Semantics, Pragmatics, and Context in Grounded Human Language Understanding



Roger Levy

Computational Psycholinguistics Laboratory (CPL) Dept. of Brain & Cognitive Sciences Massachusetts Institute of Technology

> ViGIL 4.0 10 June 2021

Collaborators



Helena Aparicio



Curtis Chen



Elizabeth Coppock



Jennifer Hu

Michael Henry Tessler Polina Tsvilodub

Noga Zaslavsky

• How do humans communicate so well with language?

• How do humans communicate so well with language?

How do humans communicate so well with language?
Ambiguity



How do humans communicate so well with language?
Ambiguity
Environmental noise



How do humans communicate so well with language?
Ambiguity Environmental noise





Memory Limitations



How do humans communicate so well with language?
Ambiguity Environmental noise



How do humans communicate so well with language?
Ambiguity Environmental noise



And how can we get machines to do the same?

The brightly milted porcupine daxed a dinner party-ready nest out of temble.

The brightly milted porcupine daxed a dinner party-ready nest out of temble.

Colorless green ideas sleep furiously.

—Chomsky, 1957

The brightly milted porcupine daxed a dinner party-ready nest out of temble.

Colorless green ideas sleep furiously.

—Chomsky, 1957

*Furiously sleep ideas green colorless.

The brightly milted porcupine daxed a dinner party-ready nest out of temble.

Colorless green ideas sleep furiously.

—Chomsky, 1957

*Furiously sleep ideas green colorless.

The brightly milted porcupine daxed a dinner party-ready nest out of temble.

Colorless green ideas sleep furiously.

—Chomsky, 1957

*Furiously sleep ideas green colorless.

The teacher spoon-fed me the example.

The brightly milted porcupine daxed a dinner party-ready nest out of temble.

Colorless green ideas sleep furiously.

—Chomsky, 1957

*Furiously sleep ideas green colorless.

The teacher spoon-fed me the example.

Science is a glacier.

— Lai, Curran, & Menn, 2009

4



Point to the frog on the left.



Point to the frog on the left.



Point to the frog on the left.

Point to the rabbit.



- Point to the frog on the left.
- × Point to the rabbit.



- Point to the frog on the left.
- × Point to the rabbit.

Point to the box.



- Point to the frog on the left.
- Point to the rabbit.
- Point to the box.



- Point to the frog on the left.
- X Point to the rabbit.
- × Point to the box.

Is the rabbit in the box?



- Point to the frog on the left.
- Point to the rabbit.
- × Point to the box.
- ✗ Is the rabbit in the box?



- Point to the frog on the left.
- X Point to the rabbit.
- × Point to the box.
- ✗ Is the rabbit in the box?

Point to the rabbit in the box.



- Point to the frog on the left.
- Point to the rabbit.
- × Point to the box.
- Is the rabbit in the box?
- Point to the rabbit in the box.



Vignettes

- Unknown words and pragmatic inference
- The nature of semantic scales and comparatives
- Syntax & inferring comparison classes for semantic scales
- Putting it all together: Complex descriptions and pragmatic inference in context

Vignettes

- Unknown words and pragmatic inference
- The nature of semantic scales and comparatives
- Syntax & inferring comparison classes for semantic scales
- Putting it all together: Complex descriptions and pragmatic inference in context

Unknown words and pragmatic inference

Carey & Bartlett (1978) "fast mapping"



- Teacher
- 3–4 year old child
- Even after a single exposure, there is some learning (a better representation for the color olive and/or that "chromium" names a color) that persists a week later!



Bob says "hat"



Bob says "hat"



Bob says "hat"





Unspoken alternatives in pragmatic inference Bob says "hat" Alternative: "scarf"
Unspoken alternatives in pragmatic inference Bob says "hat" Alternative: "scarf"

Unspoken alternatives in pragmatic inference Bob says "hat" Alternative: "scarf"

Scalar implicature (SI)





• Bob said *hat* – either snowman 2 or 3 could be possible



- Bob said *hat* either snowman 2 or 3 could be possible
- But *scarf* is an **alternative*** to *hat*



- Bob said *hat* either snowman 2 or 3 could be possible
- But scarf is an alternative* to hat
- If Bob had said scarf, I would have chosen snowman 3 and Bob knows that, and I know that Bob knows that, and Bob knows that I know that Bob knows that, and...



