Children's Processing of Ad-hoc Implicatures in Eye-tracking and Tablet Studies

Erica J. Yoon, Michael C. Frank

Department of Psychology, Stanford University

Author Note

The Author Note, containing contact information, acknowledgements, etc

Abstract

Language comprehenders routinely make pragmatic inferences that go beyond the literal meanings of utterances. If A said "I ate some of the cookies," B should infer that A ate some but not all. Children perform poorly on experimental tests of scalar implicatures like this, despite their early-emerging sensitivity to pragmatic cues. Our current work explores potential factors responsible for children's successes and failures in computing pragmatic inferences. In three experiments, we used an eye-tracking paradigm (Experiments 1 and 2) and a tablet paradigm (Experiment 3) to test children's ability to compute implicatures when they have access to contextual alternatives to the target word. We found that by the time children are four years old, they successfully identify the inferential target referent in eye-tracking and tablet paradigms. Younger children still struggle with computation in our simplified tasks, however, and there is little evidence that this struggle is caused by inhibitory demands of the tasks.

Keywords: Pragmatics; implicature; eye-tracking; cognitive development

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Introduction

Language comprehension involves not only interpreting the literal meanings of words in utterances, but also understanding the communicative intentions behind what is said. Listeners make pragmatic implicatures, inferences about speakers' intended meanings that go beyond the semantics of their utterances (Grice, 1975). One common type of implicatures, called scalar implicatures, involves scales built based on the knowledge of lexical alternatives (Horn, 1972). For example, if A says to B, "Some of the students failed the test," B may infer that A intended to say "Some, but not all, of the students failed the test." That is, A's use of the term "some" implicates that the stronger scalar alternative "all" is negated.

Whereas adults readily compute scalar implicatures (SIs), children tend to perform poorly on SI tasks (e.g., Noveck (2001), Papafragou & Musolino (2003), Huang & Snedeker (2009)}). For example, given a context in which three out of three horses jumped over a fence, adults reject a statement such as "some of the horses jumped over the fence" as infelicitous, whereas children typically judge it to be acceptable (Papafragou & Musolino, 2003).

Children's failures on SI computation are surprising, given their early-emerging sensitivity to the informativeness of utterances. For example, by around approximately five years, children adjust informativeness of their own expressions depending on the listeners' knowledge (Matthews, Lieven, Theakston, & Tomasello, 2006); reward speakers based on their informativeness (Katsos & Bishop, 2011); and provide more information when disambiguation between potential referents is difficult (Matthews,

Butcher, Lieven, & Tomasello, 2012). Given this body of research, it seems unlikely that children's lack of pragmatic ability per se causes their failures on SI tasks. What then causes children's failures, and what factors can help them succeed on implicature tasks?

One cue that may help children's implicature processing is availability of alternatives to the current term. On standard accounts, implicature involves generating and negating stronger alternatives to a given term. Upon hearing "some," the listener needs to generate a stronger alternative ("all") based on lexical knowledge, and then negate it. One potential cause of children's difficulty with previous SI tasks could be issues generating these alternative terms (Barner, Brooks, & Bale, 2011). If this hypothesis is true, children might succeed on implicature computation if they are given access to alternatives in the context.

Indeed, there is evidence that children can compute *ad-hoc* implicatures, which depend on contextually- rather than lexically-derived scales (Stiller, Goodman, & Frank, 2014). Children saw three faces, one wearing glasses and a top-hat, one wearing glasses only, and one with no item. When children heard: "My friend has glasses," 3.5-year-old children and older chose the face with glasses only as the referent above chance, successfully computing the implicature "My friend has glasses, *but not a top-hat*," given the contextual access to the stronger alternative (face with glasses and top-hat).

In the current work, we ask both about factors underlying the previously-observed developmental trajectory and about the decision-making processes underlying children's implicature computation. In Experiment 1, we measure implicature performance across a wide developmental range with an eye-tracking paradigm, and we replicate Stiller et

¹These inferences are sometimes known in the pragmatics literature as "particularized" implicatures, in contrast to "generalized" implicatures. Here we use the term "ad-hoc" implicature as a descriptive term and remain agnostic with respect to the reality of this distinction.

al. (2014)'s findings that preschoolers compute ad-hoc implicatures. However, there are two surprising findings: younger children (2- to 3-year-olds) consistently fail to compute implicatures and are even more biased towards the wrong answer; and children's performance in implicature trials is barely above chance, even for 5-year-olds.

