

# Evaluating Subregular Distinctions in the Complexity of Generalized Quantifiers

### Aniello De Santo Thomas Graf John E. Drury

Stony Brook University aniello.desanto@stonybrook.edu aniellodesanto.github.io

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## The Talk in a Nutshell

### Generalized Quantifiers and Semantic Complexity

Semantic automata (SA) as a model of quantifiers'verification

- insights into quantifiers' interpretation
- link between formal language theory and model theory

### In This Talk: Giving up the SA perspective

- But: formal language theory is richer that automata theory
- ► Coming back to formal language theory → subregular hierarchy & quantifier languages

### Consequences

- complexity independent of the recognition mechanism
- cross-domain parallels, cognitive predictions and new experimental paradigms!

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1 Semantic Automata

2 Generalized Quantifiers & Subregular Languages

**3** Psycholinguistic Predictions

### 4 Conclusions

## Generalized Quantifiers

Generalized quantifier Q(A, B):

- two sets A and B as arguments
- returns truth value (0,1)

### Example

(1) Every student cheated.

- every( $\mathbf{A}, \mathbf{B}$ ) = 1 iff  $\mathbf{A} \subseteq \mathbf{B}$
- student: John, Mary, Sue
- cheat: John, Mary
- student  $\not\subseteq$  cheat  $\Rightarrow$  every(student, cheat) = 0
- "Every student cheated" is false.

## **Binary Strings**

• The language of **A** is the set of all permutations of **A**.

Example				
studentJohn, Mary, SueL(student)John Mary Sue, John Sue MaryMary John Sue, Mary Sue JohnSue John Mary, Sue Mary John				
<ul> <li>Now replace every a ∈ A by a truth value:</li> <li>1 if a ∈ B</li> <li>0 if a ∉ B</li> <li>The result is the binary string language of A under B.</li> </ul>				
	John, Mary, Sue John, Mary 110, 101, 011			

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$\frac{\text{student}}{L(\text{student})}$	John, Mary, Sue John Mary Sue, John Sue Mary Mary John Sue, Mary Sue John Sue John Mary, Sue Mary John				
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Example					
student cheat binary strings	John, Mary				

# Quantifier Languages (van Benthem 1986)

- We can associate each quantifier Q with a language in {0,1}\* ⇒ Q accepts only binary strings of specific shape
- This is its quantifier language.

### Example: *every*

- every(A, B) holds iff  $A \subseteq B$
- ▶ So every element of A must be mapped to 1.
- $L(every) = \{1\}^*$

### Example: *some*

- some(**A**, **B**) holds iff  $\mathbf{A} \cap \mathbf{B} \neq \emptyset$
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- $L(some) = \{0, 1\}^* \, 1 \, \{0, 1\}^*$

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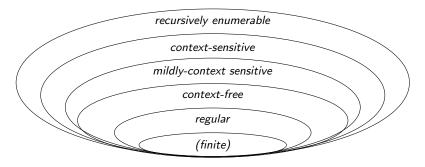
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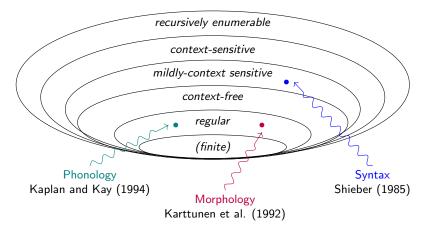
## Chomsky Hierarchy of String Languages

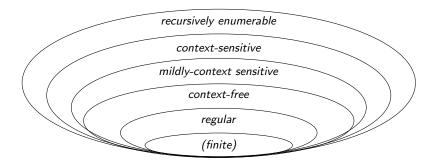
Languages (stringsets) can be classified according to the complexity of the grammars that generate them.



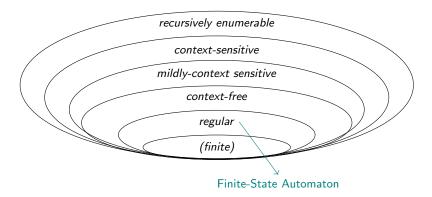
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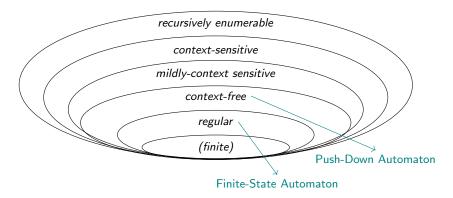




