

# Evidence of accurate logical reasoning in online sentence comprehension

34th Annual CUNY Conference on Human Sentence Processing

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March 4, 2021

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# Introduction

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# logic in thought

- what is the status of **logic in thought**?
- logic studies **relations among propositions**

## Dictum de omni

All rats love to eat.

∴ All spotted rats love to eat.

- do such schemata capture the **nature of thought**?

# logic in psychology

- **psychology** has focused on **difficulties in logical reasoning**
  - Wason's (1968) selection tasks easier when ecologically valid (Cheng and Holyoak, 1985, 1989; Cheng, Holyoak, et al., 1986)
  - dual-process theories (Evans and Stanovich, 2013; Kahneman, 2011)

A

Birds have an ulnar artery.  
∴ Robins have an ulnar artery.

⇒

B

Birds have an ulnar artery.  
∴ Penguins have an ulnar artery.

Slovan (1993)

*system 1 ... has little understanding of logic and statistics*

Kahneman (2011)

# logic in linguistics

- **formal semantics** presupposes **logical ability**  
*the logical notions are embedded in our deepest nature, in the very form of our language and thought*

Chomsky (1988, p. 99)

- linguists predict some **logical thought as effortless as language**
- can we find **evidence for spontaneous logical computation?**
- **entailment**: if  $p$  is true, then  $q$  is also true

## Dictum de omni

All rats love to eat.

∴ All spotted rats love to eat.

## Entailment directions

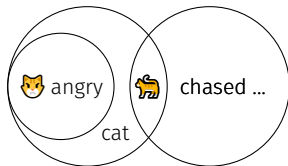
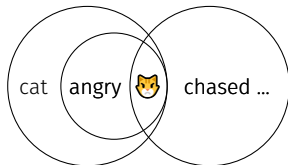
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# some: the first argument

some of the cats chased a mouse  
first argument      second argument

subset  
some of the angry cats chased a mouse  
 $\models$  some of the cats chased a mouse

superset  
some of the cats chased a mouse  
 $\not\models$  some of the angry cats chased a mouse



some, the first argument:

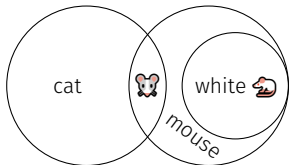
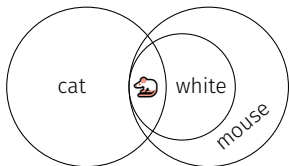
you can go from a subset to a larger set (*angry cat*  $\rightsquigarrow$  *cat*)

# some: the second argument

some of the cats chased a mouse  
first argument      second argument

some of the cats chased <sup>subset</sup> a white mouse  
 $\models$  some of the cats chased a mouse

some of the cats chased <sup>superset</sup> a mouse  
 $\not\models$  some of the cats chased a white mouse



some, the second argument:

you can go from a subset to a larger set (*white mouse*  $\rightsquigarrow$  *mouse*)



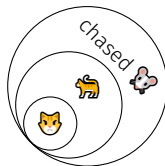
# entailment direction

- *upward entailment*: can go from a subset to a larger set
- 1<sup>st</sup> arg of *some*: *upward-entailing* (*angry cat*  $\rightsquigarrow$  *cat*)
- 2<sup>nd</sup> arg of *some*: *upward-entailing* (*white mouse*  $\rightsquigarrow$  *mouse*)
  
- *downward entailment*: can go from a superset to a smaller set

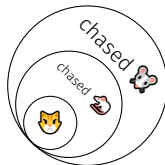
# all: both arguments

*all* of the cats chased a mouse  
first argument      second argument

<sup>superset</sup>  
*all of the cats chased a mouse*  
⊨ *all of the angry cats chased a mouse*



*all of the cats chased a white mouse*  
⊨ *all of the cats chased a mouse*  
<sup>subset</sup>



*all*: downward-entailing on the 1<sup>st</sup> argument (*cat*  $\rightsquigarrow$  *angry cat*),  
upward-entailing on the 2<sup>nd</sup> argument (*white mouse*  $\rightsquigarrow$  *mouse*)

