

1 **Effects of traditional versus Montessori schooling on 4 to 15-year old children's**
2 **performance monitoring**

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15 **ABSTRACT**

16 Through performance monitoring individuals detect and learn from unexpected outcomes,
17 indexed by post-error slowing and post-error improvement in accuracy. Though performance
18 monitoring is essential for academic learning and improves across childhood, its susceptibility
19 to educational influences has not been studied. Here we compared performance monitoring on
20 a flanker task in 234 children aged 4 through 15, from traditional or Montessori classrooms.

21 While traditional classrooms emphasize that students learn from teachers' feedback,
22 Montessori classrooms encourage students to work independently with materials specially
23 designed to support learners discovering errors for themselves. We found that Montessori
24 students paused longer post-error in early childhood and, by adolescence, were more likely to
25 self-correct. We also found that a developmental shift from longer to shorter pauses post-error
26 being associated with self-correction happened younger in the Montessori group. Our findings

27 provide preliminary evidence that educational experience influences performance monitoring,
28 with implications for neural development, learning and pedagogy.

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34 To be successful in school, children must learn to distinguish correct from incorrect
35 responses. To do this, they must monitor their own performance, noticing when their work is
36 flawed and efficiently adapting their behavior. That is, they must notice, learn from and
37 correct errors.

38 Performance monitoring comprises the set of behavioral and neuronal responses that
39 individuals show in reaction to unexpected outcomes. When individuals notice something
40 unexpected, such as an error, they tend to pause, a phenomenon known as Post-Error Slowing
41 (PES; Ullsperger, Danielmeier, & Jocham, 2014). To learn from the discrepant event, they
42 must adapt their behavior accordingly (Ridderinkhof, Ullsperger, Crone, & Nieuwenhuis,
43 2004), a phenomenon measured as post-error improvement in accuracy (PIA; Danielmeier &
44 Ullsperger, 2011; Schroder & Moser, 2014).

45 The response to own error is measured through conflict tasks (e.g. Flanker task, Simon
46 task, Go/noGo task), where congruent and incongruent conditions require task-specific
47 response monitoring. PES can be computed as the reaction time (RT) difference between
48 post-error and post-correct responses. While a multitude of infant looking time and
49 electrophysiological studies show that by 2-3 months children detect and respond to deviant
50 events (Dehaene-Lambertz, 2000; Dehaene-Lambertz & Gliga, 2004), PES has not been
51 measured in children until about age 3 y. (the Simple Simon Task; Jones, Rothbart, & Posner,

52 2003). However, developmental data are inconsistent, sometimes showing invariant (Davies,
53 Segalowitz, & Gavin, 2004; Ladouceur, Dahl, & Carter, 2007; Santesso, Segalowitz, &
54 Schmidt, 2006), and sometimes increasing (Santesso & Segalowitz, 2008) or decreasing
55 (Carrasco et al., 2013; Hajcak, Franklin, Foa, & Simons, 2008; Smulders, Soetens, & van der
56 Molen, 2016) PES across age. Neural developmental studies have also reported inconsistent
57 outcomes in error-related brain components and their trajectories (Tamnes, Walhovd,
58 Torstveit, Sells, & Fjell, 2013). These contradictory results may reflect task design features
59 such as inter-stimulus timing or difficulty-level (Dutilh et al., 2012), but they have also been
60 proposed to reflect the instability of children's error monitoring (Smulders et al., 2016).
61 Taken together with a behavioral study reporting that PIA increases with age (Overbye et al.,
62 2018), such data suggest the possibility that the relationship between PES and PIA changes
63 with development (Brewer & Smith, 1989). Perhaps longer post-error pauses are adaptive in
64 early childhood, when children require time to effortfully stop and redirect, while shorter
65 pauses post-error may be the hallmark of efficient and automatic self-correction by
66 adolescence. This would be in line with the literature reporting a shift in how children process
67 learning signal saliency (van Duijvenvoorde, Zanolie, Rombouts, Raijmakers, & Crone, 2008;
68 van den Bos, Guroglu, van den Bulk, Rombouts, & Crone, 2009).

69 In addition to the possibility of a developmental shift in adaptive use of post-error
70 pauses, these apparently contradictory results could reflect variability of experience,
71 particularly in school. Such environmental influences would be consistent with known
72 experience-dependent effects on the development of executive functioning (Davidson, Amso,
73 Anderson, & Diamond, 2006), for example in children experiencing different school curricula
74 (Diamond, 2012). If true for executive functions, related competencies could be impacted as
75 well. Here, we hypothesize that even among children from relatively privileged backgrounds,

76 school pedagogical approach may modulate the processes by which children come to notice
77 and respond to their own errors.