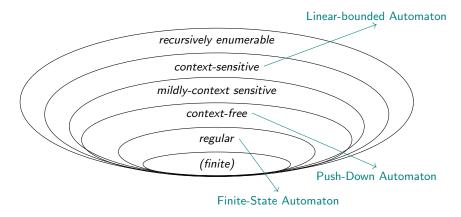
#### Semantic Automata (van Benthem 1986, Mostowski 1998)



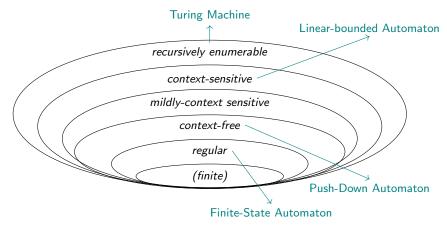
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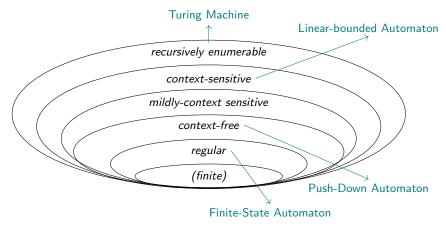
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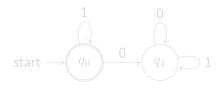


### Semantic Automata (van Benthem 1986, Mostowski 1998)

## Aristotelian Quantifiers are FSA-recognizable

### Reminder: every

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### False

student John, Mary, Sue cheat John, Mary binary strings 110, 101, 011

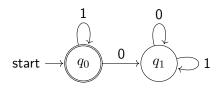
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student John, Mary, Sue cheat John, Mary,Sue binary strings 111

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False	
student cheat binary strings	John, Mary
<b>T</b>	
True	
student	John Mary Sue

111

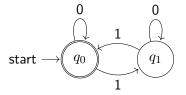
John, Mary, Sue

cheat

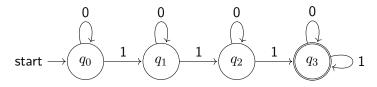
binary strings

## Other FSA-recognizable quantifiers

Parity quantifiers: An even number



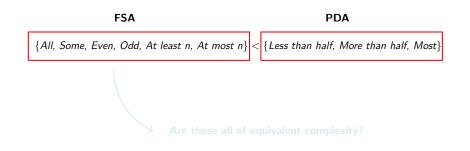
Cardinal quantifiers: At least 3

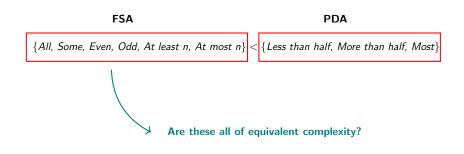


## **Proportional Quantifiers**

- most(A, B) holds iff  $|A \cap B| > |A B|$
- $L_{most} := \{ w \in \{0,1\}^* : |1|_w > |0|_w \}$
- There is no finite automaton recognizing this language.
- We need internal memory.

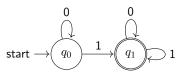
 $\Rightarrow$  **push-down automata**: two states + a stack



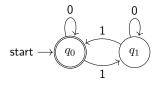


## Let's Look at the Automata One More Time

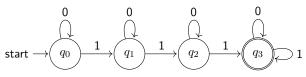
Aristotelian quantifiers: Some

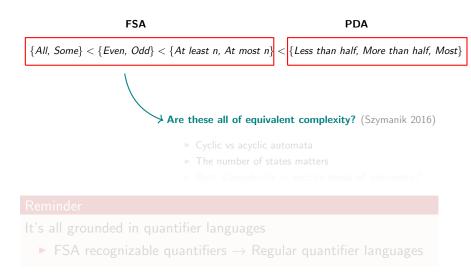


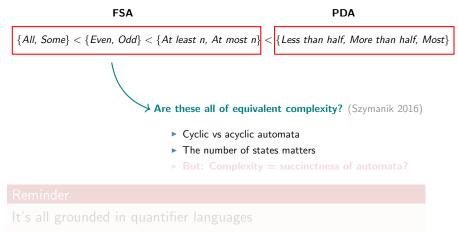
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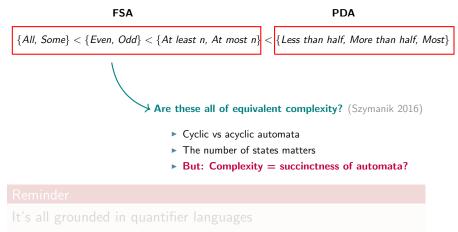
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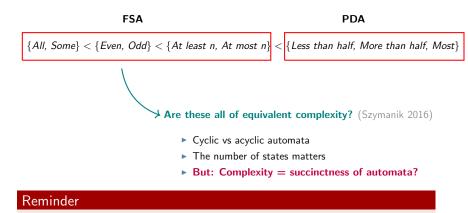




