Using contrastive inferences to learn about new words and categories

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Author Note

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- All data and code for these analyses are available at
- 7 https://osf.io/3f8hy/?view\_only=9a196db0444c4867bc899cc70a7a1e9c.
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Abstract

In the face of unfamiliar language or objects, description is one cue people can use to learn 11 about both. Beyond narrowing potential referents to those that match a descriptor, listeners 12 could infer that a described object is one that contrasts with other relevant objects of the 13 same type (e.g., "The tall cup" contrasts with another, shorter cup). This contrast may be in relation to other present objects in the environment or to the referent's category. In three 15 experiments, we investigate whether listeners use descriptive contrast to resolve reference 16 and make inferences about novel referents' categories. People use size adjectives contrastively 17 to guide referent choice, they do not do so using color adjectives (Experiment 1). People also 18 use description to infer that a novel object is atypical of its category (Experiment 2). Finally, 19 Overall, people are able to use descriptive contrast to resolve reference and make inferences about a novel object's category, but limits to these abilities present further questions about 21 the effect of context on listener interpretation." 22

23 Keywords: parent-child interaction; language development; communication

Word count: 1385

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26 Introduction

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When trying to communicate, human listeners are faced with uncertainty. Novice
listeners—children—face a continuous speech stream filled with unknown words referring to
unformed concepts. Even seasoned listeners—adults—contend with noise, variable
pronunciation, ambiguous meanings, and the occasional unknown word, too. Fortunately,
listeners bring sensitive phonetic, syntactic, and semantic skills to the task, allowing them to
reduce ambiguity during conversations and over developmental time. Most of these
well-documented skills are concerned with the listener's understanding of the speaker's
utterance alone. But communication occurs in context: in a rich world to which language
refers. Listeners' ability to combine utterance information with context—their pragmatic
ability—may be a powerful tool in resolving referential ambiguity and learning about the
concepts language describes.

One potential pragmatic tool for reducing referential uncertainty is contrastive inference. Contrastive inferences are those inferences that derive from the principle that description should discriminate. This principle falls out of the more general Gricean maxim that speakers should say as much as they need to say and no more (Grice, 1975). To the extent that communicators strive to be minimal and informative, description should discriminate between the referent and some relevant contrasting set. This contrastive inference is fairly obvious from some types of description, such as some postnominal modifiers: "The door with the lock" clearly implies a contrasting door without one (Ni, 1996; Sedivy, 2002, 2003). The degree of contrast implied by more common descriptive forms, such as prenominal adjectives in English, is less clear. Speakers do not always use prenominal adjectives contrastively, often describing more than is needed to establish reference (Engelhardt, Bailey, & Ferreira, 2006; Mangold & Pobel, 1988; Pechmann, 1989). How, then, do listeners interpret these descriptions?

Sedivy and colleagues carried out a visual world task demonstrating that adults 51 interpret at least some prenominal adjective use as contrastive (Sedivy, K. Tanenhaus, 52 Chambers, & Carlson, 1999). In their task, four objects appeared on a screen: a target (e.g., 53 a tall cup), a contrastive pair (e.g., a short cup), a competitor that shares the target's feature but not category (e.g., a tall pitcher), and an irrelevant distractor. Participants then heard a referential expression: "Pick up the tall cup." Adults looked more quickly to the correct object when the utterance referred to an object with a same-category contrastive pair 57 (tall cup vs. short cup) than when it referred to an object without a contrastive pair (e.g., the tall pitcher). Their results suggest that listeners expect speakers to use prenominal description when they are distinguishing between potential referents of the same type, and listeners use this inference to rapidly allocate their attention to the target as an utterance progresses. This kind of inference can be derived from a rational speaker framework in which listeners reason that speakers using an utterance with a description, rather than one without, chose to do so to make a useful contribution to listener understanding (Frank & Goodman, 2012). This effect was demonstrated for size and material adjectives; the results for color adjectives were mixed (Sedivy, 2003; Sedivy et al., 1999). More recently, this contrastive processing effect was replicated with 5-year-old participants using size adjectives (Huang & Snedeker, 2008). These experiments demonstrate that listeners interpret at least some prenominal adjectives contrastively, and use this contrastive inference to guide their 69 attention allocation. These results leave open, however, whether listeners use prenominal adjective contrast to resolve referential ambiguity and explicitly guide their referent choice. 71

