| Running head: | GAZE UNDERSTANDING | 1 |
|---------------|--------------------|---|
|               |                    |   |
|               |                    |   |
|               |                    |   |
|               |                    |   |
|               |                    |   |
|               |                    |   |
|               |                    |   |
| 3. r · · ·    |                    |   |

- Measuring individual differences in the understanding of gaze cues across the lifespan
- Julia Prein<sup>1</sup>, Manuel Bohn<sup>1</sup>, Steven Kalinke<sup>1</sup>, & Daniel M. Haun<sup>1</sup>
- <sup>1</sup> Department of Comparative Cultural Psychology, Max Planck Institute for Evolutionary
- 4 Anthropology, Leipzig, Germany

# Author Note

- 6 Correspondence concerning this article should be addressed to Julia Prein, Max
- 7 Planck Institute for Evolutionary Anthropology, Deutscher Platz 6, 04103 Leipzig,
- 8 Germany. E-mail: julia\_prein@eva.mpg.de

5

Abstract

To explain and predict the behavior of agents, we use social cognition: we represent and reason about others' perspectives, knowledge, intentions, beliefs, and preferences. However, 11 traditional measures of social cognition (e.g., false belief change-of-location tasks) often lack satisfactory psychometric properties: they are not designed to capture variation between children and rely on low trial numbers, dichotomous measures, and group averages. This has profound implications for what these studies can show. Poor measurement of social 15 cognition on an individual level may conceal relations between different aspects of cognition 16 and may obscure developmental change. To fully understand how social-cognitive abilities 17 emerge and relate to each other, we need new tools that can reliably measure individual 18 differences. We designed a gaze understanding task to study social cognition in young 19 children and adults to approach this issue. We concentrate on an essential ability that is involved in many social-cognitive reasoning processes: gaze understanding – the ability to 21 locate and use the attentional focus of an agent. Our interactive task works across devices and enables supervised and unsupervised, as well as in-person and remote testing. The implemented spatial layout allows for discrete and continuous measures of participants' click imprecision and is easily adaptable to different study requirements. Here we show that our task induces inter-individual differences in a child (N = XXX) and an adult (N = XXX) sample. Our two study versions and data collection modes yield comparable results that show substantial developmental gains: the older children are, the more accurately they locate the target. High internal consistency and test-retest reliability estimates underline that the captured variation is systematic. Furthermore, we find first evidence for the external validity of our task: the measured performance in gaze understanding relates to children's real-life social surroundings. This work shows a promising way forward in the study of individual differences in social cognition and will help us explore the in(ter)dependence of our core social-cognitive processes in greater detail.

- 35 Keywords: social cognition, individual differences, gaze cues, psychometrics
- Word count: X

38

Measuring individual differences in the understanding of gaze cues across the lifespan

Introduction

Banerjee, 2014; Mundy et al., 2007; Underwood, 1975).

Social cognition — representing and reasoning about an agent's perspectives,
knowledge states, intentions, beliefs, and preferences to explain and predict their behavior
is among the most-studied phenomena in developmental research. In recent decades,
much progress has been made in determining the average age at which a specific
social-cognitive ability emerges in development (Gopnik & Slaughter, 1991; Peterson,
Wellman, & Slaughter, 2012; Rakoczy, 2022; Wellman, Cross, & Watson, 2001; Wellman &
Liu, 2004). Yet, there are always individual differences. Identifying variability in
social-cognitive abilities and factors influencing their development is vital in theory
building (e.g., to test causal predictions) and for designing interventions (Happé, Cook, &
Bird, 2017; Kidd, Donnelly, & Christiansen, 2018; Lecce, Bianco, Devine, Hughes, &

Numerous studies have already examined individual differences in social cognition 50 (for an overview, see Hughes & Devine, 2015; Slaughter, 2015). These individual differences 51 studies often focus on the relationship between social-cognitive abilities and: (1) family influences, (2) other cognitive constructs, and (3) social behavioral outcome (for an overview, see Repacholi, 2003). Studies on social-cognitive abilities and family influences include the effect of parenting practices (for a review, see Pavarini, de Hollanda Souza, & Hawk, 2013), attachment quality (e.g., Astor et al., 2020), mental state talk (Gola, 2012; Hughes, Ensor, & Marks, 2011; Lecce et al., 2014), and family background as parental education, occupation, sibling interaction and childcare (Bulgarelli & Molina, 2016; Cutting & Dunn, 1999; Dunn, Brown, Slomkowski, Tesla, & Youngblade, 1991). Another group of individual differences studies focuses on the interplay of social and physical cognition (Herrmann, Hernández-Lloreda, Call, Hare, & Tomasello, 2010), executive 61 functions (Benson, Sabbagh, Carlson, & Zelazo, 2012; Buttelmann, Kühn, & Zmyj, 2021;

- Carlson & Moses, 2001; Carlson, Moses, & Claxton, 2004; Hughes & Ensor, 2007), and language abilities (McEwen et al., 2007; Milligan, Astington, & Dack, 2007; Okumura, Kanakogi, Kobayashi, & Itakura, 2017). Studies on social behavioral outcomes measured the interplay of social cognition and prosociality (for a review, see Imuta, Henry, Slaughter, Selcuk, & Ruffman, 2016; Walker, 2005), stereotypes and resource allocations (Rizzo & Killen, 2018), and moral intentions (Sodian et al., 2016).
- However, frequently, developmental psychologists are surprised to find minor or no association between measures of social cognition that are thought to be theoretically related cross-sectionally and/or longitudinally (e.g., Sodian et al., 2016). This might be because traditional measures of social cognition are not designed to capture variation between children: they often rely on low trial numbers, small sample sizes, and dichotomous measures. A recent review showed that many atudies on social cognition measures failed to report relevant psychometric properties at all (Beaudoin, Leblanc, Gagner, & Beauchamp, 2020) or when they did showed mixed results on test-retest reliability (Hughes et al., 2000; Mayes, Klin, Tercyak, Cicchetti, & Cohen, 1996).
- To give an example: perhaps the most commonly applied prototypical measure for social cognition is the change-of-location false belief task (Baron-Cohen, Leslie, & Frith, 1985; Wimmer & Perner, 1983). Here, children watch a short sequence of events (often acted out or narrated by the experimenters). A doll called Sally puts her marble into a basket. After Sally leaves the scene, a second doll named Anne takes the marble and moves it into a box. Participants then get asked where Sally will look for her marble once she returns. The outcome measures false belief understanding in a dichotomous way: children pass the task if they take the protagonist's epistemic state into account and answer that she will look into the basket. Many years of research utilizing these verbal change-of-location tasks suggest that children develop belief-representing abilities at four to five years of age (for a review, see Wellman et al., 2001). Several cross-cultural studies supported this evidence (Barrett et al., 2013; Callaghan et al., 2005; cf. Mayer & Träuble, 2015).

However, from this age onwards, the change-of-location task shows ceiling effects and has very limited diagnostic value (Repacholi, 2003). Thus, this sort of task seems to be well suited to track group-level developmental trends, yet it fails to capture individual differences (cf. "reliability paradox," Hedge, Powell, & Sumner, 2018). As Wellman (2012) put it, "it's really only passing/failing one sort of understanding averaged across age" (p. 317). This has profound implications for what studies on individual differences using this task (or others) can show. Poor measurement of social cognition on an individual level is likely to conceal relations between different aspects of cognition and may obscure developmental change.

Thus, developmental psychology faces a dilemma: many research questions are questions about individual differences, yet, there is a lack of tasks to measure these individual differences reliably. To capture the emergence of social-cognitive abilities and related social factors in greater precision and detail, we must consequently address the methodological limitations of existing study designs (Hughes et al., 2011; Hughes & Leekam, 2004).

Schaafsma, Pfaff, Spunt, and Adolphs (2015) compiled a "wish-list" for new 105 social-cognitive paradigms. They advocated for parametric – instead of dichotomous – 106 measures covering proficiency as a range, avoiding floor and ceiling effects, and showing 107 satisfactory test-retest reliability estimates (see also Beaudoin et al., 2020; Hughes & 108 Devine, 2015). New tasks should induce variation across age groups, including older children and adults (Repacholi, 2003). Another goal in creating new tasks should be to 110 focus on "face value": measures should probe the underlying social-cognitive ability as 111 straight-forward and directly as possible. The task should serve as a proxy for behavior as 112 it appears in the real world and should be validated in relation to real-world experiences 113 (Repacholi, 2003). 114

115

## A new measure of gaze understanding

Our goal was to design a new measure of social cognition that captures individual 116 differences across age groups in a systematic and reliable way. We focused on one of the 117 fundamental abilities implicated in many social-cognitive reasoning processes: gaze 118 understanding – the ability to locate and use the attentional focus of an agent. The first 119 component of this ability is often termed gaze following – turning one's eyes in the same 120 direction as the gaze of another agent – and has been studied intensively (Astor, Thiele, & 121 Gredebäck, 2021; Byers-Heinlein et al., 2021; Coelho, George, Conty, Hugueville, & Tijus, 122 2006; Del Bianco, Falck-Ytter, Thorup, & Gredebäck, 2019; Frischen, Bayliss, & Tipper, 123 2007; Hernik & Broesch, 2019; Itakura & Tanaka, 1998; Lee, Eskritt, Symons, & Muir, 124 1998; Moore, 2008; Shepherd, 2010; Tomasello, Hare, Lehmann, & Call, 2007). Following 125 an agent's gaze provides insights into their intentions, thoughts, and feelings by acting as a 126 "front end ability" (Brooks & Meltzoff, 2005, p. 535). In our definition, gaze understanding 127 goes one step further by including the acting on the gaze-cued location – therefore, using 128 the available social information to guide one's behavior as needed in real-life conditions. 129

To address the psychometric shortcoming of earlier work, we implemented the
following design features: First, we used a continuous measure which allowed us to capture
fine grained individual differences at different ages. Second, we designed short trials that
facilitate more than a dozen replicates per subject. The result are more precise
individual-level estimates. Third, we systematically investigated the psychometric
properties of the new task. Finally, to validate the task, we studied how it relates to
aspects of children's everyday experience.

Designing this task required a new testing infrastructure. We designed the task as an interactive browser-based web app. This greatly increased the flexibility with which we could modify the stimuli on a trial-by-trial basis. Furthermore, because the task is largely self-contained, it is much more controlled and standardized. Most importantly perhaps, it

makes the task portable: testing is possible in-person using tablets but also remotely via
the internet (no installation needed). As such, it provides a solid basis to study individual
differences in gaze understanding across ages at scale. We make the task and its source
code openly accessible for other researchers to use and modify.

### Task design

## 46 Implementation

145

The code is open-source (https://github.com/ccp-eva/gafo-demo) and a live demo version can be found under: https://ccp-odc.eva.mpg.de/gafo-demo/.

