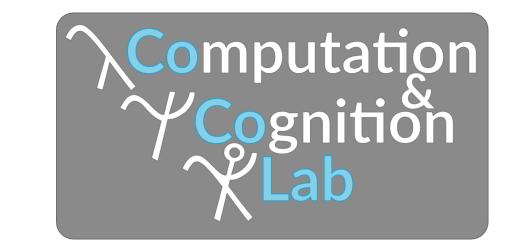


A cost- and information-based account of epistemic must

Judith Degen, Justine T. Kao, Gregory Scontras & Noah D. Goodman

Department of Psychology, Stanford University



Introduction

How do we communicate about beliefs, together with the evidence we use to form them? A case study: *must*

Must is strong, yet surprisingly weak

Compare: "It must be raining" vs. "It is raining"

Since Karttunen's (1972) *must* is weak mantra, four decades of semanticists cannot agree on the meaning of *must*; but *must* communicates more than strength

Evidentials in language: Why would you say so?

Consider: (standing in rain) "It must be raining"

Must q requires/signals weak evidence for q (von Fintel & Gillies; Lassiter; Matthewson, 2014)

Our account: M(arkedness)-implicature

The bare form conveys q, so listeners take marked must q to convey a marked meaning: the speaker arrived at q via an evidentially less certain route

We examine speaker & listener behavior as they relate to evidence strength, then implement a formal model of both within the Rational Speech-Act framework

Experiment 1 (n=40): Evidence strength

Rate probability of q (e.g., rain) given evidence (e.g., You see that it's raining), for 20 pieces of evidence (Fig. 1)

Strength estimates used in subsequent analyses

Experiment 2 (n=40): Utterance choice

How likely are speakers to use the marked *must p* utterance as evidence strength decreases?

Given a piece of evidence for q, then asked to **choose** one of four **utterances** to tell friend about the situation

- bare q, must q, probably q, might q -

Participants were more likely to choose the more marked *must q* form over the bare form as the strength of evidence decreased (Fig. 2; β =5.4, SE=2.4, p<.05)

Empirical results/model predictions

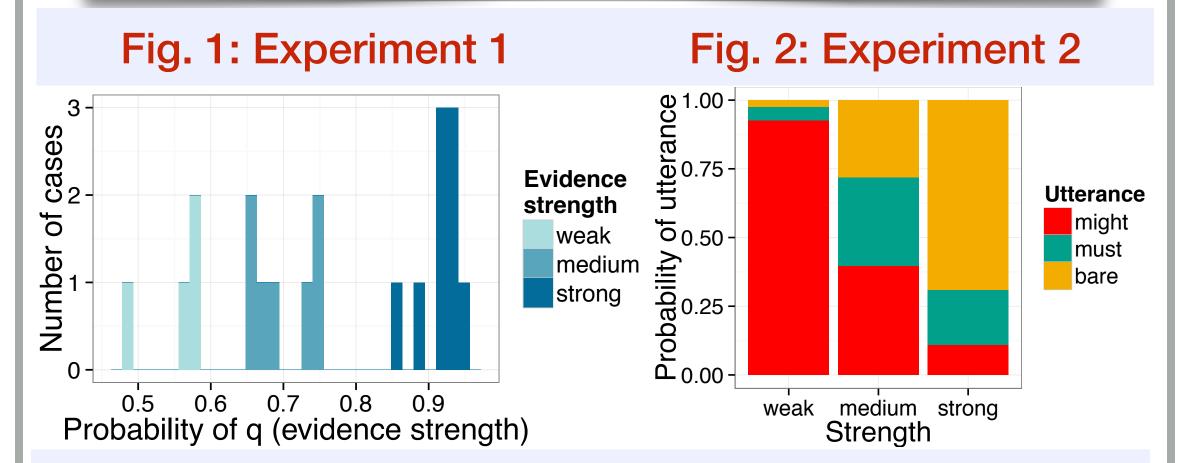


Fig. 3: Experiments 3a & 3b (inferred evidence strength)