- Bob said *hat* either snowman 2 or 3 could be possible
- But scarf is an alternative* to hat
- If Bob had said scarf, I would have chosen snowman 3 and Bob knows that, and I know that Bob knows that, and Bob knows that I know that Bob knows that, and...
- Thus I can conclude that Bob didn't mean snowman 3



- Bob said *hat* either snowman 2 or 3 could be possible
- But *scarf* is an **alternative*** to *hat*
- If Bob had said scarf, I would have chosen snowman 3 and Bob knows that, and I know that Bob knows that, and Bob knows that I know that Bob knows that, and...
- Thus I can conclude that Bob didn't mean snowman 3
- \Rightarrow I should conclude that Bob meant snowman 2

Bob says "hat"



Bob says "hat"



⁽Hu, Zaslavsky, & Levy, 2021)

Bob says "hat"



Bob says "hat"





- Bob said *hat* either snowman 2 or 3 could be possible
- But *scarf* is an **alternative*** to *hat*
- If Bob had said scarf, I would have chosen snowman 3 and Bob knows that, and I know that Bob knows that, and Bob knows that I know that Bob knows that, and..
- Thus I can conclude that Bob didn't mean snowman 3
- \Rightarrow I should conclude that Bob meant snowman 2



- Bob said *hat* either snowman 2 or 3 could be possible
- But ???? is an **alternative*** to hat
- If Bob had said ????, I would have chosen snowman 3 and Bob knows that, and I know that Bob knows that, and Bob knows that I know that Bob knows that, and...
- Thus I can conclude that Bob didn't mean snowman 3
- \Rightarrow I should conclude that Bob meant snowman 2



- Bob said *hat* either snowman 2 or 3 could be possible
- But ???? is an alternative* to hat
- If Bob had said ????, I would have chosen snowman 3 and Bob knows that, and I know that Bob knows that, and Bob knows that I know that Bob knows that, and...
- Thus I can conclude that Bob didn't mean snowman 3
- ⇒ I should conclude that Bob meant snowman 2



- Bob said *hat* either snowman 2 or 3 could be possible
- But ???? is an **alternative*** to hat
- If Bob had said ????, I would have chosen snowman 3 and Bob knows that, and I know that Bob knows that, and Bob knows that I know that Bob knows that, and...
- Thus I can conclude that Bob didn't mean snowman 3
- \Rightarrow I should conclude that Bob meant snowman 2

If the label for a certain feature is **not in common ground**, then it might not enter the computations underlying SI.

If the label for a certain feature is **not in common ground**, then it might not enter the computations underlying SI.



(Hu, Zaslavsky, & Levy, 2021)

If the label for a certain feature is **not in common ground**, then it might not enter the computations underlying SI.



If speakers generate and use **new lexical entries** from one exposure, then nonce objects may drive SI like familiar objects.

(Hu, Zaslavsky, & Levy, 2021)

If the label for a certain feature is **not in common ground**, then it might not enter the computations underlying SI.

If speakers generate and use **new lexical entries** from one exposure, then nonce objects may drive SI like familiar objects.





Do nonce objects drive scalar implicature?

Do nonce objects drive scalar implicature?

Condition 1: Familiar feature



Do nonce objects drive scalar implicature?

Condition 1: Familiar feature



Condition 2: Nonce feature







(Hu, Zaslavsky, & Levy, 2021)



(Hu, Zaslavsky, & Levy, 2021)



(Hu, Zaslavsky, & Levy, 2021)



(Hu, Zaslavsky, & Levy, 2021)



(Hu, Zaslavsky, & Levy, 2021)



(Hu, Zaslavsky, & Levy, 2021)



(Hu, Zaslavsky, & Levy, 2021)



(Hu, Zaslavsky, & Levy, 2021)

Vignettes

- Unknown words and pragmatic inference
- The nature of semantic scales and comparatives
- Syntax & inferring comparison classes for semantic scales
- Putting it all together: Complex descriptions and pragmatic inference in context

Degree semantics for scalar adjectives

Mary is tall

(Kennedy, 2007)
The meaning of a scalar adjective like *big* or *tall* does two things:

Mary is tall

- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a scale

Mary is tall

- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a scale

Mary is tall



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a scale

Mary is tall







(Kennedy, 2007)

- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a scale



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ

Mary is tall







(Kennedy, 2007)

- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ



- The meaning of a scalar adjective like *big* or *tall* does two things:
 - 1. Projects a referent onto some value on a *scale*
 - 2. Predicates that that value is greater than some threshold θ





The left circle is bigger than the right circle.





The left circle is bigger than the right circle.

Point to the bigger circle.



The left circle is bigger than the right circle.

Point to the bigger circle.

What exactly does this mean?!?





the biggest circle

the bigger circle

1. "bigger" requires that there are two *referents* in the context of the comparison class





Corpus data



⁽Aparicio, Chen, Levy, & Coppock)

Corpus data



⁽Aparicio, Chen, Levy, & Coppock)

Corpus data



A revealing example from the wild

Fitness > Workouts > Arm Exercises

Is It Better to Work the Back With Biceps or Triceps?

