# Children's developing capacity to calibrate the verbal testimony of others with observed evidence when learning causal relations

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## Highlights

- We tested the ability to calibrate verbal testimony with observable causal data.
- S1: 5-year-olds learned better from a certain claim about deterministic data.
- S2: 5-year-olds learned better from an uncertain claim about probabilistic data.
- Greater learning in S2 only emerged when the uncertain claim was accurate.
- The capacity to learn efficiently from distinct sources emerges by age 5.

## Abstract

Across two studies (N = 120), we explored the development of children's ability to calibrate the certainty of informant testimony with observable data that varied in the degree of predictive causal accuracy. In Study 1, four- and 5-year-olds heard a certain or uncertain explanation about deterministic causal relations. Five-year-olds learned better when the informant provided a certain, more calibrated explanation. In Study 2, children heard similar explanations about probabilistic relations, making the uncertain informant more calibrated. In an advance on previous calibration research, 5-year-olds learned better from an uncertain informant, but only when the explanation was attuned to the stochasticity of the data. These findings imply that the capacity to integrate, and learn efficiently from, distinct sources of knowledge emerges in the preschool years.

Keywords: Certainty, accuracy, testimony, calibration, causal learning, social learning

# Children's developing capacity to calibrate the verbal testimony of others with observed evidence when learning causal relations

To acquire everyday knowledge about the world, children must discover the underlying causal structure amongst events. Over the last twenty years, there has been renewed interest in causal learning and discovery (e.g., Gopnik & Wellman, 2012). A fundamental question is how children acquire such knowledge. Much of the research in this field has focused on describing the ways in which children recover causal structure from observation and interaction with the world (e.g., Bonawitz, van Schijndel, Friel, & Schulz, 2012; Griffiths, Sobel, Tenenbaum, & Gopnik, 2011). This research has indicated that the ability to learn about underlying causal relations about observed events and to apply that knowledge to reason about the world emerges early in development (e.g., Gopnik & Sobel, 2000; Kushnir & Gopnik, 2005).

During the same timeframe, there has been a large literature documenting children's social learning – the ways in which children acquire knowledge from their interactions with other people. Verbal testimony, defined as the communication of a credible claim (Harris & Koenig, 2006), is an important vehicle for the acquisition of abstract concepts across core domains of knowledge (Callanan & Oakes, 1992; Gelman, 2009; Harris, Pasquini, Duke, Asscher, & Pons, 2006). For example, conversations with more expert others can act as epistemic tools for children's exploration, knowledge construction, and long-term learning outcomes in the domain of science (Rowe, 2012; Kurkul & Corriveau, 2017; Tenenbaum, Snow, Roach & Kurland, 2005). In the current study, we explore the role of verbal testimony of others, as well as observed evidence, on children's ability to make inferences about the causal efficacy of objects.

Although causal learning is possible from first-hand observation alone, the acquisition of causal knowledge must be facilitated by collaborative exchanges with others in order for children

to appreciate the multifaceted structures in their physical and cultural environments (Legare, Sobel & Callanan, 2017). For example, young children actively seek out causal explanations from their parents (Callanan & Oakes, 1992; Frazier, Gelman, & Wellman, 2009). Moreover, variation in the features of adult-child interactions is related to children's interpretation of observed data (Fender & Crowley, 2007; Luce, Callanan, & Smilovic, 2013), their assessment of causal interventions (Kushnir, Wellman, & Gelman, 2008) and the scope of their subsequent exploration (Bonawitz et al., 2011). This has led some researchers to argue that children use the same learning mechanisms to make both causal inferences and inferences about others' epistemic competence (Sobel & Kushnir, 2013). An open question is how well children can integrate the way others generate verbal testimony with the causal information that is observed in real time

Indeed, previous research on testimony suggests that children are not always passive recipients of the claims of other people, but regularly gauge the epistemic competence of informants to determine their reliability as an information source (Corriveau, Meints, & Harris, 2009; Einav & Robinson, 2011). By the age of 4, children are sensitive to a variety of epistemic characteristics of a potential learning partner, and are able to track an informant's past reliability, accuracy and confidence when learning about novel words and object labels (see Harris, Koenig, Corriveau & Jaswal, 2018; Mills, 2013 for reviews). For example, Sabbagh & Baldwin (2001) found that 4-year-olds were more likely to encode novel word-referents from a speaker who conveyed they were knowledgeable about an object's label, as compared to a speaker who conveyed cues that they were ignorant. Children can integrate such social information with their own observations to make novel inferences. In a recent study, Birch, Severson, and Baimel (2020) showed that 5-year-olds prefer to learn from a certain informant who had access to knowledge about the contents of a box over a certain informant who never had access to the

box's contents (and whose verbal confidence was thus not justified). Similarly, children's false belief capacity predicts whether they appreciate that a claim someone makes about a causal relation can be false as opposed to simply believing that claim in light of data to the contrary (Sobel, 2015; Sobel et al., 2009).

Such inferences go beyond simple causal conclusions to the ways in which children integrate information they observe with information they hear from others. Young, Alibali and Kalish (2012) showed that 5- to 10-year-old children's ability to revise their hypothesis about ambiguous data is sometimes influenced by the testimony they hear from another peer. In this study, children revised their belief most often when the peer disagreed with their hypothesis initially and then generated neutral or disconfirming evidence (see also Kimura & Gopnik, 2019; Macris & Sobel, 2017). Similarly, Bridgers, Buchsbaum, Seiver, Griffiths, and Gopnik (2015) examined how 4- and 5-year-olds reasoned about an informant who provided them with information that was inconsistent with the causal evidence (the informant endorsed that one object was more likely to activate a machine, while the evidence suggested that another object was more likely to do so). Children were more likely to use an informant's testimony to guide their causal inference when the informant communicated that they were knowledgeable, as opposed to naïve, about their initial claim. Taken together, these findings suggest that young children are able to evaluate the epistemic value of informant explanations and are sensitive to cases where others generate alternate interpretations to their own observations.

