Limited evidence of test-retest reliability in infant-directed speech preference in a large 1 preregistered infant experiment 2 Melanie S. Schreiner<sup>1,2</sup>, Martin Zettersten<sup>3,4</sup>, Christina Bergmann<sup>5</sup>, Michael C. Frank<sup>6</sup>, Tom Fritzsche<sup>7</sup>, Nayeli Gonzalez-Gomez<sup>8</sup>, Kiley Hamlin<sup>9</sup>, Natalia Kartushina<sup>10</sup>, Danielle J. Kellier<sup>11</sup>, Nivedita Mani<sup>1,2</sup>, Julien Mayor<sup>10</sup>, Jenny Saffran<sup>3</sup>, Mohinish Shukla<sup>12</sup>, Priya Silverstein<sup>13, 14</sup>, Melanie Soderstrom<sup>15</sup>, & Matthias Lippold<sup>1,2</sup> <sup>1</sup> University of Goettingen <sup>2</sup> Leibniz Science Campus PrimateCognition <sup>3</sup> University of Wisconsin-Madison <sup>4</sup> Princeton University 10 <sup>5</sup> Max Planck Insitute for Psycholinguistics 11 <sup>6</sup> Stanford University 12 <sup>7</sup> University of Potsdam 13 <sup>8</sup> Oxford Brookes University <sup>9</sup> University of British Columbia <sup>10</sup> University of Oslo <sup>11</sup> University of Pennsylvania 17 <sup>12</sup> Università di Padova 18 <sup>13</sup> Institute for Globally Distributed Open Research 19

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41 Abstract

Test-retest reliability — establishing that measurements remain consistent across multiple testing sessions — is critical to measuring, understanding, and predicting individual differences in infant language development. However, previous attempts to establish 44 measurement reliability in infant speech perception tasks are limited, and reliability of frequently-used infant measures is largely unknown. The current study investigated the test-retest reliability of infants' preference for infant-directed speech (hereafter, IDS) over adult-directed speech (hereafter, ADS) in a large sample (N=158) in the context of the ManyBabies1 collaborative research project (hereafter, MB1; Frank et al., 2017; ManyBabies Consortium, 2020). Labs of the original MB1 study were asked to bring in participating infants for a second appointment retesting infants on their IDS preference. This approach allows us to estimate test-retest reliability across three different methods used to investigate preferential listening in infancy: the head-turn preference procedure, 53 central fixation, and eye-tracking. Overall, we find no consistent evidence of test-retest 54 reliability in measures of infants' speech preference (overall r = .09, 95% CI [-.06,.25]). 55 While increasing the number of trials that infants needed to contribute for inclusion in the analysis revealed a numeric growth in test-retest reliability, it also considerably reduced the 57 study's effective sample size. Therefore, future research on infant development should take into account that not all experimental measures may be appropriate for assessing 59

61 Keywords: language acquisition; speech perception; infant-directed speech; 62 adult-directed speech; test-retest reliability

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individual differences between infants.

Limited evidence of test-retest reliability in infant-directed speech preference in a large

preregistered infant experiment

Obtaining a quantitative measure of infants' cognitive abilities is an extraordinarily difficult endeavor. The most frequent way to assess what infants know or prefer is to track overt behavior. However, measuring overt behavior at early ages presents many challenges: participants' attention span is short, they do not follow instructions, their mood can change instantly, and their behavior is often inconsistent. Therefore, most measurements are noisy and the typical sample size of an infant study is small (around 20 infants per group), resulting in low power (Oakes, 2017). In addition, there is individual and environmental variation that may add even more noise to the data (e.g., Johnson & Zamuner, 2010). Despite these demanding conditions, reliable and robust methods for assessing infants' behavior are critical to understanding development.

In order to address these challenges, the ManyBabies collaborative research 76 consortium was formed to conduct large-scale, conceptual, consensus-based replications of 77 seminal findings to identify sources of variability and establish best practices for 78 experimental studies in infancy (Frank et al., 2017). The first ManyBabies collaborative research project (hereafter, MB1, ManyBabies Consortium, 2020) explored the reproducibility of the well-studied phenomenon that infants prefer infant-directed speech 81 (hereafter, IDS) over adult-directed speech (hereafter, ADS, Cooper & Aslin, 1990). Across 82 many different cultures, infants are commonly addressed in IDS, which typically is characterized by higher pitch, greater pitch range, and shorter utterances, compared to the language used between interacting adults (Fernald et al., 1989). A large body of behavioral studies finds that infants show increased looking times when hearing IDS compared to ADS stimuli across ages and methods (Cooper & Aslin, 1990; see Dunst, Gorman, & Hamby, 2012 for a meta-analysis). This attentional enhancement is also documented in neurophysiological studies showing increased neural activation during IDS compared to