# entailment direction by quantifier and argument

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	<i>SOME</i>	<i>NOT ALL</i>	<i>ALL</i>	<i>NONE</i>
FIRST ARG	upward	upward	downward	downward
SECOND ARG	upward	downward	upward	downward

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# evidence for entailment computation

- **presupposed** by accounts of:
  - Gricean implicature computation
  - distribution of negative polarity items (NPIs) (e.g. Ladusaw, 1983)
- yet, **little evidence** for online logical computation outside of acceptability judgements
- can be **challenged on empirical** grounds
  - the distribution of NPIs is more complex (cf. Hoeksema, 2012)
- previous studies:
  - Deschamps et al. (2015): signature of **quantifier's direction of entailment**
  - Agmon et al. (2019): signatures of both **negative polarity** and **downward entailment**
- limitation: inferences tested **indirectly**

# Hoeksema's (2012) 12 classes of polarity items

1. negation
2. *yes/no*-questions
3. WH-questions
4. comparatives of inequality
5. conditional clauses
6. restriction of universals
7. restriction of *the only*
8. restriction of superlatives
9. scope of *only*

	1	2	3	4	5	6	7	8	9
Any	+	+	+	+	+	+	+	+	+
Ever	+	+	+	+	+	+	+	+	+
Ook maar	+	+	+	+	+	+	+	+	+
Minimizer	+	+	+	+	+	+	+	-	-
Remotely	+	+	+	+	+	+	+	-	+
At all	+	+	+	+	+	+	+	-	+
Adv. Any	+	+	+	+	+	+	+	-	+
Yet	+	+	-	+	+	-/+	+	+	+
Either	+	+	-	+	-	-	-	-	-
In X	+	-	-	+	-	-	+	+	-
Can help	+	+	+	+	+	-/+	-	-	-
Can blame	+	+	+	-	-	-	+	-	-
Kwaad kunnen	+	+	+	-	-	-	+	-	+
Need, etc.	+	+	+	+	-	-/+	+	-	+
Anymore (US)	+	-	-	-	-	-	+	-	-
Squat	+	-	-	-	-	-	+	-	-
Exactly	+	-	-	-	-	-	-	-	-
Meer/mehr	+	-	-	-	-	-	-	-	-

# Methods

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- three novel self-paced reading experiments
- tested for signatures of accurate inferences between quantified sentences
- experiment 1 involved detecting logical contradictions
- experiments 2 and 3 leveraged variable entailments of the first and second arguments of quantifiers to detect incorrect inferences
- preregistered design and analyses on OSF

# Experiment 1

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# experiment 1

- tested whether speakers detect logical contradictions
- 400 participants on Amazon Mechanical Turk
- 12 target items displayed line by line
- 6 conditions differing in quantifiers

## Test item

- (1) *A group of scientists wanted to know whether spotted rats,*
- (2) *who are pickier eaters than other rats, liked a new kind of food.*
- (3) *They tested white, black, and spotted rats of both sexes.*
- (4) *The scientists discovered that QUANT1 of the rats loved the food.*
- (5) *Now that they knew that QUANT2 of the rats loved the food,*
- (6) *they decided to issue a recommendation based on their findings.*

- measured variable: RT of the conclusion line (5)
- participants were asked unrelated comprehension questions
  - *The researchers studied rodents.*  TRUE  FALSE

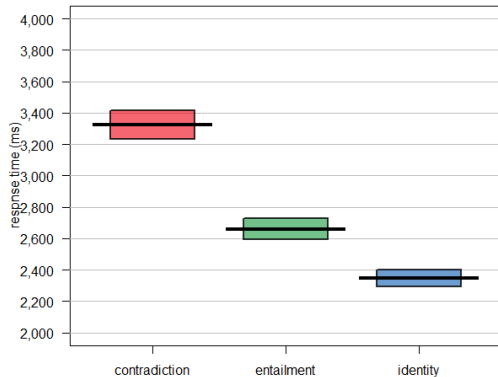
# experiment 1 conditions

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	QUANT1	QUANT2
IDENTITY	<i>some</i>	<i>some</i>
IDENTITY	<i>not all</i>	<i>not all</i>
ENTAILMENT	<i>all</i>	<i>some</i>
ENTAILMENT	<i>none</i>	<i>not all</i>
CONTRADICTION	<i>none</i>	<i>some</i>
CONTRADICTION	<i>all</i>	<i>not all</i>