None of these cases, however, consider when it is appropriate for an informant to be uncertain – in particular, registering that the hesitance of verbal testimony might indicate it is not true. Integrating the certainty with which verbal testimony is generated with the truth value of the utterance involves *calibrating* the strength of the verbal testimony with observed data. It is possible that children fail to understand such calibration. For example, Birch et al. (2020) found that even the oldest children in their sample (i.e., 8-year-olds) did not favor either of the two hesitant informants who differed in their visual access of the contents of a box. It is also possible that young children do not treat an appropriately calibrated hesitant information as more reliable than information generated more confidently. Tenney, Small, Kondrad, Jaswal, & Spellman (2011) found that 5- and 6-year-olds tended to trust a witness who provided a certain claim about event details that were both accurate and inaccurate (i.e., an informant who was certain, but their explanation was somewhat incorrect), compared to a calibrated individual who adjusted her verbal certainty based on the quality of the evidence (e.g., the informant had the same accuracy, but was more hesitant in her claims). This tendency was the same for adults who were under cognitive load.

But more generally, others' epistemic competence and the social cues they use to communicate that competence are not treated equally when children infer the reliability of verbal information. Brosseau-Liard, Cassels, & Birch (2014) found that 5-year-olds were less likely to trust confident, inaccurate speakers compared to hesitant, accurate ones. Epistemic competence similarly trumps social cues across a variety of domains (e.g., Corriveau, Kinzler & Harris, 2013; Jaswal & Neely, 2006; Vanderbourght & Jaswal, 2011, see Sobel & Finiasz, in press, for a recent metaanalysis).

One central issue that has not been addressed to date in research on children's calibration capacities is that the calibration of uncertainty can be conceptualized in two different ways. One might calibrate the stochasticity of events in the aggregate (i.e., if I toss a fair coin repeatedly, and guess the outcome each time, sometimes I will be right). Thus, verbal uncertainty represents the general probabilistic nature of being correct. Another way is to calibrate the stochasticity of the event itself (i.e., if I toss a fair coin repeatedly, sometimes it will land on heads). The Birch et al (2020) and Tenney et al. (2011) examples, as well as other investigations of children's appreciation of the probabilistic accuracy of informants (Pasquini et al., 2007), only considers the first case and not the second. Investigations of causal inference, however, (Buchanan & Sobel, 2011; Bullock, Gelman & Baillargeon, 1982) suggest that children only begin to appreciate the that events themselves can be stochastic around age 5. This suggests that between the ages of 4 and 5, children might begin to appreciate verbal testimony calibrated to individual events, even if they cannot appreciate that calibration about aggregate events.

In this paper, we explored children's developing ability to attune the confidence with which informants generate verbal testimony (i.e., the degree of verbal certainty) with the stochastic nature of the observed data described by that testimony (i.e., the likelihood of a particular outcome). We reasoned that because well-calibrated explanations place appropriate emphasis on the causal evidence at hand – for example, being confident about the likelihood that deterministic evidence will predict an outcome – children should show greater learning of novel causal relations after hearing an explanation calibrated to the observed data.

To do this, in Study 1, we manipulated the certainty with which an informant delivered testimony about deterministic causal outcomes – that is, informants generated certain or uncertain testimony describing the efficacy of cues that were 100% and 0% effective. We hypothesized that children would exhibit greater learning in the calibrated condition; when asked whether the 100% cue was more effective or the 0% cue was less effective than other, probabilistic cues, children would be more accurate when they heard calibrated testimony.

In Study 2, we replicated our certainty manipulation, but more directly tested the distinction between reasoning about cues in the aggregate as opposed to individual efficacy. In

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Study 2, children heard certain or uncertain testimony about the efficacy of probabilistic cues. Critically, two different kinds of uncertain testimony were provided. Some children heard uncertain testimony about the cues in the aggregate, similar to the Tenney et al. (2011) and Birch (2020)'s work; other children heard uncertain testimony about individual stochastic nature of the cues. We predicted that, similar to previous calibration studies, young children might not appreciate the epistemic value of uncertainty in the aggregate calibration condition. Yet, by highlighting the probabilistic nature of the data, children might understand uncertainty as it relates to the individual cues (see Study 2 for further details on the design).

In addition, across the two studies, we considered whether children's ability to calibrate the testimony to the related evidence when making causal inferences would vary across age, as suggested by the acquisition of such capacities in the findings discussed above.

## Study 1

## Method

#### **Participants**

Forty-eight 4- and 5-year-olds (24 girls, mean age = 59 months, age range = 48 - 71 months) participated in Study 1. The sample size was determined by power analysis, assuming a large effect size (Cohen's  $\omega = .5$ ; see Bridgers et al., 2015; Walker et al., 2017) and  $\alpha = .05$ , based on an  $\chi^2$ -test with df = 1. The results of this analysis suggested 26 children per condition. We opted to stop data collection once the counterbalancing requirements were reached, resulting in n = 24 participants in each condition.

Children were recruited from a local school and a children's museum in the Northeast region of the United States from March – December 2018. Children were randomly allocated to one of the two informant conditions. An equal number of 4- and 5-year-olds participated in each

condition. One child was excluded in the final analyses because they did not pass the three memory check questions (see below).

## Materials

**Machine.** The machine used in the learning phase was similar to those used in "blicket detector" paradigms from previous research on young children's causal reasoning abilities (Gopnik & Sobel, 2000). The machine employed in the current research was a 20.32cm x 15.24cm x 7.62 cm black plastic box with a lucite plastic top. The box contained blue LED lights and a small electronic music player, both of which could be remotely operated. One of the experimenters used a small remote, hidden out of view of the participant, to make the box light up and play music for trials in which a block activated the machine. This activation would last until the child retrieved the block from the top of the machine.

**Learning phase stimuli.** The block stimuli used in the learning and the test phase were based on that of Walker et al. (2017). We constructed six blocks (50.80mm wooden cubes) for the learning trials. Each block had a plastic rectangular 31.8mm x 10.4mm x 8mm Lego piece affixed to the top and another to the front of it. The top Lego piece was a different color to the front Lego piece (see illustration of learning phase blocks in Figure 1, panel A).