By Sara Lindberg Updated April 29, 2019

Reviewed by Andra Picincu, CN, CPT



Working the pulling muscles of the back and biceps together helps prevent overtraining and eliminates the need to train arms on their own day. Another muscle group to consider pairing your back workout with is the triceps. "Back and triceps workouts are a great way to ensure that you get indirect workload on the biceps, but get the direct work on the triceps while still working on **the bigger of the three muscles** — the back," explains Carneiro.

https://www.livestrong.com/article/550451-is-it-better-to-work-the-back-with-biceps-or-triceps/













- 1. "bigger" requires that there are two *referents* in the context of the comparison class
- 2. "bigger" requires that there are two *granularities* in the context of the comparison class

Theory of granularity inference



Theory of granularity inference



Experiment results



Experiment results


Vignettes

- Unknown words and pragmatic inference
- The nature of semantic scales and comparatives
- Syntax & inferring comparison classes for semantic scales
- Putting it all together: Complex descriptions and pragmatic inference in context





How do we know the comparison class?



- How do we know the comparison class?
 - How does *tall elephant* turn out to mean something different from *tall mouse*?



- How do we know the comparison class?
 - How does *tall elephant* turn out to mean something different from *tall mouse*?
 - How can the same *individual* be evaluated as either tall or not tall in different contexts?



- How do we know the comparison class?
 - How does *tall elephant* turn out to mean something different from *tall mouse*?
 - How can the same *individual* be evaluated as either tall or not tall in different contexts?





- How do we know the comparison class?
 - How does *tall elephant* turn out to mean something different from *tall mouse*?
 - How can the same *individual* be evaluated as either tall or not tall in different contexts?

Stephen Curry is tall.





- How do we know the comparison class?
 - How does *tall elephant* turn out to mean something different from *tall mouse*?
 - How can the same *individual* be evaluated as either tall or not tall in different contexts?

Stephen Curry is tall.







- How do we know the comparison class?
 - How does *tall elephant* turn out to mean something different from *tall mouse*?
 - How can the same *individual* be evaluated as either tall or not tall in different contexts?

Stephen Curry is tall.

(Stephen Curry is 6'2"; this is the 12th percentile of NBA player heights)







- How do we know the comparison class?
 - How does *tall elephant* turn out to mean something different from *tall mouse*?
 - How can the same *individual* be evaluated as either tall or not tall in different contexts?

Stephen Curry is tall.

Stephen Curry is a tall basketball player.

(Stephen Curry is 6'2"; this is the 12th percentile of NBA player heights)





You and your friend see the following:



Your friend runs far ahead of you, and you see him in the distance:





Your friend says: **That's a big great dane.**

What do you think your friend meant?

Context Basic-Level Syntax Predicate NP Noun Subordinate Category

It is big relative to other _____.

(Tessler, Tsvilodub, Snedeker, Franke, Levy)



Your friend runs far ahead of you, and you see him in the distance:





Your friend says: That dog is big.

What do you think your friend meant?

Context Subordinate-level **Syntax** Subject NP **Noun** Basic-level Category

It is big relative to other _____.

(Tessler, Tsvilodub, Snedeker, Franke, Levy)

Results



Vignettes

- Unknown words and pragmatic inference
- The nature of semantic scales and comparatives
- Syntax & inferring comparison classes for semantic scales
- Putting it all together: Complex descriptions and pragmatic inference in context



Point at the bag

31

which one?!



Point at the bag

32

Property of definites: require a unique referent



33

Request violates a cooperative norm for communication rooted in the semantics of the definite determiner



34



Point at the bag

35



The rabbit in the bag

36

Haddock (1987)



The rabbit in [the bag]

37

Haddock (1987)



[The rabbit in [the bag]]

38

Haddock (1987)



39

Puzzle



The rabbit in the bag

40

Puzzle

• Why doesn't the embedded definite fail to refer?



The rabbit in the bag

A semantic account for Haddock descriptions



Click on the rabbit in the big [***]



Click on the rabbit in the big [***]

Definitely a big box!



Click on the rabbit in the big [***]

Definitely a big box!



Not necessarily a big bag! (Aparicio, Levy, & Coppock)

Click on the rabbit in the big [***]

Definitely a big box!





Not necessarily a big bag! (Aparicio, Levy, & Coppock)

Experiment: informativity violation condition

Click on the rabbit in the big [***]





Experiment: *informativity violation* condition Click on the rabbit in the big [***] Wouldn't have needed to say "big"! Proportion of Referent Selection Threshold Informativity Violation Uncertainty

Threshold uncertainty and informativity violation

Click on the rabbit in the big [***]



Threshold uncertainty and informativity violation

Click on the rabbit in the big [***]



Modeling with Bayesian pragmatics


Modeling with Bayesian pragmatics



Modeling with Bayesian pragmatics



Model derives qualitative patterns of human response

Semantic Model

Human Data

Informativity

Violation

Threshold

Uncertainty

*





Both

Vignettes

- Unknown words and pragmatic inference
- The nature of semantic scales and comparatives
- Syntax & inferring comparison classes for semantic scales
- Putting it all together: Complex descriptions and pragmatic inference in context

Zeroing in on truly human-like language



Collaborators



Helena Aparicio



Curtis Chen



Elizabeth Coppock



Jennifer Hu

Michael Henry Tessler Polina Tsvilodub

Noga Zaslavsky 50

Thank you for listening!

http://cpl.mit.edu

http://www.mit.edu/~rplevy