

Substantive bias in paradigm reanalysis: the case of Malagasy weak-stem alternations

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July 1, 2022

TripleAFLA (Manchester)

Outline

Background

Directions of reanalysis

Modeling

Paradigm reanalysis

- Paradigms which contain neutralizing alternations are difficult to learn, and prone to reanalysis.
- Example of reanalysis in Latin:

•	<i>Before</i>			<i>After</i>	
	NOM SG.	GEN SG.		NOM SG.	GEN SG.
	hono: s	hono: ris	→	honor r	hono: ris (s → r)
	soro r	soro: ris		soro r	soro: ris

Paradigm reanalysis

- Kiparsky (1978): studying patterns of reanalysis can give us insight into the factors that drive phonological learning.
- Recent work suggests the following factors:
 - Probabilistic distributions (frequency matching)
 - biases towards less marked outputs.

Paradigm reanalysis

- Kiparsky (1978): studying patterns of reanalysis can give us insight into the factors that drive phonological learning.
- Recent work suggests the following factors:
 - Probabilistic distributions (frequency matching)
 - biases towards less marked outputs.
- Very few quantitative models of reanalysis.
- Existing ones predict that reanalysis will always be based on probabilistic distributions.
 - Albright's Minimal Generalization Learner (MGL 2002; 2003, etc.)
 - Nosofsky's (2011) Generalized Context Model (exemplar-based analogical models).

Goals of the current talk

- Show that in Malagasy, reanalysis is driven by **both**:
 - distributional information
 - a substantive bias towards phonetically natural outputs.
- Outline a constraint-based model of reanalysis which captures both effects.

Basics of Malagasy phonology

- Official Malagasy (OM), based largely on the Merina dialect
- Inventory (Howe, 2021):
 - 5 vowels (/a e i o u/)

	bilabial	labiodental	dental	alveolar	retroflex	velar	glottal
plosives*	p, b		t, d			k, g	
	^m p, ^m b		ⁿ t, ⁿ d			^ŋ k, ^ŋ g	
affricates*				ts, dz	tʂ, dʂ		
				ⁿ ts, ⁿ dz	ⁿ tʂ, ⁿ dʂ		
nasals	m		n			(ŋ)	
trills/flaps				r~r			
fricatives		f, v		s z			h
lat. approximants				l			

*Pre-nasalized stops/affricates will be written as nasal-consonant sequences (e.g. *mp* [^mp]).

- (C)V syllable structure.

Weak stems (Keenan and Polinsky, 2017)

- always end in one of the weak syllables ‘ka’, ‘tʂa’, ‘na’
- When weak stems are suffixed, the consonant in the weak syllable (tʂ/k/n) may alternate with another consonant.

pattern		active (m + stem)	passive (stem + ana)	
na ~	n	mandzavina	andzavina	‘to bear leaves’
	m	manandzana	andzamana	‘to try’
ka ~	h	mangataka	angatahana	‘to ask for’
	f	manahaka	anahafana	‘to scatter’
tʂa ~	r	mianatʂa	ianarana	‘to learn’
	t	manandzatatʂa	anandzatanana	‘to promote’
	f	mandzakutʂa	andzakufana	‘to cover’

Table 1: Patterns of consonant alternation in Malagasy weak stems

Historical basis of weak stem alternations

- final consonant neutralizations, followed by vowel epenthesis, resulted in weak stems (Adelaar, 2012).
- ~400AD: contact with Bantu resulted in a strict CV syllable structure.
 - a subset of consonant-final forms underwent final vowel epenthesis.

Historical basis of weak stem alternations

Example adapted from Mahdi (1988)

(1) **tʃa~t alternation**

PMP	*Rabut	*z-abut-a	
	↓	↓	
PSEB	*'awut	*pia'wutan	
	↓	↓	
PMlg	*'avuʈʃ	*fia'vutan	Final affrication: *-t > -ʈʃ
	↓	↓	
	'avuʈʃa	fia'vutana	tʃa~t alternation
Mlg	'avuʈʃa	fia'vutana	'to uproot'

PMP	Proto-Austronesian
PMP	Proto-Malayo-Polynesian
PSEB	Proto-South East Barito

Reanalysis in weak stems

- In general, observed alternants are supposed to match specific historical final consonants.
- In cases where there is a mismatch, reanalysis has likely occurred.
- Examples of possible reanalyses:

DIRECTION

ACTIVE

PASSIVE

r→t

miána**t**ʂaianá**r**ana → ianá**t**ana

t→r

manándz**a**tʂaanandz**a**tana → anandz**r**ana

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Question: What factors influence the direction of reanalysis in Malagasy?