Children viewed three causal trials (i.e., block activated the machine) and three inactive trials (i.e., block did not activate the machine). One of the two Lego pieces on each block always represented a deterministic cue for activation (i.e., 100% or 0%). The other piece represented a probabilistic activation cue (i.e., 66% or 33%). For example, in Figure 1 (panel A), blocks with a black piece always activated the machine (the three blocks have black pieces and all activate the machine). Thus, this piece was the 100% cue. By contrast, blocks with the yellow piece never activated the machine. This piece was the 0% cue. Blocks with the red piece activated the

machine 2 out of 3 times and blocks with the white piece activated the machine 1 out of 3 times. These were the 66% and 33% cues respectively. We refer to the 100% and 0% cues as the *deterministic cues* and the 66% and 33% cues as the *probabilistic cues*. The colors of the Lego parts associated with the deterministic and probabilistic properties were counterbalanced across participants, however for the purpose of describing the procedure below, black, yellow, red, and white indicate the 100%, 0%, 66%, and 33% cues respectively.

Small cards (18.6cm x 7cm) were placed at either side of the machine at the beginning of the learning trials to aid children's categorization of each block as causal or inactive. The causal card depicted an image of the machine lit up with a "thumbs up". The inactive card had an image of an inert machine with a "thumbs down" (see Figure 1, Panel A).

**Test phase stimuli.** Four additional wooden cube stimuli (same size and color as the blocks used in the learning phase) were used for the test phase. These blocks only had a single Lego piece attached to it. Each block had a different colored piece (i.e., black, yellow, red, white). These blocks were inserted, two at a time, into a box apparatus, which we will call the *hiding* box (see Figure 1, panel B). The hiding box was constructed based on the one used in Walker et al. (2017). The box was a black 22.2cm x 10.15cm x 5.1cm cardboard box had four rectangular cut-outs, two at the top and two at the front. The cut-out windows were covered by dark blue colored felt flaps. For each test trial, the experimenter would reveal the single piece on each block, either by lifting the top or front flaps. One of the flaps for each block remained closed during the trials. This was done to ensure that children were only making judgements between two specific cues at a given time but that they believed they were comparing two of the blocks (with two Legos) that they viewed in the learning phase. The second Lego piece on the

observed learning block therefore appeared hidden by one of the closed flaps in the test trials. The orientation of the two test cues in the top and/or front positions was randomized.

## Procedure

**Learning phase.** The experimenter brought children into a quiet room at their school or off of the museum floor. Children at the museum were tested with their parent/guardian present. Children tested at their school were tested with only the researchers. The experimenter sat across from the child at a table. A second experimenter – hitherto referred to as the *informant* – was seated next to the participant. The experimenter first asked the child a series of questions about themselves for familiarization and warm-up. Then, she introduced children to the machine by saying, "I have this machine here, and it lights up and plays music".

The experimenter placed a box filled with the learning block stimuli on the table and said, "I also have some toys. Some of these toys will make the machine go and some of them will not". She then invited the informant to provide testimony about the deterministic cues. In the *Certain* condition, the informant said, "I know! The Black ones [100% cue] make the machine go and the Yellow ones [0% cue] do not. I'm really sure." In the *Uncertain* condition, the informant said, "Um, I don't know. Maybe the Black ones [100% cue] make the machine go and maybe the Yellow ones [0% cue] do not. I'm not really sure." Following the delivery of this information, the experimenter said, "Alright! Now let's try putting one of them on the machine" and proceeded to administer the learning trials.

The experimenter then placed the six learning blocks on the machine one at a time and children observed whether each block activated the machine. Children always observed one efficacious block and one inactive block first (order counterbalanced). The first efficacious block was placed with the card that indicated activation; the first inactive block was placed with the card that indicated it failed to activate the machine. After the remaining four blocks were placed on the machine, the experimenter asked the children to help her to categorize the block as either one that "makes the machine go" or one that "does not make the machine go". The child then observed and categorized the other four blocks. The remaining four learning trials were presented in a random order.

After these six trials, the experimenter again asked the informant to provide her testimony about the blocks. The informant repeated the information she had provided before the beginning of the learning phase. Note that children were able to view all of the evidence while they heard the explanation – the three causal blocks were grouped to one side of the machine and the three inactive blocks were grouped to the other side of the machine. After delivering the second round of testimony, the informant left the room and was not present for the test phase.

**Memory checks.** After the informant's departure, the experimenter removed the machine, learning blocks, and category cards from the table. She then administered the three memory check questions. She first asked, "Do you remember which one she [the informant] said would make the machine go?" Following children's response, E asked, "Do you remember which one she said would not make the machine go?" Finally, E asked about the child's perceived certainty of the testimony (i.e., "Do you remember, was she really sure or not really sure?"). The experimenter did not provide corrective feedback to the responses. If children failed to provide the correct response for all three memory check questions, they were excluded from the analyses (n = 1).

**Test phase**. After the memory check questions, the experimenter placed the hiding box on the table. She explained, "This is a hiding box! I can put the blocks in here, and lift up these flaps and show you a part of the block. I am going to do that now and ask you about the parts you can see, okay?". When placing the two test blocks in the box for each trial, she would use a manila folder to obscure the child's view of the process.

Children were presented with six test trials in a random order. For every trial, the experimenter showed children a pair of cues on different blocks and asked them to indicate which block was more likely to activate the machine (e.g., when shown that one block has a black cue and the other block has a yellow cue, children were asked "Do you think the black one or the yellow one make the machine go?"). Children were asked to infer the more causally predictive cue from a combination of every cue they had observed in the learning phase (i.e., 100% or 0%, 100% or 66%, 100% or 33%, 66% or 0%, 33% or 0%, 66% or 33%). Five out of the six test trials involved at least one cue that was specified in the informant's testimony (i.e., the deterministic 100% or 0% cue). Responses to these trials were the main focus of the analyses<sup>1</sup>.