78 Pedagogical traditions differ on how they teach children to learn from feedback,
79 though school-based influences on the development of performance monitoring have not been
80 investigated to our knowledge. For example, traditional education provides children from one
81 age group with opportunities to engage in work, and then to learn about and correct their
82 performance later based on a teacher's feedback. By contrast, Montessori education focuses
83 on supporting children in self-correcting in real time. It utilizes specialized materials that
84 encourage children's self-discovery of relevant concepts, and multi-age classes in which
85 children discuss correct and incorrect answers as they work.

86 Given these open developmental and experience-related questions, the purposes of this
87 study are: (1) to examine PES and PIA development across childhood and early-middle
88 adolescence; and (2) to evaluate whether children from equivalently high-quality pedagogical
89 environments with systematically different pedagogical approaches differ in their
90 developmental trajectories of performance monitoring. Accordingly, we measured post-error
91 slowing and post-error improvement in accuracy among groups of Montessori and
92 traditionally-schooled children during the completion of a child-friendly Flanker Task
93 (Eriksen & Eriksen, 1974). We hypothesized that: (a) PES would decrease with age; (b) PIA
94 would increase with age; (c) there would be a developmental shift in the relationship between
95 PES and PIA such that young children's longer pauses, and adolescents' shorter pauses,
96 would be associated with more effective self-correction; (d) these developmental effects
97 would be stronger in the Montessori group; (e) by adolescence, Montessori students would
98 show lower PES and higher PIA than their traditionally schooled peers.

99 The study was conducted in Switzerland, where alternative education is only found
100 within private schools. As a consequence, the Montessori schools in this study were private.

101 Accordingly, we had no option for a lottery design study. Given these constraints, we selected
102 Montessori and traditional schools from the same neighborhoods and of similarly high
103 academic quality, and confirmed that participating groups of students did not differ on the
104 basis of family SES, fluid intelligence or age.

105

106 **Methods**

107 The study was conducted in accordance with the Declaration of Helsinki and the research
108 protocol was approved by the University ethics committee. The study is part of a larger
109 project investigating effects school pedagogy on children's brain development. Teachers' and
110 pupils' participation was voluntary.

111

112 **Recruitment site selection:** Schools were selected to include children from affluent areas
113 only, using official government data on mean salary. Traditional and Montessori schools co-
114 existed in the same neighborhoods and were of similar academic quality as judged by
115 adherence to either official Montessori qualifications or government specifications for public
116 schools.

117

118 Traditional schools were public and were identified based on their adherence to the official
119 local study plan. This plan strictly implies, as from 7 years old, that children are provided:

- 120 (i) lecture-style, interactive teaching;
- 121 (ii) feedback in the form of grades and summative assessments;
- 122 (iii) breaks every hour;
- 123 (iv) age-specific class groupings (i.e. one grade level per class).

124 Prior to 7 years old, traditionally-schooled children are provided play-oriented curricula with
125 emphasis on building gross and fine motor skills and social skills.

126

127 Montessori schools were private and were selected following the criteria set by the
128 International Montessori Association (<https://montessori-ami.org>) to ensure high fidelity
129 implementation of the curriculum (Lillard, 2012), such that:

130 (i) all teachers were Montessori-trained and there was a complete set of Montessori
131 materials in each classroom;

132 (ii) children were not provided formal grades or summative assessments on work;

133 (iii) children had 3 hours of continuous work time each day;

134 (iv) classes contained at least 3 different grade levels;

135 Prior to 7 years-old, Montessori curricula emphasize independent learning from specialized
136 materials designed to refine the senses and teach early academic skills.

137

138 **Participants:** 10 traditional and 13 Montessori schools were selected to participate. Consent
139 letters were sent home to all parents of children ages 4 to 15, and 234 children's parents
140 consented. An additional 4 children were consented but excluded due to having made no
141 errors (accuracy rate of 100%; n=2), or being outside the target age range (older than 15.5 y.;
142 n=2). The final sample consisted of 234 children from 4.4 to 15.3 y. ($M_{\text{age}} = 9.02$ years old,
143 $SD = 2.43$ y., 114 girls and 120 boys); 111 participants were enrolled in the traditional
144 educational system (59 girls), and 123 were schooled in the Montessori educational system
145 (55 girls).

146

147 **Study protocol:** The experiment took place in the children's schools. Participants were seated
148 in a separate room outside their classroom. Assessments of both groups were conducted by
149 four trained experimenters (including the first author).