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Reanalysis in Malagasy

- In Malagasy, the observed alternant often does *not* match the historical PMP one, suggesting that extensive reanalysis has occurred.
- As a preview, reanalysis appears to have largely happened in the following directions:

Ending	Direction	
ka	f→h	Predicted by lexical statistics
na	m→n	Predicted by lexical statistics
tʃa	f, t → r	Not predicted by lexical statistics

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- **Note: in the rest of this talk, I will focus on reanalysis in tʃa-final stems.**

Method and data

- Approach: compare modern Malagasy forms with their historical variants, and look for cases where the observed alternant doesn't match the expected one.
- Data:
 - Protoforms from Austronesian Comparative Dictionary (ACD; Blust and Trussel, 2010)
 - supplemented with loanwords from the World Loanword Database (Adelaar, 2009).
 - Modern Malagasy forms from the Malagasy Dictionary and Encyclopedia of Madagascar (MDEM; de La Beaujardière 2004), confirmed with a native speaker consultant.
 - 73 Malagasy tʃa-final weak stems with known historical forms.

Predicting directions of reanalysis

- Strong preference for t (67%)
- A slight dissimilatory tendency (*r...r), which has also been noted by Mahdi (1988)

expected	count	preceding r
t (<*t,*C)	49	13 (27%)
r (<*j,*d,*d)	16	2 (13%)
f (<*b,*p)	8	1 (13%)

Table 2: Expected distribution of alternants for tʃa-stems, given final consonants of PMP

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- Suppose that reanalysis was purely driven by distributional information...
- then, we expect it to result in **more t-alternation** (i.e. r→t), and potentially **more dissimilation**.

Results: directions of reanalysis

- Expected vs. actual alternant of tʃa-final stems in modern Malagasy, based on known protoforms/loanwords

match?	alternant		change	count	preceding r
	expected	modern Mal.			
yes	r	r		15	0
yes	t	t		21	14
yes	f	f		6	1
no	r	t	r→t	1	1
no	t	r	t→r	28	0
no	f	r	f→r	2	0

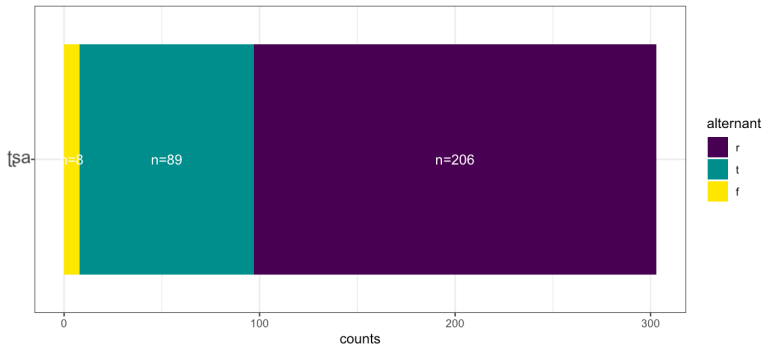
- Overwhelmingly, reanalysis is in the direction of t→r
 - ...except when there a preceding r
- We observe dissimilation, but also change in the opposite direction of what is predicted by distributional information.
- note: t>r is **not** a regular sound change, and VtV sequences are found in stems.

Results: tʃa-alternation in modern Malagasy

- What does tʃa-alternation look like in modern Malagasy?
- data: 305 tʃa-final weak stems (from the MDEM).