Beyond contrasting a referent with other objects in the environment, description may
draw a contrast between a referent and its category. In production studies, participants tend
to describe atypical features more than they describe typical ones (Mitchell, Reiter, &
Deemter, 2013; Rubio-Fernández, 2016; Westerbeek, Koolen, & Maes, 2015). For instance,
they almost always include a color descriptor when referring to a blue banana, but not when
referring to a yellow one. This, too, can be derived from a rational model of speaker

behavior, but one with graded semantics in which the utterance 'banana' fits a yellow
banana better than a blue one (Degen, Hawkins, Graf, Kreiss, & Goodman, 2019). How do

listeners interpret such adjective use? Suppose someone hears a referring expression to an

unfamiliar object: "Look at that red sprocket." In order to determine whether 'red' was used

in contrast to other objects in the environment or to the referent's category, a rational

listener must integrate contextual information. If there are many sprockets of different colors

around, 'red' was likely used to pick out an individual sprocket. If not, it may have been

used to mark the abnormality of this sprocket—perhaps it is rare for sprockets to be red. In

this way, it is possible for listeners to make inferences about the category of a novel referent

using descriptive contrast.

In this paper, we present a series of experiments to test whether and how listeners 88 make inferences about novel referents using descriptive contrast. First, we examine whether 89 listeners use descriptive contrast to resolve referential ambiguity. In a reference game, participants see groups of novel objects and are asked to pick one with a referring expression, e.g., "Find the blue toma." If participants interpret description contrastively, they should 92 infer that the description was necessary to identify the referent—that the blue toma contrasts 93 with some other-colored toma in the array. Second, we test whether listeners use descriptive contrast to make inferences about a novel object's category. Participants are presented with two interlocutors who exchange objects using referring expressions, such as "Pass me the blue toma." If participants interpret description as contrasting with an object's category, they should infer that in general, few tomas are blue. However, context should matter in these judgments: if the descriptor was necessary to identify the referent, an inference of contrast with the category is unwarranted. 100

In order to determine whether adults can use prenominal adjective contrast to
disambiguate referents, and how those inferences are affected by adjective type, we use a
reference game with novel objects. Novel objects provide both a useful experimental tool and

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an especially interesting testing ground for contrastive inferences. These objects avoid effects 104 of typicality and familiarity that relate to level of description in production (Pechmann, 105 1989; Rubio-Fernández, 2016) on particular features (Mangold & Pobel, 1988). They have 106 unknown names and feature distributions, creating the ambiguity necessary for our test of 107 referential disambiguation. But the ability to disambiguate novel referents, or to establish 108 reference with incomplete information, is also the broader problem of learning about the 109 world. This skill would aid not only adult speakers dealing with ambiguous or degraded 110 communicative signal, but also children who need to establish new word-referent mappings. 111 Across the developmental span, contrastive inference could help listeners exploit regularities 112 in language and their environment to learn about both. 113

# Experiment 1

In Experiment 1, we test whether adult participants use prenominal adjective contrast 115 to choose a novel referent. To examine whether contrast occurs across adjective types, we 116 test participants in two conditions: color contrast and size contrast. In a task similar to that 117 of Sedivy and colleagues (1999), we present participants with arrays of novel fruit objects. 118 On critical trials, participants see a target object, a lure object that shares the target's 119 contrast feature but not its shape, and a contrastive pair that shares the target's shape but 120 not its contrast feature. Participants hear an utterance denoting the feature: "Find the 121 [blue/big] dax." For the target object, use of the adjective is necessary to disambiguate from 122 the same-shape distractor; for the lure, the adjective would be superfluous description. If participants use contrastive inference to choose novel referents, they should choose the target object. However, we do not expect listeners to treat color and size equally. Because color is 125 often used redundantly in English while size is not (Nadig & Sedivy, 2002; Pechmann, 1989), 126 we expect size to hold more contrastive weight, encouraging a more consistent contrastive 127 inference. 128

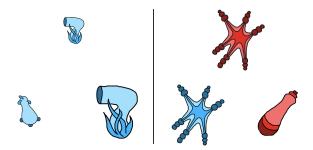


Figure 1. On the left: an example of a contrastive trial in which the critical feature is size. Here, the participant would hear the instruction "Find the small dax." On the right: an example of a contrastive trial in which the critical feature is color. Here, the participant would hear the instruction "Find the red dax." In both cases, the target is the top object.

