

# The distributional learning of recursive structures

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# Recursion vs. recursive structures

- The ability to form recursive structures is almost surely innately available to all human language users (e.g. Hauser et al. 2002).
- But languages do differ with regard to the domain of recursion, which must be learned on the basis of language specific experience (e.g. Pérez-Leroux et al. 2018).

# Within- and cross-linguistic differences in recursive structures

- (1) English: nouns can be infinitely stacked in the s-possessive, but not in the postnominal *of*-possessive:
- a. the man's neighbor's book
  - b. ?\*the book of the neighbor
  - c. \*the book of the neighbor of the man

# Within- and cross-linguistic differences in recursive structures

(2) German: the *von*-possessive ‘of’ can embed freely (a), but the *s*-possessive is restricted already at level one (b) and cannot embed infinitely (c):

a. das Buch von dem Nachbarn von dem Mann

the book of the neighbor of the man

‘the book of the neighbor of the man’

b. Marias/Vaters/\*Manns Buch

Maria’s/father’s/\*man’s book

‘Maria’s/father’s/\*man’s book’

c. \*Peters Nachbars Buch

Peter’s neighbor’s book

‘\*Peter’s neighbor’s book’

## Within- and cross-linguistic differences in recursive structures

(3) Mandarin Chinese: nouns embed freely when the possessive marker *de* is present, but not when it is omitted:

a. na ren de linju de shu  
that man GEN neighbor GEN book  
'that man's neighbor's book'

b. \*na linju shu  
that neighbor book  
'\*that neighbor's book'

c. \*na ren shu  
that man book  
'\*that man's book'

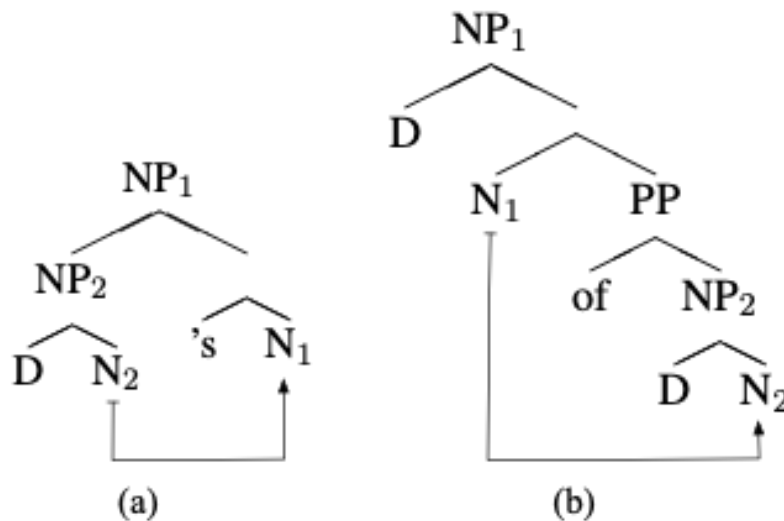
How should recursive structures be formulated? And how are they acquired by children?

# The mere attestation of multi-level embedding cannot be sufficient to support recursion

- Multi-level embedding, like all complex linguistic structures, would be vanishingly rare in the input data.
- There is no principled reason why the presence of  $N$ -level embedding would ensure even  $(N+1)$ -level embedding, never mind infinite embedding.

# Proposal: Recursion as structural commutativity

- A structure is recursive if nouns that appear in  $N_1/N_2$  can also be used in  $N_2/N_1$
- Non-head Noun  $\mapsto$  Head Noun





# Proposal: Recursion as structural commutativity

- Learning recursion: the acquisition of lexical items for which structural commutativity holds.

e.g. *the **mother's** car, the boy's **mother**,*

→ s-possessive is recursive for **mother**

→ *mother's mother, the 40-year-old mother's 80-year-old mother's 120-year-old mother...*

- Children form generalizations over attested nouns such as **mother** above

# Proposal: Productivity and generalization

- How to learn an infinite grammar from a finite sample of data?

- The Tolerance/Sufficiency Principle (TSP):

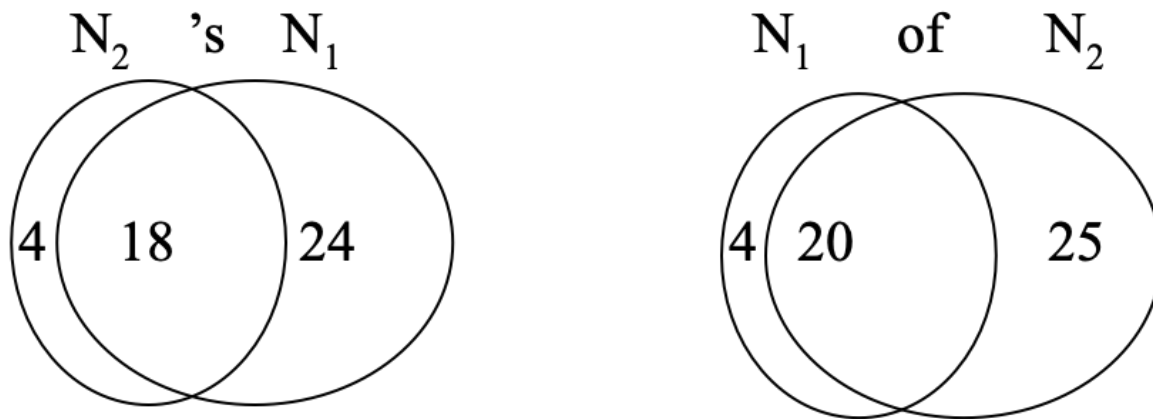
A rule that holds for  $(N-e)$  items is productive iff  $e \leq \theta_N = N/\ln N$ , where  $N$  pertains to the child learner's modest, and likely high-frequency, vocabulary (Yang 2016).