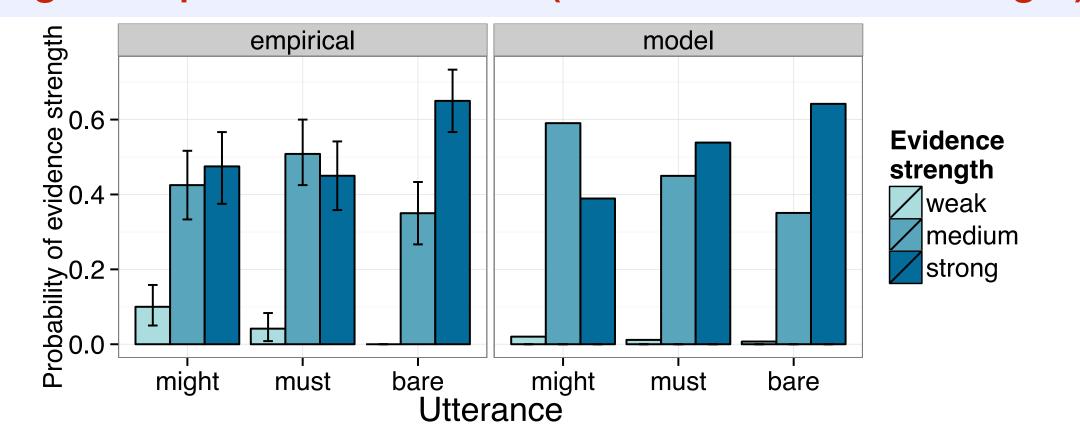
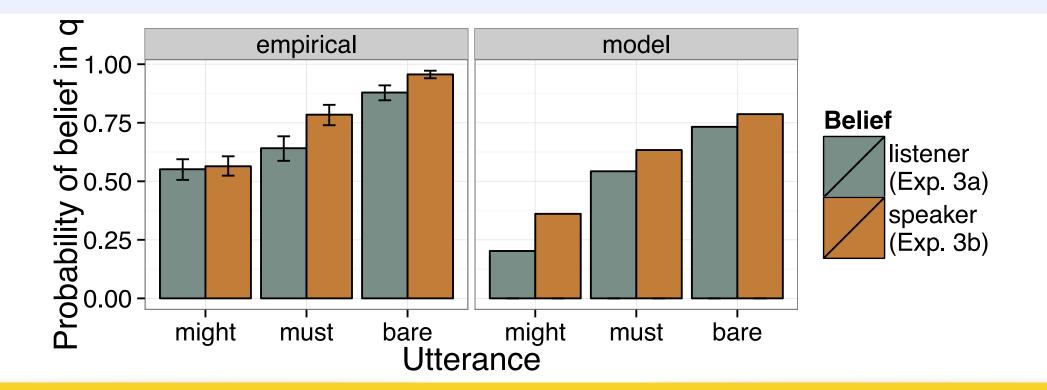


Fig. 4: Exps 3a & 3b (inferred degree of belief in q)



Exp. 3a (n=120): Utterance interpretation

How do listeners' beliefs about *q* and the strength of speakers' evidence for *q* depend on the utterance?

Given an utterance, then asked a) to **rate** the probability of *q*; and b) to select one out of five pieces of **evidence** that the speaker most likely had about *q*

Evidence strength lower after must q than after bare q (Fig. 3; β =-.08, SE=.01, t=-6.8, p<.0001)

Belief in q weaker after must q than after bare q (Fig. 4; $\beta = -.21$, SE = .02, t = -10.1, p < .0001)

Exp. 3b (n=60): Inferring speaker belief

How do listeners' beliefs about speakers' beliefs about *q* depend on the utterance?

Procedure as in Exp. 3a; asked to rate speakers' belief

in q (e.g. How likely is it that John thinks it's raining?) Listeners' estimates of speakers' beliefs stronger than their own (Fig. 4; β =.07, SE=.02, t=3.74, p<.001)

Model

We present a model extension within the **Bayesian Rational Speech-Act** framework (Frank and
Goodman, 2012) using **lexical uncertainty** and **threshold semantics** (Lassiter and Goodman, 2013)

Model assumptions

- $p(q|bare) > \theta_b$, $p(q|must) > \theta_m$, p(q|might) > 0
- cost(must q) = cost(might q) > cost(q) (fit to data)
- Prior probability of q = 0.5 (uniform)
- Probability of evidence *e* given *q* (fit to data)
- Probability of speaker belief b given evidence (Exp 1)

 $L_1(q,b,\theta,e\mid u) \propto S_1(u\mid q,b,\theta,e) P(b\mid e)P(e\mid q)P(q)$

Listener infers that speaker has weaker belief given the costlier utterance *must q.* Given generative model of world state, evidence, and beliefs, listener then infers weaker evidence and lower probability of *q,* producing qualitatively similar results to those found in Exps 1 & 3

A new perspective on *must*

Weakened meaning derives straightforwardly from an M-implicature, which drives inference about evidence

References: von Fintel & Gillies (2010). *Must* ... stay ... strong! *Natural Language Semantics, 18*. Karttunen (1972). *Possible* and *must*. In *Syntax and Semantics*. Frank & Goodman (2012). Predicting pragmatic reasoning in language games. *Science, 336.* Lassiter (2014) The weakness of *must*. In *Proceedings of SALT 24*. Lassiter & Goodman (2013). Context, scale structure, and statistics in the interpretation of positive-form adjectives. In *Proceedings of SALT 23*. Matthewson (in press). Evidential restrictions on epistemic indefinites. In *Epistemic Indefinites*.

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