<sup>&</sup>lt;sup>1</sup> One trial involved the comparison of two cues that were not part of the informant's testimony (i.e., the comparison between the 66% and 33% probabilistic cues). We realize that, based on our current predictions, it would be difficult to draw any meaningful inferences regarding performance on this trial across conditions and thus decided to exclude it from the following analyses.



*Figure 1*. The block stimuli and memory cards used for children's categorization of the learning trials (panel A) and the hiding box apparatus used in the test phase (panel B).

## **Results and Discussion**

## **Preliminary Analyses**

The number of children who correctly recalled the color of the deterministic cues identified by the informant (approximately 89% of responses) and the certainty of the informant (73% of responses) during the memory check phase is reported in Appendix A (see Table S1 for the breakdown by condition and question type). One child did not provide correct responses for any of the three memory check questions and was excluded for the remainder of the analyses.

For each test trial, children were given a score of 1 if they chose the block with the cue that indicated a higher likelihood of activation, otherwise they were given a score of 0. Using

mixed-effects logistic regression models, the preliminary analyses revealed that there was no effect of the counterbalancing variables (order of first learning block, color associated with the predictive cue; all p's > .10), participant variables (gender, testing site; both p's > .87) nor trial type (all p's > .23) on children's causal judgements in the test phase. We did not consider these variables further.

## Main Analyses

We conducted a stepwise mixed-effects binomial logistic regression model using the *glmer* function of the *lme4* package in R statistical software (version 3.4.2) to explore the effect of Informant Condition (categorical predictor: Certain vs. Uncertain) and Age (categorical predictor: 4-year-old vs. 5-year-old) on whether children chose the more predictive cue on each test phase question<sup>2</sup>. The models included Informant Condition and Age as fixed effects and participant ID as a random effect to account for variability of individual responses across the test trials. We entered Informant Condition in a first step, Age in a second step, and, in a third model, we added the interaction between Informant and Age. All of the data files are openly available at https://osf.io/raqh3/?view\_only=6b2c171ed8924d828beae3da67724732

The final model revealed a significant main effect of Age,  $\beta = 2.21$ , SE = 0.83, z = 2.04, p = .008, and significant Informant Condition x Age interaction,  $\beta = -2.86$ , SE = 1.09, z = -2.62, p = .009. To investigate the interaction further, we ran two separate mixed-effects logistic regression models within each age group. The results showed a significant main effect of Informant Condition among the 5-year-olds,  $\beta = -2.83$ , SE = 0.99, z = -2.42, p = .016, OR = .09, 95% CI = [.01, .64], indicating that children were more likely to identify the correct causal cues in the *Certain* condition compared to the *Uncertain* condition (see Figure 2). There was no effect

<sup>&</sup>lt;sup>2</sup> All of the reported interaction effects hold when age is entered as a continuous predictor in the main models.

of Informant Condition on 4-year-olds' responses,  $\beta = 0.60$ , SE = 0.62, z = 0.98, p = .33. The ability to appropriately integrate the verbal testimony of others and evidence cues when learning about deterministic data was evident among the older children.



*Figure 2*. The proportion of test trials that children chose the more causally predictive cue as a function of informant condition and age.

## Study 2

Study 1 demonstrated that 5-year-olds in the calibrated condition (i.e., the *Certain* condition) showed high rates of choosing the more causally predictive cue in the test trials compared to similarly aged children who heard an uncertain explanation. The younger children did not show sensitivity to the relative match between the verbal certainty cues and the accuracy of the data. This finding compliments previous studies exploring how young children use confidence cues to guide their learning (e.g., Sabbagh & Baldwin, 2001) and extends this work by showing that hearing others state information that is consistent with observed data confidently fostered judgments among 5-year-olds about the likelihood that causal features are efficacious.

In Study 1, the 5-year-olds were sensitive to the confidence of the speaker in a positive direction presumably because the verbal testimony accurately described the observed data. An important open question is whether children in this age range were also sensitive to speakers' confidence when an informant generates verbal information that is not about deterministic causes but rather are probabilistic, or are indicative of outcomes that do not always occur. Here, uncertain verbal testimony might support children's causal learning because it is calibrated to unreliability of the associated causal cues in the observed data. Generating certain testimony about a probabilistic cue is inaccurate in light of the fact that there is another, deterministic causal cue; if children are capable of calibrating the hesitance of the testimony to these data, they should learn better when such testimony is hesitant as opposed to certain.

In Study 2, children were presented with the same causal learning paradigm outlined in Study 1. However, we manipulated the certainty with which the informant delivered an explanation about the two probabilistic data cues - children either heard a certain or uncertain explanation about the 66% and 33% cues. To provide a more robust test of children's ability to calibrate the uncertainty of the verbal testimony in this context, we had two uncertain conditions. In one of these conditions, the uncertain informant (like in the certain informant condition) provided testimony about the data in the aggregate (e.g., "Maybe the Red one [66%] makes the machine go"). In the other uncertain condition, the uncertain informant acknowledged the stochastic nature of the data (e.g., "Maybe the Red one *sometimes* make the machine go").

We expected that children would demonstrate greater learning of the causal cues after hearing an uncertain, as compared to a certain, explanation in this study because hesitant testimony places appropriate emphasis on the probabilistic causal evidence. We anticipated that children might be particularly sensitive to the calibrated testimony when the uncertain informant provided an accurate description of the probabilistic outcomes (i.e., the *Uncertain* + *Sometimes* condition), as previous findings have suggested that calibration of uncertain information in the aggregate might be difficult for 5-year-olds.

## Method

## **Participants**

Seventy-two 4- and 5-year-olds (31 girls, mean age = 60 months, age range = 48 - 72 months) were recruited to participate in Study 2. Children in the *Certain* and *Uncertain* conditions were recruited from the same Study 1 locations between March - December 2018. The children in the *Uncertain* + *Sometimes* condition were recruited at a later time point from the same two locations between June – August 2019. There was an equal number of 4- and 5- year-olds in each condition. Four children were excluded in the final analyses because they did not pass the memory check phase (see below).