Experiments 2 and 3 address these concerns. In Experiment 2, we explore the cause of younger children's difficulty with implicature computation and explore one potential cause: inability to inhibit their response to more salient items. In Experiment 3, we use a tablet paradigm to confirm children's robust implicature computation, and compare their performances across the two methodologies used.

Experiment 1

In Experiment 1, we use an eye-tracking paradigm to look at children's ad-hoc implicature computation. Eye-tracking offers several advantages over purely behavioral measures for examining pragmatic inference. First, it is possible to track participants' gaze as an utterance is being produced, providing moment-by-moment data about responses to spoken language. Second, eye gaze reflects a more implicit measure of comprehension and hence allows for more direct developmental comparisons compared with behavioral choices that may reflect conscious deliberation.

A previous eye-tracking paradigm looking at SI computation in children (Huang & Snedeker, 2009) suggested that children do not calculate SI during online language processing. For example, when they saw a girl who has two out of four (some but not all) of the socks and another girl who has three out of three (all) of the soccer balls, and heard "... the girl who has *some* of the soc...," unlike adults, children did not look more toward the girl with socks until they heard the disambiguating word "socks."

Children might have struggled with SI computation from the lack of access to lexical

scales (some-all), and the time constraint to process implicatures (in less than one second). Our current work uses a similar but simpler paradigm that tests children's inference of implicatures given scales that are set up contextually.

Thus, in addition to replicating previous research on ad-hoc implicatures in the online processing context, we are able to pursue two goals in Experiment 1: measure the time-course of ad-hoc pragmatic inference; and identify potential factors that contribute to the developmental differences in implicature computation performance.

Method

Participants. Parents and their 2- to 5-year-old children visiting Children's Discovery Museum in San Jose, CA, were invited to participate in a short video study. The current sample comprised of children who were exposed to English at least 75% of the time as indicated by their parents. In addition, individual trials with more than 50% missing gaze data were excluded from analysis, and only participants who completed at least half of the trials according to this criterion were included in the analysis. These exclusion criteria led to a final sample of 123 (out of 143 participants): 26 2-year-olds (M = FIXME, range FIXME, FIXME girls), 33 3-year-olds (M = FIXME, range FIXME, FIXME girls), 35 5-year-olds (M = FIXME, range FIXME, FIXME girls). Children were given a sticker for participating in the study. We also tested fifteen adult participants, undergraduate students recruited through Stanford Psychology credit pool.

Stimuli and Design. On each trial, participants saw two images: a target and distractor, which could either be an item with a single feature (e.g. a plate with only a carrot or only a banana), or an item with double features (e.g., a plate with a carrot and a banana). Each trial contained three phases: in the initial phase (8.5 seconds), two

images were presented in silence for two seconds, then a pre-recorded voice said a sentence (e.g. "Look at these plates. Elmo's plate has a carrot."). Then, in the anticipatory phase (1.5 seconds), a chime sound played to induce participants' anticipatory gaze. In the following feedback phase (1.5 seconds), a character appeared next to the target with an amusing sound effect. This outcome served to keep the task engaging for participants.

There were three types of test trials (pictured in Figure FIXME). In *inference* trials, the target item had a single feature (e.g., a carrot), and the distractor item had two features, one that was common with the target (e.g., a carrot) and the other feature that was unique (e.g., a banana). The test sentence named the feature that was common to the target and distractor. Thus, if participants understood that "Elmo's plate has a carrot" implicates "Elmo's plate has a carrot *but not a banana*," given the context, they should look more toward the target than the distractor, but otherwise look equally to both.

There were two additional trial types, with semantically unambiguous targets:

Control-double trials looked identical to inference trials, but the target and distractor were switched, such that the double-feature item was the target and the single-feature item was the distractor, and the test sentence named the unique feature on the target.

Control-single trials presented two items that each had a unique single feature, and either could be the target. Children saw 4 inference, 4 control-double, and 4 control-single trials; adults saw 6 inference, 6 control-double, and 12 control-single trials.

There were six sets of item and feature types, and the features were named with nouns found on the MacArthur-Bates Communicative Development Inventory word list (Fenson et al., 1994). Two orders of the test trials were created, such that trial types and item types were counterbalanced and trial order was pseudo-randomized across the

two orders.