# Corpus study

| Language | Corpora                         | Input words  | Structures                        |
|----------|---------------------------------|--------------|-----------------------------------|
| English  | All English corpora on CHILDES  | 12.6 million | N <sub>2</sub> 's N <sub>1</sub>  |
|          |                                 |              | N <sub>1</sub> of N <sub>2</sub>  |
| German   | 5 German corpora on CHILDES     | 3.5 million  | N <sub>1</sub> von N <sub>2</sub> |
|          |                                 |              | N <sub>2</sub> 's N <sub>1</sub>  |
| Mandarin | All Mandarin Corpora on CHILDES | 1.7 million  | N <sub>2</sub> de N <sub>1</sub>  |
|          |                                 |              | N <sub>2</sub> N <sub>1</sub>     |

- Extract the possessive structures where the head noun in N<sub>1</sub> and/or N<sub>2</sub> position is known to young children (Carlson et al. 2014, Hao et al 2008, Szagun et al. 2006).

## Results: Structural commutativity in English



- The s-possessive ( $N_2 \mapsto N_1$ ): 22  $N_2$  nouns, 18 appear in  $N_1$  (TSP requires 15)
  - Recursive for possessor
- The of-possessive ( $N_1 \mapsto N_2$ ): 24  $N_1$  nouns, 20 appear in  $N_2$  (TSP requires 17)
  - Recursive for possessum

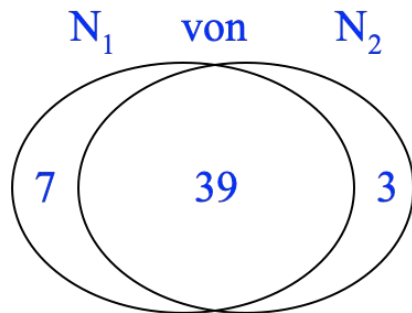
# Results: Semantic conditions for English possessives

| Construction   | N              | Counts | 20 Most Frequent Nouns  |
|--|----------------|--------|---|
| s-possessive<br>(N <sub>2</sub> 's N <sub>1</sub> )  | N <sub>1</sub> | 42     | name, head, hair, nose, mouth, room, hat, house, car, bed,<br>hand, chair, food, cup, mommy, juice, water, truck, daddy, school                             |
|  | N <sub>2</sub> | 22     | baby, daddy, boy, mommy, dog, girl, man, cat, bear, fish,<br>truck, train, cup, name, door, day, way, hat, color, car                                       |
| of-possessive<br>(N <sub>1</sub> of N <sub>2</sub> ) | N <sub>1</sub> | 24     | <i>piece</i> , top, <i>bit</i> , picture, name, <i>cup</i> , time, color, day, head,<br>door, <i>box</i> , way, hair, thing, mouth, book, school, room, man |
|  | N <sub>2</sub> | 45     | cheese, cake, head, book, train, house, water, milk, box, baby,<br>hair, car, juice, food, school, fish, hat, day, dog, man                                 |

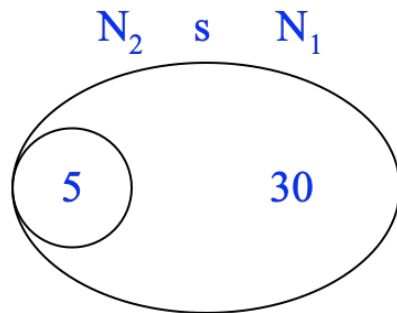
Possessor in 's-possessive: internal (kin, body parts, attributes) and external possession (ownership)

Possessum in of-possessive: measure words (*piece*, *bit*, *cup*, *box*) and internal possession

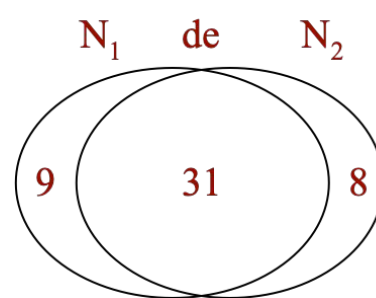
# Results: German and Mandarin



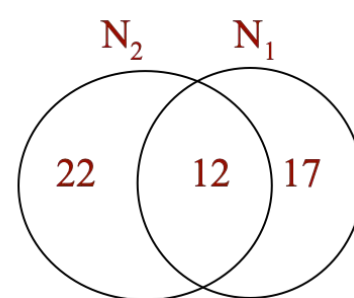
$N_1 \leftrightarrow N_2$



Only kinship terms



$N_1 \leftrightarrow N_2$



Kinship terms,  
measure words

# Conclusion

- Recursion derives from the *commutativity* of two structural positions.
- Therefore, recursion can be acquired as a productive generalization from level-1 input data for specific syntactic domains.

# Thanks

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# Questions