## Materials and Procedure

The materials used were identical to that of Study 1. The learning and test phases were also similar to Study 1. In the learning phase, the one difference was the content of the informant's testimony that children heard before and after observing the experimenter place the six learning blocks on the machine. In the *Certain* condition, the informant said: "I know! The Red ones [66% cue] make the machine go and the White ones [33% cue] do not. I'm really sure." In the *Uncertain* condition, the informant said: "Um, I don't know. Maybe the Red ones [66% cue] make the machine go and maybe the White ones [33% cue] do not. I'm not really sure". In the *Uncertain* + *Sometimes* condition, the informant said: "Um, I don't know. Maybe the Red ones [66% cue] sometimes make the machine go and maybe the White ones [33% cue] do not. I'm not really sure".

In both conditions, children were then asked to infer the more causally predictive cue from a combination of every cue they had observed during the learning trials (i.e., 66% or 33%, 100% or 66%, 100% or 33%, 66% or 0%, 33% or 0%, 100% or 0%<sup>3</sup>). Note that, in two of these trials, there is a conflict between the correct answer based on the observed data and the cue that is mentioned in the testimony (conflict trials: 100% or 66%, 33% or 0%). For example, in order to choose the more predictive cue, children would need to discount the testimony that the 66% cue is efficacious and favor the deterministic 100% cue in their judgments.

## **Results and Discussion**

#### **Preliminary Analyses**

The number of children who correctly recalled the color of the probabilistic cues (approximately 78% of responses) and the certainty of the informant (64% of responses) during the memory check phase are reported in Appendix A (see Table S2 for the breakdown by condition and question type). Four children did not provide correct responses for any of the three memory check questions and were excluded for the remainder of the analyses.

Responses to the test questions were scored in the same manner as Study 1. Mixedeffects regression models revealed that there was no effect of the counterbalancing variables (order of first learning block, color associated with the predictive cue; all *p*-values> .19), nor participant variables (gender, testing site; both *p*'s > .74) on correct responses to the test trials in Study 2. There was a main effect of trial type: overall, children were more likely to choose the more accurate causal cue on the trials that were generally consistent with the testimony provided by the informant (66% or 33%, 100% or 33%, 66% or 0%) compared to the two trials that could

<sup>&</sup>lt;sup>3</sup> As in Study 1, one of the test trials involved children's inference of two cues that were not identified in the verbal testimony (i.e., the comparison between the 100% and 0% deterministic cues). We decided to drop this trial and only focus on the five trials that related to the testimony, and thus to our research hypothesis, in the main analyses.

pose a potential conflict between the testimony and observed evidence (100% or 66% and 33% or 0%; all *p*-values < .003). We retained this variable in the following models to control for this significant main effect, see below.

## Main Analyses

We conducted a stepwise mixed-effects binomial logistic regression model using the *glmer* function of the *lme4* package in R statistical software (version 3.4.2) to examine the effect of Informant Condition (Certain, Uncertain, Uncertain + Sometimes) and Age in months (4-year-old vs. 5-year-old) on whether children inferred the more predictive cue in the test trials. The models included Informant Condition and Age as fixed effects and participant ID as a random effect to account for variability of individual responses in the test phase. Because we expected the children's performance to differ in the two Uncertain conditions in comparison to the Certain condition, we first defined the Certain condition as the reference level.

The results yielded a significant Informant Condition x Age interaction,  $\beta = 1.68$ , SE = 0.67, z = 2.52, p = .012, which was only indicated for the comparison between the *Certain* and *Uncertain* + *Sometimes* condition. To check the comparison between the two Uncertain conditions, we then defined the *Uncertain* + *Sometimes* condition as the reference level in the model. The results showed a significant main effect of Age,  $\beta = 1.50$ , SE = 0.49, z = 3.10, p = .002, and a significant Informant Condition x Age interaction,  $\beta = -1.51$ , SE = 0.66, z = -2.28, p = .022, for the comparison between the *Uncertain* and *Uncertain* + *Sometimes* condition. Thus, the effect of Age differed in the *Uncertain* + *Sometimes* condition compared to both the *Certain* and *Uncertain* conditions. There was no such difference between the *Certain* and *Uncertain* and *Uncertai* 

To examine this interaction further, we conducted separate mixed-effects logistic regression models within each age group. There was a significant effect of Informant Condition among the 5-year-olds: children in the *Uncertain* + *Sometimes* condition were more likely to choose the more accurate causal cue in comparison to the 5-year-olds in the *Certain* condition,  $\beta$  = -1.06, *SE* = 0.49, z = -2.18, *p* =.029, OR = .35, 95% CI = [.13, .90], and *Uncertain* condition,  $\beta$  = -1.07, *SE* = 0.48, z = -2.24, *p* =.025, OR = .34, 95% CI = [.14, .84] (see Figure 3).

Recall that children were invited to make decisions about some trials that were consistent with the informant's testimony (66% or 33%, 100% or 33%, 66% or 0%) and two trials where the more accurate causal cue could potentially be in conflict with the testimony (100% or 66% and 33% or 0%). The results of the model suggested that, 5-year-olds were generally less likely to choose the causally correct cue on the two conflict trials in comparison to each of the three other trials (all p's < .004).

By contrast, there was no effect of Informant Condition among the younger children (see Figure 3). There was a significant effect of trial type in this age group however: 4-year-olds were also less likely to infer the casually correct cue in the conflict trials in comparison to the three consistent trials (all p's < .027<sup>4</sup>).

<sup>&</sup>lt;sup>4</sup> The comparison between the 66% or 0% trial (consistent trial) and the 100% or 66% trial (conflict trial) was not significant among this age group (p = .21).



*Figure 3*. The proportion of test trials that children chose the more causally predictive cue as a function of informant condition and age.