ADS exposure (Naoi et al., 2012; Zangl & Mills, 2007). IDS has also been identified as facilitating early word learning. In particular, infants' word segmentation abilities (Floccia et al., 2016; Schreiner & Mani, 2017; Singh, Nestor, Parikh, & Yull, 2009; Thiessen, Hill, & Saffran, 2005) and their learning of word-object associations (Graf Estes & Hurley, 2013; Ma, Golinkoff, Houston, & Hirsh-Pasek, 2011) are enhanced in the context of IDS. In sum, several lines of evidence suggest that IDS is beneficial for early language development.

Within MB1, 67 labs contributed data from 2,329 infants showing that babies 96 generally prefer to listen to IDS over ADS. Nevertheless, the overall effect size of d=0.3597 was smaller than a previously reported meta-analytic effect size of d = 0.67 (Dunst et al., 98 2012). The results revealed several additional factors that influenced the effect size. First, 99 older infants showed a larger preference of IDS over ADS. Second, the stimulus language 100 was linked to IDS preference, with North American English learning infants showing a 101 larger IDS preference than infants learning other languages. Third, comparing the different 102 methods employed, the head-turn preference procedure yielded the highest effect size, while 103 the central fixation paradigm and eye-tracking methods revealed smaller effects. Finally, 104 exploratory analyses assessed the effect of different inclusion criteria. Across methods, 105 using stricter inclusion criteria led to an increase in effect sizes despite the larger proportion of excluded participants (see also Byers-Heinlein, Bergmann, & Savalei, 2021). 107

However, there is a difference between a result being reliable in a large sample of 108 infants and the measurement of an individual infant being reliable. In studies tracking 109 individual differences, the measured behavior during an experimental setting is often used 110 to predict a cognitive function or specific skill later in life. Individual differences research of this kind often has substantial implications for theoretical and applied work. For example, 112 research showing that infants' behavior in speech perception tasks can be linked to later 113 language development (see Cristia, Seidl, Junge, Soderstrom, & Hagoort, 2014 for a 114 meta-analysis) has the potential to identify infants at risk for later language delays or 115 disorders. However, a necessary precondition for this link to be observable is that 116

individual differences between infants can be measured with high reliability at these earlier stages, in order to ensure that measured inter-individual variation mainly reflects differences in children's abilities rather than measurement error. How reliable are the measures used in infancy research?

Previous attempts to address the reliability of measurements have typically been 121 limited to adult populations (Hedge, Powell, & Sumner, 2018; Oliveira, Hayiou-Thomas, & 122 Henderson, 2023), or have been conducted with small sample sizes (Colombo, Mitchell, & 123 Horowitz, 1988; e.g., Houston, Horn, Qi, Ting, & Gao, 2007). For example, Houston et al. 124 (2007) tested 10 9-month-old infants' speech discrimination in a visual habituation 125 procedure in two test sessions 1-3 days apart and found a large correlation (r = .7). These 126 data were subsequently included in a much larger systematic investigation of test-retest 127 reliability in infant speech perception (Cristia, Seidl, Singh, & Houston, 2016). Cristia et 128 al. (2016) analyzed 13 different experiments assessing test-retest reliability in infant speech 129 perception tasks, with the retest session occurring 0-18 days after the first session. The 130 experiments were conducted at three different labs with different implementations of the individual studies. Hence, it was only after completed data collection that the data was 132 pooled together by the different labs revealing potential confounds. Nevertheless, the 133 results showed that reliability was extremely variable across the different experiments and labs and low overall (meta-analytic r = .07). 135

Against this background, the current study investigates test-retest reliability of infants' performance in a speech preference task. Within MB1, a multi-lab collaboration, we examine whether infants' preferential listening behavior to IDS and ADS is reliable across two different test sessions. We also investigate the influence of various moderators on the reliability of IDS preference (e.g., time between test and retest; infants' language background).