Procedure. Participants sat in a booster seat, approx. 60 cm away from the monitor of an SMI RED 120 Hz binocular remote eye-tracker. Participants were introduced to the task as watching a short video. The video began with a short Elmo video clip that lasted for 1-2 minutes, during which any necessary adjustments to the eye-tracker and participants' chair positions were made. The eye-tracker was then calibrated using a 2-point calibration and validation of the calibration points. Then participants were introduced to Sesame Street characters and told "Today, [they] will show us lots of fun things. Are you ready? Let's go!" Following the introduction, participants saw two gaze-contingent practice trials, with unambiguous targets that differed from the test items. Then children watched 16 test trials and adults watched 24 test trials, as well as 4 filler photos of children playing and 2 Elmo video clips, presented at a pseudo-random points between test trials. The video lasted approximately 8 minutes.

Results and Discussion

Participants of all ages looked to the targets in both control-double and control-single trials reliably above chance (50%; Figure 1). There were age differences in the speed of looking at the target and the proportion of correct looking across both control trial types.

For inference trials, children of 4 years and above robustly looked to inferential targets (for 4-year-olds: t(28) = 2.55, p = 0.016). For example, upon hearing "Bert's plate has a carrot," older children identified the plate with only a carrot as the referent rather than the plate with a carrot and a banana, replicating Stiller et al. (2014)'s findings of ad-hoc implicature. Although previous studies are not directly comparable

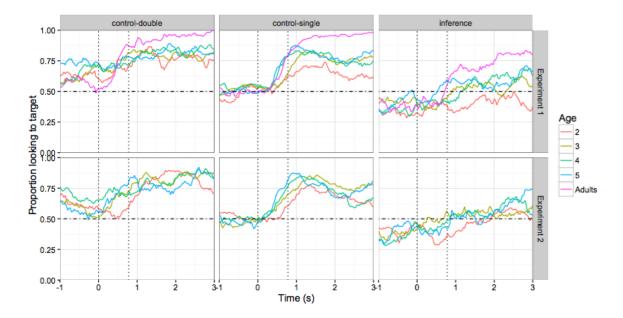


Figure 1. Proportion of 2- to 5-year-old children and adults looking to the target image as the utterance unfolds. Time 0 represents the target word onset. Proportion correct looking is defined by looks to the target divided by the total looks to both the target and the distractor. (FIXME) Bottom panels show example stimuli from each condition; the named character emerged at the end of the trial to mark the correct target.

due to low-level differences in the task and materials, our finding is consistent with the hypothesis that children's inferential ability might have been obscured in previous SI tasks due to the unavailability of lexical alternatives (e.g. "all" given "some"; Barner et al. (2011)).

We additionally observed an unpredicted trend in two-year-olds' behavior: they did not disengage from distractors relative to their baseline bias prior to hearing the target word, and were marginally *below* chance in their overall performance (t(25) = -3.66, p = 0.001). We address this issue in Experiment 2.

We fit a linear mixed-effects model² to measure the effects of trial type and age on ²All mixed-effects models were run using the lme4 package, version 1.1-10 (D. Bates, Maechler, Bolker,

Predictor	Estimate	Std. Error	t value
Intercept	0.60	0.05	13.19
Control-double	0.13	0.06	2.24
Inference	-0.33	0.06	-5.24
Age	0.04	0.01	3.34
Control-double * Age	-0.02	0.01	-1.67
Inference * Age	0.03	0.02	1.94

Table 1

Predictor estimates with standard errors and significance information for a linear

mixed-effects model predicting accurate looking to target in Experiment 1.

the proportion of children looking to the target between 0.8 and 4s after noun onset (Table 1). We selected this time window because participants would have to wait until the end of target noun (0.8 seconds on average) to know they should switch to the inferential target, given the absence of a disambiguating continuation (e.g., "Elmo's plate has a carrot and banana."). Results of the mixed-effects model indicate significant main effects of trial type and age: participants looked to the target significantly less in inference trials compared to control-single trials, and across all trial types, participants' looking to target increased with age.

We next analyzed participants' reaction times (Fernald, Zangl, Portillo, & Marchman, 2008). We selected trials on which participants were looking at the distractor at the point of disambiguation, and measured the average length of time prior

Walker, & others, 2014). The random effects structure for this model was as follows: (trial type \$|\$ subid) + (age \$|\$ item) All of our data and processing and analysis code can be viewed in the version control repository for this paper at: https://github.com/ejyoon/FIXME.