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# experiment 1 results



- identity
- entailment
- contradiction

LMER effect between  
contradiction and  
entailment:  $\chi^2 = 161.31$   
 $p < 0.001$

## Experiment 2

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## experiment 2

- same paradigm to detect subtler unlicensed inferences (n = 400)
- manipulated quantifiers and premise quantifier's 1<sup>st</sup> arg

### Test item

- (1) *A group of scientists wanted to know whether spotted rats,*
- (2) *who are pickier eaters than other rats, liked a new kind of food.*
- (3) *They tested white, black, and spotted rats of both sexes.*
- (4) *The scientists discovered that QUANT of the ((male) spotted) rats loved the food.*
- (5) *Now that they knew that QUANT of the spotted rats loved the food,*
- (6) *they decided to issue a recommendation based on their findings.*

- 4 quantifiers × 3 containment relations = 12 conditions
  - 4 conditions: **premise identical to (trivially entails) conclusion**
  - 4 conditions: **premise entails conclusion**
  - 4 conditions: **premise does not entail conclusion**
- within quantifier, critical lines have identical lexical content

# experiment 2 conditions, full

	SOME	NOT ALL	ALL	NONE
SUBSET → of spotted rats →	<i>... some of the male spotted rats loved the food. Now that they knew that some of the spotted rats ...</i>	<i>... not all of the male spotted rats loved the food. Now that they knew that not all of the spotted rats ...</i>	<i>... all of the male spotted rats loved the food. Now that they knew that all of the spotted rats ...</i>	<i>... none of the male spotted rats loved the food. Now that they knew that none of the spotted rats ...</i>
IDENTICAL → to spotted rats →	<i>... some of the spotted rats loved the food. Now that they knew that some of the spotted rats ...</i>	<i>... not all of the spotted rats loved the food. Now that they knew that not all of the spotted rats ...</i>	<i>... all of the spotted rats loved the food. Now that they knew that all of the spotted rats ...</i>	<i>... none of the spotted rats loved the food. Now that they knew that none of the spotted rats ...</i>
SUPERSET → of spotted rats →	<i>... some of the rats loved the food. Now that they knew that some of the spotted rats ...</i>	<i>... not all of the rats loved the food. Now that they knew that not all of the spotted rats ...</i>	<i>... all of the rats loved the food. Now that they knew that all of the spotted rats ...</i>	<i>... none of the rats loved the food. Now that they knew that none of the spotted rats ...</i>

- trivially entailed
- entailed
- not entailed

## experiment 2 conditions, abridged

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	<i>SOME</i>	<i>NOT ALL</i>	<i>ALL</i>	<i>NONE</i>
SUBSET	entl'd	entl'd	¬entl'd	¬entl'd
IDENT	triv'l	triv'l	triv'l	triv'l
SUPERSET	¬entl'd	¬entl'd	entl'd	entl'd

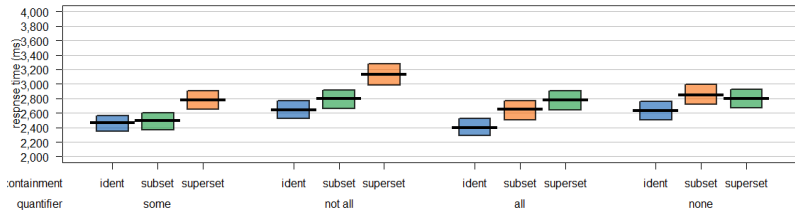
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■ trivially entailed