#### 29 Method

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Participants. 300 participants were recruited from Amazon Mechanical Turk. participants were assigned to a condition in which the critical feature was color (stimuli contrasted on color), and participants were assigned to a condition in which the critical feature was size.

Stimulus displays were arrays of three novel fruit objects. Fruits were 134 chosen randomly at each trial from 25 fruit kinds. Ten of the 25 fruit drawings were adapted 135 and redrawn from Kanwisher, Woods, Iacoboni, and Mazziotta (1997); we designed the 136 remaining 15 fruit kinds. Each fruit kind has an instance in each of four colors (red, blue, 137 green, or purple) and two sizes (big or small). There were two display types: unique target 138 displays and contrastive displays. Unique target displays contain a target object that has a unique shape and is unique on the trial's critical feature (color or size), and two distractor objects that match each other's (but not the target's) shape and critical feature. Contrastive displays contain a target, its contrastive pair (matches the target's shape but not critical feature), and a lure (matches the target's critical feature but not shape). The positions of 143 the target and distractor items were randomized within a triad configuration.

Design and Procedure. Participants were told they would play a game in which
they would search for strange alien fruits. Each participant saw eight trials. Half of the trials
were unique target displays and half were contrastive displays. Crossed with display type,
half of trials had audio instructions that described the critical feature of the target ("Find
the [blue/big] dax"), and half of trials had audio instructions with no adjective description
("Find the dax"). A name was randomly chosen at each trial from a list of eight nonce
names: blicket, wug, toma, gade, sprock, koba, zorp, and lomet.

## 152 Results

We first confirmed that participants understood the task by analyzing performance on 153 trials in which there was a target unique on both shape and the relevant adjective. We asked 154 whether participants chose the target more often than expected by chance (33%) by fitting a 155 mixed effects logistic regression with an intercept term, a random effect of subject, and an 156 offset of logit(1/3) to set chance probability to the correct level. The intercept term was 157 reliably different from zero for both color ( $\beta=$  , t= , p ) and size ( $\beta=$  , t= , p ). In 158 addition, participants were more likely to select the target when an adjective was provided in 159 the audio instruction in both conditions. We confirmed this effect statistically by fitting a 160 mixed effects logistic regression predicting target selection from condition, adjective use, and 161 their interaction with random effects of participants. Adjective type (color vs. size) was not 162 statistically related to target choice ( $\beta = p$ , p = 1), and adjective description in the audio 163 increased target choice ( $\beta=$  , t= , p ). The two effects did not interact ( $\beta=$  , t= , p= ). Participants had a general tendency to choose the target in unique target trials, which was 165 amplified if the audio instruction contained the relevant contrast adjective. 166

Our key test was whether participants would choose the target object on contrastive trials in which description was given, reflecting use of a contrastive inference to choose a novel referent. To do this, we compare participants' rate of choosing the target to their rate of choosing the lure, which shares the relevant contrast feature with the target, when the

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audio described the contrast feature. Participants chose the target more than the lure in the 171 size condition ( $\beta =$ , t =, p =). However, participants in the color condition did not choose 172 the target significantly more often than they chose the lure ( $\beta=$  , t= , p= ). On contrastive 173 trials in which a descriptor was not given, participants dispreferred the target, instead 174 choosing the lure object, which matched the target on the descriptor but had a unique shape; 175 this was true across color ( $\beta = 1$ , t = 1, p = 1) and size ( $\beta = 1$ , t = 1, p = 1) conditions. Adjective 176 use therefore increased target choice ( $\beta=$  , t= , p ) across contrastive trials. Participants' 177 choice of the target in the size condition was therefore not due to a prior preference for the 178 target in contrastive displays, but relied on contrastive interpretation of the adjective. 179

# Experiment 2

In our first experiment, we examined whether adult listeners would interpret 181 description as implying contrast with other present objects. However, as discussed earlier, 182 description can imply contrast with sets other than the set of currently available referents. 183 One of these alternative sets is the referent's category. Work by Mitchell et al. (2013) and 184 Westerbeek et al. (2015) demonstrates that speakers use more description when referring to 185 objects with atypical features (e.g., a yellow tomato) than typical ones (e.g., a red tomato). 186 This marking of atypical objects potentially supplies useful information to listeners: they 187 have the opportunity to not only learn about the object at hand, but also about its broader category. In the following experiment, we test whether listeners use this type of contrast to 189 learn about unfamiliar objects' categories.