The current study also explores whether there are any differences in test-retest

reliability between three widely used methods: central fixation (CF), eye-tracking (ET), 143 and the head-turn preference procedure (HPP). Exploring differences in CF, ET, and HPP, 144 Junge et al. (2020) provide experimental and meta-analytic evidence in favor of using the 145 HPP in speech segmentation tasks. Similarly, the MB1 project reported an increase in the 146 effect size for HPP compared to CF and ET (ManyBabies Consortium, 2020). HPP 147 requires gross motor movements relative to other methods, such as CF and ET paradigms, 148 for which subtle eve movements towards a monitor located in front of the child are 149 sufficient. One possible explanation for the stronger effects with HPP may be a higher 150 sensitivity to the contingency of the presentation of auditory stimuli and infants' head 151 turns away from the typical forward-facing position. While these findings suggest that 152 HPP may be a more sensitive index of infant preference, they do not necessarily imply 153 higher reliability for individual infants' performance using HPP. For example, Marimon and Höhle (2022) found no evidence for test-retest reliability when testing infants' prosodic 155 preferences using the HPP method across three testing sessions, each 7-8 days apart on 156 average. It remains an open question whether the same measures that produce larger effect 157 sizes at the group-level also have higher test-retest reliability for individual infants 158 (Byers-Heinlein et al., 2021). Therefore, assessing the test-retest reliability of the different 159 preference measures is crucial, so that researchers can make informed decisions about the 160 appropriate methods for their particular research question. Critically, only measures with 161 high test-retest reliability should be used for studies of individual differences. 162

163 Method

# 164 Preregistration

We preregistered the current study on the Open Science Framework (https://osf.io/v5f8t). Section S1 in the Supplementary Materials contains additional notes on the preregistration decisions and any deviations from the preregistered analytic plan.

## Data Collection

A call was issued to all labs participating in the original MB1 study on January 24th,
2018 (ManyBabies Consortium, 2020). The collection of retest session data was initially set
to end on May 31st, 2018, one month after the end date of the original MB1 project. Due
to the fact that the original MB1 project extended the time frame for data collection and
the late start of data collection for the MB1 test-retest study, we also allowed participating
labs to continue data collection past the scheduled end date.

## 175 Participants

Contributing labs were asked to re-recruit their monolingual participants between the 176 ages of 6 to 12 months who had already participated in the MB1 project. If participating 177 labs had not committed to testing either of these age groups, they were also allowed to 178 re-recruit participants from the youngest age group of 3- to 6-month-olds and/or the oldest 179 age group of 12- to 15-month-olds. Labs were asked to contribute half (n=16) or full 180 samples (n=32); however, a lab's data was included in the study regardless of the number 181 of included infants. The study was approved by each lab's respective ethics committee and 182 parental consent was obtained for each infant prior to participation in the study. 183

Our final sample consisted of 158 monolingual infants from 7 different labs (Table 1).

In order to be included in the study, infants needed a minimum of 90% first language

exposure, to be born full term with no known developmental disorders, and normal hearing

and vision. We excluded 18 additional participants (see Data Exclusion section for details).

The mean age of infants included in the study was 245 days (range: 108 – 373 days;

approximately 8.06 months).

### 190 Materials

Our study was faced with a critical design choice: what stimuli to use to assess 191 test-retest reliability. One constraint on our study was that, since it was a follow-on to 192 MB1, any stimulus we used would always be presented after the MB1 stimuli. One option 193 would be simply to bring back infants and have them hear exactly the same stimulus 194 materials. A weakness of this design would be the potential for stimulus familiarity effects, 195 however, since infants would have heard the materials before. Further complicating 196 matters, infants might show a preference for or against a familiar stimulus depending on 197 their age (Hunter & Ames, 1988). The ideal solution then would be to create a brand new 198 stimulus set with the same characteristics. Unfortunately, because of the process of how 199 MB1 stimuli were created, we did not have enough normed raw recordings available to 200 make brand new stimulus items that conformed to the same standards as the MB1 stimuli. 201 We therefore chose an intermediate path: we reversed the ordering of MB1 stimuli. 202 Average looking times in MB1 were always lower than 9s per trial, even for the youngest 203 children on the earliest trials (the group who looked the longest on average), so most 204 children in MB1 did not hear the second half of most trials. Thus, by reversing the order, 205 we had a perfectly matched stimulus set that was relatively unfamiliar to most infants. 206 The disadvantage of this design was that infants who looked longer might be more likely to 207 hear a familiar clip heard in the previous study. If infants then showed a familiarity preference — an assumption which might not be true — the end result could be to inflate 209 our estimates of test-retest reliability slightly, since longer lookers would on average look longer at retest due to their familiarity preference. We view this risk as relatively low, but 211 do note that it is a limitation of our design. 212

Visual stimuli. The visual stimuli and instructions were identical to MB1. For the
CF paradigm and ET, labs used a multicolored static checkerboard as the fixation stimulus
as well as a multicolored moving circle with a ringing sound as an attention-getter between

trials. For the HPP method, labs used their standard procedure, as in MB1.

