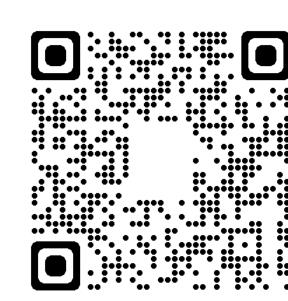
Evaluating a Phonotactic Learner for MITSL² Languages



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Key Findings

- MITSL2IA (De Santo & Aksënova, 2021) is succesful on several subregular patterns, despite low data
- Aksënova (2020)'s evaluation pipeline is valuable for testing subregular learning algorithms
- Transparent learners could be used to inspect the quality of the data in samples available to learners

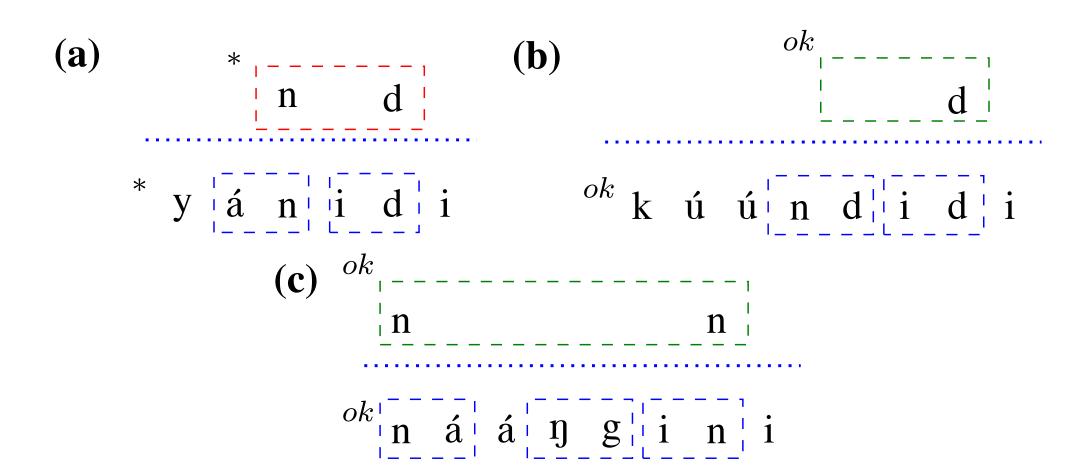


Figure: ITSL $_2^2$ analysis of Yaka nasal harmony from De Santo & Aksënova (2021), illustrating a 2-local projection and 2-local tier constraints. (a) is ill-formed because of tier-adjacent *[nd], but [n,d,g,N] are projected on the tier only when not in a nasal-stop cluster in the input (cf. (b), (c)).; data from Walker (2000)

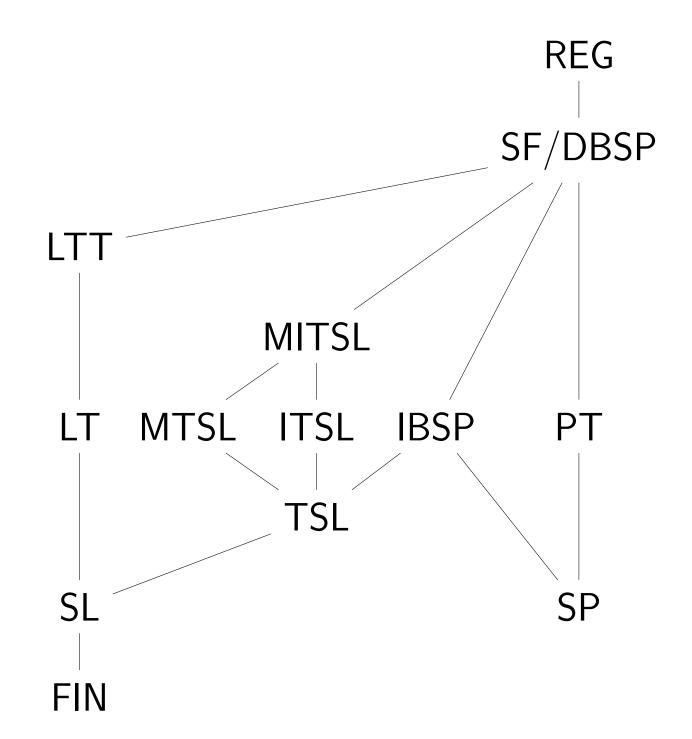
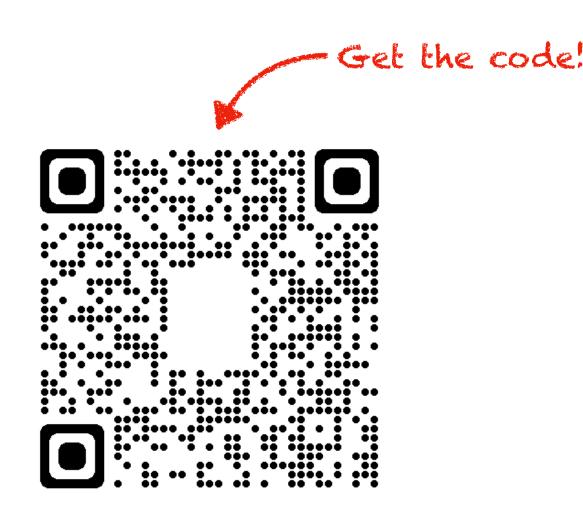


Figure: Subsumption of subregular classes, with the TSL extensions as of De Santo & Graf (2019).