If listeners do use this type of contrast, it may not be as simple as judging that an over-described referent is atypical. Description can serve many purposes. In the prior experiment, we investigated its use in contrasting between present objects. If a descriptor was needed to distinguish between two present objects, it likely was not used to mark atypicality. We therefore manipulate the context of the objects around the referent to see whether listeners adjust their inferences accordingly.

# $_{197}$ Method

Participants. Two hundred and forty participants were recruited from Amazon
Mechanical Turk. One hundred and twenty participants were assigned to a condition in
which the critical feature was color (red, blue, purple, or green), and 120 participants were
assigned to a condition in which the critical feature was size (small or big).

Stimuli & Procedure. Stimulus displays showed two alien interlocutors, one on the left (Alien A) and one on the right (Alien B) side of the screen, each with two novel fruit objects beneath them. Alien A, in a speech bubble, asked Alien B for one of its fruits (e.g., "Hey, pass me the red gade.") Alien B replied, "Here you go!" and the referent disappeared from Alien B's side and reappeared on Alien A's side.

Two factors, presence of the critical adjective in the referring expression and object 207 context, were fully crossed within subjects. Object context had three levels: within-category 208 contrast, between-category contrast, and same feature. In the within-category contrast 209 condition (hereafter abbreviated as "contrast"), Alien B possessed the target object and 210 another object of the same shape, but with a different value of the critical feature (color or 211 size). In the between-category contrast condition (abbreviated as "different"), Alien B 212 possessed the target object and another object of a different shape, and with a different value 213 of the critical feature. In the same feature condition (abbreviated as "same"), Alien B 214 possessed the target object and another object of a different shape but with the same value 215 of the critical feature as the target. Thus, in the within-category contrast condition, the 216 descriptor is necessary to distinguish the referent; in the between-category contrast condition 217 it is unnecessary but potentially helpful; and in the same feature condition it is unnecessary 218 and unhelpful. We manipulated the critical feature type (color or size) between subjects. 219

Participants performed six trials. After each exchange between the alien interlocutors, they made a judgment about the prevalence of the target's critical feature in the target object's category. For instance, after seeing a red blicket being exchanged, participants would be asked, "On this planet, what percentage of blickets do you think are red?" and
answer on a sliding scale between zero and 100. In the size condition, participants were
asked, "On this planet, what percentage of blickets do you think are the size shown below?"
with an image of the target object they just saw available on the screen.

After completing the study, participants were asked to select which of a set of alien words they had seen previously during the study. Four were words they had seen, and four were novel lure words. Participants were dropped from further analysis if they did not respond to at least 6 of these 8 correctly (above chance performance as indicated by a one-tailed binomial test at the p = .05 level). This resulted in excluding XX participants, leaving XX for further analysis.

# 233 Results

We first analyzed participants' judgments of the prevalence of the target object's 234 critical feature in its category. We began by fitting a maximum mixed-effects linear model: 235 effects utterance type (adjective or no adjective), context type (contrast, different, or same), 236 and critical feature (color or size) as well as all interactions and random slopes of utterance 237 type and context type nested within subject. Random effects were removed until the model 238 converged, and fixed effects were removed if they did not improve model fit. The final model 239 revealed significant effects of utterance type ( $\beta_{adjective} = , t = , p$ ), critical feature ( $\beta_{size} = , t = , p$ ) 240  $t=\,,\,p$  ) and a marginally lower prevalence for same search type relative to contrast search 241 type ( $\beta_{same} = 1$ , t = 1, p = 1). Prevalence judgments for different trials was not reliably 242 different from contrast trials ( $\beta_{different} = 1$ , t = 1, p = 1). Participants robustly inferred that described features were less prevalent in the target's category than unmentioned features. This atypicality inference was marginally stronger for trials on which the distractor had the same feature as the target, making the descriptor particularly unhelpful, than on trials in which the descriptor was necessary to distinguish between two objects of the same type. 247 Overall, however, participants failed to substantially adjust their inferences according to the 248

context of the referring expression.

