

# Markedness bias in phonological learning: a Samoan case study and proposed experiment

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## 1 Background

- How do learners resolve conflicting data patterns in morphophonological paradigms? English example from Berko (1958):

SG	PL
chie[f]	chie[f]s
lea[f]	lea[v]es
heaf	hea[f]s? hea[v]es?

- Learner errors are informative.
  - Reanalysis: errors adopted into speech community, resulting in a type of language change.
- Malagasy: patterns of reanalysis suggest that learners are sensitive to both **frequency matching** and to a **markedness bias**.
  - ...where markedness is restricted to “active” markedness already present in stem **phonotactics**.
- **Goals for today:**
  1. Describe a Samoan case study showing the effect of markedness in reanalysis over time.
    - “replication” of Malagasy results
  2. Propose a nonce-word experiment that builds on these findings, by comparing the effect of learning biases in Samoan L1 vs. heritage speakers.

## 2 A Samoan case study: the reanalysis of $\emptyset \sim C$ alternations

- In the Polynesian languages (and many other Oceanic languages), a consonant of unpredictable quality may surface under suffixation (Pawley 2001)
- Samoan (Mosel and Hovdhaugen 1992): the -Cia ‘ERGATIVE’ suffix has various allomorphs, which mainly differ in their initial consonant (Table 1). Note: only /-a, -ina/, the vowel-initial allomorphs, are productive.<sup>1</sup>

ERG.	STEM	SUFFIXED	GLOSS	POc
a	rere	rere-a	to take	*rere
ina	iloa	iloa-ina	to see, perceive	*qilo
tia	pulu	pulu-tia	to plug up	*bulut
sia	laka	laka-sia	to step over	*lakas
ŋia	tutu	tu-ŋia	to light a fire	*tutuŋ
fia	utu	utu-fia	to draw water	*qutup
mia	inu	inu-mia	to drink	*inum
lia	tautau	tautau-lia	to hang up	*saur
na	ʔai	ʔai-na	to eat	*kaen
ʔia	momo	momo-ʔia	to break in pieces	*mekmek

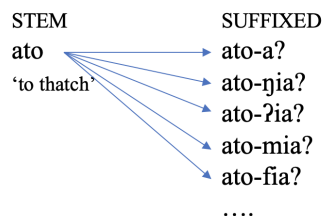
Table 1: Samoan  $\emptyset/C$  alternations

- Historical origin: word-final consonants of Proto-Oceanic (POc) were regularly lost.

POc	*inum	*inumia	*bulut	bulutia
	inu	–	pulu	–
				(C > $\emptyset$ /__#)
Samoan	inu	inu-mia	pulu	pulu-tia

- Ambiguity in the unsuffixed form can result in reanalysis (Hale 1973):

Conflicting patterns make learning difficult.



**Reanalysis:** errors adopted into speech community and passed through generations of speakers.

Samoan suffixed form			
POc	Expected	Actual	Reanalysis
*qatop	ato-fia	ato-a	f → $\emptyset$
*akot	aʔo-tia	aʔo-ina	t → $\emptyset$
*qulin	uli-na	uli-ŋia	n → ŋ

<sup>1</sup>The relative distribution of a/ina is partially predictable from the length of a word.

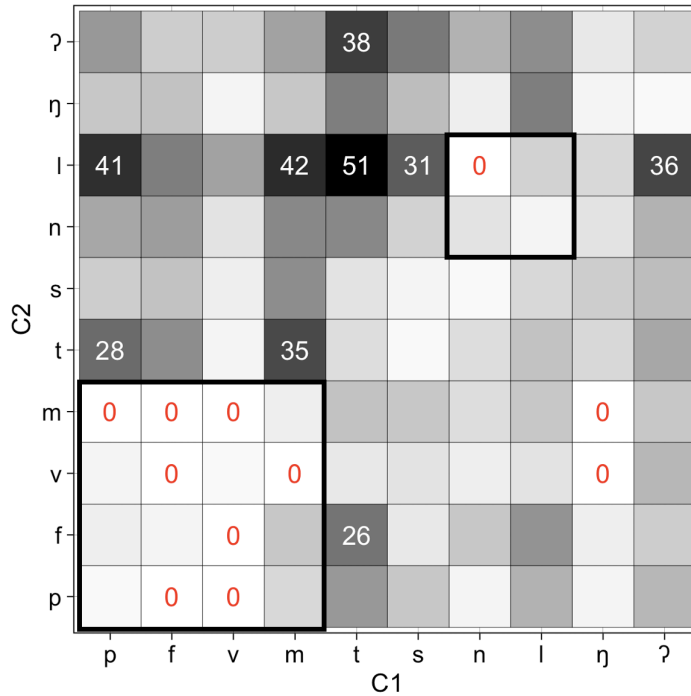
### Preview of results:

- Reanalysis is towards the more frequent allomorph, but is sensitive to markedness effects.
  - Phonotactically marked outputs are more likely to be reanalyzed.
- How so? Samoan *roots* are subject to (non-local) consonant OCP effects. A model of reanalysis which incorporates these OCP effects outperforms a purely distributional model.

## 2.1 Phonotactic markedness: OCP effects in Samoan roots

- OCP: consecutive identical features are banned/dispreferred.
- Samoan is subject to transvocalic consonant OCP effects (Alderete and Bradshaw 2013)
  - Crosslinguistically well-attested (McCarthy 1988, 1994; Coetzee and Pater 2008; Wilson and Obdeyn 2009)
- OCP effects are particularly strong across:
  - Labials (\*[+LABIAL][+LABIAL], e.g. \*[fuma])
  - Coronal sonorants (\*{n,l}{n,l}, e.g. \*[nula])
- Visualized in (1) (data: corpus of 1,512 roots from Milner 1966, narrowed down from around 4200 headwords, and with pseudo-reduplicants removed).<sup>2</sup>

### (1) Transvocalic consonant co-occurrences in modern Samoan roots



<sup>2</sup>Samoan has two registers of speech, *tautala lelei* and *tautala leaga*. *Tautala lelei* preserves more segmental contrasts, but native speakers are generally cognizant of both levels. All data in this paper are from the *tautala lelei* register, as it is the one described in dictionaries and most scholarly work on Samoan.

- Patterns confirmed using the UCLA Phonotactic Learner (Hayes and Wilson 2008)
- Similar OCP effects are suggested to be a general property of Polynesian languages (Krupa 1971)

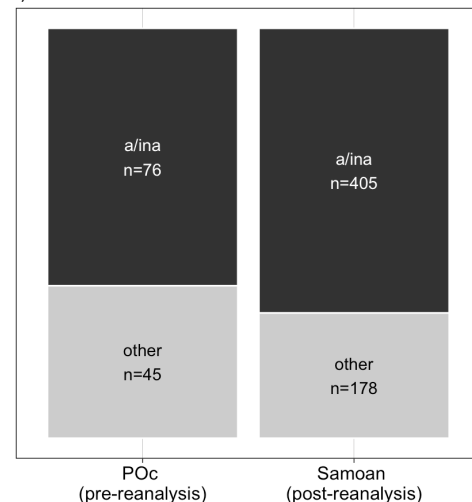
## 2.2 Reanalysis of ergative suffix allomorphs

- The allomorphs that existed prior to reanalysis are inferred by looking at the final consonants in Proto-Oceanic.
  - Data: 519 protoforms from the Austronesian Comparative Dictionary (Blust and Trussel 2010) and Polynesian Lexicon Project (Greenhill and Clark 2011)
- **Result 1:** Reanalysis is mostly towards /a, ina/, which is predictable from frequency distributions.