Speech stimuli. We used the identical training stimuli of piano music from MB1.

A second set of naturalistic IDS and ADS recordings of mothers either talking to their

infant or to an experimenter was created for the retest session by reversing the order of

clips within each sequence of the original study. This resulted in eight reordered sequences

of natural IDS and eight reordered sequences of natural ADS with a length of 18 seconds

each.

Procedure. Infants were retested using the identical procedure as during the first testing day: CF, HPP, or ET. Participating labs were asked to schedule test and retest sessions 7 days apart with a minimum number of 1 day and a maximum number of 31 days. However, infants whose time between test and retest exceeded 31 days were still included in the analyses (n = 3). The mean number of days between test and retest was 10 (range: 1 - 49).

A total of 18 trials, including two training, eight IDS, and eight ADS trials, were
presented in one of four pseudo-randomized orders. Trial length was either infant-controlled
or fixed depending on the lab's standard procedure: a trial stopped either if the infant
looked away for 2 seconds or after the total trial duration of 18 seconds. The online coding
experimenter and the parent listened to music masked with the stimuli of the study via
noise-cancelling headphones. If the experimenter was in an adjacent room separate from
the testing location, listening to masking music was optional for the experimenter.

Data exclusion. In total, 18 participants were excluded from the analysis. 4

participants were excluded for being preterm (defined as a gestation time of less than 37

weeks). 6 participants were excluded due to session errors involving an experimenter error

(e.g., inaccurate coding or presentation of retest stimuli on the first test session).

Individual trials were excluded if they were marked as trial errors (5.45% of remaining

trials), i.e., if the infant was reported as fussy, an experimental or equipment error

Table 1
Statistics of the included labs. n refers to the number of infants included in the final analysis.

| Lab              | Method           | Language  | Mean age (days) | N  |
|------------------|------------------|-----------|-----------------|----|
| InfantCog-UBC    | central fixation | English   | 147             | 7  |
| babylab-potsdam  | HPP              | German    | 227             | 22 |
| babyling-oslo    | eye-tracking     | Norwegian | 249             | 10 |
| brookes-babylab  | central fixation | English   | 267             | 18 |
| infantll-madison | HPP              | English   | 230             | 30 |
| lancslab         | eye-tracking     | English   | 236             | 16 |
| wsi-goettingen   | HPP              | German    | 242             | 16 |
| wsi-goettingen   | central fixation | German    | 280             | 39 |

occurred, or there was parental interference during the task (e.g., if the parent spoke with
the infant during the trial). Trials were also excluded if the minimum looking time of 2 s
was not met (12.60% of the remaining trials). If a participant was unable to contribute at
least one IDS and one ADS trial for either test or retest after trial-level exclusions, all data
of that participant was excluded from the test-retest analyses (12 additional participants).

Results

# IDS preference

First, we conducted confirmatory analyses examining infants' preference for IDS in both sessions. Two-samples t-tests comparing the difference in average looking time between IDS and ADS to zero revealed that infants showed a preference of IDS over ADS in Session 1, t(157) = 6.47, p < .001, and Session 2, t(157) = 4.19, p < .001, replicating the

| Trial type | Session 1 Mean | Session 1 $SD$ | Session 2 Mean | Session 2 $SD$ |
|------------|----------------|----------------|----------------|----------------|
| ADS        | 7.71           | 2.77           | 6.96           | 2.92           |
| IDS        | 8.76           | 2.84           | 7.75           | 2.75           |

Table 2

Average looking times (in seconds) for each session and condition

main finding from MB1 (Table 2). 68.35% of infants in Session 1 and 63.29% of infants in Session 2 showed a preference for IDS. In order to test whether there was a difference in the strength of the preference effect across sessions, we fit a linear mixed-effects model predicting infants' average difference in looking time between IDS and ADS from test session (1 vs. 2), including by-lab and by-participant random intercepts. There was no significant difference in the magnitude of infants' preference between the two sessions,  $\beta$ =-0.30, SE=0.24, p=.208.