*Consistent vs conflict trials.* The results suggest that 4- and 5-year-old children tended to use the testimony to guide their judgements over their own observations of the causal evidence when both sources of knowledge were in conflict. Yet, the older children showed greater learning in the *Uncertain* + *Sometimes* condition in comparison to the two other conditions (whereas the younger children exhibited similar levels of learning across the three informant conditions). To further explore the observed boost in older children's learning in this condition, we ran separate analyses on the consistent and conflict trials among this age group. For 5-year-olds' performance on the consistent trials (66% or 33%, 100% or 33%, 66% or 0%), there were no significant comparisons between the *Uncertain* + *Sometimes* and the two other conditions (both p's > .30). In contrast, 5-year-olds were significantly more likely to choose the causally correct cue in the conflict trials in the *Uncertain* + *Sometimes* compared to the *Uncertain* condition,  $\beta = -1.41$ , SE = 0.51, z = -2.79, p = .005, OR = .25, 95% CI = [.09, .66], and *Certain* condition,  $\beta = -1.44$ , SE = 0.51, z = -2.23, p = .026, OR = .32, 95% CI = [.12, .87].

The ability to integrate and *to learn to appropriately discount* informant testimony about probabilistic cues was evident among 5-year-olds. Importantly, the boost in children's learning emerged when the informant's claim most accurately represented the probabilistic causal information (i.e., when the informant was uncertain, but accurate about the stochastic nature of the data – "Maybe it *sometimes* makes the machine go") as opposed to information about the cue in the aggregate.

## **General Discussion**

The results of the two studies suggest that children's capacity to calibrate informant testimony with first-hand observations when learning about novel causal relations emerges during the preschool years. Five-year-olds, but not 4-year-olds, demonstrated the ability to appropriately attune the verbal certainty of an explanation to the predictive accuracy of causal data. In Study 1, 5-year-olds showed high rates of learning when they heard a certain explanation about deterministic outcomes, as compared to an uncertain explanation. In Study 2, we observed a similar developmental trend; five-year-old children learned more effectively about the nature of the probabilistic cues after hearing an uncertain explanation. Importantly, the higher rates of learning relied on the calibrated informant not only conveying verbal cues to uncertainty about the outcomes, but also providing an accurate explanation about probabilistic events (or outcomes that *sometimes* occur). By contrast, children tended to erroneously side with unreliable testimony on the conflict trials when the informant was certain or uncertain about the aggregate of the probabilistic outcome. In other words, children who heard an explanation about the stochastic nature of the individual probabilistic cues were more likely to appropriately discount those cues in favor of more causally predictive evidence. In both studies, 4-year-olds did not demonstrate any attunement to the integration of verbal testimony and the observed evidence. Taken together,

the present studies offer novel insights into the effects of informant calibration on children's causal understanding in a broad learning environment.

The finding that the older children successfully drew from both the testimonial and observed deterministic evidence in Study 1 compliments previous findings on children's epistemic evaluations of confident informants (e.g., Birch et al., 2020; Brosseau-Liard et al., 2014). For example, Birch et al. (2020) found that 5-year-olds selectively trust an informant whose verbal confidence positively correlated with their knowledge access. Here, we extend these findings to show that children in this age range learn more effectively about causal relations from a calibrated confident informant. Furthermore, the results of Study 1 demonstrate the benefits of explanation for children's causal learning outcomes (Walker et al., 2017). When an adult provided a causal explanation that was consistent with children's first-hand observations, 5-year-olds were more likely to endorse the efficacious causal relations.

The pattern of results in Study 2 makes a novel contribution to studies exploring children's understanding of uncertainty in learning contexts. Previous research has suggested that young children are not sensitive to cues that might justify a person's hesitancy, at least in their epistemic judgements and selective learning preferences. At age 5, children did not appreciate the epistemic value of uncertainty when recalling the details of an accident (Tenney et al., 2011) or the possible contents of a box (Birch et al., 2020). We, too, found that children treated an informant who provided an uncertain explanation in the aggregate similarly to that of a certain explanation. However, the present findings provide some evidence that, by the age of 5, children are able to understand and integrate uncertain testimony that is consistent with and calibrated to individual probabilistic events.

There was some indication that children were more sensitive to cues to certainty than cues to uncertainty. The older children we investigated were not at ceiling in the accurate, uncertain condition in Study 2. Thus, 5-year-olds still sometimes interpreted the uncertain testimony in this condition at face value and chose the probabilistic cues over the deterministic evidence on certain trials. Further, children were generally more likely to recognize verbal certainty (or when the informant was "really sure") than verbal uncertainty (or when the informant was "not really sure") in the memory check phase. Although previous work suggests young children show systematic differences in their behavior on the basis of such verbal epistemic cues (e.g., Bridgers et al., 2015; Sabbagh & Baldwin, 2001), one possibility is that the younger children in our sample might not have the metacognitive skills to explicitly reflect on the certainty of the informant (Ruffman, Rustin, Garnham & Parkin, 2001). Another possibility is that the current phrasing of the memory check questions did not directly tap into children's understanding of a person's level of confidence. Further research is necessary to discern between these two possibilities.

Children in the present study heard an explanation about the causal system both prior to and after viewing the evidence. Because the informant provided an explanation before the observation phase, this may have primed children to pay attention to the relevant cues, and potentially lead them to weigh the testimony more heavily than the first-hand evidence. This might be particularly true in Study 2 where the informant's explanation was not consistent with the general causal structure of the objects (i.e., ignored the more obvious, deterministic evidence). Future research should explore whether children's causal judgements would differ if they had the opportunity to observe the evidence before hearing a claim about that evidence in the same learning environment. For example, Decker et al. (2015) asked 6- to 12-year-olds to

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learn probabilistic relations between a stimulus and a reward (either positive or negative), and then introduced them to informants who generated false information about those relations. The children were more likely to weigh their own observations over erroneous verbal instruction when making judgements about the probability of an outcome. While Decker et al.'s (2015) study used a different age range and paradigm to the present study, integrating these findings does suggest that hearing verbal testimony before observing data could promote the calibration pattern that we posit here; further research should investigate this issue.

