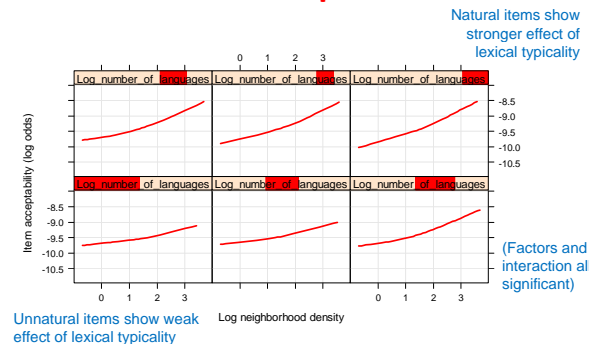
## Test 3: Neighbors & Onset typology

- **Lexical typicality:** Number of lexical neighbors (One segment from target (Vitevitch & Luce 1999))
- **Naturalness:** Number of languages that have the item's initial consonant (in UPSID; Maddieson 1984)

Neighborhood density	UPSID frequency of onset	
	Lower	Higher
Higher	t <sup>h</sup> io <sup>2</sup>	pio <sup>4</sup>
Lower	t <sup>h</sup> ie <sup>1</sup>	pie <sup>1</sup>

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## Result: Cooperation



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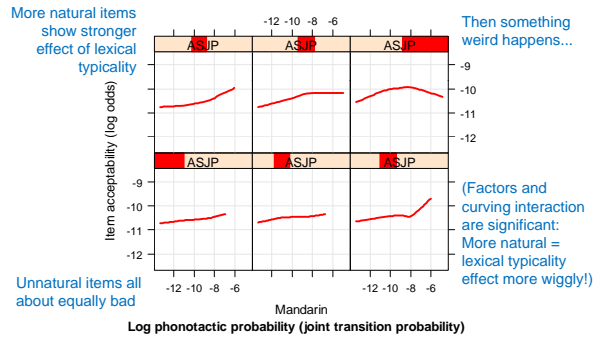
## Test 4: Lexical & typological phonotactics

- **Lexical typicality:** Joint transition probability of bigrams in Mandarin (Albright 2009):
 
$$(\text{freq}(s_1s_2)/\text{freq}(s_1)) \times (\text{freq}(s_2s_3)/\text{freq}(s_2)) \times \dots$$
- **Naturalness:** Same thing, but computed over languages in ASJP database (Brown et al. 2013) (see Appendix 1 for details on ASJP)

		ASJP transition probability	
		Lower	Higher
Mandarin transition probability	Lower	siau <sup>4</sup>	sin <sup>3</sup>
	Higher	liai <sup>1</sup>	fau <sup>2</sup>

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## Result: Cooperation?



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## Is the cooperative interaction real?

- Empirically robust?
  - Other quantifications of naturalness and lexical typicality, other languages, interfering factors...
    - Whence the wiggleness...?
- Statistically meaningful?
  - Interaction may be due to a “floor effect”:
    - Are the flatter trend lines merely due to overall low acceptability?
    - But Test 4 shows simple interactions aren’t inevitable

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## Can OT get this pattern?

- Consider three markedness constraints *A, B, C*
- Encode items via violation profiles
  - [ABC] = a form obeying all three constraints
  - [aBC] = a form violating A but obeying B & C, etc...
- Sort items by degree of markedness:
  - More natural items: [aBC], [AbC], [ABc]
  - Less natural items: [abc], [aBc], [Abc]
- Does OT more readily distinguish among the *natural* items, as the judgment data imply?

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## OT: No interaction, or competition

- All violation profiles equally distinguishable:

	More natural items			Less natural items		
	A	B	C	A	B	C
aBC	*			*	*	
AbC		*		*		*
ABc			*		*	*

- Unnatural items more informative about constraint demotion:

	C	A	B
abC		*	*
aBc	*	*	
Abc	*		*

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## Interactions and addition

- OT comes from **Harmonic Grammar** (HG), which computes harmony via addition (Hayes & Wilson 2008; Potts et al. 2010):
 
$$H = \text{Weight}_1 \times \text{Violations}_1 + \text{Weight}_2 \times \text{Violations}_2 + \dots$$
- HG makes the same false predictions as OT
  - If  $H([aBC]) > H([AbC])$ , then  $H([aBc]) > H([Abc])$
- In essence this is because interactions go beyond addition (as in statistics)
 
$$Y = X_1 + X_2 + X_1X_2$$

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## Modeling interactions in OT