# 260 Reliability

We assessed test-retest reliability in two planned, confirmatory analyses. First, we fit 261 a linear mixed-effects model predicting IDS preference in Session 2 from IDS preference in 262 Session 1, including a by-lab random intercept. The results revealed no significant 263 relationship between IDS preference in Session 1 and 2 (Table 3). Second, we calculated 264 the Pearson correlation coefficient. While a simple correlation coefficient might 265 overestimate the test-retest reliability in our sample because it does not control for the differences between different labs and methods (HPP, CF, and ET), we felt it was important to also conduct a Pearson correlation as it is commonly used to assess reliability. The size of the correlation coefficient was not statistically different from zero and the 269 estimate was small, r = .09, 95% CI [-.06, .25], t(156) = 1.19, p = .237. Moreover, no 270 significant correlations emerged in each sample considered separately (Figure 1; see 271

Table 3

Coefficient estimates from a linear mixed effects model predicting IDS preference in Session 2.

|                          | Estimate | SE   | t    | р    |
|--------------------------|----------|------|------|------|
| Intercept                | 0.87     | 0.46 | 1.92 | 0.10 |
| IDS Preference Session 1 | 0.04     | 0.09 | 0.41 | 0.68 |

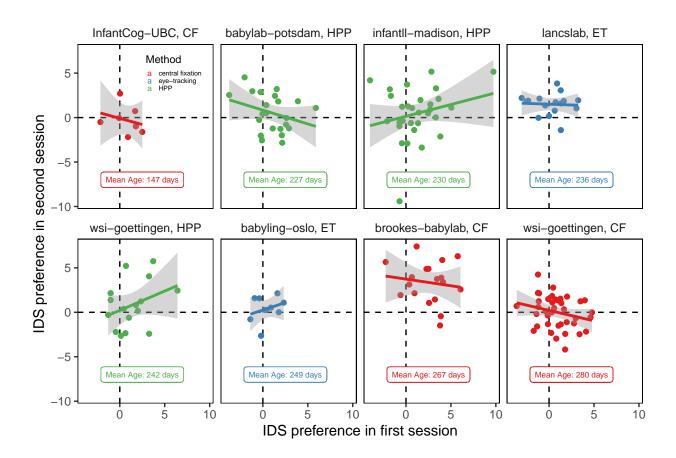


Figure 1. Correlation between IDS Preference in Session 1 and Session 2 in each lab and method. Dots indicate individual participants. Error bands represent 95 percent confidence intervals. The dashed line indicates no preference (i.e., a value of zero) for the first and second session, respectively.

Table 4

Coefficient estimates from a linear mixed effects

model predicting IDS preference in Session 2 and

Pearson correlation coefficient for each method

separately.

| Method           | beta  | SE   | p    | Pearson r |
|------------------|-------|------|------|-----------|
| central fixation | -0.20 | 0.12 | 0.12 | 0.08      |
| HPP              | 0.15  | 0.14 | 0.28 | 0.13      |
| eye-tracking     | 0.03  | 0.16 | 0.84 | 0.02      |

Supplementary Materials S3 for a meta-analytic approach). 41.77% of the infants reversed their direction of preference for IDS versus ADS from the test to the retest session.

To investigate the test-retest reliability of each specific method, we computed Pearson 274 correlation coefficients and the same mixed-effects model described above for HPP, CF, 275 and ET separately (Table 4) in additional exploratory analyses. None of the three methods 276 showed evidence of test-retest reliability. Neither the Pearson correlation coefficients nor 277 the coefficients of the multilevel analysis were significant, all p-values > 0.12. In planned 278 secondary analyses, we found that time between test sessions, participant age, method, and 279 language background did not moderate the relationship between IDS preference in session 280 1 and session 2 (see Supplementary Materials S2). Taken together, we find no significant 281 evidence of test-retest reliability across our preregistered analyses. 282

## 83 Exploratory analyses with different inclusion criteria

To this point, all analyses were performed using the inclusion criteria from MB1,
which required only that infants contribute at least one trial per condition for inclusion
(i.e., one IDS and one ADS trial). However, more stringent inclusion criteria yielded larger

effect sizes in MB1. We therefore conducted exploratory analyses assessing test-retest 287 reliability after applying progressively stricter inclusion criteria, requiring two, four, six, 288 and eight valid trials per condition. Applying stricter criteria — and thereby increasing the 289 number of test trials — increased reliability numerically from r = 0.07 to r = 0.34 (Figure 290 2). In part due to a decrease in sample size, only one of these correlations was statistically 291 significant (when requiring six trial pairs): two valid trial pairs, t(152) = 0.90, p = .367; 292 four valid trial pairs, t(143) = 1.03, p = .306; six valid trial pairs, t(98) = 2.23, p = .028; 293 eight valid trial pairs — all trials in both sessions — t(22) = 1.68, p = .108. The analyses 294 provide tentative evidence that stricter inclusion criteria may lead to higher test-retest 295 reliability, but at the cost of substantial decreases in sample size (see Supplementary 296 Materials S4 for additional analyses, including moderator analyses using a more restricted 297 sample).