Thus, participants treated all adjectives as marked, and inferred lower typicality, 250 regardless of whether they could felicitiously be interpreted as contrasting between potential target referents. But were participants nonetheless sensitive to this information in their 252 response times? We investigated this question by analyzing participants' time to advance 253 after seeing the aliens' referential exchange. Though this task was not speeded, we 254 hypothesized that participants would advance more quickly after seeing referential exchanges 255 that were easier to process. After dropping all response times less than 1 second and longer 256 than 10 seconds, and log transforming them because of the right skew in response time data, 257 we predicted participants' time to advance on each trial of the experiment from utterance 258 type, context type, critical adjective type, and the interaction between utterance type and 259 context type (log(rt)  $\sim$  adjective \* search + type + (1 |subj)). This model 260 showed a reliable effect of utterance type ( $\beta_{adjective} = 1$ , t = 1, p)-participants were faster 261 when an a descriptor was provided despite having to process an additional word. There was 262 no main effect of critical adjective type ( $\beta_{size} =$ , t =, p =), nor context type ( $\beta_{different} =$ , 263 t=, p=;  $\beta_{same}=$ , t=, p=), but the interactions between utterance type and context 264 type trended towards significance for both non-contrast searches ( $\beta_{adjective*different} =$  , t = , 265  $p = \beta_{adjecgive*same} = t = 1$ . Directionally, these results indicate that participants 266 took longer to process utterances which were under-described (contrast trials with no adjective) than those with appropriately no description, and processed trials with an appropriate level of description (contrast trials with an adjective) more quickly than those 269 with superfluous description.

#### Discussion

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#### Experiment 3

In Experiments 1 and 2, we established that people can use contrastive inferences to resolve referential ambiguity and to make inferences about the feature distribution of a novel

category. Additionally, in Experiment 2, we found that these two inferences do not seem to
trade off substantially: even if an adjective is necessary to establish reference, people infer
that it also marks atypicality. We also found that inferences of atypicality about color and
size adjectives pattern very similarly, though their baseline is shifted, while color and size are
not equally contrastive with respect to referential disambiguation.

To strengthen our findings in a way that would allow us to better detect potential
differences between color and size or trade-offs between these two types of inference, here we
replicate Experiment 2 in a larger sample of participants. . . . [ some explanation of why the
new control condition is interesting as well . . . ]

#### 284 Method

Participants. Four hundred participants were recruited from Amazon Mechanical
Turk. Two hundred were assigned to a condition in which the critical feature was color (red,
blue, purple, or green), and 200 participants were assigned to a condition in which the
critical feature was size (small or big).

Stimuli & Procedure. Stimulus displays showed two alien interlocutors, one on the left (Alien A) and one on the right (Alien B) side of the screen, each with two novel fruit objects beneath them. Alien A, in a speech bubble, asked Alien B for one of its fruits (e.g., "Hey, pass me the red gade.") Alien B replied, "Here you go!" and the referent disappeared from Alien B's side and reappeared on Alien A's side.

Two factors, presence of the critical adjective in the referring expression and object context, were fully crossed within subjects. Object context had two levels: within-category contrast and between-category contrast. In the within-category contrast condition (hereafter abbreviated as "contrast"), Alien B possessed the target object and another object of the same shape, but with a different value of the critical feature (color or size). In the between-category contrast condition (abbreviated as "different"), Alien B possessed the

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critical feature. Thus, in the within-category contrast condition, the descriptor is necessary
to distinguish the referent; in the between-category contrast condition it is unnecessary but
potentially helpful. We manipulated the critical feature type (color or size) between subjects.