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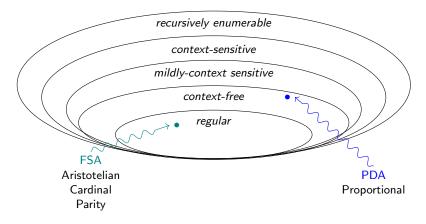


### It's all grounded in quantifier languages

• FSA recognizable quantifiers  $\rightarrow$  Regular quantifier languages

## Chomsky Hierarchy of String Languages (Reprise)

Languages (stringsets) can be classified according to the complexity of the **grammars** that generate them.



# The Subregular Hierarchy

### Often Forgotten:

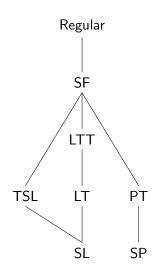
 hierarchy of subregular languages (McNaughton&Papert 1971), (Rogers et al. 2010)

### A Richness of Results

- Phonology is subregular (Heinz&Idsardi 2013, Heinz 2015)
- Morphotactics (and Morphology?) is subregular

(Aksënova et al. 2016, Chandlee 2016, Aksënova&De Santo 2017)

▶ Syntax? (Graf&Heinz 2015)



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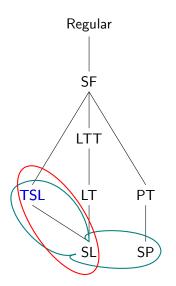
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Syntax? (Graf&Heinz 2015)



## Strictly Local and Tier-based Strictly Local

### Strictly Local (SL)

▶ SL<sub>k</sub> grammars are lists of forbidden k-grams;

### Tier-based Strictly Local (TSL)

- TSL is a minimal extension of SL, inspired by phonological tiers;
  - define a subset T of the string alphabet;
  - a grammar is a list of strictly k-local constraints over T

## Subregular Quantifiers: Every is SL

### Reminder: Every

• every(A, B) holds iff  $A \subseteq B$ 

• 
$$L(every) = \{1\}^*$$

• Eg. Every student cheated.

### False

student John, Mary, Sue cheat John, Mary binary strings 110, 101, 011 grammar \*0

#### True

student John, Mary, Sue cheat John, Mary, Sue binary strings 111 grammar \*0

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× 1	1 0 ×	⋊ 1	1 1 ×

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# False student John, Mary, Sue cheat binary strings 000 grammar \*0

#### rue

student	John, Mary, Sue
	John
binary strings	100,010,001

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binary strings grammar	000 *0	binary strings grammar	
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F × [0 0] 0 ×	

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student John, Mary, Su	e <b>student</b> John, Mary, Sue
cheat	cheat John
binary strings 000	binary strings 100,010,001
grammar *000	grammar *000
F ⋊ <u>¦0_0_0</u> ⊨ ⋈	$\overset{\top}{}_{} _{}{} _{}{}$

John, Mary, Sue

100,010,001

??

John

 $\begin{bmatrix} 0 & 0^n & 1 \end{bmatrix} \ltimes$ 

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cheat	cheat
binary strings 000	binary strings
grammar ??	grammar
$\times [0 0^n 0] \ltimes$	× <u>0</u>

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- Eg. Some student cheated.

# FalsestudentJohn, Mary, Suecheat000binary strings000grammar $T = \{1\}$ $S = \{* \rtimes \ltimes \}$

#### True

student Jo cheat Jo binary strings 10 grammar T

John, Mary, Sue John, 100, 010, 001  $T = \{1\}$  $S = \{* \rtimes \ltimes \}$ 

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cheat		cheat	John,
binary strings	000	binary strings	100, 010, 001
grammar	$T = \{1\}$	grammar	$T = \{1\}$
	$S = \{^* \rtimes \ltimes \}$		$S = \{{}^* \rtimes \ltimes\}$
			1

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⋈ 0	00 🛛	$\rtimes 0$	$1  0  \ltimes$

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	$S = \{^* \rtimes \ltimes \}$		$S=\{^*\rtimes\ltimes\}$
$\rtimes$	$\ltimes$		
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- some(A, B) holds iff  $A \cap B \neq \emptyset$
- $L(\text{some}) = \{0,1\}^* \, 1 \, \{0,1\}^*$
- Eg. Some student cheated.