# Correlations between sessions for number of trials contributed and overall looking time

In exploratory analyses, we also investigated whether there were stable individual differences in (a) the number of trials an infant contributed across the two test sessions and (b) infants' overall looking times.

Number of trials contributed. We found a strong positive correlation between number of trials contributed during the first and the second session r = .58, 95% CI [.47, .67], t(160) = 9.00, p < .001 (Figure 3A). In other words, if infants contributed a higher number of trials in one session, compared to other infants, they were likely to contribute a higher number of trials in their next session. This finding is consistent with the hypothesis that how attentive infants are throughout an experiment (and hence how many trials they contribute) is a stable individual difference, at least for some infant looking time tasks.

Overall looking times. To what extent are participants looking times between the two sessions related? To test this question, we investigated whether participants' overall



Figure 2. IDS preferences of both sessions plotted against each other for each inclusion criterion. n indicates the number of included infants, r is the Pearson correlation coefficient as the indicator for reliability.

looking times — irrespective of condition — were correlated between the first and second 313 session. There was a robust correlation between average looking time in Session 1 and 314 Session 2: infants with longer looking times during their first session also tended to look 315 longer during their second session, r = .45, 95% CI [.31, .57], t(156) = 6.28, p < .001316 (Figure 3B). This relationship held even after controlling for number of trials (b = 0.42, 317 95% CI [0.27, 0.58], t(154) = 5.52, p < .001) and participants' average age (b = 0.44, 95% 318 CI [0.30, 0.59], t(155) = 6.16, p < .001) across the two test sessions in linear regression 319 models. Finally, we found similar correlations in average looking time to IDS stimuli in 320 Session 1 and 2, r = .38, 95% CI [.24, .51], t(156) = 5.19, p < .001, and ADS stimuli in 321 Session 1 and 2, r = .40, 95% CI [.26, .53], t(156) = 5.49, p < .001 (Figure 3C; see 322 Supplementary Materials S9 and S10 for further details, including an investigation of 323 item-level correlations).

#### General Discussion

325

The current study investigated the test-retest reliability of infants' preference for IDS 326 over ADS. As part of the original MB1 project, we tested the IDS preference of infants in 327 two separate test sessions to assess the extent to which their pattern of preference would 328 remain consistent. While we replicated the original effect of infants' speech preference for 329 IDS over ADS for both the test and retest session on the group-level, we found that 330 infants' speech preference measures showed no evidence of test-retest reliability. In other 331 words, we were unable to detect stable individual differences in infants' preference for IDS. 332 This finding is consistent with past research suggesting low test-retest reliability in other infant paradigms (Cristia et al., 2016). Given that most experimental procedures conducted in infant research are interested in the comparison of groups, individual 335 differences between participants within a specific condition are usually minimized by the 336 experimental procedure while differences between conditions are maximized. Therefore, 337 infant preference measures may be a good approach for capturing group-level phenomena, 338