The web app was programmed in JavaScript, HTML5, CSS and PHP. For stimulus 149 presentation, a scalable vector graphic (SVG) composition was parsed. This way, the 150 composition scales according to the user's view port without loss of quality, while keeping 151 the aspect ratio and relative object positions constant. Furthermore, SVGs allow us to define all composite parts of the scene (e.g., pupil of the agent) individually. This is needed 153 for precisely calculating exact pupil and target locations and sizes. Additionally, it makes it 154 easy to adjust the stimuli and, for example, add another agent to the scene. The web app 155 generates two file types: (1) a text file (.json) containing meta-data, trial specifications and 156 participants' click responses, and (2) a video file (.webm) of the participant's webcam 157 recording. These files can either be sent to a server or downloaded to the local device. 158

#### 159 Stimuli

Our newly implemented task features an online game where children or adults are
asked to search for a balloon. The events proceed as follows (see Figure 1B and C). An
animated agent (a sheep, monkey, or pig) looks out of a window of a house. A balloon (i.e.,
target; blue, green, yellow, or red) is located in front of them. The target then falls to the
ground. At all times, the agent's gaze tracks the movement of the target. That is, the

pupils and iris of the agent move in a way that their center aligns with the center of the target. While the distance of the target's flight depends on the final location, the target moves at a constant speed. Participants are then asked to locate the target: they respond by touching or clicking on the screen. Visual access to the target's true location is manipulated by a hedge. Participants either have full, partial, or no visual access to the true target location. When partial or no information about the target location is accessible, participants are expected to use the agent's gaze as a cue.

To keep participants engaged and interested, the presentation of events is
accompanied by cartoon-like effects. Each trial starts with an attention-getter: an
eye-blinking sound plays while the pupils and iris of the agent enlarge (increase to 130%)
and change in opacity (decrease to 75%) for 0.3 sec. The landing of the target is
accompanied by a tapping sound. Once the target landed, the instructor's voice asks
"Where is the balloon?". For confirming the participant's click, a short plop sound plays
and a small orange circle appears at the location of choice. If no response is registered
within 5 secs after the target landed, an audio prompt reminds the participant to respond.

### 80 Trials

Trials differ in the amount of visual access that participants have to the final target 181 position. Before the test trials start, participants complete four training trials during which 182 they familiarize themselves with clicking the screen. In the first training trial, participants 183 have full visual access to the target flight and the target's end location and are simply 184 asked to click on the visible balloon. In the second and third training trials, participants 185 have partial access: they witness the target flight but cannot see the target's end location. They are then asked to click on the hidden balloon, i.e., the location where they saw the target land. In test trials, participants have no visual access to the target flight or the end 188 location. Participants are expected to use the agent's gaze as a cue to locate the target. 189 The first trial of each type comprises a voice-over description of the presented events. The

audio descriptions explicitly state that the agent is always looking at the target (see
Appendix for audio script). After the four training trials, participants receive 15 test trials.
The complete sequence of four training trials and 15 test trials can be easily completed
within 5-10 minutes.

### 195 Study versions

We designed two study versions which differ in the final hiding place of the target 196 and, consequently, on the outcome measure: a hedge version (continuous) and a box version (discrete). Both versions use the same first training trial and then differ in the consecutive 198 training and test trials. In the hedge version, participants have to indicate their estimated target location directly on a hedge. Here, the dependent variable is imprecision, which is 200 defined as the absolute difference between the target center and the x coordinate of the 201 participant's click. In the box version, the target lands in a box and participants are asked 202 to click on the box that hides the target. Researchers have the choice how many boxes are 203 shown: one up to eight boxes can be displayed as potential hiding locations. Here, we use a 204 categorical outcome (i.e., which box was clicked) to calculate the proportion of correct 205 responses. Note that in the test trials of both versions, the target flight is covered by a 206 hedge. In the hedge version, the hedge then shrinks to a minimum height required to cover 207 the target's end location. In the box version, the hedge shrinks completely. The boxes then 208 hide the target's final destination (see Figure 1B and C). 209

### 210 Randomization

All agents and target colors appear equally often and are not repeated in more than
two consecutive trials. The randomization of the target end location depends on the study
version. In the hedge version, the full width of the screen is divided into ten bins. Exact
coordinates within each bin are then randomly generated. In the box version, the target

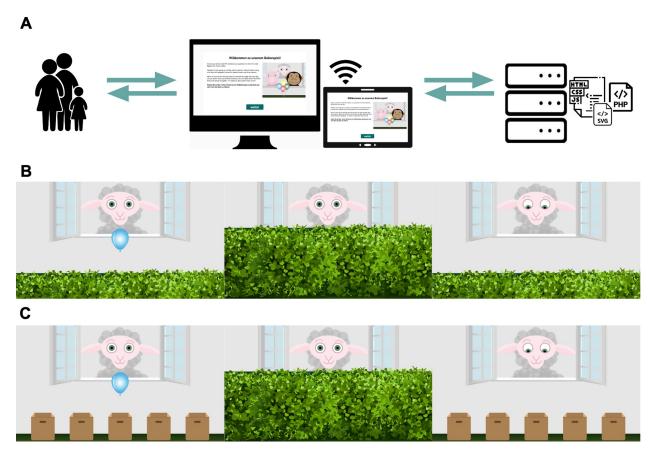


Figure 1. Study setup. (A) Infrastructure for online testing. (i) Subjects aged 3 – 99+ can participate. Data collection can take place anywhere: online, in kindergartens or research labs. (ii) The task is presented as a website that works across devices. (iii) The scripts for the website and the recorded data are stored on secure local servers. (B) Hedge version (continuous) of the gaze understanding task. (i) The agent stands in a window with the target in front of them. (ii) A hedge grows and covers the target. (iii) The target falls to a random location on the ground. The agent's eyes track the movement of the target. (C) Box version (discrete) of the gaze understanding task. Number of boxes (min. 1; max. 8) as potential hiding locations can be set according to the researcher's need.

randomly lands in one of the boxes. As with agent and color choice, each bin/box occurs equally often and can only occur twice in a row.

#### Individual differences

Our first aim was to assess whether our gaze understanding task induces
inter-individual variation in a child and adult sample. Furthermore, we were interested in
how the data collection mode influences responses.

Methods, sample size and analysis were pre-registered: https://osf.io/snju6 (child sample) and https://osf.io/r3bhn (adult sample). Participants were equally distributed across the two study versions. The study was approved by an internal ethics committee at the Max Planck Institute for Evolutionary Anthropology. Data was collected between May and October 2021.

## 226 Participants

217

We collected data from an in-person child sample, a remote child sample, and a remote adult sample. In-person testing with children took place in kindergartens in Leipzig, Germany. The in-person child sample consisted of 120 children, including 40 3-year-olds (mean = 41.45 months, SD = 3.85, range = 36 - 47, 22 girls), 40 4-year-olds (mean = 54.60 months, SD = 3.10, range = 48 - 59, 19 girls), and 40 5-year-olds (mean = 66.95 months, SD = 3.39, range = 60 - 71, 22 girls).

For our remote child sample, we recruited families via an internal database. The remote child sample included 147 children, including 45 3-year-olds (mean = 42.62 months, SD = 3.35, range = 36 - 47, 14 girls), 47 4-year-olds (mean = 52.64 months, SD = 3.40, range = 48 - 59, 25 girls), and 55 5-year-olds (mean = 65.11 months, SD = 3.77, range = 60 - 71, 27 girls). Children in our sample grow up in an industrialized, urban Central-European context. Information on socioeconomic status was not formally recorded,

239 although the majority of families come from mixed, mainly mid to high socioeconomic 240 backgrounds with high levels of parental education.

Adults were recruited via *Prolific* (Palan & Schitter, 2018). *Prolific* is an online participant recruitment service from the University of Oxford with a predominantly European and US-american subject pool. Participants consisted of 50 and 50 English-speakers with an average age of 31.92 and 30.76 years (SD = 12.15 and 9.12, range = 18 and 19 - 63 and 59, 36 and 28 females). For completing the study, subjects were payed above the fixed minimum wage (in average £10.00 per hour).

### Procedure Procedure

Children in our in-person sample were tested on a tablet in a quiet room in their 248 kindergarten. An experimenter guided the child through the study. Children in the remote 249 sample received a personalized link to the study website and families could participate at 250 any time or location they wanted. In the beginning of the online study, families were 251 invited to enter our "virtual institute" and were welcomed by an introductory video of the 252 study leader, shortly describing the research background and further procedure. Then, 253 caregivers were informed about data security and were asked for their informed consent. 254 They were asked to enable the sound and seat their child centrally in front of their device. 255 Before the study started, families were instructed how to setup their webcam and enable 256 the recording permissions. We stressed that caregivers should not help their children. 257 Study participation was video recorded whenever possible in order to ensure that the 258 answers were generated by the children themselves. Depending on the participant's device, the website automatically presented the hedge or box version of the study. For families that used a tablet with touchscreen, the hedge version was shown. Here, children could directly click on the touchscreen themselves to indicate where the target is. For families that used a 262 computer without touchscreen, the website presented the box version of the task. We 263 assumed that younger children in our sample would not be acquainted with the usage of a 264

computer mouse. Therefore, we asked children to point to the screen, while caregivers were asked to act as the "digital finger" of their children and click on the indicated box.

All participants received 15 test trials. In the box version, we decided to adjust the task difficulty according to the sample: children were presented with five boxes while adults were presented with eight boxes as possible target locations.

### 270 Analysis

All test trials without voice over description were included in our analyses. We ran all analyses in R version 4.2.0 (2022-04-22) (R Core Team, 2022). Regression models were fit as Bayesian generalized linear mixed models (GLMMs) with default priors for all analyses, using the function brm from the package brms (Bürkner, 2017, 2018).

To estimate the developmental trajectory of gaze understanding and the effect of data 275 collection mode, we fit a GLMM predicting the task performance by age (in months, 276 z-transformed) and data collection mode (reference category: in-person supervised). The 277 model included random intercepts for each participant and each target position, and a 278 random slope for symmetric target position within participants (model notation in R: performance ~ age + datacollection + (symmetricPosition | subjID) + (1 | 280 targetPosition)). Here, targetPosition refers to the exact bin/box of the target, while 281 symmetricPosition refers to the absolute distance from the stimulus center (i.e., smaller 282 value meaning more central target position). We expected that trials could differ in their 283 difficulty depending on the target centrality and that these these item effects could vary between participants. 285

For the hedge version, performance was defined as the absolute click distance between
the target center and the click X coordinate, scaled according to target widths, and
modeled by a lognormal distribution. For the box version, the model predicted correct
responses (0/1) using a Bernoulli distribution with a logit link function. We inspected

the posterior distribution (mean and 95% Confidence Interval (CI)) for the age and data collection estimates.

#### 292 Results

We found a strong developmental effect: with increasing age, participants got more
and more accurate in locating the target. In the hedge version, children's click imprecision
decreased with age, while, in the box version the proportion of correct responses increased
(see Figure 2A and F). Most participants in the box version performed above chance level.

By the end of their sixth year of life, children came close to the adult's proficiency level.

Most importantly, however, we found substantial inter-individual variation across study
versions and age groups. For example, some three-year-olds were more precise in their
responses than some five-year-olds. Even though variation is smaller, we even find
inter-individual differences in the adult sample.

As Figure 2A and F show, our remotely collected child data resembled the data from
the kindergarten sample. We found evidence that responses of children participating
remotely were slightly more precise. This difference was mainly driven by the younger
participants and especially prominent in the box version of the task. It is conceivable that
caregivers were especially prone to influence the behavior of younger children. In the box
version, caregivers might have had more opportunities to interfere since they carried out
the clicking for their children.<sup>1</sup>

Our GLMM analysis corroborated the visual inspection of the data: in the hedge version, the estimates for age ( $\beta = -0.33$ ; 95% CI [-0.41; -0.24]) and data collection mode -0.32 (95% CI [-0.50; -0.14]) were negative and reliably different from zero. In the box

 $<sup>^1</sup>$  In an exploratory analysis, we coded parental behavior and environmental factors during remote unsupervised testing. We focused on the subsample with the greatest performance difference between data collection modes: the three-year-olds in the box version of the task (n = 16). We reasoned that if parental interference cannot explain the greatest performance difference in our sample, the effects would be negligible in the remaining sample. Based on our model comparison, we conclude that there is no clear evidence of a stable effect of parental interference. See Supplements for further detail.