Participants performed six trials. After each exchange between the alien interlocutors,
they made a judgment about the prevalence of the target's critical feature in the target
object's category. For instance, after seeing a red blicket being exchanged, participants
would be asked, "On this planet, what percentage of blickets do you think are the color
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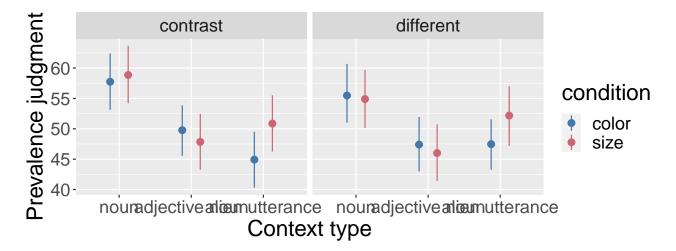


Figure 2. The proportion of the novel category participants judged to have the feature of the target object, by condition. The left panel shows judgments on trials in which no adjective was used in the referring expression (e.g., 'Pass me the blicket'), and the right panel shows judgments on trials in which an adjective was used (e.g., 'Pass me the [purple/small] blicket'). This is crossed by the type of object context (contrast, different, same) on the x-axis.

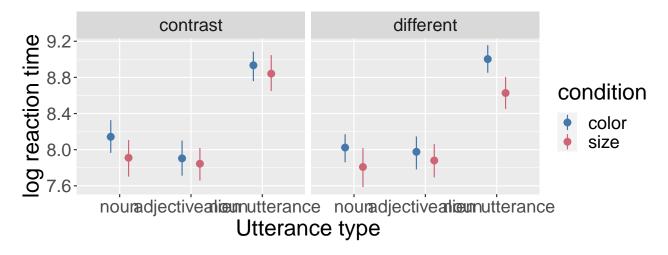


Figure 3. The log reaction time participants took to advance after seeing the referential exchange, by condition.

type ( $\beta_{same} = 1$ , t = 1, p = 1). Prevalence judgments for different trials was not reliably 325 different from contrast trials ( $\beta_{different} = 1$ , t = 1, p = 1). Participants robustly inferred that 326 described features were less prevalent in the target's category than unmentioned features. 327 This atypicality inference was marginally stronger for trials on which the distractor had the 328 same feature as the target, making the descriptor particularly unhelpful, than on trials in 329 which the descriptor was necessary to distinguish between two objects of the same type. 330 Overall, however, participants failed to substantially adjust their inferences according to the 331 context of the referring expression. 332

Thus, participants treated all adjectives as marked, and inferred lower typicality, 333 regardless of whether they could felicitiously be interpreted as contrasting between potential 334 target referents. But were participants nonetheless sensitive to this information in their 335 response times? We investigated this question by analyzing participants' time to advance 336 after seeing the aliens' referential exchange. Though this task was not speeded, we 337 hypothesized that participants would advance more quickly after seeing referential exchanges 338 that were easier to process. After dropping all response times less than 1 second and longer 339 than 10 seconds, and log transforming them because of the right skew in response time data, 340 we predicted participants' time to advance on each trial of the experiment from utterance 341 type, context type, critical adjective type, and the interaction between utterance type and context type (log(rt)  $\sim$  adjective \* search + type + (1 |subj)). This model 343 showed a reliable effect of utterance type ( $\beta_{adjective} = 1$ , t = 1, p)-participants were faster 344 when an a descriptor was provided despite having to process an additional word. There was 345 no main effect of critical adjective type ( $\beta_{size} = 1$ , t = 1, p = 1), nor context type ( $\beta_{different} = 1$ , t=, p=;  $\beta_{same}=$ , t=, p=), but the interactions between utterance type and context type trended towards significance for both non-contrast searches ( $\beta_{adjective*different} = , t = ,$ p=;  $\beta_{adjecgive*same}=$ , t=, p=). Directionally, these results indicate that participants 349 took longer to process utterances which were under-described (contrast trials with no 350 adjective) than those with appropriately no description, and processed trials with an 351

appropriate level of description (contrast trials with an adjective) more quickly than those with superfluous description.

Model Model

To formalize the inference that participants were asked to make, we developed a model 355 in the Rational Speech Act Framework (RSA, Frank & Goodman, 2012). In this framework, 356 pragmatic listeners (L) are modeled as drawing inferences about speakers' (S)357 communicative intentions in talking to a hypothetical literal listener ( $L_0$ . This literal listener 358 makes no pragmatic inferences at all, evaluating the literal truth conditions of statements, 359 and chooses randomly among all referents consistent with a statement (e.g. it is true that a 360 red toma can be called "toma" and "red toma" but not "blue toma"). In planning their 361 referential expressions, speakers choose utterances that are successful at accomplishing two 362 goals: (1) Making the listener as likely as possible to select the correct object, and (2) 363 minimizing their communicative cost (i.e. producing as few words as possible). Pragmatic 364 listeners use Bayes' rule to invert the speaker's utility function, essentially inferring what the 365 speaker's intention was likely to be given the utterance they produced.

