

# Representing and learning non-linear sound patterns in natural language

Adam Jardine, Department of Linguistics & Cognitive Science

ajardine@udel.edu



## Big Questions

- Sounds and word order patterns in natural language are not arbitrary
- Why do languages have some kinds of patterns and not others?
- How does this relate to how children acquire language?

## Takeaway

- Many sound patterns are describable as illegal substrings (Rogers et al., 2013)
- This provides a strong, computational theory with insights into learning (García et al., 1990; Heinz, 2010)
- However, some sound patterns, especially regarding tone (pitch), require non-linear representations (Goldsmith, 1976)
- We can extend the ‘illegal substructure’ idea to these representations using *subgraphs*

## A Tone Pattern

Digo (Kenya & Tanzania; Kisseberth, 1984):

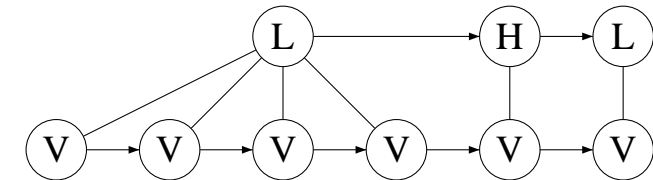
	‘I am...’	‘He/she is...’
‘praising’	ni-na-togor-a	a-na-togór-a
‘waking up’	ni-na-ramuk-a	a-na-ramúk-a
‘pressing’	ni-na-gandamiz-a	a-na-gandamíz-a
‘adding to’	ni-na-onjerez-a	a-na-onjeréz-a

Analysis: A high tone (H) ‘shifts’ to the end of the word

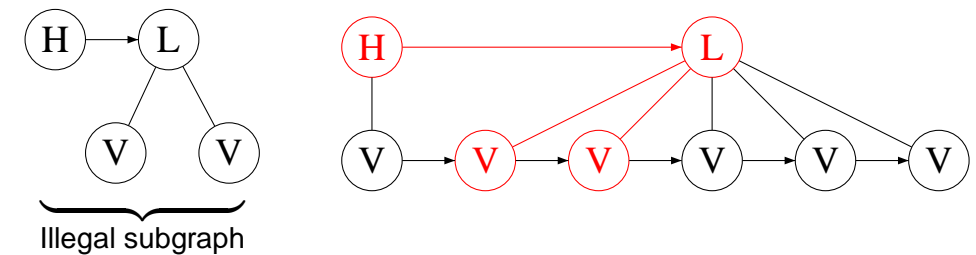
H  
a-na-gandamiza → a-na-gandamiz-a ‘he is pressing’

## Representing Tone as Graphs

- We can view this non-linear relationship between tones and vowels as a labeled graph
- To the right is graph representation of *a-na-gandamíz-a* ‘he/she is pressing’

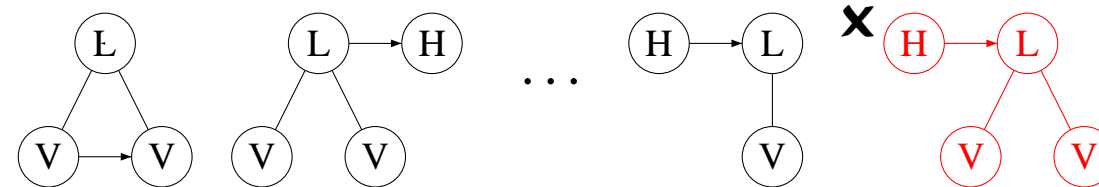


- Valid graphs in the Digo pattern can be said to exclude this subgraph
- Thus, \**á-na-gandamiz-a*, where the tone matches up with its prefix vowel, is excluded



## Learning Graph Patterns

- ‘Banned substructure’ patterns allow a simple method for learning from positive data: remember substructures of a certain size for each data point (Heinz, 2010)
- Subgraphs up to *size* 3 of *diameter* 1 of *a-na-gandamíz-a* graph:



**size:** number of edges (lines)  
**diameter:** longest minimum path between nodes (circles)

## Acknowledgements & References

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