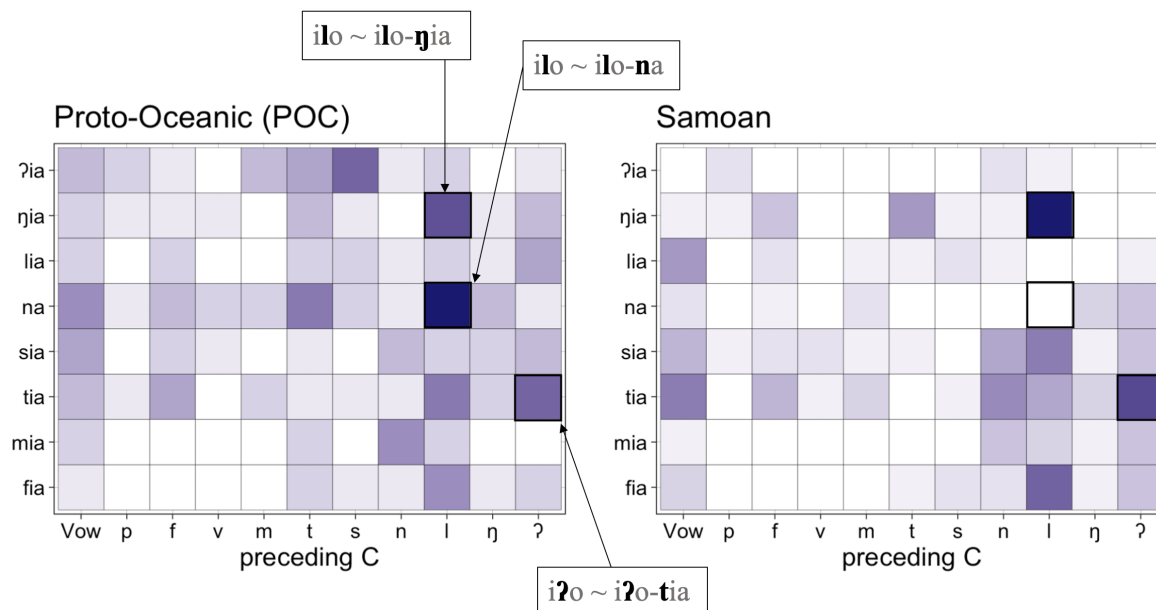
(2) *Historical distribution of passive allomorphs*

POc	Erg.	N	P	
<b>vowel, *ʔ, *q</b>	<b>a, ina</b>	<b>346</b>	<b>0.67</b>	⇐ *
*p	fia	13	0.03	
*t, *c	tia	29	0.06	
*k	ʔia	24	0.05	
*s	sia	18	0.03	
*m	mia	11	0.02	
*n, *ŋ	na	41	0.08	
*ŋ	ŋia	21	0.04	
*r, *l	lia	16	0.03	

(3) *Reanalysis is generally towards a/ina*



- **Result 2:** phonotactically **marked** outputs are more likely to be reanalyzed.
- the Cia allomorph that surfaces is partially conditioned by the identity of the preceding consonant.
- Some regularities in POc are passed down to modern Samoan, while others are not. Figure (4) compares the distribution of Cia allomorphs in POc and Samoan.

(4) *Distribution of Cia allomorphs before and after reanalysis (/a, ina/ excluded)*

- Most notably, suffixed forms of the type [ilo-na] were relatively frequency pre-reanalysis, but never observed post-reanalysis.
  - motivated by coronal sonorant OCP ( $\{n,l\}\{n,l\}$ )

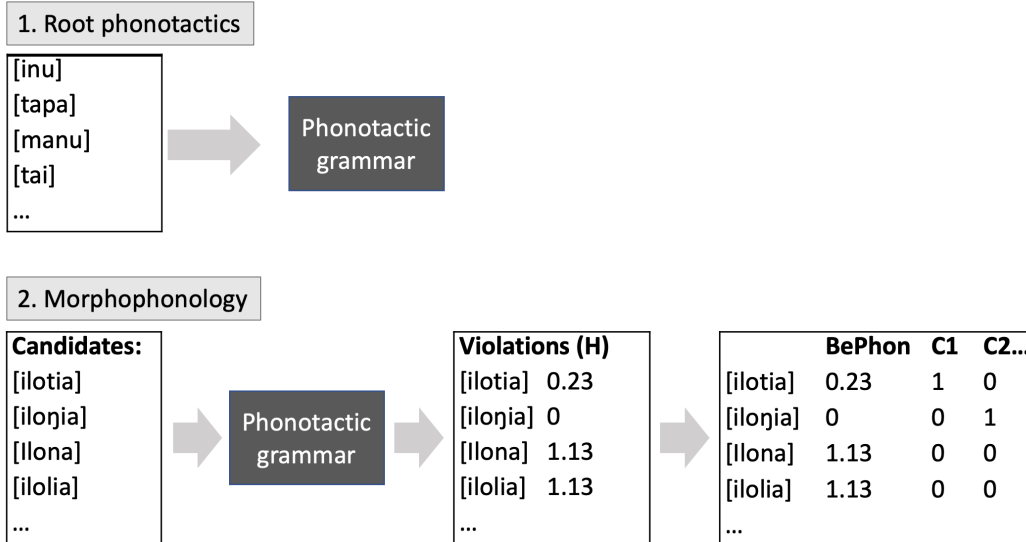
## 2.3 Modeling reanalysis of the Samoan ergative suffix