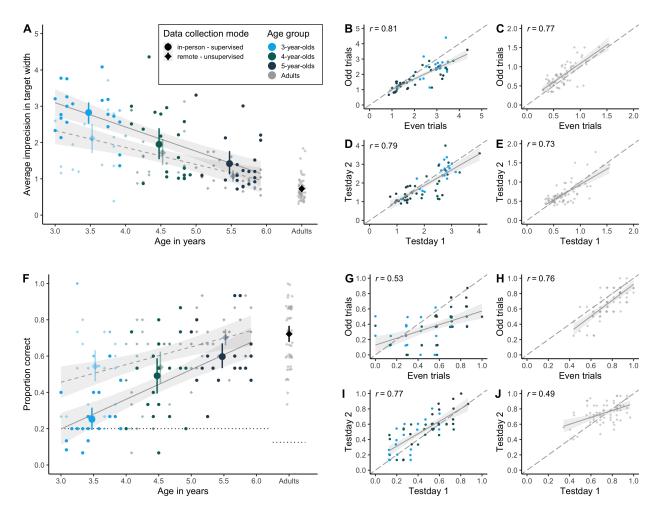


Figure 2. Measuring inter-individual variation. (A) Developmental trajectory in continuous hedge version. Performance is measured as average imprecision, i.e., the absolute distance between the target's center and the participant's click. The unit of imprecision is counted in the width of the target, i.e., a participant with an imprecision of 1 clicked in average one target width to the left or right of the true target center. (B) Internal consistency (odd-even split) in hedge child sample. (C) Internal consistency in hedge adult sample. (D) Test-retest reliability in hedge child sample. (E) Test-retest reliability in hedge adult sample. (F) Developmental trajectory in discrete box version. Performance is measured as the proportion of correct responses, i.e., how many times the participant clicked on the box that actually contained the target. Dotted black line shows level of performance expected by chance (for child sample 20%, i.e., 1 out of 5 boxes; for adult sample 12.5%, i.e., 1 out of 8 boxes). (G) Internal consistency (odd-even split) in box child sample. (H) Internal consistency in box adult sample. (I) Test-retest reliability in box child sample. (J) Testretest reliability in box adult sample. Regression lines with 95% CI show smooth conditional mean based on a linear model (generalized linear model for box version), with *Pearson*'s correlation coefficient r. Large points with 95% CI (based on non-parametric bootstrap) represent performance means by age group (binned by year). Small points show the mean performance for each subject. Shape of data points represents data collection mode: opaque circles for in-person supervised data collection, translucent diamonds for remote unsupervised data collection. Color of data points denotes age group.

version, the estimate of age ( $\beta = 0.63$  (95% CI [0.40; 0.88]) and the estimate of data collection mode ( $\beta = 1.11$  (95% CI [0.68; 1.56]) were positive and reliably different from zero. Note that even though confidence intervals from the data collection estimates were wide, the effect was positive and reliably different from zero in a way that our remote sample performed more accurately than our in-person sample.

#### Discussion

325

Our task induced inter-individual variation in both adults and children. We see
substantial developmental gains: with increasing age, participants got more and more
precise in locating the target. The five-year-olds reached a proficiency level close to the
adults' level. For neither study version nor age group did we find any floor or ceiling
effects. The presentation as a tablet game kept children interest and motivated throughout
the 15 test trials. Furthermore, we found a comparable developmental trajectory for an
unsupervised remote child sample. This illustrates the flexibility of the task.

### Internal consistency and retest reliability

As a next step, we aimed at investigating whether the variation that we captured
with our gaze understanding task is reliable. We assessed internal consistency (split-half
reliability) and test-retest reliability. Data collection and analysis were pre-registered (can
be found here: https://osf.io/xqm73 for child sample, and https://osf.io/nu62m adult
sample). Participants were equally distributed across the two study versions. The study
was approved by an internal ethics committee at the Max Planck Institute for Evolutionary
Anthropology. Data was collected between July 2021 and April 2022.

## 333 Participants

Participants were recruited in the same way as in the previous study. The child sample consisted of 120 children, including 41 3-year-olds (mean = 42.34 months, SD = 3.10, range = 37 - 47, 20 girls), 41 4-year-olds (mean = 53.76 months, SD = 3.15, range = 48 - 59, 21 girls), and 38 5-year-olds (mean = 66.05 months, SD = 3.40, range = 60 - 71, 19 girls).

The adult sample consisted of 70 and 66 English-speakers with an average age of 25.43 and 26.05 years (SD = 6.43 and 9.44, range = 18 and 18 - 51 and 71, 45 and 42 females).

### Procedure Procedure

We applied the same procedure as in the first study, with the following differences. 342 Participants completed the study twice, with a delay of  $14 \pm 3$  days. The target locations as well as the succession of agents and target colors was randomized once and then held constant across participants. The child sample received 15 test trials. In the hedge version, each bin occurred once, making up ten of the test trials. For the remaining five test trials, 346 we repeated one out of two adjacent bins (i.e., randomly chose between bin 1 & 2, bin 3 & 4, etc). In the box version, we ensured that each of the five boxes occurred exactly three 348 times. For the remaining training trials, we repeated a fixed order of four random 349 bins/boxes. Adults in the hedge version received 30 test trials, each of the ten bin 350 occurring exactly three times. Adults in the box version received 32 test trials with each of 351 the eight boxes occurring exactly four times. 352

#### 353 Analysis

We assessed reliability in two ways. First, we focused on the internal consistency by
calculating splithalf reliability coefficients. For each subject, trials were split into odd and
even trials, performance was aggregated and then correlated using *Pearson* coefficients. For

this, we used the data of the first test day. Performance was defined according to study 357 version: in the hedge version, performance referred to the mean absolute difference between 358 the target center and the click coordinate, scaled according to target widths; in the box 359 version, we computed the mean proportion of correct choices. Pronk, Molenaar, Wiers, and 360 Murre (2021) recently compared various methods for computing split-half reliability that 361 differ in how the trials are split into parts and whether they are combined with 362 stratification by task design. To compare our traditional approach of a simple odd-even 363 split, we additionally calculated reliability estimates using first-second, odd-even, permutated, and Monte Carlo splits without and with stratification by target position. 365 First-second and odd-even splits belong to single sample methods, since each participant 366 has a single pair of performance scores, while permutated (without replacement) and 367 Monte Carlo (with replacement) splits make use of resampling. Analyses were run using the function by split from the splithalfr package (Pronk et al., 2021).

Second, we assessed the test-retest reliability. We calculated performance scores 370 (depending on study version as described above) for each participant in each test session 371 and correlated them using *Pearson* correlation coefficients. Furthermore, for our child 372 sample we report an age-corrected correlation between the two test days using a GLMM 373 based approach (Rouder & Haaf, 2019). We fit trial by trial data with a fixed effect of age, 374 a random intercept for each subject and a random slope for test day (model notation in R: 375 performance ~ age (0 + reliday | subjID)). For the hedge version, performance was 376 modeled by a lognormal distribution, while the model for the box version used a Bernoulli 377 distribution with a logit link function. The model computes a correlation between the participant specific estimates for each test day. This can be interpreted as the test-retest reliability. By using this approach, we do not need to compromise on data aggregation and, therefore, loss of information. Since the model uses hierarchical shrinkage, we obtain 381 regularized, more accurate person-specific estimates. Most importantly, the model includes 382 age as a fixed effect. The correlation between the two person-specific estimates is 383

consequently the age-independent estimate for test-retest reliability. This rules out the
possibility that a high correlation between test days arises from domain general cognitive
development instead of study-specific inter-individual differences. A high correlation
between our participant specific model estimates would speak for a high association
between test days.

### 9 Results

We found that our gaze understanding task induced systematic variation: splithalf 390 and test-retest reliability was high for most samples. For the internal consistency, we show 391 traditional odd-even splits on our data and the corresponding *Pearson* correlation coefficients in Figure 2B, C, G and H. Figure 3 compares splithalf reliability coefficients by splitting and stratification method (Pronk et al., 2021). In the hedge version, the splithalf reliability coefficients ranged from 0.57 to 0.84. In the box version, splithalf reliability coefficients ranged from 0.49 to 0.76. Similarly to the results of Pronk et al. (2021), we found that more robust splitting methods that are less prone to task design or time 397 confounds yielded higher reliability coefficients. In the majority of cases, stratifying by 398 target position lead to similar or even higher estimates compared to no stratification. As 399 might be expected, we found higher coefficients for the samples with higher variation, i.e., 400 for our continuous hedge version of the task. 401

For the test-retest reliability, we show the association between raw performance scores of the two test days and corresponding *Pearson* correlation coefficients in Figure 2D, E, I and J.<sup>2</sup>

The age-corrected, GLMM based retest reliabilities for children yielded similar results. In hedge version it was 0.89 (95% CI [0.65;1.00]). In the box version it was 0.91

<sup>&</sup>lt;sup>2</sup> In the hedge version, we excluded one 5-year-old child from the test-retest analysis. The performance of the mentioned child was 3 standard deviations above the mean on both test days. Including the child yielded a *Pearson* correlation coefficient of r = 0.87.

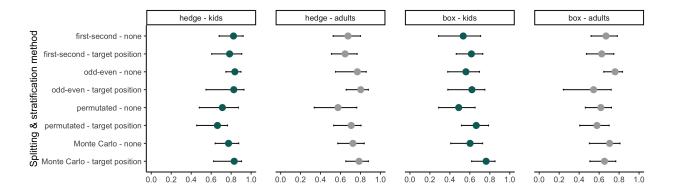


Figure 3. Internal Consistency. Reliability coefficients per splitting method, stratification level, study version and age group. Error bars show the 95% confidence intervals of the coefficient estimates, calculated with the function by\_split from the splithalfr package (Pronk et al., 2021).

407 (95% CI [0.71;1.00]).

#### 08 Discussion

Our results indicated that the measured variation was systematic. As could be
expected, the continuous measure of the hedge version yielded higher reliability estimates
than the discrete box version. For children, the model based reliability estimates showed
that the task did capture individual differences even when correcting for age. This
corroborates what we already see in Figure 2: there was a clear overlap between age
groups, indicating that age is predictive of performance for the mean, but is not the main
source of individual differences.

Validity

Our third aim was to assess whether the captured individual variation in gaze
understanding relates to factors in children's real live social environment. Previous studies
found associations between social cognition measures and various environmental factors
(Devine & Hughes, 2018; Hughes & Leekam, 2004), including family background and
education [Cutting and Dunn (1999); bulgarelli2016social], number and age of siblings and

family constellation Cassidy, Fineberg, Brown, & Perkins (2005), interaction with siblings
(Dunn et al., 1991), and centre-based childcare (Bulgarelli & Molina, 2016). It is assumed
that opportunities to play, communicate and argue with siblings and similarly-aged peers
help children to understand the human mind. Therefore, if we find a link between gaze
understanding and family factors, we regard this as an indicator for the validity of our
measure.