To conclude, the present research set out to address a gap in the literatures on the acquisition of children's causal knowledge from their own observations of the world (Gopnik, & Wellman, 2012) and from their interactions with other people (Harris et al., 2018; Mills, 2013; Sobel & Kushnir, 2013). Our results show the nuanced relation between the verbal and observed information that children are privy to in a causal learning context. By the age of 5, children were able to attune subtle differences in the social cues that people use to convey their epistemic competence to the accuracy of those claims when making causal discoveries. More generally, these findings suggest that the capacity to integrate disparate sources of evidence emerges relatively early in development.

## References

- Birch, S., Severson, R. L., & Baimel, A. (2020). Children's understanding of when a person's confidence and hesitancy is a cue to their credibility. *PloS One*, 15, e0227026. doi: 10.1371/journal.pone.0227026
- Bonawitz, E., Shafto, P., Gweon, H., Goodman, N. D., Spelke, E., & Schulz, L. (2011). The double-edged sword of pedagogy: Instruction limits spontaneous exploration and discovery. *Cognition*, 120, 322–330. doi: 10.1016/j.cognition.2010.10.001
- Bonawitz, E.B., van Schijndel, T., Friel, D., & Schulz, L. (2012). Balancing theories and evidence in children's exploration, explanations, and learning. *Cognitive Psychology*, *64*, 215-234. doi: 10.1016/j.cogpsych.2011.12.002
- Bridgers, S., Buchsbaum, D., Seiver, E., Griffiths, T. L., & Gopnik, A. (2016). Children's causal inferences from conflicting testimony and observations. *Developmental Psychology*, 52, 9–18. doi: 10.1037/a0039830
- Brosseau-Liard, P., Cassels, T., & Birch, S. (2014). You seem certain but you were wrong before: Developmental change in preschoolers' relative trust in accurate versus confident speakers. *PloS One*, 9, e108308. doi: 10.1371/journal.pone.0108308
- Buchanan, D. W., & Sobel, D. M. (2011). Mechanism-based causal reasoning in young children. *Child Development*, 82, 2053-2066. doi: 10.1111/j.1467-8624.2011.01646.x
- Bullock, M. Gelman, R., & Baillargeon, R. (1982). The development of causal reasoning. In W.J. Friedman, (Ed.) *The developmental psychology of time*. New-York: Academic Press, pp. 209–254

- Callanan, M. A., & Oakes, L. M. (1992). Preschoolers' questions and parents' explanations:
  Causal thinking in everyday activity. *Cognitive Development*, 7, 213–233. doi: 10.1016/0885-2014(92)9001
- Corriveau, K. H., Kinzler, K. D., & Harris, P. L. (2013). Accuracy trumps accent in children's endorsement of object labels. *Developmental Psychology*, 49, 470-479. doi: 10.1037/a0030604
- Corriveau, K. H., Meints, K., & Harris, P. L. (2009). Early tracking of informant accuracy and inaccuracy. *The British Journal of Developmental Psychology*, 27, 331–342. doi: 10.1348/026151008x310229
- Decker, J. H., Lourenco, F. S., Doll, B. B., & Hartley, C. A. (2015). Experiential reward learning outweighs instruction prior to adulthood. *Cognitive, Affective & Behavioral Neuroscience, 15*, 310–320. doi: 10.3758/s13415-014-0332-5
- Einav, S., & Robinson, E. J. (2011). When being right is not enough: Four-year-olds distinguish knowledgeable informants from merely accurate informants. *Psychological Science*, 22, 1250–1253. doi: 10.1177/0956797611416998
- Fender, J. G., & Crowley, K. (2007). How parent explanation changes what children learn from everyday scientific thinking. *Journal of Applied Developmental Psychology*, 28, 189–210. doi: 10.1016/j.appdev.2007.02.007
- Frazier, B. N., Gelman, S. A., & Wellman, H. M. (2009). Preschoolers' search for explanatory information within adult-child conversation. *Child Development*, 80, 1592–1611. doi: 10.1111/j.1467-8624.2009.01356.x
- Gelman, S. A. (2009). Learning from others: Children's construction of concepts. *Annual Review* of *Psychology*, 60, 115–140, doi: 10.1146/annurev.psych.59.103006.093659

- Gopnik, A., & Sobel, D. M. (2000). Detecting blickets: How young children use information about novel causal powers in categorization and induction. *Child Development*, 71, 1205– 1222. doi: 10.1111/1467-8624.00224
- Gopnik A, & Wellman H. M. (2012). Reconstructing constructivism: causal models, Bayesian learning mechanisms, and the theory theory. *Psychological Bulletin*, 138, 1085-1108. doi: 10.1037/a0028044
- Griffiths, T.L., Sobel, D.M., Tenenbaum, J.B., & Gopnik, A. (2011). Bayes and Blickets: Effects of knowledge on causal induction in children and adults. *Cognitive Science*, 35, 1407-1455. doi: 10.1111/j.1551-6709.2011.01203.x
- Harris P. L., & Koenig M. A. (2006). Trust in testimony: How children learn about science and religion. *Child Development*, 77, 505–524 doi: 10.1111/j.1467-8624.2006.00886.x
- Harris, P. L., Koenig, M. A., Corriveau, K. H., & Jaswal, V. K. (2018). Cognitive foundations of learning from testimony. *Annual Review of Psychology*, 69, 251-273. doi: 10.1146/annurev-psych-122216-011710
- Harris P. L., Pasquini, E. S., Duke S., Asscher J. J., & Pons F. (2006). Germs and angels: The role of testimony in young children's ontology. *Developmental Science*, 9, 76–96. doi: 10.1111/j.1467-7687.2005.00465.x
- Jaswal, V. K., & Neely, L. A. (2006). Adults don't always know best: Preschoolers use past reliability over age when learning new words. *Psychological Science*, 17, 757-758. doi: 10.1111/j.1467-9280.2006.01778.x
- Kimura, K., & Gopnik, A. (2019). Rational higher-order belief revision in young children. *Child Development*, 90, 91-97. doi: 10.1111/cdev.13143