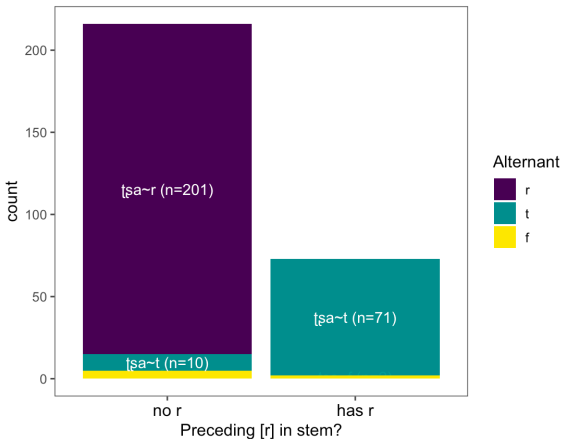
Results: tʃa -alternation in modern Malagasy

- What does tʃa -alternation look like in modern Malagasy?
- data: 305 tʃa -final weak stems (from the MDEM).
- general preference for r as alternant



State of tʃa -alternation in modern Malagasy

- strong dissimilatory pattern
- **r** is the default, **except** when stem already has an **r**



Summary of pattern

historical Malagasy

preference for t-alternation; weak dissimilatory patterns (*r...r)

current Malagasy

preference for r-alternation; strong dissimilatory patterns

Summary of pattern

historical Malagasy

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current Malagasy

preference for r-alternation; strong dissimilatory patterns

Why was there reanalysis towards r-alternation?

- not predicted by distributional probabilities; problem for existing quantitative models of analogical change
- Cause: markedness constraint against intervocalic stops?
 - Evidence from Malagasy
 - Typological evidence

Markedness constraints against intervocalic stops

- Evidence from Malagasy
 - historical lenition/spirantization: *b>v; *p>f; *d,*d̥>r; *k,*g>h (Adelaar, 2012)
 - ...resulted in there being fewer intervocalic stops at some point in historical Malagasy
 - ka-final weak stems always alternate with fricatives (h, f)
e.g. 'aloka~a'lohana, 'hirika ~hirifana

- Typology
 - phonetically natural, from both an articulatory (Kirchner, 1998) and perceptual (Kaplan, 2010; Katz, 2016) point of view.
 - Examples of lenition of stops specifically at morpheme boundaries: English tapping (Hayes, 2011, p. 143-144), Korean lenis stop voicing (Jun, 1994).

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Modeling

- Reanalysis of t̥sa-final stems is qualitatively influenced by markedness constraints.
- **Next step:** explicitly demonstrate how this works in a quantitative model
- Model should predict reanalysis of *t>r, despite the distribution of final stops in historical Malagasy, which favors t over r.

Modeling

- Reanalysis of $\text{t}\text{ʃa}$ -final stems is qualitatively influenced by markedness constraints.
- **Next step:** explicitly demonstrate how this works in a quantitative model
- Model should predict reanalysis of $*\text{t} > \text{r}$, despite the distribution of final stops in historical Malagasy, which favors t over r .
- Model is based in Maximum Entropy Harmonic Grammar (Maxent; Goldwater and Johnson, 2003; Prince and Smolensky, 1993), a stochastic variant of OT which assigns candidates probabilities.
- Faithfulness constraints are biased to have lower weights.
 - Captures the intuition that learners may value markedness over faithfulness constraints in the beginning stages of learning (e.g. Tesar and Smolensky, 2000; Jusczyk et al., 2002).

Input

- tra-, ka-final, na- final weak stems
- Frequency counts based on the PMP protoforms.
- rather than URs, the input is **surface forms**, mapping from stem to suffixed.

e.g. INPUT CANDIDATES
 'vuliʦa → vu'lir-ana
 vu'lit-ana
 vu'liʦ-ana

- Reason: Empirically, all reanalyses are from the stem→suffixed forms, and this happens when learners have access to the surface stem, but not the suffixed forms.
- Similar to approach to Albright (2002)
- Note: for simplicity, I'm ignoring ʦa~f alternating forms, which are rare and do not influence model outcomes.

Constraint set: faithfulness

- IDENT-OO constraints (output-output identity constraints, by feature)

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- Following Wilson (2006), biases are implemented as Gaussian priors, with a preferred weight (μ) for each constraint.
 - Faithfulness constraints have $\mu = 0$, and are therefore penalized for having high weight.