False		True	
student	John, Mary, Sue	student	John, Mary, Sue
cheat		cheat	John,
binary strings	000	binary strings	100, 010, 001
grammar	$T = \{1\}$	grammar	$T = \{1\}$
	$S = \{^* \rtimes \ltimes \}$		$S=\{^*\!\rtimes\!\ltimes\}$
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	$S = \{ {}^* \rtimes \ltimes \}$		$S = \{{}^* \rtimes \ltimes\}$
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# True student John, Mary, Sue cheat John, binary strings 100, 010, 001 grammar $T = \{1\}$ $S = \{* \rtimes \ltimes\}$ $| \varkappa = 1 | \ltimes$ $\rtimes = 0, 1, 0, \ltimes$

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### Subregular Quantifiers: Some is TSL

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student	John, Mary, Sue	
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	$S = \{{}^* \rtimes \ltimes \}$	
$\rtimes 0^n$	$1 \ 0^n \ltimes$	

#### An even number

▶ An even number(A, B) holds iff  $|A \cap B| \ge 2n$ , with n > 0▶  $L(even) = \{w \in 0, 1^*s.t. |1|_w \ge 2n$ , with  $n > 0\}$ 

Is L(even) a TSL language?

#### F11100 T11110 F11111

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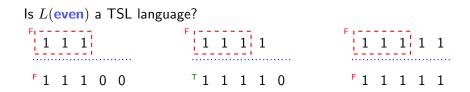
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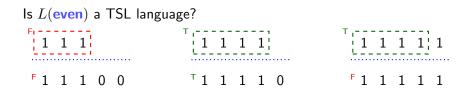
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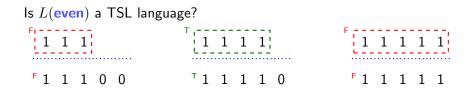
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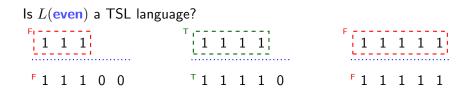
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Since *n* is arbitrary, there is **no general TSL grammar** that can generate L(even).

### Characterization of Quantifier Languages: Summary

Language	Constraint	Complexity	Subregular Grammar
every	$ 0 _{w} = 0$	SL-1	$\mathbf{S} := \{\neg 0\}$
no	$ 1 _{w} = 0$	SL-1	$\mathbf{S} := \{ \neg 1 \}$
some	$ 1 _w \ge 1$	TSL-2	$T \mathrel{\mathop:}= \{1\}$ , $S \mathrel{\mathop:}= \{\neg \rtimes \ltimes\}$
not all	$ 0 _w \ge 1$	TSL-2	$T \mathrel{\mathop:}= \{0\}, \ S \mathrel{\mathop:}= \{\neg \rtimes \ltimes\}$
(at least) n	$ 1 _w \ge n$	TSL-(n+1)	$T := \{1\}$ , $S := \left\{ \neg \rtimes 1^k \ltimes  ight\}_{k \leq n}$
(at most) n	$ 1 _w \le n$	TSL-(n+1)	$T := \{1\},  S := \{\neg 1^{k+1}\}$
all but n	$ 0 _w = n$	TSL-(n+1)	$ \begin{split} \mathbf{T} &:= \{1\},  \mathbf{S} := \left\{\neg 1^{k+1}\right\} \\ \mathbf{T} &:= \{0\},  \mathbf{S} := \left\{\neg 0^{n+1}, \neg \rtimes 0^k \ltimes\right\}_{k \le n} \end{split} $
even number	$ 1 _w = 2n, n \ge 0$	regular	impossible
most	$ 1 _w \ge  0 _w$	context-free	impossible

# A Complexity Hierarchy (Revisited)

Semantic Automata predictions

**FSA** 

PDA

 $\{AII, Some\} < \{Even, Odd\} < \{At least n, At most n\} < \{Less than half, More than half, Most\}$ 

#### Subregular characterization predictions



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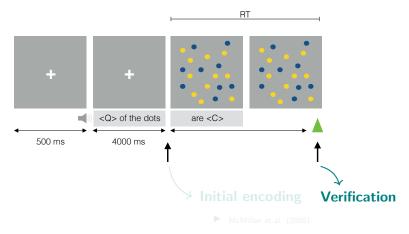
#### Automata vs Quantifier Languages

- cardinal < parity;</p>
- complexity independent of the specific recognition machine
- what's the cognitive reality of these predictions?