## 428 Participants

For this exploratory analysis, we included all children of the aforementioned samples where families filled out a short demographic questionnaire. This subsample consisted of 109 children, including 30 3-year-olds (mean = 41.82 months, SD = 3.31, range = 36 - 47, 19 girls), 36 4-year-olds (mean = 54.32 months, SD = 2.95, range = 48 - 59, 27 girls), and 43 5-year-olds (mean = 66.43 months, SD = 3.48, range = 60 - 71, 22 girls).

#### Procedure Procedure

Families of our kindergarten and online child sample were asked to fill out a brief
demographic questionnaire. We asked for (1) the total number of household members, (2)
the number of children, (3) age of the other children, (4) whether the child was in day care,
and if yes, (5) since when and (6) for how long on an average day.

#### 439 Analysis

To estimate the effects of social surrounding on gaze understanding, we fit GLMMs
predicting the task performance by each of our questionnaire variables, controlling for age
(in months, z-transformed), data collection mode (reference category: in-person
supervised) and study version (reference category: hedge version). The models included
random intercepts for each participant and each target position, and a random slope for

symmetric target position within participants. Therefore, our null model closely resembled the structure from our first analysis (see Analysis section of Does the gaze understanding 446 task induce variation?; here: performance ~ age + datacollection + studyversion + 447 (symmetricPosition | subjID) + (1 | targetPosition)). In order to combine data of 448 our two study versions, we transformed continuous click responses from the hedge version 449 into a discrete outcome. For the target position, we categorized two adjacent bins as one 450 imaginary box. To measure participants' performance, we created imaginary box 451 boundaries around the target's landing position and examined whether the participant's 452 click response fell into this imaginary box. Across the two study versions, we could 453 consequently model the participant's correct response (0/1) using a Bernoulli distribution 454 with a logit link function. For model comparisons, we ran separate models, each with one 455 of the following predictors as a fixed effects added to the null model: number of household members, number of children aged 0-18 in household, number of children aged 1-12 in household, hours spent in childcare each day, and age when subject entered childcare. In addition, we calculated three index scores. First, we calculated a sibling variety score 459 according to Peterson (2000). Second, we implemented the modified version of Cassidy et 460 al. (2005) (for more details, see Supplements). Third, based on our own data exploration, 461 we calculated the amount of peer exposure determined as the number of siblings and the 462 average hours spent in childcare (both z-transformed). We compared the models using 463 WAIC (widely applicable information criterion) scores and weights (McElreath, 2020). As 464 an indicator of out-of-sample predictive accuracy, lower WAIC scores stand for a better 465 model fit. WAIC weights represent the probability that the model in question provides the 466 best out-of-sample prediction compared to the other models. 467

#### 68 Results

The model including our peer exposure index, as defined as the number of other children in the household and average hours spent in childcare, showed the best

out-of-sample predictive accuracy. Note that we did not find a great difference in WAIC 471 scores between the compared models (see Supplements for WAIC scores and weights). The 472 model estimates were all considerably smaller than estimates of age, study version and 473 data collection, and all 95\% CIs included zero. For example, for our winning model, we 474 found a peer exposure estimate of  $\beta = 0.17$  (95% CI [-0.03; 0.36]), with the estimates of 475 age being  $\beta = 0.57$  (95% CI [0.38; 0.77]), data collection mode being  $\beta = 0.95$  (95% CI [0.56; 476 1.35]), and study version  $\beta = 1.87$  (95% CI [0.25; 3.59]). Nevertheless, a general pattern 477 emerges: exposure to a more variable social environment positively influenced children's 478 gaze understanding. The number of people and, more specifically, children, as well as the 479 more diverse their age, the more likely children were to understand the agent's gaze cue. 480 The only predictor resulting in a negative estimate was the age at which a participant 481 entered childcare, i.e., the later a child entered, the better performance in the task.

#### 483 Discussion

492

We found that factors of children's social surrounding influenced their gaze
understanding. Even though the effects are small and confidence intervals wide, it is
remarkable that we were able to detect relationships between this fundamental
social-cognitive ability and very distant, real life variables. Previous studies often focused
on more complex, later developing social-cognitive abilities (e.g., false belief
understanding). Apparently, systematic links between family factors and social-cognitive
abilities can be found even when looking at more fundamental social-cognitive abilities like
gaze understanding.

#### General Discussion

In this paper, we presented a new experimental paradigm to study individual
differences in gaze understanding across the lifespan. This paper contributes to
methodological advances in developmental psychology in the following ways. First, our new

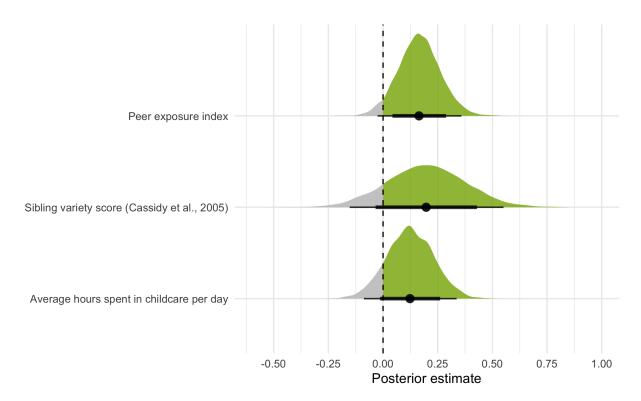


Figure 4. External validity of the gaze understanding task. Factors of children's social surroundings and their influence on the probability of responding correctly. Models are ordered according to their WAIC scores, with the uppermost winning the model comparison. The graph shows the estimated density curves of a model's predictor coefficient. Only models performing better than our null model are included in the graph.

web-based testing infrastructure proved useful for standardized, portable data collection at
scale, both remotely as well as in-person. Second, we could captured fine-grained
individual differences in gaze understanding at different ages – from early childhood until
adulthood. Third, our task showed satisfactory psychometric properties with respect to
internal consistency and retest reliability estimates. Finally, we found that gaze
understanding relates to aspects of children's everyday experience. The web app
(https://ccp-odc.eva.mpg.de/gafo-demo/) and its source code
(https://github.com/ccp-eva/gafo-demo) are openly accessible. We want to highlight that
researchers are welcome to use and modify our task according to their needs.

One of the main contributions of this paper is that our newly presented gaze understanding task induces variation between participants. This is primarily achieved

through the implementation of short trials, resulting in over a dozen replicates per subject (15 test trials within 5-10 minutes testing time). Our experimental design enables a continuous outcome measure, which again quantifies individual differences.

In our task, participants are asked to locate a balloon by using the gaze cues of 510 another agent. The outcome measure depends on the presented study version: in the hedge 511 version, we implemented a continuous measure, while the box version employs a categorical 512 measure. Our continuous hedge version yields higher internal consistency estimates 513 compared to the categorical box version. Both study versions exhibit high retest reliability. 514 Therefore, when a sufficient amount of trials is presented, the box version of the task can 515 yield reliable individual estimates [cf. Hughes et al. (2000); improved reliability through 516 aggregation. When testing time is limited, we would recommend the use of the continuous 517 study version for higher internal consistency. However, the categorical box version 518 demonstrates design features that might be preferable in some research contexts: the 519 discrete outcome might facilitate clicking for children. In addition, researchers could induce 520 different levels of salience for each box. Our task could consequently be used to study bias, 521 preferences and diverse desires (e.g. matching the box appearance to some feature of the 522 agent). In sum, our task provides a step towards more robust and reliable research methods, especially with regards to individual differences research.

In addition to the new task design itself, we designed a new testing infrastructure.

Our gaze understanding task is presented as an interactive web app. This enables

presentation across devices without any prior installation. Stimuli presentation is achieved

through the use of SVGs. This has several advantages: the aspect ratio and stimulus

quality are kept constant no matter which size the web browser displays. Most

importantly, we can dynamically modify the stimulus details (e.g., positions) on a

trial-by-trial basis. Presented agents and objects can be easily adapted for future task

modifications or specific cultural settings. The cartoon-like presentation makes the task

engaging for children and adults alike.

Participants can be tested in-person with supervision or remotely at home. Test 534 instructions are standardized and, with prior informed consent, the webcam records study 535 participation. This allows us to scale up data collection: testing is flexible, fast and 536 requires no further experimenter training. We compared children participating in-person, 537 supervised in kindergartens with children participated remotely at home. Our results 538 suggest a comparable developmental trajectory of gaze understanding in both samples. 530 Children in the remote sample are slightly more precise. This effect is most pronounced in 540 the three-year-olds in the box version (for an analysis of the webcam recordings, see Appendix XXX). Therefore, we recommend using a tablet for remote data collection. 542 Children can then click for themselves and caregivers have less chance to interfere.

After finding consistent and reliable individual estimates, we aimed at verifying the appropriateness of our new task. Validity is often assessed by looking at concurrent 545 relations between measures. Here we looked at a relation that is often postulated for social 546 cognition tasks, namely that social-cognitive ability is predicted by family level variables. 547 We found that children's gaze understanding relates to factors of their social environment: 548 children were more accurate, the more social exposure and the more diverse their 549 surrounding was. However, compared to our fine-grained, parametric measure of gaze 550 understanding, family variables were only captured on the surface level by employing single 551 questionnaire items. We hope that future technological advances will enable continuous 552 measures of children's real life social surroundings (Barr et al., 2020; Long, Kachergis, 553 Agrawal, & Frank, 2020; Rogoff, Dahl, & Callanan, 2018).

#### 555 Future research

Even though aggregate scores seem to improve reliability estimates (cf. Hughes et al., 2000), they may smooth out noise that could be attributed to individual differences. As we could see in the splithalf reliability calculations, the more accurately the statistical method represents the task structure, the higher our reliability estimates are. Therefore, we argue

that future research should aim at implementing statistical analyses that mirror the 560 experimental design in its complexity. A potentially promising approach are computational 561 cognitive models. We could take advantage of all available information and model variation 562 between and within individuals in an even more fine-grained and interpretable manner. 563 Computational frameworks could also be used to model performance and their underlying 564 cognitive processes across tasks. With nested hierarchical models, we could assess the 565 systematic relation between various social-cognitive abilities and recover potentially shared 566 structures between cognitive processes (Bohn, Tessler, Kordt, Hausmann, & Frank, 2022). 567

Adding complexity to our gaze understanding task might increase individual differences in an adult sample. Researchers could consider to adjust the task difficulty, for example, by adjusting the target speed or implementing a saccade version (i.e., where the agent only briefly looks at the target position and then back to the center). By inducing more between-person variance, reliability estimates could further increase.

Our future goal is to utilize the presented testing infrastructure for further studies on social-cognitive abilities. We aim at creating a task battery to study individual differences in various aspects of social cognition. As Schaafsma et al. (2015) pointed out, social cognition is encompasses a whole range of abilities which could be best assessed by task batteries. We want to move from the most fundamental social-cognitive abilities to more complex processes like knowledge-ignorance or false belief understanding.

579 Limitations

580 Conclusion

big picture

568

569

570

571

572

581

582

- ind diff important for ..., good measures needed
- dedicated measures of ind diff instead of simply using well-established. reliability
  paradox paper zitieren

• task & infrastructure

585

586

596

597

598

601

602

• foundations for more precise measures for cognitive development

587

We presented a new experimental paradigm to study individual differences in a

fundamental social-cognitive ability – gaze understanding. The task is presented as an

interactive web app that does not require any prior installation and works across devices.

Data collection is enabled at scale, with supervised and remote testing and standardized

test instructions. Stimuli presentation is achieved through the use of SVGs which has

several advantages: the aspect ratio and stimulus quality are kept constant no matter

which size the web browser displays. Most importantly, we can dynamically modify the

stimulus details (e.g., positions) on a trial-by-trial basis.

