## Probabilistic syllable structure

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## Overview

$\square$ Two questions that may seem independent:

- What types of syllables are possible in a language?
- What types of syllables are favored?
$\square$ The message:
- These questions are deeply connected.
- The same phonological principles predict both ...
- ...given the right theory of phonology.
$\square$ Given the same set of syllable structure constraints
- Optimality Theory (OT) predicts universals that are empirically supported.
- Maximum Entropy Grammars (MaxEnt) are so unrestrictive that no syllable is predicted to be universally worse than any other syllable.


## Data

$\square$ Finnish data:

- Corpus: 16 million words of newspaper text (Aamulehti 1999)
- Sample: Words with a frequency of $\geq 100$, about 15,000 words
- Machine-syllabified by Finnsyll (Shapiro et al. 2017)
- Syllabification manually verified for correctness
- Approximately 48,000 syllables total
$\square$ Dagaare data:
- A dictionary with 7,075 lemmas (Ali et al. 2021) syllabified by us
- Some rules: CC $\rightarrow$ C.C, VCV $\rightarrow$ V.CV, VV $\rightarrow$ V.V if the vowels were not identical or known diphthongs (Kennedy 1966, Bodomo 1997)
- Digraphs were interpreted as single segments (e.g., /ım/)
- Approximately 18,000 syllables total
$\square$ Finnish example words:

| spelling | syllabification | translation | template |
| :--- | :--- | :--- | :--- |
| alkaen | al.ka.en | beginning from | VC.CV.VC |
| torstai | tors.tai | Thursday | CVCC.CVV |
| poliisilaitos | po.lii.si.lai.tos | police station | CV.CVV.CV.CVV.CVC |

$\square$ Dagaare example words:

| spelling | syllabification | translation | template |
| :--- | :--- | :--- | :--- |
| yiri | jí.rì | house | CV.CV |
| yooraa | júv.ráà | tourist | CVV.CVV |
| kpageloo | kpág.lứu | firm | CVC.CVV |

$\square$ Top 10 rows of Finnish syllabary (by type frequency)

| Syllable | Stress | Template | Weight | Vowel | Frequ |
| :--- | :--- | :--- | :--- | :--- | :--- |
| ta | $U$ | CV | L | A | 2208 |
| si | $U$ | CV | L | I | 1190 |
| ti | $U$ | CV | L | I | 1179 |
| sa | $U$ | CV | L | A | 1138 |
| a | $U$ | V | L | A | 864 |
| tä | $U$ | CV | L | Ä | 815 |
| li | $U$ | CV | L | I | 791 |
| la | $U$ | CV | L | A | 764 |
| nen | $U$ | CVC | H | E | 684 |
| le | $U$ | CV | L | E | 612 |

$\square$ Top 10 rows of Dagaare syllabary (by type frequency)
Syllable Initial Template Weight +ATR Frequency

| rì | false | CV | L | false | 517 |
| :--- | :--- | :--- | :--- | :--- | :--- |
| rí | false | CV | L | false | 430 |
| rì | false | CV | L | true | 296 |
| rí | false | CV | L | true | 264 |
| lì | false | CV | L | false | 240 |
| gì | false | CV | L | false | 213 |
| lí | false | CV | L | false | 199 |
| gí | false | CV | L | false | 183 |
| ní | false | CV | L | false | 170 |
| ráá | false | CVV | H | false | 167 |

$\square$ Exclusions: A few marginal syllable types were omitted when evaluating the theories.
$\square$ In Finnish, we excluded consonant clusters longer than two (CCC, CCCC) as non-native.
$\square$ In Dagaare, we excluded the following:

- Apparent VVV-syllables left intact by our syllabification rules. They seem to be either VV.V or V.VV but we currently don't know which.
- 80 instances of a C-syllable, mostly /m/ and ///, that may be syllabic sonorants comparable to V -nuclei.


## Modeling

$\square$ A working phonologist might expect to find some basic syllable structure asymmetries. We fitted linear regression models to the data to verify that those asymmetries are indeed there in both Finnish and Dagaare.

- Response variable: the syllable's log type frequency
- Predictor variables:

Predictor
onset
coda
complex onset
complex coda
number of segments

EXPECTED EFFECT presence increases frequency presence decreases frequency presence decreases frequency presence decreases frequency more segments decreases frequency
$\square$ Onset vs. coda in Finnish:

- An onset increased the log frequency of a syllable by 0.64 ( $b=0.64, S E=0.11, t=5.834, p<0.001$ )
- A coda decreased it by $0.35(b=-0.35, S E=0.07, t=-4.781$, $p<0.001$ ).
$\square$ Onset vs. coda in Dagaare:
- An onset increased the log frequency of a syllable by 1.05 ( $b=1.05, S E=0.09, t=11.580, p<0.001$ ).
- A coda decreased it by $0.29(b=-0.29, S E=0.04, t=-7.605$, $p<0.001$ ).
$\square$ The expected effects are seen for the other predictors as well.
$\square$ Complex onsets and complex codas in Finnish (Dagaare has no complex margins) and the number of segments in both languages significantly decrease the syllable's frequency.
$\square$ We also fitted more complex models, including mixed models with syllable as a random intercept, with similar results.
$\square$ The regression modeling shows that there is something to study. But are these facts predicted by any theory of phonology?
$\square$ In particular, given a set of syllable structure constraints and an arbitrary ranking (OT) or weighting (HG, MaxEnt), do the empirical asymmetries follow?
$\square$ Constraints:
[Prince and Smolensky 1993/2004]
- Onset, *Coda, *CxOnset, *CxCoda, *Seg
- MaxV, MaxC, DepV, DepC
$\square$ Candidates:
- 17 syllable types generated by the template (C)(C)V(V)(C)(C)
- CCVVCC omitted because not found in either language
- all syllable types are candidates of each other
$\square$ We focus on implicational universals that compare faithful mappings with identical underlying and surface forms:

$$
\begin{aligned}
(y, y) & \rightarrow(\hat{y}, \hat{y}) \\
(/ C C V C C /,[C C V C C]) & \rightarrow(/ C V /,[C V])
\end{aligned}
$$