Constraint set: Markedness

- $*[\text{ʃ}]V$, $*[k]V$, $*[n]V$, which assess violations for every $C]V$, where C is at a **morpheme boundary**.
 - motivates alternation of the final consonant of weak stems.
 - Need to reference morpheme boundary because within stems, prevocalic ʃ , k , and n are allowed (e.g. beʃoka ‘to swell up’, ʃsano ‘box’)
 - Example:

'vuliʃa	*[ʃ]	ID-OO[anterior]	ID-OO[voice]
a. vu'lit-ana		*	
b. vu'lir-ana		*	*
c. vu'liʃ-ana	*!		

Constraint set: Markedness

- ***V[-cont] V**: motivates re-analysis from t>r

'vuliʃa	*V[-cont]V	ID-OO[voice]	ID-OO[ant]
a. vu'lit-ana	*!		*
☞ b. vu'lir-ana		*	*

- ***r...r**: motivate r-dissimilation.

'vuriʃa	*r...r	*V[-cont]V	ID-OO[voice]	ID-OO[ant]
☞ a. vu'rit-ana		*		*
b. vu'rir-ana	*!		*	*

Markedness constraints

- Notably, *V[-cont]V and *r...r do not trigger alternations in the lexicon.
- Examples of stems which violate these constraints:
 - *akándzo* ‘coat, dress’, *áto* ‘close at hand’
 - *ráraka* ‘spilled’, *boréra* ‘weak, limp’
- However, they appear to be present as weak phonotactic constraints in the Malagasy lexicon.
 - Based on a phonotactic grammar built using the UCLA Phonotactic Learner (Hayes and Wilson, 2008).

Model results: one iteration

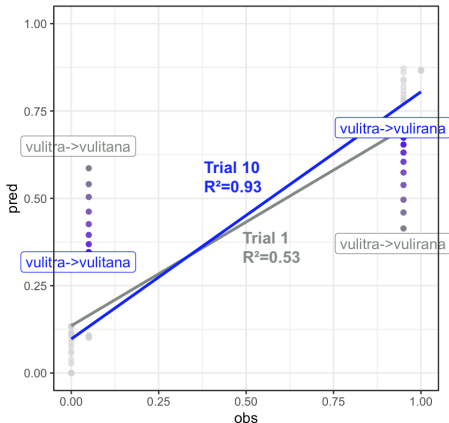
Results after one iteration of the model:

- Bias in the correct direction, but with a small magnitude.

input	output	type	obs (PMP)	P (biased)
vuliṭṣa	vulir-ana	ṭṣ~r	0.28	0.33 +5%
	vulit-ana	ṭṣ~t	0.72	0.67
	vuliṭṣ-ana	non-alt	0	0
vuriṭṣa	vurir-ana	ṭṣ~r	0.13	0.13
	vurit-ana	ṭṣ~t	0.87	0.87
	vuriṭṣ-ana	non-alt	0	0
vulika	vulih-ana	k~h	0.90	0.88
	vulif-ana	k~f	0.10	0.11
	vulik-ana	non-alt	0	0.01
vulina	vulim-ana	n~m	0.04	0.04
	vulin-ana	non-alt	0.96	0.96

Model results: multigenerational

- Running the model multiple times could simulate the effect of a bias over multiple generations.
- Method: run the model 10 times, with the results of the previous trial as the input to the next.



- Plot: observed rates of alternation in modern Malagasy vs. model predictions.
- A biased model improves fit to modern Malagasy lexicon, suggesting that it better predicts directions of reanalysis.

Conclusion

- In Malagasy, the direction of reanalysis in tʃa-final weak stems is not predicted by lexical statistics.
- Instead, it is drive by two markedness constraints, both arguably phonetically natural.
 - *V[-cont]V
 - *r...r
- Reanalysis can be modeled in MaxEnt, where frequency matching is modulated by a substantive bias.

Special thanks to...

- Vololona, for generously using her time to provide native speaker judgements.
- Bruce Hayes, Kie Zuraw, Claire Moore-Cantwell, David Goldstein, and members of the UCLA phonology seminar for their invaluable feedback.

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