### Formal Complexity and Cognition

- FO-quantifiers vs higher order quantifiers
  - neuroimaging (McMillan et al. 2005, Clark & Grossman 2007)
  - patient literature (McMillan et al. 2009, Troiani et al 2009,)
- Psycholinguistic evidence for semantic automata
  - many behavioral findings (Szymanik & Zajenkowsky 2009, 2010, Steinert-Threlkeld & Icard 2013, i.a.)
  - for a survey: Szymanik (2016)
- Subregular hierarchy and cognition
  - general discussion(Rogers et al. 2013)
  - animal vs human cognition (Pulum & Rogers 2006, Rogers & Pullum 2011)
  - learnability and acquisition (Lai 2015, Avcu 2017)

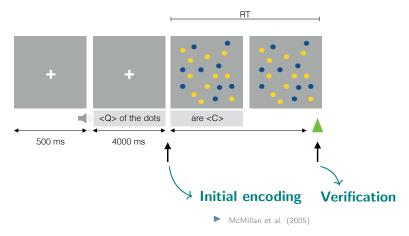
### Testing the Subregular Predictions



#### Disentangling encoding from verification

- ► ERP → upcoming (De Santo et al, SNL2017), MEG, ...
- ▶ Pupil size ← **ongoing**...

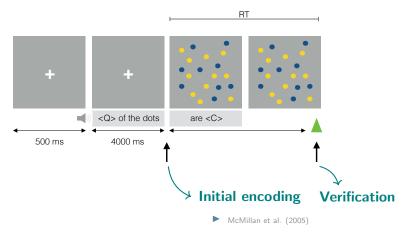
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### Testing the Subregular Predictions



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- ▶ ERP  $\rightarrow$  upcoming (De Santo et al, SNL2017), MEG, ...

### Conclusions

### **Tracing Back our Steps**

- SA as a plausible model of quantifier complexity
- Refined by looking at weaker classes in the Chomsky hierarchy
   subregular characterization of generalized quantifiers

#### Outcomes & Future Work

- Computational complexity and cognition
  - precise, testable predictions about cognitive resources
  - strong, cross-domain linking hypothesis
- Support for cross-domain subregular generalizations
  - typological predictions (Graf 2017)
  - insights on learnability/acquisition
- New theoretical questions
  - e.g. permutation closure & subregular languages?

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An algorithm is likely to be understood more readily by understanding **the nature of the problem** being solved than by examining the mechanism (and the hardware) in which it is embodied.

(Marr 1983, p.27)

### Selected References I

- Aksënova, Alëna, Thomas Graf, and Sedigheh Moradi. 2016. Morphotactics as tier-based strictly local dependencies. In Proceedings of SIGMorPhon 2016.
- 2 Aksënova, Alëna and Aniello De Santo. 2017. Strict Locality in morphological derivations. (to appear )In Proceedings of CLS53 2017.
- 3 Avcu Enes. 2017. Experimental investigation of the subregular hierarchy. In Proceedings of PLC41, 2017.
- 4 van Benthem, Johan. 1986. Semantic automata. In Essays in logical semantics, 151?176. Dordrecht: Springer.
- 5 Chandlee, Jane. 2016. Computational locality in morphological maps. Ms., Haverford College.
- 6 Graf, Thomas. 2017. The subregular complexity of monomorphemic quantifiers. Ms., Stony Brook University.
- 7 Graf, Thomas and Heinz, Jeffrey. 2016. Tier-based strictly locality in phonology and syntax. Ms., Stony Brook University and University of Delaware.
- 8 Heinz, Jeffrey. 2015. The Computational Nature of Phonological Generalizations. Ms., University of Delaware.
- 9 Heinz, Jeffrey, Chetan Rawal, and Herbert G. Tanner. 2011. Tier-based strictly local constraints in phonology. In Proceedings of ACL 49th, 58–64.
- Kaplan, Ronald M., and Martin Kay. 1994. Regular models of phonological rule systems. Computational Linguistics 20:3317378.
- Karttunen, Lauri, Ronald M. Kaplan, and Annie Zaenen. 1992. Two-level morphology with composition. In COLING'92, 141-148.
- Just, M. A., P. A. Carpenter, and A. Miyake. 2003. Neuroindices of cognitive workload: Neuroimaging, pupillometric and event-related potential.
- 13 Lai, Regine. 2015. Learnable vs. unlearnable harmony patterns. Linguistic Inquiry 46:425?451.