- Basic idea: use **root phonotactics** to inform model of **morphophonology/reanalysis**.
- Phonotactic markedness constrains
  - A phonotactic model is trained on roots, and then used to assign violations to the candidate suffixed forms in the morphophonological grammar, as in (5).
  - UCLA Phonotactic Learner (Hayes and Wilson 2008), which is based in MaxEnt.
  - Two phonotactic grammars:
    - \* Bigram grammar: constraints are the set of all possible  $C_1C_2$  combinations.
    - \* OCP grammar: constraints are restricted to OCP constraints that target natural classes, e.g.  $*[+CORONAL][+CORONAL]$ ,  $*\begin{bmatrix} +CORONAL \\ +sonorant \end{bmatrix} \begin{bmatrix} +CORONAL \\ +sonorant \end{bmatrix}$
- Model of reanalysis:
  - MaxEnt Harmonic Grammar (Smolensky 1986; Goldwater and Johnson 2003)
  - Phonotactically motivated constraints (e.g. OCP-place) are biased to have high weight, following Wilson (2006), White (2013), etc.<sup>3</sup>

<sup>3</sup>Bias is implemented by giving the model a Gaussian prior, and assigning relevant constraints a higher  $\mu$ .

- Iterated learning component (20 generations)

(5) *Incorporating phonotactic markedness into morphophonological grammar*

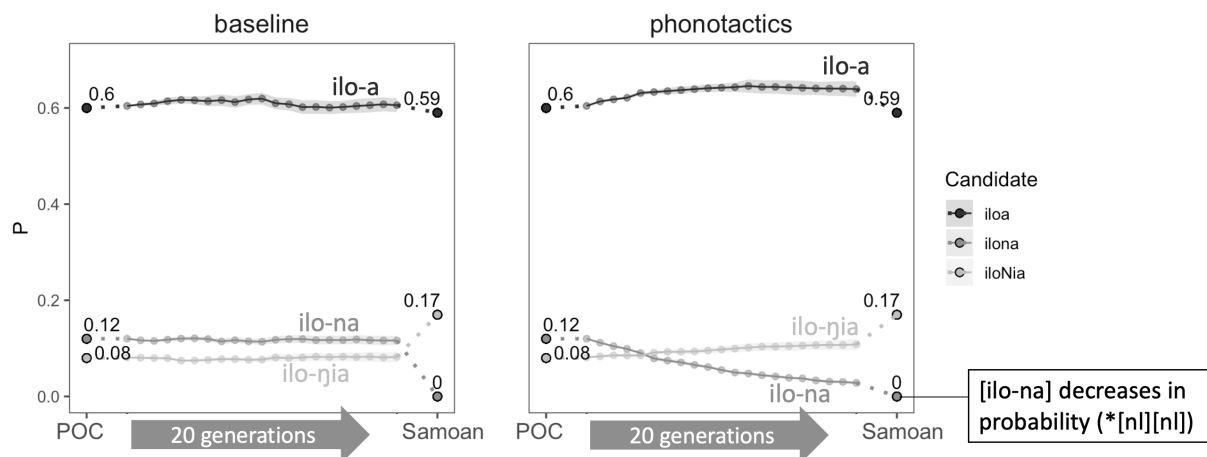


- **Result:** The models with a markedness bias perform better in terms of model fit to the modern Samoan distribution; see (6) for log-likelihood.
- In particular, the markedness models do better at predicting the output for words with coronal dissimilation; see (7).

(6) *Model results*

model	L	p
Baseline	-2408.8	–
Phonotactics (OCP)	-2376.1	$p < 0.00001$
Phonotactics (bigrams)	-2400.746	$p < 0.01$