$\square$ This seems appropriate because our data are phonotactic (comparative well-formedness of syllable types) and do not directly involve alternations.
$\square$ We interpret these universals as follows:

- every CATEGORICAL grammar that realizes /CCVCC/ faithfully also realizes /CV/ faithfully
- every PROBABILISTIC grammar realizes /CCVCC/ faithfully with probability no larger than the probability with which it realizes /CV/ faithfully
$\square$ We used $\mathbb{C o} \mathbb{G}$ eTo (https: //cogeto.stanford.edu/) to compute the predicted universals.


## Theoretical results

## First result:

$\square$ Categorical OT predicts 58 implicational universals
$\square$ Each arrow corresponds to a one-step improvement
$\square$ OT universals thus recapitulate the markedness hierarchy


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## Second result:

$\square$ Each arrow admits a probabilistic interpretation:
probability of antecedent $\leq$ probability of consequent
$\square$ To test this interpretation, we annotate each faithful mapping with the number of occurrences of the corresponding syllable type in Finnish and Dagaare
$\square$ Assuming that these counts reflect probabilities, all the predicted implications turn out empirically true in both data sets


## Third result:

$\square$ ME (with these candidates and constraints) does not predict a single one of the implicational universals plotted
$\square$ Since a ME universal is also an OT universal, we conclude that ME predicts no implicational universals among faithful mappings
[Anttila and Magri 2018a; Magri and Anttila 2024]
$\square$ Each faithful mapping can have a larger ME probability than any other faithful mapping

- E.g.: some ME weights predict VVCC ( 5 tokens in Finnish) to have a higher probability than $C V$ ( $\sim 17,000$ tokens in Finnish)
$\square$ ME predicts no markedness asymmetries


## Why are ME's predictions empty?

## First step:

$\square$ To diagnose this ME pathology, we denote by $\bar{F}(x)$ the average number of violations assigned by a faithfulness constraint $F$ to the candidates of the underlying form $x$ :

$$
\bar{F}(x)=\frac{1}{|\operatorname{Gen}(x)|} \sum_{y \in \operatorname{Gen}(x)} F(x, y)
$$

$\square$ If an implication $(x, x) \rightarrow(\hat{x}, \hat{x})$ between two faithful mappings is a ME universal, the average number of antecedent faithfulness violations cannot be larger than the average number of consequent faithfulness violations:
[Magri and Anttila 2024]

$$
\bar{F}(x) \leq \bar{F}(\hat{x})
$$

## Second step:

$\square$ The average number $\overline{\mathrm{MAxV}}$ of vowel deletions grows as the number of underlying vowels grows
$\square$ Conversely, the average number $\overline{\mathrm{DEPV}}$ of vowel epentheses decreases as the number of underlying vowels grows
$\square$ Thus the inequalities $\overline{\operatorname{MAxV}}(x) \leq \overline{\mathrm{MAxV}}(\hat{x})$ and $\overline{\operatorname{DEPV}}(x) \leq \overline{\mathrm{DEPV}}(\hat{x})$ entail that, if $(x, x) \rightarrow(\hat{x}, \hat{x})$ is a ME universal, the two forms $x$ and $\hat{x}$ compared must have the same number of vowels
$\square$ By reasoning analogously for MAxC and DEPC, we conclude that they also must have the same number of consonants
$\square$ Out of the 58 implications in the figure above, 56 compare antecedent and consequent strings that differ in the number of either vowels or consonants
$\square$ Their failure is thus straightforwardly predicted

## Third step:

$\square$ The remaining implications

$$
(/ V C /,[V C]) \rightarrow(/ C V /,[C V]) \text { and }(/ V V C /,[V V C]) \rightarrow(/ C V V /,[C V V])
$$

compare strings that have the same number of vowels and the same number of consonants
$\square$ They fail because the difference (vertical axis) between the ME probability of (/CV/, [CV]) minus that of (/VC/, [VC]) is negative when MaxC and ${ }^{*} \mathrm{CxCodA}$ share the same weight (horizontal axis) while the other
 weights are small
$\square$ The diagnosis of their failure in MaxEnt is more complex

## Conclusions

$\square$ It is well known that ranked constraints (Prince and Smolensky 1993/2004) predict universals, e.g., factorial typologies of syllable types like $\{\mathrm{CV}, \mathrm{CVC}, \mathrm{VC}, \mathrm{V}\}$.
$\square$ It is less well known that probabilistic grammars also predict universals, e.g., by arranging syllables by their relative probability
[Anttila and Magri 2018b]
$\square$ Evidence from Dagaare and Finnish shows that the same syllable structure universals (categorical, probabilistic) hold true in two unrelated languages, as predicted by Optimality Theory (OT) but not by Maximum Entropy (MaxEnt).

## Thank you!

## References

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