- Kurkul K., & Corriveau K. H. (2017). Question, explanation, follow-up: A mechanism for learning from others? *Child Development*, 89, 280-294. doi:10.1111/cdev.12726
- Kushnir, T., & Gopnik, A. (2005). Young children infer causal strength from probabilities and interventions. *Psychological Science*, *16*, 678–683. doi: 10.1111/j.1467-9280.2005.01595.x
- Kushnir, T., Wellman, H. M., & Gelman, S. A. (2008). The role of preschoolers' social understanding in evaluating the informativeness of causal interventions. *Cognition*, 107, 1084–1092. doi: 10.1016/j.cognition.2007.10.004
- Legare, C. H., Sobel, D. M., & Callanan, M. (2017). Causal learning is collaborative: Examining explanation and exploration in social contexts. *Psychonomic Bulletin & Review*, 24, 1548–1554. doi: 10.3758/s13423-017-1351-3
- Luce, M. R., Callanan, M. A., & Smilovic, S. (2013). Links between parents' epistemological stance and children's evidence talk. *Developmental Psychology*, 49, 454–461. doi: 10.1037/a0031249
- Macris, D. M., & Sobel, D. M. (2017). The role of evidence diversity and explanation in 4-and 5year-olds' resolution of counterevidence. *Journal of Cognition and Development*, 18, 358-374. doi: 10.1080/15248372.2017.1323755
- Mills, C. M. (2013). Knowing when to doubt: Developing a critical stance when learning from others. Developmental Psychology, 49, 404–418. doi: 10.1037/a0029500
- Pasquini, E. S., Corriveau, K. H., Koenig, M., & Harris, P. L. (2007). Preschoolers monitor the relative accuracy of informants. *Developmental Psychology*, 43, 1216-1226. doi: 10.1037/0012-1649.43.5.1216

- Rowe ML. 2012. A longitudinal investigation of the role of quantity and quality of child-directed speech in vocabulary development. *Child Development*, *83*, 17–74, doi: 10.1111/j.1467-8624.2012.01805.x
- Ruffman, T., Rustin, C., Garnham, W., & Parkin, A. J. (2001). Source monitoring and false memories in children: relation to certainty and executive functioning. *Journal of Experimental Child Psychology*, 80, 95–111. doi: 10.1006/jecp.2001.2632
- Sabbagh, M. A., & Baldwin, D. A. (2001). Learning words from knowledgeable versus ignorant speakers: links between preschoolers' theory of mind and semantic development. *Child Development*, 72, 1054–1070. doi: 10.1111/1467-8624.00334
- Sobel, D. M. (2015). Can you do it? How preschoolers judge whether others have learned. *Journal of Cognition and Development*, 16, 492-508. doi:
  10.1080/15248372.2013.815621
- Sobel, D. M., & Finiasz, Z. (2020). How children learn from others: An analysis of selective word learning. *Child Development*. doi: 10.1111/cdev.13415
- Sobel D. M., & Legare C. H. (2014). Causal learning in children. *Wiley Interdisciplinary Reviews: Cognitive Science*, *5*, 413-427. doi: 10.1002/wcs.1291
- Sobel, D. M., & Kushnir, T. (2013). Knowledge matters: how children evaluate the reliability of testimony as a process of rational inference. *Psychological Review*, 120, 779–797. doi: 10.1037/a0034191
- Sobel, D. M., Sommerville, J. A., Travers L. V., Blumenthal E. J., & Stoddard E. (2009). The role of probability and intentionality in preschoolers' causal generalizations. Journal of *Cognition and Development, 10*, 262-284. doi: 10.1080/15248370903389416

- Tenenbaum, H.R., Snow, C.E., Roach, K.A., & Kurland, B. (2005). Talking and reading science: Longitudinal data on sex differences in mother-child conversations in low-income families. *Applied Developmental Psychology*, 26, 1–19. doi: 10.1016/j.appdev.2004.10.004
- Tenney, E. R., Small, J. E., Kondrad, R. L., Jaswal, V. K., & Spellman, B. A. (2011). Accuracy, confidence, and calibration: How young children and adults assess credibility. *Developmental Psychology*, 47, 1065–1077. doi: 10.1037/a0023273
- VanderBorght, M., & Jaswal, V. K. (2009). Who knows best? Preschoolers sometimes prefer child informants over adult informants. Infant and Child Development: An International *Journal of Research and Practice*, 18, 61-71. doi: 10.1002/icd.591
- Walker, C. M., Lombrozo, T., Williams, J. J., Rafferty, A. N., & Gopnik, A. (2017). Explaining constrains causal learning in childhood. *Child Development*, 88, 229–246. doi: 10.1111/cdev.12590
- Young, A. G., Alibali, M. W., & Kalish, C. W. (2012). Disagreement and causal learning:
  Others' hypotheses affect children's evaluations of evidence. *Developmental Psychology*, 48, 1242–1253. doi: 10.1037/a0027540

# **Supplementary Information**

## Appendix A. Children's Performance on the Memory Check Questions

Table S1. *The number (and percentage) of children who correctly recalled the deterministic cues and the certainty of the informant by condition in Study 1.* 

	Informant Condition					
	<u>Ce</u>	<u>rtain</u>	<u>Uncertain</u>			
	N	%	N	%		
Recall of 100% cue	23	95.83	18	75.00		
Recall of 0% cue	22	91.67	22	91.67		
Recall of certainty	22	91.67	13	54.17		

Table S2. The number (and percentage) of children who correctly recalled the probabilistic cues and the certainty of the informant by condition in Study 2.

	Informant Condition							
	Certain		<u>Uncertain</u>		<u>Uncertain</u> <u>'Sometimes'</u>			
	N	%	Ν	%	Ν	%		
Recall of 66% cue	21	87.50	18	75.00	14	58.33		
Recall of 33% cue	22	91.67	21	87.50	16	66.67		
Recall of certainty	15	62.50	15	62.50	16	66.67		