In our task, participants are asked to locate a balloon by using the gaze cues of another agent. Therefore, participants need to follow the agent's gaze and act according to this social cue. The outcome measure depends on the presented study version: in the hedge version, we implemented a continuous measure, while the box version employs a categorical measure. Short trials facilitate a substantial number of trials – here, we employed 15 test trials within 5-10 minutes testing time. The cartoon-like presentation makes the task engaging for children and adults alike.

First, our new web-based testing infrastructure proved useful for standardized,
portable data collection at scale, both remotely as well as in-person. Second, we could
show that we captured fine grained individual differences in gaze understanding at different
ages – especially in the continuous hedge version. Third, our task showed satisfactory
psychometric properties with respect to internal consistency and retest reliability
estimates. Finally, we found that gaze understanding relates to aspects of children's
everyday experience. The web app (https://ccp-odc.eva.mpg.de/gafo-demo/) and its

612

613

614

615

616

617

618

619

620

621

622

623

624

source code (https://github.com/ccp-eva/gafo-demo) are openly accessible. We want to highlight that researchers are welcome to use and modify our task according to their needs.

- From previous intro potentially:
  - Hedge et al. (2018) section on reliability paradox
  - Few studies that do realize continuous measures often administer (theory of mind) scales and conventionally compute aggregate scores (across tasks or trials), therefore neglecting the issue of measurement error (Hughes et al., 2011).
     This way, a particular social-cognitive ability in question is still assessed categorically on a trial basis (e.g., Bulgarelli & Molina, 2016; Buttelmann et al., 2021; Rizzo & Killen, 2018).
    - Additionally, it has been argued that social-cognitive abilities should not be treated as an all-or-nothing matter (e.g., dichotomously in pass/fail situations)
       but as abilities on a continuum (Beaudoin et al., 2020; Hughes & Devine, 2015).
       Task batteries might be better suited to cover a range of social-cognitive abilities (Hughes et al., 2011).

Declarations

#### Open practices statement

The web application (https://ccp-odc.eva.mpg.de/gafo-demo/) described here is open source (https://github.com/ccp-eva/gafo-demo). The datasets generated during and/or analysed during the current study are available in the [gazecues-methods] repository, (https://github.com/jprein/gazecues-methods). All experiments were preregistered (https://osf.io/zjhsc/).

### 632 Funding

This study was funded by the Max Planck Society for the Advancement of Science, a noncommercial, publicly financed scientific organization (no grant number). We thank all the children and parents who participated in the study.

### 636 Conflicts of interest

The authors declare that they have no conflict of interest.

# Ethics approval

## 639 Consent to participate

Informed consent was obtained from all individual participants included in the study or their legal guardians.

## 642 Consent for publication

### Open access

# Authors' contributions

optional: please review the submission guidelines from the journal whether statements are mandatory

References 647 Astor, K., Lindskog, M., Forssman, L., Kenward, B., Fransson, M., Skalkidou, A., 648 Gredebäck, G. (2020). Social and emotional contexts predict the 649 development of gaze following in early infancy. Royal Society Open Science, 650 7(9), 201178. https://doi.org/10.1098/rsos.201178 651 Astor, K., Thiele, M., & Gredebäck, G. (2021). Gaze following emergence relies on 652 both perceptual cues and social awareness. Cognitive Development, 60, 101121. 653 https://doi.org/10.1016/j.cogdev.2021.101121 654 Baron-Cohen, S., Leslie, A. M., & Frith, U. (1985). Does the autistic child have a 655 "theory of mind"? Cognition, 21, 37–46. 656 https://doi.org/10.1016/0010-0277(85)90022-8 657 Barr, R., Kirkorian, H., Radesky, J., Coyne, S., Nichols, D., Blanchfield, O., ... 658 Fitzpatrick, caroline. (2020). Beyond Screen Time: A Synergistic Approach to a 659 More Comprehensive Assessment of Family Media Exposure During Early 660 Childhood. Frontiers in Psychology, 11. 661 Barrett, H. C., Broesch, T., Scott, R. M., He, Z., Baillargeon, R., Wu, D., ... 662 Laurence, S. (2013). Early false-belief understanding in traditional non-Western 663 societies. Proceedings of the Royal Society B: Biological Sciences. 664 https://doi.org/10.1098/rspb.2012.2654 665 Beaudoin, C., Leblanc, E., Gagner, C., & Beauchamp, M. H. (2020). Systematic 666 Review and Inventory of Theory of Mind Measures for Young Children. Frontiers in Psychology, 0. https://doi.org/10.3389/fpsyg.2019.02905 Benson, J., Sabbagh, M., Carlson, S., & Zelazo, P. (2012). Individual Differences in Executive Functioning Predict Preschoolers' Improvement From Theory-of-Mind 670 Training. Developmental Psychology, 49. https://doi.org/10.1037/a0031056 671 Bohn, M., Tessler, M. H., Kordt, C., Hausmann, T., & Frank, M. C. (2022). An 672 individual differences perspective on the development of pragmatic abilities in the 673

700

preschool years. PsyArXiv. https://doi.org/10.31234/osf.io/s2e3p 674 Brooks, R., & Meltzoff, A. N. (2005). The development of gaze following and its 675 relation to language. Developmental Science, 8(6), 535–543. 676 https://doi.org/10.1111/j.1467-7687.2005.00445.x 677 Bulgarelli, D., & Molina, P. (2016). Social Cognition in Preschoolers: Effects of 678 Early Experience and Individual Differences. Frontiers in Psychology, 7. 679 https://doi.org/10.3389/fpsyg.2016.01762 680 Bürkner, P.-C. (2017). Brms: An R Package for Bayesian Multilevel Models Using 681 Stan. Journal of Statistical Software, 80(1). 682 https://doi.org/10.18637/jss.v080.i01 683 Bürkner, P.-C. (2018). Advanced Bayesian Multilevel Modeling with the R Package 684 brms. The R Journal, 10(1), 395. https://doi.org/10.32614/RJ-2018-017 685 Buttelmann, D., Kühn, K., & Zmyj, N. (2021). The Relations among Theory of 686 Mind, Inhibitory Control, and Aggressive Behavior in 4-Year-Old Children – A 687 Multi-Measure Multi-Informant Approach. Journal of Cognition and 688 Development,  $\theta(0)$ , 1–24. https://doi.org/10.1080/15248372.2021.1987240 689 Byers-Heinlein, K., Tsui, R. K.-Y., van Renswoude, D., Black, A. K., Barr, R., 690 Brown, A., ... Singh, L. (2021). The development of gaze following in 691 monolingual and bilingual infants: A multi-laboratory study. Infancy, 26(1), 692 4–38. https://doi.org/10.1111/infa.12360 693 Callaghan, T., Rochat, P., Lillard, A., Claux, M. L., Odden, H., Itakura, S., ... 694 Singh, S. (2005). Synchrony in the onset of mental-state reasoning: Evidence 695 from five cultures. Psychological Science. 696 https://doi.org/10.1111/j.0956-7976.2005.01544.x 697 Carlson, S., & Moses, L. J. (2001). Individual Differences in Inhibitory Control and 698 Children's Theory of Mind. Child Development, 72(4), 1032–1053. 690

Carlson, S., Moses, L. J., & Claxton, L. J. (2004). Individual differences in

executive functioning and theory of mind: An investigation of inhibitory control 701 and planning ability. Journal of Experimental Child Psychology, 87(4), 299–319. 702 https://doi.org/10.1016/j.jecp.2004.01.002 703 Cassidy, K. W., Fineberg, D. S., Brown, K., & Perkins, A. (2005). Theory of Mind 704 May Be Contagious, but You Don't Catch It from Your Twin. Child 705 Development, 76(1), 97–106. 706 Coelho, E., George, N., Conty, L., Hugueville, L., & Tijus, C. (2006). Searching for 707 asymmetries in the detection of gaze contact versus averted gaze under different 708 head views: A behavioural study. Spatial Vision, 19(6), 529–545. 709 https://doi.org/10.1163/156856806779194026 710 Cutting, A. L., & Dunn, J. (1999). Theory of Mind, Emotion Understanding, 711 Language, and Family Background: Individual Differences and Interrelations. 712 Child Development, 70(4), 853–865. https://doi.org/10.1111/1467-8624.00061 713 Del Bianco, T., Falck-Ytter, T., Thorup, E., & Gredebäck, G. (2019). The 714 Developmental Origins of Gaze-Following in Human Infants. Infancy, 24(3), 715 433–454. https://doi.org/10.1111/infa.12276 716 Devine, R. T., & Hughes, C. (2018). Family Correlates of False Belief 717 Understanding in Early Childhood: A Meta-Analysis. Child Development, 718 89(3), 971–987. https://doi.org/10.1111/cdev.12682 719 Dunn, J., Brown, J., Slomkowski, C., Tesla, C., & Youngblade, L. (1991). Young 720 children's understanding of other people's feelings and beliefs: Individual 721 differences and their antecedents. Child Development, 62(6), 1352–1366. 722 Frischen, A., Bayliss, A. P., & Tipper, S. P. (2007). Gaze cueing of attention: 723 Visual attention, social cognition, and individual differences. Psychological 724 Bulletin, 133(4), 694–724. https://doi.org/10.1037/0033-2909.133.4.694 725 Gola, A. A. H. (2012). Mental verb input for promoting children's theory of mind: 726

A training study. Cognitive Development, 27(1), 64–76.

727

https://doi.org/10.1016/j.cogdev.2011.10.003 728 Gopnik, A., & Slaughter, V. (1991). Young Children's Understanding of Changes in 729 Their Mental States. Child Development, 62(1), 98. 730 https://doi.org/10.2307/1130707 731 Happé, F., Cook, J. L., & Bird, G. (2017). The Structure of Social Cognition: 732 In(ter)dependence of Sociocognitive Processes. Annual Review of Psychology, 733 68(1), 243–267. https://doi.org/10.1146/annurev-psych-010416-044046 734 Hedge, C., Powell, G., & Sumner, P. (2018). The reliability paradox: Why robust 735 cognitive tasks do not produce reliable individual differences. Behavior Research 736 Methods, 50(3), 1166–1186. https://doi.org/10.3758/s13428-017-0935-1 737 Hernik, M., & Broesch, T. (2019). Infant gaze following depends on communicative 738 signals: An eye-tracking study of 5- to 7-month-olds in Vanuatu. Developmental 739 Science, 22(4), e12779. https://doi.org/10.1111/desc.12779 740 Herrmann, E., Hernández-Lloreda, M. V., Call, J., Hare, B., & Tomasello, M. (2010). The Structure of Individual Differences in the Cognitive Abilities of 742 Children and Chimpanzees. Psychological Science, 21(1), 102–110. 743 https://doi.org/10.1177/0956797609356511 744 Hughes, C., Adlam, A., Happé, F., Jackson, J., Taylor, A., & Caspi, A. (2000). 745 Good Test-Retest Reliability for Standard and Advanced False-Belief Tasks 746 across a Wide Range of Abilities. Journal of Child Psychology and Psychiatry, 747 41(4), 483–490. https://doi.org/10.1111/1469-7610.00633 748 Hughes, C., & Devine, R. T. (2015). Individual Differences in Theory of Mind From 749 Preschool to Adolescence: Achievements and Directions. Child Development 750 Perspectives, 9(3), 149–153. https://doi.org/10.1111/cdep.12124 751 Hughes, C., & Ensor, R. (2007). Executive function and theory of mind: Predictive 752 relations from ages 2 to 4. Developmental Psychology, 43(6), 1447–1459. 753 https://doi.org/10.1037/0012-1649.43.6.1447 754