- The  $X_1X_2$  part in  $Y = X_1 + X_2 + X_1X_2$  looks familiar...
- Try **constraint conjunction** (Smolensky 1993)
  - A&B violated if and only if both A and B are violated
- But this makes unnatural items *more* distinct:

	More natural items				Less natural items			
	A&B	A	B	C	A&B	A	B	C
aBC		*				*		
abC	*	*	*		*	*	*	
AbC			*			*		*
ABc				*			*	*

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## Positive constraint conjunction

- Try again (Crowhurst & Hewitt 1997; cf. Wolf 2007)
  - AB is *obeyed* if and only if both A and B are *obeyed* (The Smolensky type is actually disjunction)
- This works! Natural items are more distinct:

	More natural items				Less natural items			
	AB	A	B	C	AB	A	B	C
aBC	*	*			*	*		
AbC	*		*		*		*	
ABc				*	*			*

(See Appendices 2 & 3 for more discussion...)

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## Sketch of a learning model

- Learner encodes items via innate constraints
  - /san/ = {✓ONSET, ✓\*NUC/i, \*NOCODA,...}
  - This is the key **learning bias**
- Learner creates positively conjoined constraints
  - [aBC] triggers creation of [BC] [aBc] triggers nothing
- And ranks them by how often they’re obeyed
  - freq([aBC]) > freq([AbC]) triggers BC >> AC
  - The above steps capture cooperative interaction
- Non-conjoined constraints do nothing...?
  - BC >> AC works (almost) exactly like B >> A

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## Conclusions

- Naturalness and lexical typicality cooperate
  - Many empirical questions remain open
  - (The ASJP database is an amazing typology tool)
- Standard OT misses this insight
  - Positive conjoined constraints may help
  - Many formal questions remain open
- Learning biases are better than UG
  - UG: Learning fills innate gaps (no interaction, or competition)
  - Biases: Naturalness helps learning (cooperation)

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## Thanks!

- Experimental participants
- Assistants Guo-Ming Hong, Chiung-Wen Hsu, Zi-Ping Hsu, Yu-Leng Lin, Chia-Wen Lo, Chen-Tsung Yang
- National Science Council (Taiwan) grants NSC 97-2410-H-194-067-MY3, NSC98-2410-H-194-086-MY3, NSC101-2410-H-194-115-MY3
- Commentators Tsung-Ying Chen, Bruce Hayes, Elizabeth Hume, Yu-Leng Lin, and the audiences of SLE 45 (Stockholm, 2012) and the Workshop on Phonological Markedness (Hsinchu, Taiwan, 2012)

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## Appendix 1: The ASJP database

- The Automated Similarity Judgment Program was created to study diachronic phonology
  - Around 40 Swadesh (1971) words per language
  - Currently contains 5844 languages!
  - Includes creoles, Esperanto, Klingon, no sign language...
  - Transcriptions can be simplified and noisy: Mandarin “blood” [ɔyɛ³]: Sie, Swe, Siueh
- But it’s also great for phonological typology
  - Family and genus information can be used for representative samples (we haven’t tried this yet)

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## Appendix 2: Gradient interactions

The more unnatural, the more constraints needed to distinguish...

	AB	AC	AD	BC	BD	CD	A	B	C	D
More natural	aBCD	*	*	*				*		
	AbCD	*			*	*			*	
	ABcD		*		*	*			*	*
Semi-natural	ABCD	*	*	*	*	*		*	*	*
	abCD	*	*	*	*	*	*	*	*	*
	aBCd	*	*	*	*	*	*	*	*	*
	AbCd	*	*	*	*	*	*	*	*	*
Less natural	AbCd	*	*	*	*	*	*	*	*	*
	abCd	*	*	*	*	*	*	*	*	*
	aBCd	*	*	*	*	*	*	*	*	*
	Abcd	*	*	*	*	*	*	*	*	*

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## Appendix 3: Think positive

- **Standard OT**
  - Representations encoded via violations only (Golston 1996)
  - Learner learns only what is not already innate
  - **UG approach:** What’s innate is a partial grammar
- **OT with positive constraint conjunction**
  - Representations also encode obeyed constraints
  - Innately sanctioned representations filter learning
  - **Bias approach:** What’s innate is a learning algorithm

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