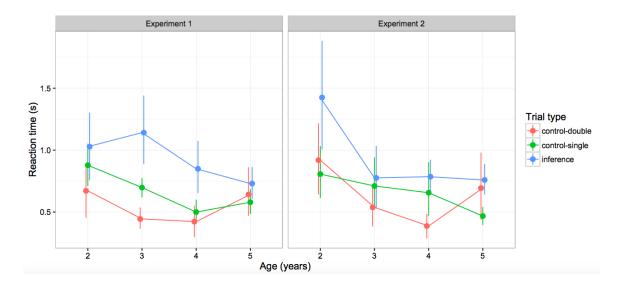


Figure 2. Reaction times (time to switch from distractor to target) in Experiments 1 and 2

to a shift to the target. Looks to the target were slower in inference trials compared to both control trial types across all age groups (Figure 2). We next fit a linear mixed-effects model with the same structure as the previous analysis, but predicting reaction time rather than accuracy. This model again showed significant main effects of trial type ($\beta = 0.52$, p < .05) and age ($\beta = -0.08$, p < .01) on the average RT, with no interaction (largest $\beta = -0.06$, p > .24). Inference trials were generally slower compared to unambiguous control trials, regardless of the participants' age, and participants reacted faster with increasing age generally across trial types.

Experiment 2

In Experiment 1, we largely replicated Stiller et al. (2014)'s findings in an eye-tracking paradigm, and showed that adults and older children (4- to 5-year-olds) look toward the pragmatically felicitous based on ad-hoc implicature.

But younger children still struggled to look at the inferential target. Further,

2-year-olds not only did not look at the correct inferential target, but seemed to look if anything more toward the distractor. A potential explanation for this pattern comes from the inhibitory demands of our task. The two items in inference trials differed in salience: Since the distractor item contained an extra referent (e.g., a carrot and a banana), it was likely to be more salient. Supporting this idea, looking to the two-referent item was greater than chance during the baseline period of each trial. Perhaps 2- and 3-year-olds had difficulty disengaging from this more salient (and logically possible) distractor item in favor of the inferentially-correct target item. Inhibitory control is difficult for children and continues to develop throughout the period we studied here (e.g., Davidson, Amso, Anderson, & Diamond (2006)). In addition, several recent studies suggest that inhibitory control might affect word recognition in similar eye-tracking paradigms (Yurovsky & Frank, 2014, Nordmeyer & Frank (2013)).

Experiment 2 sought to explore the question of whether inhibitory demands of the task caused younger children's failures. We increased the saliency of distractor even more by presenting three instead of two features.

Method

Participants. Participants were recruited as in Experiment 1. The final sample consisted of 102 (out of 126 participants): 26 2-year-olds (M = FIXME, range FIXME, FIXME girls), 30 3-year-olds (M = FIXME, range FIXME, FIXME girls), 36 4-year-olds (M = FIXME, range FIXME, FIXME girls), 27 5-year-olds (M = FIXME, range FIXME, FIXME girls).

Stimuli. The stimuli were identical to Experiment 1, except for one change: target items in inference trials and distractor items in control-double trials now had three features instead of two (see figure FIXME).

Design and Procedure. The design and procedure were identical to Experiment 1.

Results and Discussion

A linear mixed-effects model predicting accuracy based on age and trial type in Experiment 2, as in Experiment 1, showed a significant main effect of trial type ($\beta =$ -0.25, p < .001), such that looking at target was lower in inference trials than in control trials. There was no significant main effect of age or interaction between age and trial type (largest $\beta = -0.25$, p > .19). There was no evidence of performance above or below chance for any of the age groups (largest t: t(28) = 1.78, p = 0.086)

A linear mixed-effects model looking at the reaction times of making first switch from distractors to targets as in Experiment 1, found a significant main effect of trial type ($\beta = 0.58$, p < .05) and age ($\beta = -0.1$, p < .05) on the average RT, with no interaction ($\beta = -0.08$, p > .23). Thus, participants' looking was faster with increasing age, and looking at inferential targets was slower and overall lower compared to unambiguous targets, consistent with what was observed in Experiment 1.