(7) *Subset of model predictions for words with a preceding /l/*



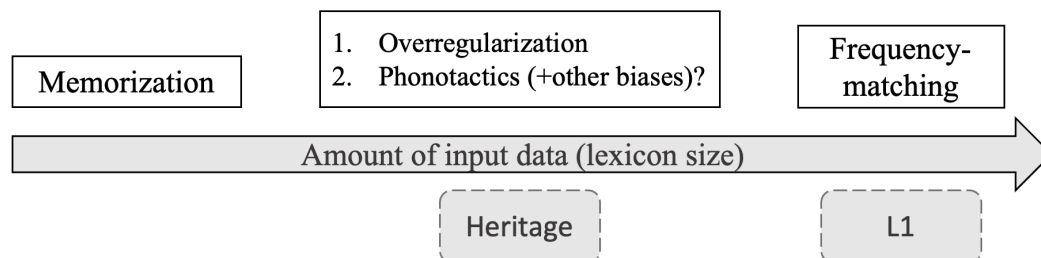
### 3 Next steps: markedness effects in the synchronic Samoan grammar

- Do Samoan speakers frequency-match when applying the ergative suffix to novel words, or are they also sensitive to markedness effects?
- Wug test on both fluent L1 and heritage speakers.
  - Both fluent and heritage speakers of Samoan are contactable.

#### 3.1 Background: insights from heritage language phonology

- There is evidence that phonotactic learning is easier than alternation learning; even with limited input, adults possess sophisticated phonotactic intuitions (Oh et al. 2020).
- Many theories of acquisition and learning algorithms predict that learners will become better frequency-matchers as their lexicon increases in size.
  - Tolerance Principle (Yang 2016)
  - MaxEnt Harmonic Grammar (Zymet 2018)
  - Perceptron (online versions of MaxEnt; O'Hara 2020)
- **Prediction:** when learners have limited input, they will be more sensitive to markedness effects, and potentially other biases.

#### (8) Relationship between lexicon size and morphophonological learning



- **Heritage speaker:** a speaker who learns a (minority) language as their L1 at home, but then become dominant in the majority language spoken in the wider community (Polinsky and Kagan 2007).
  - Differs from L1 speakers in having less input data (Polinsky 2008)
  - Predicted to be **more sensitive** to markedness bias (and less prone to frequency-matching)
- In my own work on Seediq (Kuo, forthcoming), I wug-tested both middle-aged speakers (some heritage) and elderly speakers (truly native). Heritage speakers showed evidence of following (and exaggerating) a phonological generalization.

## 3.2 Methodology

- Nonce-word tests (wug tests; Berko 1958)
  - used to demonstrate speakers' knowledge about distributional facts of their lexicon (e.g. Zuraw 2000; Ernestus and Baayen 2003; Hayes and Londe 2006; Becker et al. 2011).
  - When speakers underlearn or overlearn patterns in the lexicon, this suggests the effect of a learning bias (e.g. Wilson 2006; Becker et al. 2011).
- Procedure:
  - Pretest: speakers provide phonological well-formedness ratings for the stimuli (i.e. novel stems).<sup>4</sup>
  - Open response: participants volunteer ergative forms for the wug verbs.
  - Rating task: speakers rate possible ergative forms for wug verbs; for each verb, 4 possible suffixed forms are provided:
    1. default ([ilo-a])
    2. OCP violation; same segment ([ilo-lia])
    3. OCP violation; same class ([ilo-na])
    4. no OCP violation (ilo-fia)
- Stimuli: words of the shape (C)V**CV**, conditioned by final consonant (in boldface).
 

Condition	Example	Rating task
labial	<b>imo</b>	imo-a, imo-mia, imo-fia, imo-tia
coronal sonorant	<b>ilo</b>	ilo-a, ilo-lia, ilo-na, ilo-mia
coronal non-sonorant	<b>ito</b>	ito-a, ito-tia, ito-na, ito-mia
filler	<b>iʔo</b>	iʔo-a, iʔo-ʔia, iʔo-ŋia, iʔo-tia
- Prediction: Both in production and goodness ratings, speakers will disprefer outputs which result in OCP violations. This effect is predicted to be stronger for heritage speakers.

## 4 Summing up (goals)

- I hope to obtain converging evidence from historical change (reanalysis), L1 speakers, and heritage speakers on how markedness bias interacts with frequency-matching.
- A corpus which aims to connect corpus results with experimental results, which can be used to test different models of learning.
  - Can be expanded to languages such as Tongan.
- Greater understanding of L2/heritage acquisition
  - Most existing work in heritage language phonology has focused on the learning of specific phonemes (e.g. Rao and Ronquest 2015; Kang and Nagy 2016), rather than the learning of morphophonological paradigms.

<sup>4</sup>This step, following Albright and Hayes (2003), is included to address the possible confounding influence of stem well-formedness on morphological intuitions



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