■ entailed

■ not entailed

# experiment 2 results

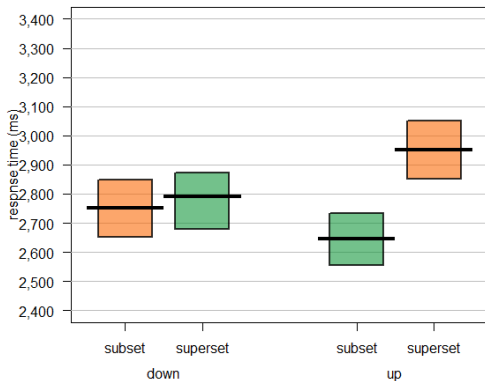


- trivial
- entailed
- not entailed

subset: *male spotted rats*  $\prec$  *spotted rats*  
ident: *spotted rats*  $\prec$  *spotted rats*  
superset: *rats*  $\prec$  *spotted rats*



## experiment 2 results, quantifiers grouped by entailment



■ entailed

subset: *male spotted rats*  $\prec$  *spotted rats*

■ not entailed

superset: *rats*  $\prec$  *spotted rats*

containment (subset vs. superset)  $\times$  entailment (up vs. down):  $\chi^2 = 10.9, p < 0.001$

## Experiment 3

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## experiment 3

- manipulated quantifiers and premise quantifier's 2<sup>nd</sup> arg

### Test item

- (1) *A group of scientists wanted to know what rats liked to eat.*
- (2) *They gave rats a choice of different meats,*
- (3) *as well as leafy and root vegetables, both fresh and frozen.*
- (4) *They discovered that QUANT of the rats ate ((frozen) leafy) vegetables.*
- (5) *Now that they knew that QUANT of the rats ate leafy vegetables,*
- (6) *they decided to issue a recommendation based on their findings.*

- 12 conditions, with different interactions of quantifier × containment relation

# experiment 3 conditions, full

	SOME	NOT ALL	ALL	NONE
SUBSET →	... <b>some</b> of the rats ate <b>frozen leafy veg-</b> <b>etables.</b> Now that they knew that	... <b>not all</b> of the rats ate <b>frozen leafy veg-</b> <b>etables.</b> Now that they knew that	... <b>all</b> of the rats ate <b>frozen leafy veg-</b> <b>etables.</b> Now that they knew that	... <b>none</b> of the rats ate <b>frozen leafy veg-</b> <b>etables.</b> Now that they knew that
of leafy veg. →	<b>some</b> of the rats ate <b>leafy vegetables</b> ...	<b>not all</b> of the rats ate <b>leafy vegetables</b> ...	<b>all</b> of the rats ate <b>leafy vegetables</b> ...	<b>none</b> of the rats ate <b>leafy vegetables</b> ...
IDENTICAL →	... <b>some</b> of the rats ate <b>leafy vegetables.</b> Now that they knew that	... <b>not all</b> of the rats ate <b>leafy vegetables.</b> Now that they knew that	... <b>all</b> of the rats ate <b>leafy vegetables.</b> Now that they knew that	... <b>none</b> of the rats ate <b>leafy vegetables.</b> Now that they knew that
to leafy veg. →	<b>some</b> of the rats ate <b>leafy vegetables</b> ...	<b>not all</b> of the rats ate <b>leafy vegetables</b> ...	<b>all</b> of the rats ate <b>leafy vegetables</b> ...	<b>none</b> of the rats ate <b>leafy vegetables</b> ...
SUPERSET →	... <b>some</b> of the rats ate <b>vegetables.</b> Now that they knew that	... <b>not all</b> of the rats ate <b>vegetables.</b> Now that they knew that	... <b>all</b> of the rats ate <b>vegetables.</b> Now that they knew that	... <b>none</b> of the rats ate <b>vegetables.</b> Now that they knew that
of leafy veg. →	<b>some</b> of the rats ate <b>leafy vegetables</b> ...	<b>not all</b> of the rats ate <b>leafy vegetables</b> ...	<b>all</b> of the rats ate <b>leafy vegetables</b> ...	<b>none</b> of the rats ate <b>leafy vegetables</b> ...