150

151 *Group comparison.* To ensure between-group homogeneity, we tested for pedagogical group
152 differences in: (i) age; (ii) gender; (iii) socio-economic status [SES; measured through a
153 parental questionnaire (Genoud, 2011) that 78.6% filled out, 84.7% in the traditionally-
154 schooled group and 73.2% in the Montessori group]; and (iv) fluid intelligence (FI), evaluated
155 using the black-and-white version of the Raven's Progressive Matrices task (Raven, Raven, &
156 Court, 1998).

157
158 *PES* and *PIA* were assessed using RT and accuracy from a child-friendly version of the
159 Flanker task (Eriksen & Eriksen, 1974), presented via Presentation® software. The child was
160 asked to “feed hungry fish” by pressing the key facing the same direction as the target fish in
161 the display (five fishes in line). Each child completed three blocks, the first two of which were
162 preceded by training sessions. In the first block, the child was instructed to focus on the fish at
163 the center of the line (17 trials). In this block, all stimuli (fishes) were blue. In the second
164 block, the child was instructed to focus on the fishes flanking the central one (17 trials). In
165 this block, all stimuli were pink. In the final block, the child was instructed to focus either on
166 the inside fish or on the outside, flanker fish, depending on their color (45 trials). Due to RT
167 change across age, the response time limit was 2000 ms up to 6 years old, and 1500 ms for
168 older children.

169 *Dependent variables.* We examined PES and PIA measures across age and tested for
170 interactions by pedagogical group.

171
172 Statistical analyses were done with the Jamovi open-source software (Version 0.9; The
173 jamovi project (2019). Retrieved from <https://www.jamovi.org>).

174

175 **Results**

176 *Pedagogical group demographic comparison.* Independent samples *t* tests showed no
177 pedagogical group differences in age, SES background or fluid intelligence (FI) scores (all
178 $p > .4$; see Table 1). A χ^2 test showed no group differences in gender distribution.

179 *Pedagogical group task performance comparison.* One-way ANCOVAs showed no
180 statistically significant differences between Montessori and traditional students on either
181 mean Reaction time (RT) or Error rate, controlling for age (RT: $F(1,230) = 0.34$, $p = .56$, $\eta^2 =$
182 0.001 ; Error Rate: $F(1,230) = 1.29$, $p = .26$, $\eta_p^2 = 0.006$). As expected, RT and Error rate
183 significantly decreased with age (RT: $F(1,230) = 295.52$, $p < .001$, $\eta_p^2 = 0.56$; Error Rate:
184 $F(1,230) = 167.10$, $p < .001$, $\eta_p^2 = 0.42$).

185

186 *PES.* The detection of errors was investigated by comparing the RT after correct and incorrect
187 responses. Following previous studies' protocol (Eriksen & Eriksen, 1974; McDermott,
188 Perez-Edgar, & Fox, 2007), we computed differences in valid RT¹ (RT > 250 ms and within 2
189 SD) between post-error and post-correct trials ($RT_{post-error} - RT_{post-correct}$). We computed a one-
190 way ANCOVA with age as the covariate and pedagogy as a fixed factor, and the interaction
191 term (pedagogy*age). The analysis revealed that PES increased with age, $F(1,230) = 4.99$,
192 $p = .026$, $\eta_p^2 = 0.02$. There was no effect of pedagogy on PES, $F(1,230) = 2.26$, $p = .134$,
193 $\eta_p^2 = 0.01$, and no significant interaction between pedagogy and age on PES, $F(1,230) = 1.76$,
194 $p = .186$, $\eta_p^2 = 0.001$. To accommodate the possibility that the developmental change would not
195 be linear, we ran an additional age-group analysis. We divided the children into four age
196 groups with cut points corresponding as closely as possible to school transitions, i.e. from
197 Kindergarten to grade school; from early to middle grade school; from middle grade school to
198 pre-adolescent classrooms; from early adolescence onward. Groups spanned an average of 2.5

¹ Analysis with raw RTs strengthens the findings. However, to avoid that outlier trials drive the significant results, RTs outside 2 SD were filtered out.

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199 years (see Table 2). To test differences in developmental pattern in PES, we computed a two-
200 way ANOVA with age-group, pedagogy and the interaction term (age-group*pedagogy) as
201 fixed factors and confirmed an age-group difference, $F(1,226) = 2.67, p = .048, \eta_p^2 = 0.034$. A
202 post-hoc t-test revealed that pedagogical groups differed in PES from age 4.5 to 9 y.;
203 traditional students showed significantly less PES in this age range ($t(226) = -3.16,$
204 $p_{tukey} = 0.038$; see Figure 1A).