Comparison between Experiment 1 and 2. To determine the effect of saliency contrast on children's inferential processing, we compared looking at targets across both Experiment 1 and 2 for inference trials. A linear mixed-effects model predicting accuracy based on experiment, age, and trial type (Table 2) revealed significant main effects of trial type and age, but no interaction between Experiment 2 and any other variable. Thus, in contrast to our initial predictions, we did not find evidence of the effect of perceptual saliency on children's looking patterns. FIXME: post-hoc ana of performance near end of the trials?

Predictor	Estimate	Std. Error	t value
Intercept	0.60	0.05	12.92
Experiment 2	0.07	0.07	1.00
Control-double	0.13	0.06	2.11
Inference	-0.33	0.07	-4.94
Age	0.04	0.01	3.34
Experiment 2 * Control-double	0.02	0.08	0.25
Experiment 2 * Inference	0.08	0.10	0.86
Experiment 2 * Age	-0.02	0.02	-1.28
Control-double * Age	-0.02	0.01	-1.67
Inference * Age	0.03	0.02	1.88
Experiment 2 * Control-double * Age	0.00	0.02	0.13
Experiment 2 * Inference * Age	-0.02	0.02	-0.79

Table $\bar{2}$

Predictor estimates with standard errors and significance information for a linear mixed-effects model predicting accurate looking to target in Experiments 1 and 2.

Experiment 3

In Experiment 1, we confirmed that 4- and 5-year-olds reliably looked to the pragmatically felicitous targets above chance, and thus saw evidence of their implicature computation. Interestingly, however, the proportion of looking to target was generally lower than expected, never reaching beyond 75%, whereas older children in Stiller et al. (2014)'s paradigm selected the target much more robustly.

One potential source of this discrepancy is stimuli, in specific pictures and utterances given. (FIXME: Add a point about how our task is actually supposed to be

easier?) Yet another important difference between Stiller et al. (2014)'s and our paradigms is methodological one: Stiller et al. (2014) used a behavioral selection paradigm on paper, whereas we used an eye-tracking procedure. FIXME: selection paradigm better estimate of children's accuracy, but eye-tracking offers us RT. If looking time isn't the best to capture the rate at which children make implicature computation, is there a paradigm that can show both accuracy and reaction time, that are comparable to eye-tracking?

A tablet paradigm is a useful, engaging way to collect data from young children, in that it yields comparable data to that of behavioral paradigms, while making it possible to examine the accuracy and reaction time of children's judgments (Frank, Sugarman, Horowitz, Lewis, & Yurovsky, 2016).

In Experiment 3, we examine children's ad-hoc implicature processing using a tablet paradigm, and we revisit the findings from all Experiments to compare the two methodologies, tablet vs. eye-tracking.

Method

Participants. Participants were recruited as in Experiment 1, except that a partial sample was recruited from a local nursery school. The final sample consisted of 62 (out of 64 participants): 24 3-year-olds (M = FIXME, range FIXME, FIXME girls), 25 4-year-olds (M = FIXME, range FIXME, FIXME girls), 13 5-year-olds (M = FIXME, range FIXME, FIXME girls).

Stimuli. FIXME: stimuli were presented on a tablet.

Design and Procedure. FIXME: The design and procedure were identical to Experiment 2, except that each participant saw all the possible numbers of features.

A linear mixed-effects model predicting accuracy based on age, trial type and

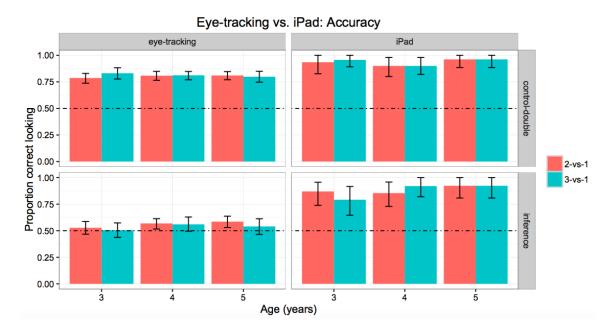


Figure 3. Accuracy rates across Experiments 1, 2 (eye-tracking), and 3 (iPad).

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number of features present showed there was no significant main effect or interaction (largest $\beta = -0.12, p > .32$).

A linear mixed-effects model predicting reaction time based on age, trial type and number of features present showed no significant main effect or interaction, other than a marginal main effect of age ($\beta = -321.44$, p > .05).

Comparing across Experiments 1, 2, and 3

General Discussion

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