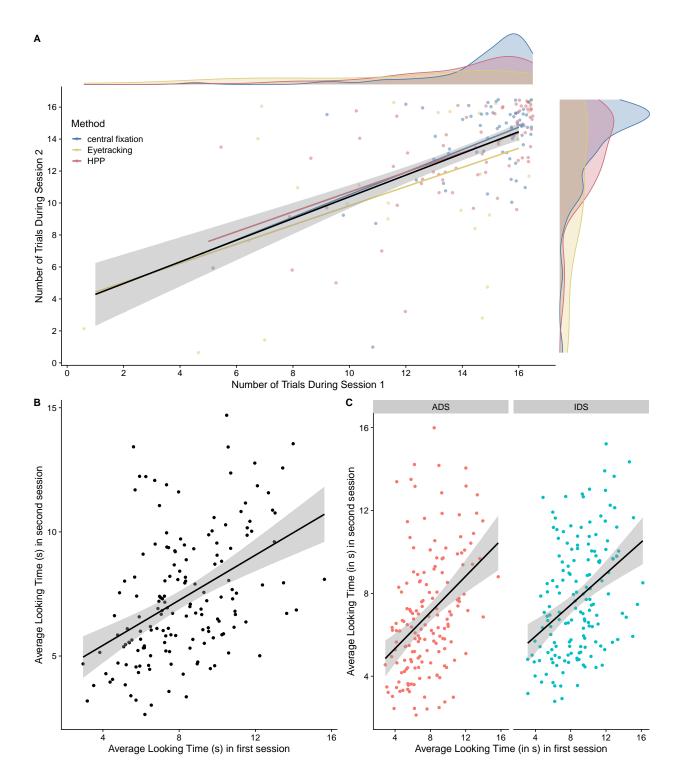


Figure 3. (A) Correlation between the number of trials contributed in Session 1 and Session 2. Each data point represents one infant. Colored lines represent linear fits for each method. (B) Overall correlations in average looking time (in s) between Session 1 and 2. (C) Correlations in average looking time (in s) between sessions, split by IDS/ADS condition.

but may be less appropriate for examining individual differences in development.

Consistent with general psychometric theory (e.g., DeBolt, Rhemtulla, & Oakes, 340 2020), stricter inclusion criteria — and consequently a larger number of included test trials 341 per participant — tended to increase the magnitude of the correlation between test 342 sessions. However, this association was based on exploratory analyses and was in part only 343 observed descriptively, and hence should be interpreted with caution. A similar effect on 344 the group-level was found in the MB1 project, where a stricter inclusion criterion led to 345 bigger effect sizes (ManyBabies Consortium, 2020). As in MB1, higher reliability through 346 strict exclusions came at a high cost. In particular, with the strictest criterion, only a small 347 portion of the original sample size (24 out of 158 infants) could be included in the final 348 sample. In other words, applying stricter criteria leads to a higher drop-out rate and can 340 dramatically reduce the sample size. In the case of studies in the field of developmental 350 science, where there are many practical restrictions in collecting large samples of infants 351 (e.g., birth rate in the area, restricted lab capacities, budget restrictions), a strict drop-out 352 criterion may often be difficult to implement. Note that studies in developmental science 353 already have above-average drop-out rates (Miller, 2017). In addition, drop out may not be 354 random, and so having high drop-out rates can further limit the generalizability of a study. In fact, the number of trials individual infants contributed was highly correlated between test sessions in the current study (see Supplementary Materials S6). Particularly in the 357 context of turning individual differences measures into diagnostic tools, high drop-out rates 358 have an additional limitation of not being broadly usable. 359

Even under best-case scenarios, reliability remained quite low. For example, when restricting the sample to infants contributing at least 6 trials in each condition in both sessions, we obtained a correlation of r = 0.22 and an intra-class correlation coefficient of  $\alpha$  = 0.36. As Byers-Heinlein et al. (2021) outline, low measurement reliability severely restricts power for detecting relationships between measures. Using the same approach as Byers-Heinlein et al. (2021), we estimate that over 682 infants would be needed to have at

least 80% power to observe a true correlation of r=.3 between two measurements, assuming an intra-class correlation coefficient as large as that observed in our restricted sample ( $\alpha=0.36$ ). Even a very large true correlation of r=.7 would require a sample size of over 120 infants. In other words, even under optimistic estimates of reliability based on strict inclusion criteria, the low reliability of IDS preference measures would severely limit the feasibility of individual difference and longitudinal research using current methods.

An alternative approach to increasing the number of valid trials is to increase the 372 number of experimental trials. This approach seeks to increase the likelihood that 373 participants will contribute sufficient trials (after trial-level exclusions) to allow for precise 374 individual-level estimates (DeBolt et al., 2020; see also Silverstein, Feng, Westermann, 375 Parise, & Twomey, 2021). While this approach is promising, it may not always be feasible, 376 because the attention span of a typical infant participant is limited. Therefore, prolonging 377 the experimental procedure to maximize the absolute number of trials is often challenging 378 in practice. Other avenues for obtaining higher numbers of valid trials may include changes 379 in the procedure (e.g., Egger, Rowland, & Bergmann, 2020) or implementing multi-day test 380 sessions (Fernald & Marchman, 2012). 381