781

Hughes, C., Ensor, R., & Marks, A. (2011). Individual differences in false belief 755 understanding are stable from 3 to 6 years of age and predict children's mental 756 state talk with school friends. Journal of Experimental Child Psychology, 108(1), 757 96–112. https://doi.org/10.1016/j.jecp.2010.07.012 758 Hughes, C., & Leekam, S. (2004). What are the Links Between Theory of Mind and 759 Social Relations? Review, Reflections and New Directions for Studies of Typical 760 and Atypical Development. Social Development, 13(4), 590–619. 761 https://doi.org/10.1111/j.1467-9507.2004.00285.x 762 Imuta, K., Henry, J. D., Slaughter, V., Selcuk, B., & Ruffman, T. (2016). Theory of 763 mind and prosocial behavior in childhood: A meta-analytic review. 764 Developmental Psychology, 52(8), 1192-1205. 765 https://doi.org/10.1037/dev0000140 Itakura, S., & Tanaka, M. (1998). Use of experimenter-given cues during 767 object-choice tasks by chimpanzees (Pan troglodytes), an orangutan (Pongo 768 pygmaeus), and human infants (Homo sapiens). Journal of Comparative 769 Psychology, 112(2), 119–126. https://doi.org/10.1037/0735-7036.112.2.119 770 Kidd, E., Donnelly, S., & Christiansen, M. H. (2018). Individual Differences in 771 Language Acquisition and Processing. Trends in Cognitive Sciences, 22(2), 772 154–169. https://doi.org/10.1016/j.tics.2017.11.006 773 Lecce, S., Bianco, F., Devine, R. T., Hughes, C., & Banerjee, R. (2014). Promoting 774 theory of mind during middle childhood: A training program. Journal of 775 Experimental Child Psychology, 126, 52–67. 776 https://doi.org/10.1016/j.jecp.2014.03.002 777 Lee, K., Eskritt, M., Symons, L. A., & Muir, D. (1998). Children's use of triadic eye 778 gaze information for "mind reading". Developmental Psychology, 34(3), 525–539. 779 https://doi.org/10.1037//0012-1649.34.3.525 780

Long, B., Kachergis, G., Agrawal, K., & Frank, M. C. (2020). Detecting social

808

information in a dense dataset of infants' natural visual experience [Preprint]. 782 PsyArXiv. https://doi.org/10.31234/osf.io/z7tdg 783 Mayer, A., & Träuble, B. (2015). The weird world of cross-cultural false-belief 784 research: A true- and false-belief study among samoan children based on 785 commands. Journal of Cognition and Development, 16(4), 650–665. 786 https://doi.org/10.1080/15248372.2014.926273 787 Mayes, L. C., Klin, A., Tercyak, K. P., Cicchetti, D. V., & Cohen, D. J. (1996). 788 Test-Retest Reliability for False-Belief Tasks. Journal of Child Psychology and 789 Psychiatry, 37(3), 313–319. https://doi.org/10.1111/j.1469-7610.1996.tb01408.x 790 McElreath, R. (2020). Statistical rethinking: A Bayesian Course with Examples in 791 R and Stan (Second). Chapman and Hall/CRC. 792 McEwen, F., Happé, F., Bolton, P., Rijsdijk, F., Ronald, A., Dworzynski, K., & 793 Plomin, R. (2007). Origins of individual differences in imitation: Links with 794 language, pretend play, and socially insightful behavior in two-year-old twins. 795 Child Development, 78(2), 474–492. 796 https://doi.org/10.1111/j.1467-8624.2007.01010.x 797 Milligan, K., Astington, J. W., & Dack, L. A. (2007). Language and Theory of 798 Mind: Meta-Analysis of the Relation Between Language Ability and False-belief 799 Understanding. Child Development, 78(2), 622–646. 800 https://doi.org/10.1111/j.1467-8624.2007.01018.x 801 Moore, C. (2008). The Development of Gaze Following. Child Development 802 Perspectives, 2(2), 66-70. https://doi.org/10.1111/j.1750-8606.2008.00052.x 803 Mundy, P., Block, J., Delgado, C., Pomares, Y., Van Hecke, A. V., & Parlade, M. V. 804 (2007). Individual differences and the development of joint attention in infancy. 805 Child Development, 78(3), 938–954. 806 https://doi.org/10.1111/j.1467-8624.2007.01042.x 807 Okumura, Y., Kanakogi, Y., Kobayashi, T., & Itakura, S. (2017). Individual

```
differences in object-processing explain the relationship between early
809
              gaze-following and later language development. Cognition, 166, 418–424.
810
              https://doi.org/10.1016/j.cognition.2017.06.005
811
          Palan, S., & Schitter, C. (2018). Prolific.ac—A subject pool for online experiments.
812
              Journal of Behavioral and Experimental Finance, 17, 22–27.
813
              https://doi.org/10.1016/j.jbef.2017.12.004
814
          Pavarini, G., de Hollanda Souza, D., & Hawk, C. K. (2013). Parental Practices and
815
              Theory of Mind Development. Journal of Child and Family Studies, 22(6),
816
              844-853. https://doi.org/10.1007/s10826-012-9643-8
817
          Perner, J., Ruffman, T., & Leekam, S. R. (1994). Theory of Mind Is Contagious:
818
              You Catch It from Your Sibs. Child Development, 65(4), 1228–1238.
819
              https://doi.org/10.2307/1131316
820
           Peterson. (2000). Kindred spirits: Influences of siblings' perspectives on theory of
821
              mind. Cognitive Development, 15(4), 435–455.
822
              https://doi.org/10.1016/S0885-2014(01)00040-5
823
          Peterson, Wellman, H. M., & Slaughter, V. (2012). The Mind Behind the Message:
824
              Advancing Theory-of-Mind Scales for Typically Developing Children, and Those
825
              With Deafness, Autism, or Asperger Syndrome: The Mind Behind the
826
              Message. Child Development, 83(2), 469–485.
827
              https://doi.org/10.1111/j.1467-8624.2011.01728.x
828
          Pronk, T., Molenaar, D., Wiers, R. W., & Murre, J. (2021). Methods to split
829
              cognitive task data for estimating split-half reliability: A comprehensive review
830
              and systematic assessment. Psychonomic Bulletin & Review.
831
              https://doi.org/10.3758/s13423-021-01948-3
832
          R Core Team. (2022). R: A language and environment for statistical computing
833
              [Manual]. Vienna, Austria: R Foundation for Statistical Computing.
834
          Rakoczy, H. (2022). Foundations of theory of mind and its development in early
835
```

childhood. Nature Reviews Psychology, 1–13. 836 https://doi.org/10.1038/s44159-022-00037-z 837 Repacholi, V. S. & B. (2003). Introduction Individual Differences in Theory of 838 Mind: What Are We Investigating? In *Individual Differences in Theory of Mind*. 839 Psychology Press. 840 Rizzo, M. T., & Killen, M. (2018). Theory of mind is related to children's resource 841 allocations in gender stereotypic contexts. Developmental Psychology, 54(3), 842 510. https://doi.org/10.1037/dev0000439 843 Rogoff, B., Dahl, A., & Callanan, M. (2018). The importance of understanding 844 children's lived experience. Developmental Review, 50, 5–15. 845 https://doi.org/10.1016/j.dr.2018.05.006 846 Rouder, J. N., & Haaf, J. M. (2019). A psychometrics of individual differences in experimental tasks. Psychonomic Bulletin & Review, 26(2), 452-467. 848 https://doi.org/10.3758/s13423-018-1558-y Schaafsma, S. M., Pfaff, D. W., Spunt, R. P., & Adolphs, R. (2015). Deconstructing 850 and reconstructing theory of mind. Trends in Cognitive Sciences, 19(2), 65–72. 851 https://doi.org/10.1016/j.tics.2014.11.007 852 Shepherd, S. (2010). Following Gaze: Gaze-Following Behavior as a Window into 853 Social Cognition. Frontiers in Integrative Neuroscience, 4. 854 Slaughter, V. (2015). Theory of Mind in Infants and Young Children: A Review. 855 Australian Psychologist, 50(3), 169–172. https://doi.org/10.1111/ap.12080 856 Sodian, B., Licata, M., Kristen-Antonow, S., Paulus, M., Killen, M., & Woodward, 857 A. (2016). Understanding of Goals, Beliefs, and Desires Predicts Morally 858 Relevant Theory of Mind: A Longitudinal Investigation. Child Development, 859 87(4), 1221-1232. https://doi.org/10.1111/cdev.12533 860 Tomasello, M., Hare, B., Lehmann, H., & Call, J. (2007). Reliance on head versus 861 eyes in the gaze following of great apes and human infants: The cooperative eye 862

| 863 | hypothesis. Journal of Human Evolution, $52(3)$ , $314-320$ .                        |
|-----|--|
| 864 | $\rm https://doi.org/10.1016/j.jhevol.2006.10.001$                                   |
| 865 | Underwood, B. J. (1975). Individual differences as a crucible in theory construction |
| 866 | $American\ Psychologist,\ 30 \ (2),\ 128-134.\ \ https://doi.org/10.1037/h0076759$   |
| 867 | Walker, S. (2005). Gender Differences in the Relationship Between Young              |
| 868 | Children's Peer-Related Social Competence and Individual Differences in Theory       |
| 869 | of Mind. The Journal of Genetic Psychology, 166(3), 297–312.                         |
| 870 | $\rm https://doi.org/10.3200/GNTP.166.3.297\text{-}312$                              |
| 871 | Wellman, H. M. (2012). Theory of mind: Better methods, clearer findings, more        |
| 872 | development. European Journal of Developmental Psychology, $9(3)$ , $313-330$ .      |
| 873 | $\rm https://doi.org/10.1080/17405629.2012.680297$                                   |
| 874 | Wellman, H. M., Cross, D., & Watson, J. (2001). Meta-analysis of theory-of-mind      |
| 875 | development: The truth about false belief. Child Development, 72, 655–684.           |
| 876 | https://doi.org/10.1111/1467-8624.00304  |
| 877 | Wellman, H. M., & Liu, D. (2004). Scaling of Theory-of-Mind Tasks. Child             |
| 878 | $Development,\ 75(2),\ 523-541.\ \ https://doi.org/10.1111/j.1467-8624.2004.00691.x$ |
| 879 | Wimmer, H., & Perner, J. (1983). Beliefs about beliefs: Representation and           |
| 880 | constraining function of wrong beliefs in young children's understanding of          |
| 881 | deception. $Cognition$ . https://doi.org/10.1016/0010-0277(83)90004-5                |
| 882 | Zhang, Z., Yu, H., Long, M., & Li, H. (2021). Worse Theory of Mind in                |
| 883 | Only-Children Compared to Children With Siblings and Its Intervention.               |
| 884 | Frontiers in Psychology, 12, 5073. https://doi.org/10.3389/fpsyg.2021.754168         |

## Supplements

## Child sample

885

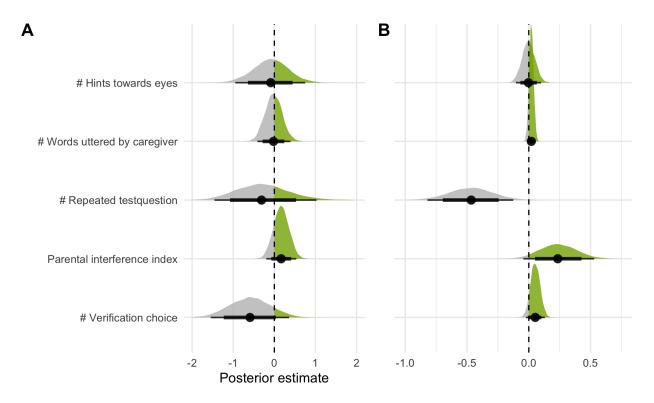


Figure 5. Model comparison for exploratory webcam coding of parental interference. Factors of parental interference and their influence on the probability of responding correctly. The graph shows the estimated density curves of a model's predictor coefficient. Models are ordered according to their WAIC scores in the trial-by-trial analysis, with the uppermost winning the model comparison. (A) Analysis on a trial-by-trial level. (B) Analysis on a subject level.