### Selected References II

- Marr, David (1983). Vision: A Computational Investigation into the Human Representation and Processing Visual Information. San Francisco: W. H. Freeman.
- McMillan Corey T., Robin Clark, Peachie Moore, Christian Devita, and Murray Grossman. 2005. Neural basis for generalized quantifier comprehension. Neuropsychologia, 43(12):1729?1737, Jan2005.
- 16 McNaughton, Robert, and Seymour Papert. 1971. Counter-free automata. Cambridge, MA: MIT Press.
- Mostowski, M. 1998. Computational semantics for monadic quantifiers. Journal of Applied Non-Classical Logics, 8, 107–121.
- 10 Pullum, Geoffrey K., and James Rogers. 2006. Animal pattern-learning experiments: Some mathematical background. Ms., Radcliffe Institute for Advanced Study, Harvard University.
- Rogers, J., J. Heinz, M. Fero, J. Hurst, D. Lambert, and S. Wibel (2013). Cognitive and Subregular Complexity, Chapter Formal Grammar, pp. 90?108. Springer.
- Rogers, James and Geoffrey Pullum. 2007. Aural Pattern Recognition Experiments and the Subregular Hierarchy. In Proc. of Mathematics of Language 10, 1–16.
- 21 Shieber, Stuart M. 1985. Evidence against the context-freeness of natural language. Linguistics and Philosophy. 8:333–345.
- Steinert-Threlkeld Shane and Thomas F. Icard III. 2013. Iterating Semantic Automata. Linguistics and Philosophy, 2013.
- Szymanik Jakub and Marcin Zajenkowski. 2010. Comprehension of simple quantifiers: empirical evaluation of a computational model. Cognitive Science, 34(3):521–532, April 2010.
- Szymanik Jakub and Marcin Zajenkowski. 2011. Contribution of working memory in parity and proportional judgments. Belgian Journal of Linguistics, 25(1):176–194, January 2011.
- 25 Szymanik, Jacub. 2016. Quantifiers and Cognition: Logical and Computational Perspectives. Springer International Publishing.
- 26 Troiani, V., Peelle, J., Clark, R., and Grossman, M. 2009. Is it logical to count on quantifiers?

Dissociable neural networks underlying numerical and logical quantifiers. Neuropsychologia, 47, 104-111.

Appendix

### Logical Definability of Subregular Classes

	Regular	Monadic Second-Order Logic
	U	
$\begin{array}{c} Locally \\ Threshold \ Testable \end{array} \subset$	Star Free	First-Order Logic
U	U	
Locally	Piecewise	Propositional
Testable	Testable	Logic
U	$\cup$	
Strictly 💪 TSL	Strictly	Conjunction of
Local	Piecewise	Negative Literals
$S/ \triangleleft$	$$	

### Word-Final Devoicing is SL

- SL grammars are lists of forbidden n-grams;
- Word-Final Devoicing: voiced segments at the end of a word are forbidden.

#### Word-Final Devoicing: German Example

• Grammar 
$$S := \{ *z \ltimes, *v \ltimes, *d \ltimes \}$$

$$* \times r a d \ltimes$$

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\* 
$$\times$$
 rad  $\times$ 

### Tier-based Strictly Local (Heinz et al. 2011)

- TSL is a minimal expansion of SL
- Inspired by phonological tiers

#### TSL Grammars

- ▶ a projection function  $E: \Sigma \to T \cup \lambda$ , with  $T \subseteq \Sigma$
- strictly local constraints over T

If multiple sibilants {s, z, ʒ, ∫} occur in the same word, they must all be voiceless {s, ∫} or voiced {z, ʒ}.

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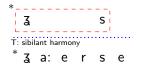
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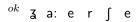


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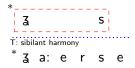


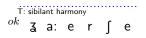
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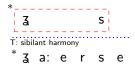


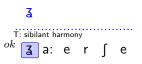
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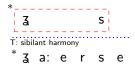


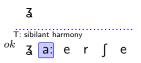
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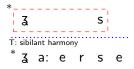


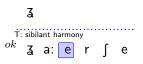
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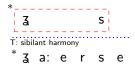


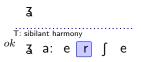
If multiple sibilants {s, z, ʒ, ∫} occur in the same word, they must all be voiceless {s, ∫} or voiced {z, ʒ}.



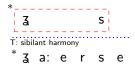


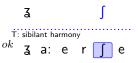
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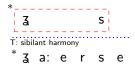


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