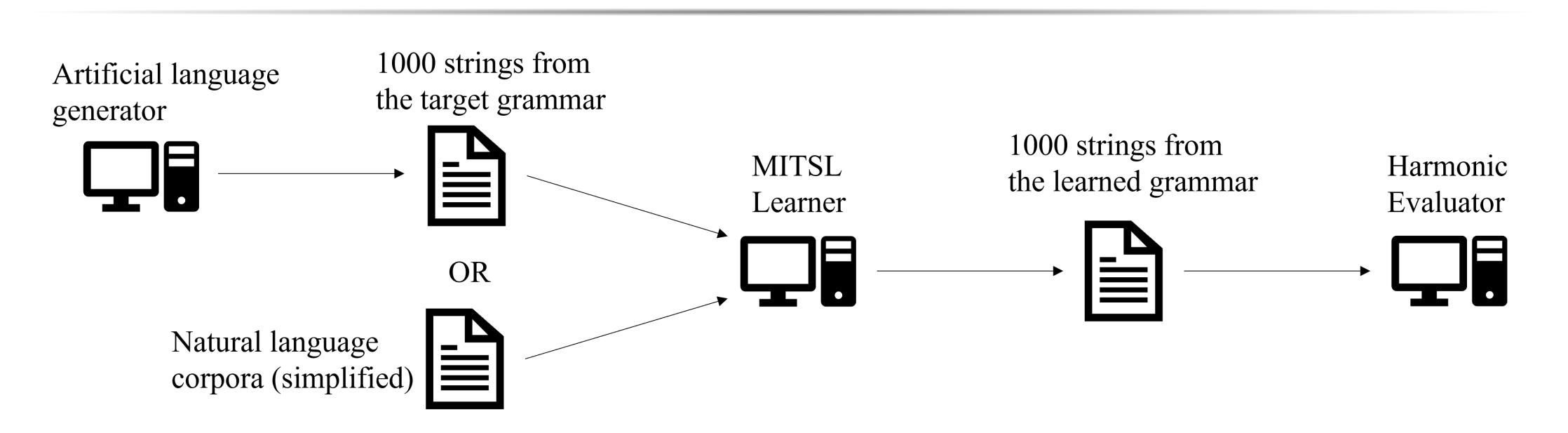
Introduction

- Formal Language Theory provides insights into properties underlying typologically attested patterns (Heinz, 2018)
- MITSL handles multiple interactions of local and non-local phonotactic constraints (De Santo & Graf, 2019)
- MITSL² can be learned efficiently from positive data (De Santo & Aksënova, 2021)
- Here: An implementation and extensive evaluation of (De Santo & Aksënova, 2021)

Learning MITSL² Patterns

- De Santo & Aksënova extend McMullin et al. (2019)'s MTSL₂ algorithm to MITSL₂
- MITSL2IA builds on the intuition that if a bigram $\rho_1\rho_2$ is banned on some tier, then it will never appear in string-adjacent contexts
- We can determine which segments are freely distributed with respect to a bigram $\rho_1\rho_2$ which is not attested and thus assumed to be banned on some tier
- MITSL2IA is guaranteed to learn target grammars efficiently if the input sample is characteristic, but does this align with how phenomena of interest are represented in naturalistic data sets?
- Our implementation of MITSL2IA is available at https://github.com/jacobkj314/MITSL2IA
- By inspecting the output, it is possible to infer whether/why the input data was insufficient for the learner to converge on the target grammar in some cases

The Evaluation Pipeline (Aksënova, 2020)



- We implemented MITSL2IA in Python 3 following requirements of SigmaPie
- We evaluated it on artificial and simplified natural language phenomena in different subregular classes
- Artificial datasets contained 1000 randomly sampled strings, and up to 130K words for the simplified natural language corpora
- The learned grammars were then given to string generators, and we computed the proportion of strings in the newly generated sample that were well-formed according to the target grammar
- We defined an injection procedure process to explain strings generated by the learned grammar that were not accepted by the target grammar and form new strings to augment the input sample
- Re-running the learner on the data augmented with the "missing" samples resulted in a 100% performance in all cases

References

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		_	_	nova (2020)		This Paper
		SP	SL		MTSL	MITSL
			Word-	final d	evoicing	5
	Τ	X				
	Α				100%	100%
					100%	100%
	Si	ngle vo	owel ha	rmony	withou ⁻	t blocking
	T		X			
					100%	100%
					100%	100%
		Single	vowel ł	narmon	y with	blocking
	T	X	X			
	Α	84%	89%	100%	100%	99%
	Several vowel harmonies without blocking					
	T		X			
	Α	100%	69%	100%	100%	100%
Several vowel harmonies with blocking						blocking
	Т	X	X			
	Α	76%	59%	100%	100%	99%
	N_T	76%	70%	67%	95%	99%
	Vowel harmony and consonant					
		ha	rmony	withou	ut block	ing
	Т		X	X		
	Α	100%	64%	74%	100%	100%
	Vowel harmony and consonant harmony with blocking					
	Т	X	X	X		
	Α	83%	64%	69%	100%	100%
	Unbounded tone plateauing					
	T		X	X	X	
	Α	100%	85%	90%		100%
	Two locally-driven long-distance assimilations (ITSL restrictions)					
	Т	X	X	X	X	
	Α					100%
		T\L = = = =	<u>+: </u>			

Table: (T)heoretical expectations and performance of 5 subregular learners on (A)rtificial and simplified (N)atural language input data-sets. MITSL corresponds to this work. N_G : German; N_F : Finnish; N_T : Turkish.