Webcam coding. Comparing the performances of children across our two data collection modes, we found that children participating remotely were slightly more precise. This difference was especially prominent in younger participants in the box version of the task. It is conceivable that caregivers were especially prone to influence the behavior of younger children. In the box version, caregivers might have had more opportunities to interfere since they carried out the clicking for their children. In an exploratory analysis, we coded parental behavior and environmental factors during remote unsupervised testing.

Due to the time consuming nature of hand coding videos frame by frame, we focused on

the subsample with the greatest performance difference between data collection modes: the three-year-olds in the box version of the task (n = 16). We reasoned that if parental 896 interference cannot explain the greatest performance difference in our sample, the effects 897 would be negligible in the remaining sample. A trial was defined as the time between two 898 eye blinking sounds. We transcribed all utterances by parents and children and counted 890 the words uttered by each. We then classified the utterances into several categories: 900 question asked by child, repeated test questions by caregiver, hints towards agents (how 901 many times the caregivers guided the child's attention to the agent), hints towards eyes 902 (how many times the caregivers guided the child's attention to the agent's eyes), 903 verification of choice (how many times the caregiver questioned or double checked the 904 child's response), mentioning of screen (how many times the caregiver verbally guided the 905 child's attention to the screen), pointing to screen (how many times the caregiver pointed towards the screen), positive & negative feedback, motivational statements, and incomprehensible utterances. In addition, we coded how many adults and children were present, whether a response click was obviously conducted by the caregiver themselves, and 909 whether children took a break during the trial. We conducted a model comparison to 910 estimate the effects of parental interference. Our null model explained the response 911 behavior by age, while including random effects for subject and target position (model 912 notation in R: correct ~ age + (1 | subjID) + (1 | targetPosition). 913

We compared this null model to models including the number of words uttered by the
caregiver, number of repeated testquestions, verification of choice, or hints towards eyes as
fixed effects. Furthermore, we calculated an parental interference index by summing up
number of repeated testquestions, verification of choice, and hints towards eyes, with the
sign matching the variable's direction of effect. Remaining variables that we coded for were

<sup>&</sup>lt;sup>3</sup> Attentive readers might notice that we simplified the structure of random effects. Compared to our models in the *Individual differences* and *External Validity* sections, this model does not include the random slope for symmetric target position within participants. We decided to do so since we had limited amount of data from few participants.

not included since there was not enough variation and/or occurrences in our sample. We 919 compared models using WAIC (widely applicable information criterion) scores and weights. 920 As an indicator of out-of-sample predictive accuracy, lower WAIC scores stand for a better 921 model fit. WAIC weights represent the probability that the model in question provides the 922 best out-of-sample prediction compared to the other models. On the trial level, the model 923 including the verification of choice as a main effect performed best: here, the less the 924 caregivers asked for children's responses again, the more likely children clicked on the 925 correct box. Interestingly, the effect reversed on a subject level - possibly due to greater 926 learning effects for the children that were most likely to click incorrectly in the beginning 927 and then receiving most parental comments. On the subject level, the model including 928 number of repeated test questions performed best: the more caregivers asked again where 929 the target landed, the more likely children were to respond to the incorrect box. In all cases, however, ELPD difference scores were smaller than their standard errors. Similarly, 95% CI of the model estimates included zero and were rather wide (Table ??). Therefore, we conclude that the effect of parental interference was negligable and could, most likely, 933 be explained as described above. 934

#### Appendix to external validity section.

935

Scoring of sibling variety scores. For assessing the external validity of our gaze understanding task, we calculated two sibling variety scores based on the existing Theory of Mind literature. First, we followed the approach by Peterson (2000). Here, only-children as well as firstborns with siblings under one year scored 0 points; lastborns with siblings above 12 years scored 0.5 points; children with twins, firstborns with siblings over one year, and lastborns with at least one sibling under 13 years scored 1 point, middleborns with at least one older and younger sibling aged one to 12 years scored 2 points.

Second, we implemented the sibling variety score by Cassidy et al. (2005). The
authors adjusted the original score of Peterson (2000) in the following way: only-children
scored 0 points; children with a sibling under one year or above 12 years, and twins with no

Table 1
Model comparison for influences of children's social surrounding

| Predictor                                    | WAIC         | SE_WAIC | Weight | ELPD_DIFF | SE_ELPD |
|--|--------------|---------|--------|-----------|---------|
| Average hours spent in childcare per day     | 2,540.39     | 52.23   | 0.54   | 0.00      | 0.00    |
| Peer exposure index                          | 2,541.00     | 52.22   | 0.28   | -0.30     | 0.92    |
| # Children in household aged 0-18            | $2,\!541.65$ | 52.30   | 0.02   | -0.63     | 1.09    |
| Sibling variety score (Cassidy et al., 2005) | 2,541.76     | 52.33   | 0.01   | -0.68     | 1.05    |
| Sibling variety score (Peterson, 2000)       | 2,541.80     | 52.38   | 0.02   | -0.71     | 1.10    |
| Age of childcare entry                       | 2,542.19     | 52.38   | 0.12   | -0.90     | 1.32    |
| # Children in household aged 1-12            | $2,\!542.26$ | 52.34   | 0.00   | -0.94     | 0.92    |
| Null model                                   | 2,542.58     | 52.26   | 0.00   | -1.09     | 0.79    |
| # Household members                          | 2,543.46     | 52.36   | 0.00   | -1.54     | 0.97    |

*Note.* All models included random intercepts for each participant and each target position, and a random for symmetric target position within participants

other sibling scored 0.5 points; children with a sibling above one year or under 13 years scored 1 point; middleborns with at least one older and younger sibling aged one to 12 years scored 2 points. Twins with additional siblings scored depending on the age and number of their siblings.

The reasoning was that children between one and 13 years of age would engage in sibling play, while the youngest and most mature siblings would be less likely to participate in such. However, teenage siblings might provide opportunities for interesting discussions (Peterson, 2000).

WAIC scores and weights of the model comparison. As can be seen, ELPD difference scores are smaller than their respective standard errors. WAIC scores between models don't differ substantially (Table 1). All effects except when a child entered childcare positively influence performance.

## $\mathbf{Adult\ sample}$

**Recruitment.** We recruited participants using the online participant recruitment 959 service Prolific from the University of Oxford. Prolific's subject pool consists of a mostly 960 European and US-american sample although subjects from all over the world are included. 961 The recruitment platform realises ethical payment of participants, which requires 962 researchers to pay participants a fixed minimum wage of £5.00 (around US\$6.50 or €6.00) 963 per hour. We decided to pay all participants the same fixed fee which was in relation to the 964 estimated average time taken to complete the task. Prolific distributed our study link to 965 potential participants, while the hosting of the online study was done by local servers in 966 the Max Planck Institute for Evolutionary Anthropology, Leipzig. Therefore, study data 967 was saved only on our internal servers, while *Prolific* provided demographic information of 968 the participants. Participants' Prolific ID was forwarded to our study website using URL 969 parameters. This way, we could match participant demographic data to our study data. 970 The same technique was used to confirm study completion: we redirected participants from 971 our study website back to the *Prolific* website using URL parameters. We used *Prolific*'s 972 inbuilt prescreening filter to include only participants who were fluent in English and could 973 therefore properly understand our written and oral study instructions. 974

Study 1 - Validation hedge version. The aim of Study 1 was to validate the
hedge version of our gaze understanding task. The pre-registration can be found here:
https://osf.io/r3bhn. We recruited participants online by advertising the study on *Prolific*.

50 adults participated in the study. One additional subject returned their submission, i.e., decided to leave the study early or withdrew their submission after study completion. Data collection took place in May 2021. Participants were compensated with £1.25 for completing the study. We estimated an average completion time of 6 minutes, resulting in an estimated hourly rate of £10.00. In average, participants took 05:56min to complete the study. Participants were required to complete the study on a tablet or desktop. Participation on mobile devices was disabled since the display would be too small and would harm click precision. It was indicated that the study required audio sound.

We stored *Prolific*'s internal demographic information, while not asking for additional personal information.

Study 2 - Validation box version. As in study 1, we recruited participants on

Prolific, and employed the same methodology. However, this time we focussed on

validating the box version of the task in an adult sample. Participants were presented with

eight boxes in which the target could land. 50 adults participated in the study. One

additional subject returned their submission, i.e., decided to leave the study early or

withdrew their submission after study completion. Data collection took place in June 2021.

Participants were compensated with £1.00 for completing the study. We estimated an

average completion time of 6 minutes, resulting in an estimated hourly rate of £10.00. In

average, participants took 04:43min to complete the study.

Study 3 - Reliability hedge version. In study 3 and 4, we assessed the 997 test-retest reliability of our gaze understanding task in an adult sample. The 998 pre-registration can be found here: https://osf.io/nu62m. We tested the same participants 999 twice with a delay of two weeks. The testing conditions were as specified in Study 1 and 2. 1000 However, the target locations as well as the succession of animals and target colors was 1001 randomized once. Each participant then received the same fixed randomized order of target 1002 location, animal, and target color. Participants received 30 test trials without voice-over 1003 description, so that each of the ten bins occurred exactly three times. 1004

In addition to the beforementioned prescreening settings, we used a whitelist. *Prolific*has a so-called *custom allowlist prescreening filter* where one can enter the *Prolific* IDs of
participants who completed a previous study. Only these subjects are then invited to
participate in a study. This way, repeated measurements can be implemented, collecting
data from the same subjects at different points in time.

In a first round, 60 participants took part on the first testday. Additional two 1010 subjects returned their submission, i.e., decided to leave the study early or withdrew their 1011 submission after study completion. One additional participant timed out, i.e., did not 1012 finish the survey within the allowed maximum time. The maximum time is calculated by 1013 Prolific, based on the estimated average completion time. For this study, the maximum 1014 time amounted to 41 minutes. For the first testday, participants were compensated with 1015 £1.25. We estimated an average completion time of 9 minutes, resulting in an estimated 1016 hourly rate of £8.33. In average, participants took 07:11min to complete the first part. 1017

Of the 60 participants that completed testday 1, 41 subjects finished testday 2. One additional participant timed out, i.e., did not finish the survey within the allowed maximum time. Participants were compensated with £1.50 for completing the second part of the study. We estimated an average completion time of 9 minutes, resulting in an estimated hourly rate of £10. In average, participants took 06:36min to complete the second part of the study.

