

### In Search of the Computational Primitives of Language

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### Computation and Theory Building

[...] this is a confusion of two quite separate issues, simulation and explanation. [...] What we are really interested in [...] is explanation — in developing models that help us understand how it is that people behave that way, not merely demonstrating that we can build an artifact that behaves similarly.

(Kaplan, 1995)

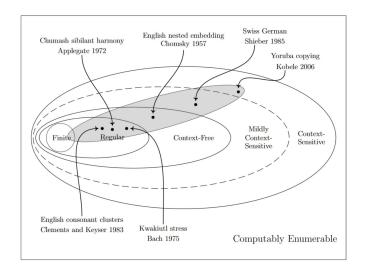
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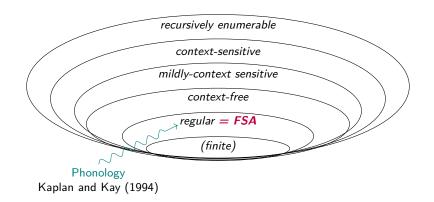
(Kaplan, 1995)

Interpretability for the win!

### A Lens: Formal Language Theory



## Spoken Languages' Phonology as a Regular System



### Local Phonotactic Dependencies

### Intervocalic voicing in Italian

Forbid voiceless segments in between two vowels

(1) a. \*/kasa/ b. /kaza/  $\rightarrow$  cf. orthography: "casa"

### Intervocalic voicing is Strictly Local (SL)

- ► Forbid voiceless segments in-between two vowels: \*V[-voice]V
- ltalian: \*ase, \*ise, \*ese, \*isi, ...
  - **\$** k a **s** a **\$**
- \$ k a z a \$

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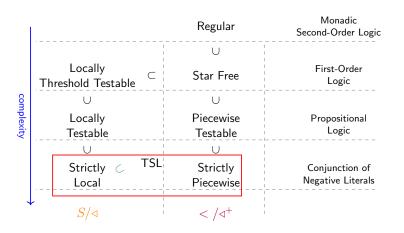
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## Beyond Automata: Subregular Languages<sup>1</sup>



<sup>&</sup>lt;sup>1</sup>McNaughton & Papert (1976), Heinz (2011), Chandlee & Heinz (2014), De Santo & Graf (2019), De Santo & Rawski (2022), a.o.

### FLT, Linguistics, and LLM Expressivity

#### Saturated Transformers are Constant-Depth Threshold Circuits

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\* Allen Institute for Al † New York University † University of Washington
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Between Circuits and Chomsky: Pre-pretraining on Formal Languages Imparts Linguistic Biases

1 re-pretraining on Formai Languages Imparts Linguistic Diase

Michael Y. Hu<sup>1</sup> Jackson Petty<sup>2</sup> Chuan Shi<sup>1</sup> William Merrill<sup>1</sup>

Neuro-Symbolic Language Modeling with Automaton-augmented Retrieval

Tal Linzen<sup>1,2</sup>

Uri Alon <sup>1</sup> Frank F. Xu <sup>1</sup> Junxian He <sup>1</sup> Sudipta Sengupta <sup>2</sup> Jan Roth <sup>3</sup> Graham Neubig <sup>1</sup> <sup>3</sup> Amguage Technologies Institute, Camegie Mellon University <sup>3</sup> Amazon AWS Al Labs <sup>4</sup> (ual.on, fangzhex, junxkanh, gneubig J (6 s. cmu. edu <sup>4</sup> sudipta, drot) § amazon .com <sup>4</sup> (sudipta, drot) § amazon .com

What Makes Instruction Learning Hard? An Investigation and a New Challenge in a Synthetic Environment

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#### **Not All Structures Are Processed Equally**

Subject VS object relative clause

SRC The horse [ $_{RC}$  that kicked the wolf] went home.

ORC The horse [ $_{RC}$  that the wolf kicked] went home.

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#### Assessing the Ability of LSTMs to Learn Syntax-Sensitive Dependencies

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### **Not All Structures Are Processed Equally**

- Subject VS object relative clause SRC The horse [RC that t kicked the wolf] went home. ORC The horse [RC that the wolf kicked t] went home.
- Attachment preferences
  - 1.a I shot an elephant in my pajamas
  - 1.b | [shot an elephant] [in my pajamas

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# Ambiguity All the Way Down





### So What?

#### Ambiguity is ubiquitous in natural language!

#### For Cognitive Science

- How do humans handle multiple structural representations?
- What principles guide ambiguity resolution cross-linguistically?
- Language specific properties vs. general biases/mechanisms?

#### For NLP

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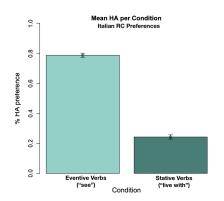
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## Ambiguity and Relative Clauses Cross-linguistically <sup>2</sup>

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## Ambiguity and Relative Clauses Cross-linguistically <sup>2</sup>

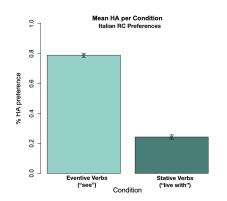
They saw the daughter of the actress that was on the balcony
 NP<sub>1</sub> The daughter was on the balcony
 HA
 NP<sub>2</sub> The actress was on the balcony



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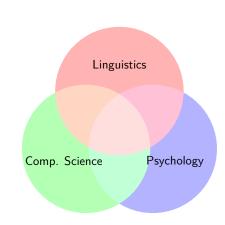
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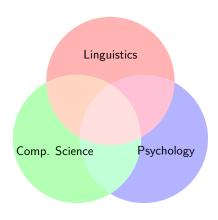
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Let's chat!

- Samala Sibilant Harmony Sibilants must not disagree in anteriority.
  (?)
  - (2) a. \* hasxintilawa∫
    - b. \* ha∫xintilawas
    - c. ha∫xintilawa∫

#### Example: Samala

```
*$hasxintilawaʃ$
```

\$ha∫xintilawa∫\$

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#### Example: Samala

▶ But: Sibilants can be arbitrarily far away from each other!

\*\$**s**tajanowonwa∫\$

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#### Example: Samala

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### Unbounded Dependencies are TSL

- Let's revisit Samala Sibilant Harmony
  - (3) a. \* hasxintilawa
    - b. \* ha∫xintilawas
    - c. haʃxintilawaʃ
- ▶ What do we need to project? [+strident]
- What do we need to ban? \*[+ant][-ant],\*[-ant][+ant]
  I.E. \*s∫, \*s₃, \*z∫, \*z₃, \*∫s, \*₃s, \*∫z, \*₃z

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