■ trivially entailed

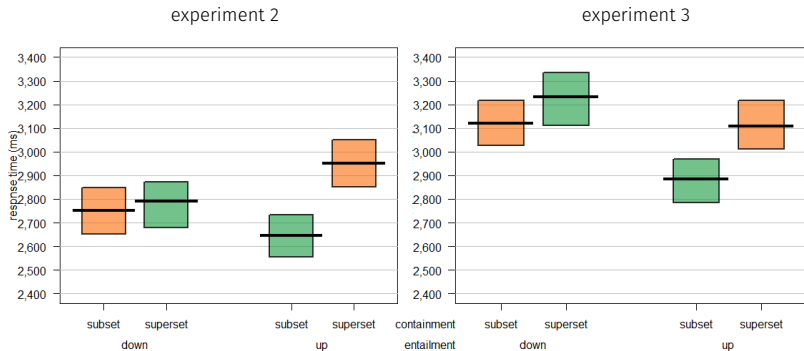
■ entailed

■ not entailed

## experiment 2 and 3 conditions, compared

exp. 2: 1 <sup>st</sup> arg of	SOME	NOT ALL	ALL	NONE
SUBSET	entl'd	entl'd	¬entl'd	¬entl'd
IDENT	triv'l	triv'l	triv'l	triv'l
SUPERSET	¬entl'd	¬entl'd	entl'd	entl'd
<hr/>				
exp. 3: 2 <sup>nd</sup> arg of	SOME	NOT ALL	ALL	NONE
SUBSET	entl'd	¬entl'd	entl'd	¬entl'd
IDENT	triv'l	triv'l	triv'l	triv'l
SUPERSET	¬entl'd	entl'd	¬entl'd	entl'd

# experiment 2 and 3 results



experiment 3

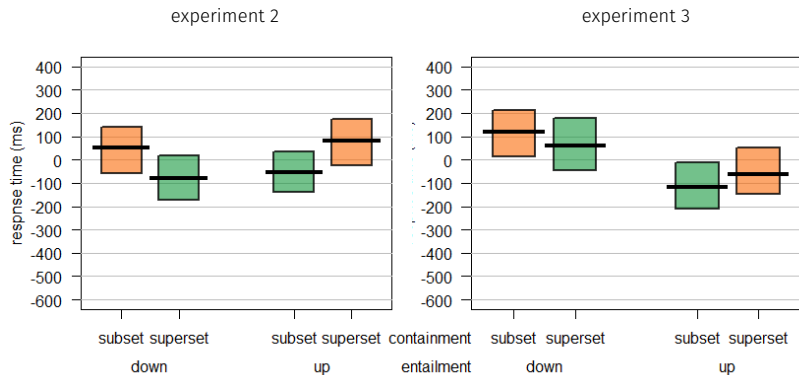
containment (subset vs. superset)

× entailment (up vs. down):

$$\chi^2 = 6.21$$

$$p = 0.013$$

# experiments 2 and 3, partial residual graphs



between experiments

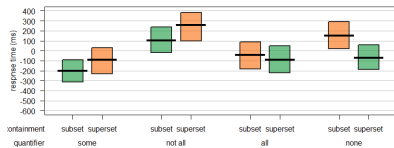
containment  $\times$  experiment  
 $\times$  entailment flip (yes vs. no):

$$\chi^2 = 0.98$$

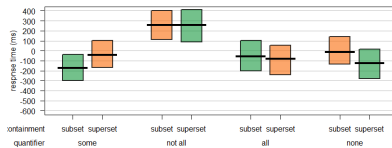
$$p = 0.32$$

# experiment 2 and 3 partial residuals, by quantifier

experiment 2



experiment 3



- entailed
- not entailed



## Discussion

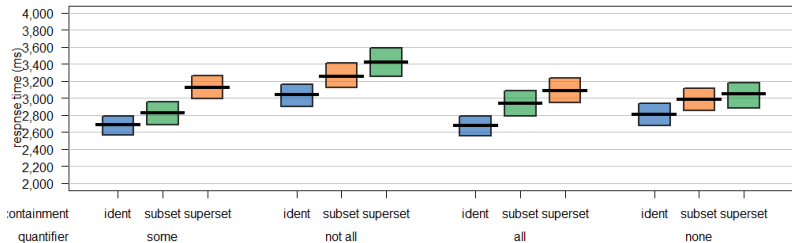
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# discussion