Since we aimed for a minimum sample size of 60 subjects participating on both 1024 testdays, we reran the first testday with additional 50 participants. Additional seven 1025 subjects returned their submission, i.e., decided to leave the study early or withdrew their 1026 submission after study completion. Two additional participants timed out, i.e., did not 1027 finish the survey within the allowed maximum time. Again, participants were compensated 1028 with £1.25 for completing the first part of the study (estimated average completion time 9) 1029 minutes, estimated hourly rate of £8.33). In average, participants took 06:51min to 1030 complete the first part. 1031

Of the additional 50 participants that completed testday 1, 29 subjects finished
testday 2. Again, participants were compensated with £1.50 for completing the second
part of the study (estimated average completion time 9 minutes, estimated hourly rate of
£10). In average, participants took 06:26min to complete the second part of the study.

Study 4 - Reliability box version. As in study 3, we recruited participants on Prolific, and employed the same methodology. However, this time participants were presented with the box version of the task. Participants received 32 test trials without voice-over description, so that each of the eight boxes occurred exactly four times. As in study 2, we employed eight boxes in which the target could land.

In a first round, 60 participants took part on the first testday. Additional five subjects returned their submission, i.e., decided to leave the study early or withdrew their submission after study completion. For the first testday, participants were compensated with £1.25. We estimated an average completion time of 9 minutes, resulting in an estimated hourly rate of £8.33. In average, participants took 07:33min to complete the first part.

Of the 60 participants that completed testday 1, 41 subjects finished testday 2.

Participants were compensated with £1.50 for completing the second part of the study. We estimated an average completion time of 9 minutes, resulting in an estimated hourly rate of £10. In average, participants took 07:50min to complete the second part of the study.

Since we aimed for a minimum sample size of 60 subjects participating on both 1051 testdays, we reran the first testday with additional 50 participants. Additional eight 1052 subjects returned their submission, i.e., decided to leave the study early or withdrew their 1053 submission after study completion. One additional participant timed out, i.e., did not 1054 finish the survey within the allowed maximum time. Again, participants were compensated 1055 with £1.25 for completing the first part of the study (estimated average completion time 9) 1056 minutes, estimated hourly rate of £8.33). In average, participants took 07:37min to 1057 complete the first part. 1058

Of the additional 50 participants that completed testday 1, 28 subjects finished testday 2. Additional three subjects returned their submission, i.e., decided to leave the study early or withdrew their submission after study completion. One additional

1066

participant timed out, i.e., did not finish the survey within the allowed maximum time.

Again, participants were compensated with £1.50 for completing the second part of the

study (estimated average completion time 9 minutes, estimated hourly rate of £10). In

average, participants took 06:30min to complete the second part of the study.

# Instructions and voice over descriptions

This is the content of our audio recordings that were played as instructions and during voice over trials.

| Timeline | German                 | English             | Filename    |
|----------|------------------------|---------------------|-------------|
| welcome  | Hallo! Schön, dass     | Hello! Great that   | welcome.mp3 |
|          | du da bist. Wir        | you're here. We'll  |             |
|          | spielen jetzt das      | now play a balloon  |             |
|          | Ballon-Spiel! Siehst   | game. Can you see   |             |
|          | du die Tiere auf dem   | the animals in the  |             |
|          | Bild da? Wir           | picture over there? |             |
|          | möchten gleich         | We want to play     |             |
|          | zusammen mit den       | together with the   |             |
|          | Tieren mit einem       | animals using the   |             |
|          | Ballon spielen. Was    | balloon. We'll now  |             |
|          | genau passiert,        | talk you through    |             |
|          | erklären wir dir jetzt | exactly what will   |             |
|          | ganz in Ruhe.          | happen.             |             |

| touch | Schau mal, da steht  | Look, an animal is   | touch-1.mp3   |
|-------|----------------------|----------------------|---------------|
|       | ein Tier im Fenster. | standing in the      |               |
|       | Und siehst du den    | window. And can      |               |
|       | Ballon da? Der       | you see the balloon  |               |
|       | Ballon fällt immer   | over there? The      |               |
|       | runter und landet    | balloon always falls |               |
|       | auf dem Boden. Und   | down and lands on    |               |
|       | du musst ihn dann    | the ground. And you  |               |
|       | finden. Das Tier     | have to find it! The |               |
|       | hilft Dir und schaut | animal helps you     |               |
|       | immer den Ballon     | and always looks at  |               |
|       | an.                  | the balloon.         |               |
|       | Wo ist der Ballon?   | Where is the         | prompt-touch- |
|       | Drück auf den        | balloon? Click on    | long.mp3      |
|       | Ballon!              | the balloon!         |               |

| fam - HEDGE | Klasse, das war       | Perfect, that was    | fam-hedge-1.mp3 |
|-------------|-----------------------|----------------------|-----------------|
|             | super! Jetzt spielen  | great! Now, we'll    |                 |
|             | wir weiter. Siehst du | continue playing.    |                 |
|             | wieder das Tier und   | Can you see the      |                 |
|             | den Ballon da? Der    | animal and the       |                 |
|             | Ballon fällt wieder   | balloon again? The   |                 |
|             | runter. Diesmal fällt | balloon will fall    |                 |
|             | er hinter eine Hecke. | down again. This     |                 |
|             | Du musst ihn wieder   | time, it will fall   |                 |
|             | finden. Das Tier      | behind a hedge. And  |                 |
|             | hilft dir und schaut  | you have to find it! |                 |
|             | immer den Ballon      | The animal helps     |                 |
|             | an.                   | you and looks at the |                 |
|             |                       | balloon.             |                 |
|             | Wo ist der Ballon?    | Where is the         | prompt-hedge-   |
|             | Drücke auf die Hecke  | balloon? On the      | long.mp3        |
|             | - wo der Ballon ist.  | hedge, click where   |                 |
|             |                       | the balloon is.      |                 |

| fam - BOX    | Klasse, das war       | Perfect, that was     | fam-box-1.mp3    |
|--------------|-----------------------|-----------------------|------------------|
|              | super! Jetzt spielen  | great! Now, we'll     |                  |
|              | wir weiter. Siehst du | continue playing.     |                  |
|              | wieder das Tier und   | Can you see the       |                  |
|              | den Ballon da? Der    | animal and the        |                  |
|              | Ballon fällt wieder   | balloon again? The    |                  |
|              | runter. Diesmal fällt | balloon falls down    |                  |
|              | er in eine Kiste. Du  | again. This time, it  |                  |
|              | musst ihn wieder      | falls into a box. And |                  |
|              | finden. Das Tier      | you have to find it!  |                  |
|              | hilft dir und schaut  | The animal helps      |                  |
|              | immer den Ballon      | you and looks at the  |                  |
|              | an.                   | balloon.              |                  |
|              | Wo ist der Ballon?    | Where is the          | prompt-box-      |
|              | Drücke auf die Kiste  | balloon? Click on     | long.mp3         |
|              | mit dem Ballon.       | the box with the      |                  |
|              |                       | balloon.              |                  |
| test - HEDGE | Klasse , das hast du  | Nice, good job!       | test-hedge-1.mp3 |
|              | toll gemacht! Nun     | Now, we'll continue   |                  |
|              | spielen wir weiter.   | playing. There is the |                  |
|              | Da sind wieder der    | balloon, the animal   |                  |
|              | Ballon, das Tier und  | and the hedge. The    |                  |
|              | die Hecke. Die Hecke  | hedge is growing a    |                  |
|              | wächst jetzt hoch.    | bit now.              |                  |

|            | Der Ballon ist nun    | The balloon is        | test-hedge-2.mp3 |
|------------|-----------------------|-----------------------|------------------|
|            | hinter der Hecke. Du  | behind the hedge      |                  |
|            | kannst das nicht      | now. You can't see    |                  |
|            | sehen - das Tier      | it - but the animal   |                  |
|            | aber! Jetzt fällt der | can! The balloon      |                  |
|            | Ballon auf den        | falls to the ground   |                  |
|            | Boden und du musst    | and you have to find  |                  |
|            | ihn wieder finden.    | it. Remember - the    |                  |
|            | Denk dran - das Tier  | animal always looks   |                  |
|            | schaut immer den      | at the balloon!       |                  |
|            | Ballon an.            |                       |                  |
|            | Dann schrumpft die    | Now, the hedge is     | test-hedge-3.mp3 |
|            | Hecke. Drücke auf     | shrinking. On the     |                  |
|            | die Hecke - wo der    | hedge, click where    |                  |
|            | Ballon ist.           | the balloon is.       |                  |
| test - BOX | Klasse , das hast du  | Nice, good job!       | test-box-1.mp3   |
|            | toll gemacht! Nun     | Now, we'll continue   |                  |
|            | spielen wir weiter.   | playing. There is the |                  |
|            | Da sind wieder der    | balloon and the       |                  |
|            | Ballon, das Tier und  | animal. Now, a        |                  |
|            | die Kisten. Jetzt     | hedge is growing.     |                  |
|            | wächst eine Hecke     |                       |                  |
|            | hoch.                 |                       |                  |
|            |                       |                       |                  |

|                |                       |                      | ,                  |
|----------------|-----------------------|----------------------|--------------------|
|                | Der Ballon ist nun    | The balloon is       | test-box-2.mp3     |
|                | hinter der Hecke. Du  | behind the hedge     |                    |
|                | kannst das nicht      | now. You can't see   |                    |
|                | sehen - das Tier      | it - but the animal  |                    |
|                | aber! Jetzt fällt der | can! The balloon     |                    |
|                | Ballon in eine Kiste  | falls into a box and |                    |
|                | und du musst ihn      | you have to find it. |                    |
|                | wieder finden. Denk   | Remember - the       |                    |
|                | dran - das Tier       | animal always looks  |                    |
|                | schaut immer den      | at the balloon!      |                    |
|                | Ballon an.            |                      |                    |
|                | Dann schrumpft die    | Now, the hedge is    | test-box-3.mp3     |
|                | Hecke. Drücke auf     | shrinking. Click on  |                    |
|                | die Kiste mit dem     | the box with the     |                    |
|                | Ballon.               | balloon.             |                    |
| goodbye        | Geschafft! Die Tiere  | The animals are      | goodbye.mp3        |
|                | sind schon ganz       | super happy after    |                    |
|                | glücklich vom         | playing. Thanks a    |                    |
|                | Spielen! Vielen       | lot for your help!   |                    |
|                | Dank für deine Hilfe! | See you soon and     |                    |
|                | Bis zum nächsten      | goodbye from the     |                    |
|                | Mal und liebe Grüße   | pig, monkey and      |                    |
|                | vom Schwein, Affen    | sheep                |                    |
|                | und Schaf             |                      |                    |
| general prompt | Wo ist der Ballon?    | Where is the         | prompt-general.mp3 |
|                |                       | balloon?             |                    |
|                |                       |                      |                    |

| touch - no        | Drück auf den        | Click on the balloon! | prompt-touch.mp3  |
|-------------------|----------------------|-----------------------|-------------------|
| response          | Ballon!              |                       |                   |
| hedge - no        | Drücke auf die Hecke | On the hedge, click   | prompt-hedge.mp3  |
| response          | - wo der Ballon ist! | where the balloon is! |                   |
| box - no response | Drücke auf die Kiste | Click on the box      | prompt-box.mp3    |
|                   | mit dem Ballon!      | with the balloon!     |                   |
| landing sound of  | -                    | -                     | balloon-lands.mp3 |
| balloon           |                      |                       |                   |
| sound of blinking | -                    | -                     | blink.mp3         |
| eyes              |                      |                       |                   |
| sound for target  | -                    | -                     | positive-         |
| click             |                      |                       | feedback.mp3      |