Lit =

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Speaker =

L =

This computation naturally predicts a number of phenomena in pragmatics. For example,
RSA explains scalar implicature—listeners treat "I ate some of the cookies" as a poor
description of a case where the speaker at all of the cookies. The speaker's statement is
literally true—the speaker eating some of the cookies is consistent with a world in which they
ate all of then. However, this statement is ambiguous—it is true of both the world in which

some cookies remain and the world in which there are no cookies left. Thus, if the speaker 373 intends to convey that they are all of the cookies, saying "I are some of the cookies" will 374 cause the literal listener to guess the wrong world half of the time. In contrast, the 375 statement "I at all of the cookies" is consistent only with world in which all of the cookies 376 were eaten. Thus, if the speaker ate all of the cookies, this statement would accomplish their 377 goal of communicating the state of the world more effectively. Scalar implicature arises from 378 exact this inference: If the speaker actually ate all of the cookies, they should have said "I 379 ate all of the cookies" because that would be a better utterance than "I ate some of the 380 cookies." Since they produced "some," it is more likely that they wanted to communicate 381 about the other possible world (Frank & Goodman, 2012). 382

Extensions of this framework have successfully accounted for a variety of other
pragmatic inferences, including inference that speech is hyperbolic (e.g. waiting "a million
years" means waiting a long time), inferring when speakers are being polite rather than
truthful, and learning new words in ambiguous contexts (???; ???; ???; ???). Further, a
recent extension of the framework using continuous rather than discrete semantics has given
an account of the kinds of differences between color and size modification that we observed
in our experimental data (???).

To allow the Rational Speech Act Framework to capture inferences about typicality, we modified the Speaker's utility function to have an additional term: The cost of referring to atypical object with a bare noun. This cost could arise from two possible sources. One possibility is that speakers are motivated to help listeners to select the correct referent not just eventually but as quickly as possible. In this case, they should prefer not to produce bare nouns (e.g. "bird") to refer to atypical examples of that category (e.g. "penguin"). This is roughly the kind of inference encoded in (???)'s continuous semantics Rational Speech Act model. Alternatively, the cost may arise from difficulty of lexical access: In order to refer to an object, speakers need to retrieve the linguistic label appropriate. The difficulty of

retrieving a lexical label may be proportional to how difficult it is [CITE?]. We are agnostic about whether this cost comes from speaker or listener design, and it makes no difference for the model's predictions. BETA DISTRIBUTION SIZE PRINCIPLE (???).

Listeners draw inferences about speakers as in regular RSA, but now need to figure out
whether an adjective was caused by this retrieval term, or reference, or both.

404 Discussion

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In this series of experiments, we asked whether listeners could use pragmatic contrast to resolve referential ambiguity and make inferences about a referent's category. In our first experiment, participants were able to use size adjectives contrastively to establish a novel word-referent mapping. Their contrastive inference goes beyond the implicit attention allocation shown in prior eye-tracking paradigms (Huang & Snedeker, 2008; Sedivy et al., 1999), determining explicit referent choice. This finding bolsters contrastive inference as a viable tool for referential disambiguation. In our second experiment, participants interpreted size and color adjectives contrastively to make inferences about a novel referent's category.

Participants failed, however, to use color adjectives contrastively in choosing referents. 413 What makes size different from color? One possibility is that the scalar nature of size supports a contrastive interpretation. We tested whether using relative color adjectives (e.g., 415 bluer, greyer) or adjectives describing value (bright, dark) on saturated and desaturated stimuli would encourage the contrastive inference. We also tested whether adding a prosodic cue to contrast (e.g., "Find the blue dax") would encourage contrastive inference. 418 Participants persisted in interpreting color non-contrastively, never consistently choosing the 419 intended target over the lure. Though we do not claim that contrastive color inferences 420 cannot be used to explicitly choose referents, it seems that a contrastive interpretation is 421 difficult to elicit using color, while it emerges under similar conditions using size. 422