- language involves **accurate and spontaneous logical computations**
- **differs** from **dual-process theories** of cognition
  - it is assumed that people's intuitive logical knowledge emerges from a learning process in which key principles have been practiced to automaticity*
  - De Neys and Pennycook (2019)
- **consistent** with some logic being naturally intuitive
  - **natural logic** in reasoning (e.g. Braine and O'Brien, 1998)
  - logic (**L-analyticity**) in grammar (e.g. Gajewski, 2002)
- **inference** derives from **compositionality**?
- **some** logical competence **revealed more easily in natural language comprehension** than in puzzles and tests
- **new empirical terrain**: which inferences follow from structure of language?

thank you!

# experiment 3 results



trivial

subset: *frozen leafy vegetables*  $\prec$  *leafy vegetables*



entailed






ident: *leafy vegetables*  $\prec$  *leafy vegetables*



not entailed

superset: *vegetables*  $\prec$  *leafy vegetables*

## references i

-  Agmon, Galit, Yonatan Loewenstein, and Yosef Grodzinsky (2019). “Measuring the cognitive cost of downward monotonicity by controlling for negative polarity”. In: *Glossa: A Journal of General Linguistics* 4.1.
-  Braine, Martin D. S. and David P. O’Brien (1998). *Mental logic*. Psychology Press.
-  Cheng, Patricia W. and Keith J. Holyoak (1985). “Pragmatic Reasoning Schemas”. In: *Cognitive Psychology* 17.4, pp. 391–416.
-  Cheng, Patricia W. and Keith J. Holyoak (1989). “On the natural selection of reasoning theories”. In: *Cognition*.
-  Cheng, Patricia W., Keith J. Holyoak, Richard E. Nisbett, and Lindsay M. Oliver (1986). “Pragmatic versus syntactic approaches to training deductive reasoning”. In: *Cognitive Psychology* 18.3, pp. 293–328.

## references ii



De Neys, Wim and Gordon Pennycook (2019). “Logic, fast and slow: Advances in dual-process theorizing”. In: *Current Directions in Psychological Science* 28.5, pp. 503–509.








Deschamps, Isabelle, Galit Agmon, Yonatan Loewenstein, and Yosef Grodzinsky (2015). “The processing of polar quantifiers, and numerosity perception”. In: *Cognition* 143, pp. 115–128. ISSN: 0010-0277. DOI: <https://doi.org/10.1016/j.cognition.2015.06.006>. URL: <https://www.sciencedirect.com/science/article/pii/S0010027715300160>.



Evans, Jonathan St. B. T. and Keith E. Stanovich (2013). “Dual-process theories of higher cognition: Advancing the debate”. In: *Perspectives on Psychological Science* 8.3, pp. 223–241.



Gajewski, Jon (2002). “L-analyticity and natural language”. Manuscript. Cambridge, MA: MIT.

-  Hoeksema, Jack (2012). “On the natural history of negative polarity items”. In: *Linguistic Analysis* 38.1/2, pp. 3–33.
-  Kahneman, Daniel (2011). *Thinking, Fast and Slow*. Farrar, Straus and Giroux.
-  Ladusaw, William A. (1983). “Logical form and conditions on grammaticality”. In: *Linguistics and Philosophy* 6.3, pp. 373–392.
-  Sloman, Steven A. (1993). “Feature-based induction”. In: *Cognitive Psychology* 25.2, pp. 231–280.
-  Wason, Peter C. (1968). “Reasoning about a rule”. In: *Quarterly Journal of Experimental Psychology* 20.3, pp. 273–281.