As our results are only based on the phenomenon of IDS preference (albeit, with 382 three widely used methods: HPP, CF, ET) it is essential to further assess the underlying 383 reliability of preferential looking measures within other areas of speech perception 384 (Marimon & Höhle, 2022). While most infants prefer IDS over ADS (Dunst et al., 2012), 385 patterns of preferential looking in other tasks (e.g., speech segmentation) are often 386 inconsistent and difficult to predict (Bergmann & Cristia, 2016). These inconsistencies in looking behavior are especially important to consider in the context of relating a direction of preference to later language development, and can sometimes lead to seemingly contradictory findings. That is, both familiarity and novelty responses have been suggested 390 to be predictive of infants' later linguistic abilities (DePaolis, Vihman, & Keren-Portnoy, 391 2014; Newman, Ratner, Jusczyk, Jusczyk, & Dow, 2006; Newman, Rowe, & Ratner, 2016). 392

In light of our findings, researchers conducting longitudinal studies with experimental data from young infants predicting future outcomes should be cautious, as there may be large intra-individual variability affecting preference measurement.

While we observed limited evidence for test-retest reliability using preference 396 measures, we observed robust correlations for average looking times between session 1 and 397 2, both overall and for IDS and ADS stimuli considered separately (see also Supplementary Materials S9 for an investigation of item-level correlations). This finding is consistent with past results in infant looking time studies finding robust correlations in average looking times across multiple sessions (Marimon & Höhle, 2022). It also raises an apparent puzzle: why are overall looking times for ADS and IDS stimuli correlated, while difference scores are not? One explanation is that infants have stable individual differences in how long they look to stimuli, but little or no stable individual differences in their preference for one 404 stimulus type over another. This only partially explains the current pattern of results, 405 however, because IDS looking time in session 1 predicted IDS looking time in session 2 406 even when controlling for ADS looking time, and vice versa (see S9). In other words, the 407 condition-specific looking time correlations are not fully explained by overall looking 408 behavior. Another long-established explanation is that difference scores tend to have poor 409 measurement reliability, because difference scores combine error from individual 410 measurements into a composite score and increasing the ratio of error relative to the 411 variance between participants (Hedge et al., 2018; Lord, 1956). Given the limitations of 412 difference scores (and composite scores in general), one goal for future research will be to 413 assess the use of trial-by-trial model-based approaches for estimating reliability (Haines et 414 al., 2020; Rouder & Haaf, 2019). 415

# 6 Limitations

While we had an above-average sample size for a study in infant research, we were unable to approach the number of participants collected within the original MB1 study. In

addition to a delayed call, the extra effort of having to schedule a second lab visit for each 419 participant and the fact that there were already other collaborative studies taking place 420 simultaneously (MB1B, Byers-Heinlein, Tsui, Bergmann, et al., 2021; MB1G, 421 Byers-Heinlein, Tsui, Van Renswoude, et al., 2021), might have contributed to a low 422 participation rate. A higher sample size and a larger number of participating labs from 423 different countries would have enabled us to conduct a more highly-powered test of 424 differences in test-retest reliability across different methods, language backgrounds, and 425 participant age. 426

A further limitation concerns the stimuli. While the order of the audio recording clips 427 presented to infants within a given trial differed between the first and second session, the 428 exact same stimulus material as in MB1 was used in both sessions. In particular, all 429 children heard the exact same voices in Session 1 and in Session 2. From a practical point 430 of view, this was the most straightforward solution for coordinating the experiment within 431 the larger MB1 project. However, familiarity effects might have influenced infants' looking 432 behavior. Infants with longer looking times in their first session might have had more 433 opportunity to recognize familiar audio clips in their second session. For infants with short 434 looking times, familiar audio clips would only occur towards the end of second-session 435 trials, thus offering infants less opportunity to recognize voices from their first session. 436 Therefore, inconsistent familiarity with the stimulus material in the second session across 437 infants might have artificially lowered test-retest reliability. Moreoever, infants' experience 438 with a testing paradigm has been found to systematically affect looking time to familiar 439 stimuli (Santolin, Garcia-Castro, Zettersten, Sebastian-Galles, & Saffran, 2021), further complicating the interpretation of infant familiarity preferences in retest sessions. On the other hand, one factor that mitigates this concern is that infants' looking times generally declined in session 2 compared to session 1 (consistent with past work, e.g. Marimon & Höhle, 2022), limiting opportunities for infants to encounter previously experienced stimulus material.

446 Conclusion

Following the MB1 protocol, the current study could not detect test-retest reliability
in measures of infants' preference for IDS over ADS. Subsequent analyses provided
tentative evidence that stricter criteria for the inclusion of participants may enhance
test-retest reliability at the cost of high drop-out rates. Developmental studies relying on
stable individual differences between their participants need to consider the underlying
reliability of their measures, and we recommend a broader assessment of test-retest
reliability in infant research.

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