Another possibility is that color adjectives are often used redundantly, and therefore

receive less contrastive weight than adjectives consistently used to differentiate between referents. Sedivy (2003) puts forth such an account, finding that color adjectives tend not to 425 be interpreted contrastively in eye-tracking measures except in contexts that make their use 426 unlikely. In comparison, adjectives describing material (e.g., plastic) and size are interpreted 427 contrastively, which corresponds to less redundant use of material and size adjectives in 428 production (Sedivy, 2003; see Chapter 10 of Gibson & Pearlmutter, 2011). This account 429 explains well why color is not interpreted contrastively here, but fails to explain why 430 presumably rare adjectives (bluer, bright) do not receive contrastive treatment in our task. 431 Further work is necessary to determine whether contrastive inferences hew to production 432 norms, and whether implicit indications of contrast usually extend to explicit referent choice. 433

Description is not limited to conveying contrast between present objects: it can also 434 convey contrast with an object's category. In Experiment 3, we tested whether listeners 435 inferred that a described feature of a novel object was atypical of its category, and how this 436 inference was affected by the distractor objects present. We find that listeners infer 437 atypicality from use of descriptors. However, they do not reserve this inference for cases of 438 over-description alone: listeners inferred atypicality of a described feature even when the 439 descriptor was necessary to establish reference. Listeners, then, seem not to rationally weigh 440 the potential contrasts intended by the listener and trade off between them. Rather, participants' behavior in this task is better described by a coarse heuristic: use of description 442 implies atypicality in relation to the category. Despite not being very sensitive to the 443 referential context in their overt judgments, participants in our third experiment did show 444 facilitation from contrast in processing. Directionally, participants advanced more quickly on trials in which a descriptor was used and was necessary to establish reference than on trials when a supplied descriptor was unnecessary. Overall, our results suggest that the atypicality inference is robust to the point of being difficult to suppress: it is not discounted, even when a descriptor is needed to distinguish between present objects. Participants do trend toward 449 showing effects of the object context in their reaction times, but this processing effect does 450

not consistently extend to overt judgments about the target's category.

Though the participants in our experiments were adults, the ability to disambiguate 452 novel referents using contrast most obviously serves budding language learners: children. 453 Contrastive use of adjectives is a pragmatic regularity in language that children could 454 potentially exploit to establish word-referent mappings. Tasks using a mixture of novel 455 adjectives and words suggest that children as young as 3 can make contrastive inferences 456 about adjectives (Diesendruck, Hall, & Graham, 2006; Gelman & Markman, 1985; Huang & 457 Snedeker, 2008). We plan to research further the development of these contrastive skills, as 458 well as their potential as tools for extracting information from language and context. 450

### #Conclusion

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Taken together, these experiments show that people use contrastive inference to map 461 novel words to novel referents and to make inferences about the typicality of novel referents' 462 features. Hearing "small toma" allows people to narrow possible referents not only to small 463 objects, but objects with larger counterparts nearby. Hearing "big toma" in a referential context leads them to think that most tomas are not that size. However, these two abilities 465 do not appear to interact. A referential felicitous use of description does not block an 466 inference of atypicality. These results do not yet provide an explanation of why these skills do not interact: the inference may be too complex, the stimuli too novel, or listeners may use contrast more heuristically than rational models of pragmatic inference assume (Frank & Goodman, 2012). Understanding the origins of these independent but non-interpendent inferential abilities, as well as asymmetries between comprehension and production and adjectives like color and size, will be an important next challenge in our development of 472 theories of human pragmatic inference.

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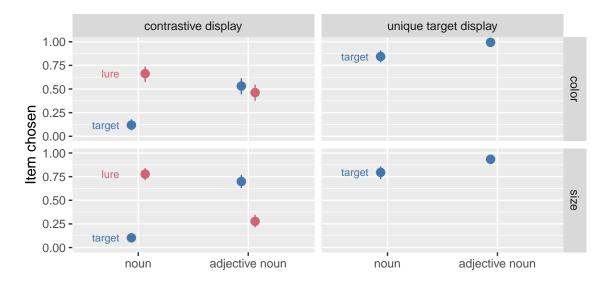


Figure 4. Proportion of times that participants chose the target and lure items as a function of condition and whether an adjective was provided. Points indicate group means; error bars indicate 95% confidence intervals computed by non-parametric bootstrapping.