205 *PIA*. Self-correction post-error was computed as the ratio of error trials that were immediately
206 followed by a correct trial, divided by the total number of error trials. The ANCOVA analysis
207 revealed that PIA increased with age, $F(1,230) = 104.76, p < .001, \eta_p^2 = 0.31$. Pedagogy was
208 associated with PIA at the trend-level, $F(1,230) = 3.09, p = .08, \eta_p^2 = 0.013$, with overall self-
209 correction post-error slightly higher in Montessori students. As hypothesized, there was a
210 significant interaction between pedagogy and age on PIA, $F(1,230) = 4.08, p = .045, \eta_p^2 = 0.02$,
211 such that Montessori students showed a stronger developmental increase in self-correction. A
212 two-way ANOVA on PIA by age-group, pedagogy and the interaction term (age-
213 group*pedagogy) further confirmed a significant increase across age-groups, $F(1,226) = 32.39,$
214 $p < .001, \eta_p^2 = 0.30$, an effect that was stronger in the Montessori older schoolers ($p_{tukey} < 0.025$;
215 see Figure 1B).

216 *The relationship between PES, PIA and Pedagogy* shifted with development. In a linear
217 regression model, PES, age, pedagogy and the interaction terms (age*PES, age*pedagogy,
218 pedagogy*PES), age, PES, and age*PES were all predictors of PIA ($R^2 = 0.34$; all $p < 0.035$),
219 such that as students grew older, the less PES they showed, the greater PIA they showed.
220 Pedagogy was nearly a significant predictor of PIA in this model ($p = 0.052$). Furthermore,
221 there was a significant interaction between pedagogy and age such that Montessori students
222 showed a stronger and earlier developmental effect ($F(1,227) = 5.72, p = 0.018$; see Figure 2).

223 By adolescence (age 11-15y.), Montessori students showed lower PES and greater PIA than
224 their traditionally schooled peers (PES: $t(46)=2.13, p=.039$; PIA: $t(46)=2.14, p=.037$).

225 **Discussion**

226 In this study we compared PES and PIA in traditional and Montessori schoolers across
227 age, with the aim of mapping developmental differences in performance monitoring in the
228 flanker task, and observing how developmental changes in performance monitoring may be
229 influenced by pedagogy. The age range included in our study, from 4 to 15 years old,
230 corresponds to the broad developmental period in which the brain regions responsible for
231 conflict monitoring and error recognition and correction are maturing (Kelly et al., 2009;
232 Velanova, Wheeler, & Luna, 2008). It is also the age range in which schooling is known to
233 have a profound effect on cognitive skills (e.g. on IQ; Falch & Massih, 2011).

234 We found that, whether attending Montessori or traditional school, as children grew
235 older both their PES and their PIA increased, partially corroborating previous studies
236 (Overbye et al., 2018; Smulders et al., 2016). Interestingly, the developmental increase in PES
237 we observed was largely driven by the younger children (<9 years old) enrolled in traditional
238 schools. In our study, the youngest Montessori students' PES was similar to that of the oldest
239 students, suggesting an earlier maturation of the capacity to detect response errors. These
240 findings may possibly explain inconsistencies between previously reported findings
241 (Smulders et al., 2016); our data suggest that the ability to detect response errors is especially
242 malleable up to 9 years old, and may be trained by schooling. Of note, the number of errors
243 did not differ between pedagogical groups at any age; instead, it was the capacity for self-
244 correction that showed pedagogical effects.

245 The relationship between PES and PIA also changed with age: in young children,
246 pausing after an error was associated with a subsequent self-correction. This was no longer
247 the case among adolescents, for whom shorter pauses were associated with more effective

248 self-correction. The developmental shift from longer to shorter pauses being associated with
249 more effective self-correction happened at a younger age among Montessori students
250 (approximately at age 8 versus at age 10). Together these results shed light on the
251 developmental trajectory of performance monitoring across childhood and early-mid
252 adolescence, and suggest that error recognition may be modulated by early school experience
253 (< 9 years old), with implications for self-correction in adolescence. Future longitudinal work
254 is needed to uncover the developmental processes that undergird our findings, and to better
255 understand the implications of these findings for children's development and learning more
256 broadly.

257 Over the course of schooling, children learn to associate salient events like task
258 outcomes with context-dependent feedback, and to adjust behavior. Our results could possibly
259 reflect the Montessori curriculum's relative emphasis on students building early awareness of
260 the sensory properties of materials (i.e. learning to discriminate forms, colors, textures,
261 temperatures, etc.), without waiting for a teacher's feedback or external reinforcers (e.g.
262 grades, rewards, etc.; Dolan & Dayan, 2013; Glascher, Daw, Dayan, & O'Doherty, 2010).
263 This may serve to orient Montessori students toward directly perceiving information about
264 outcomes in academic tasks and may teach them to more effectively self-monitor in academic
265 tasks. Whereas the free play orientation used early in traditional schools may benefit children
266 in other ways (Lillard, 2017), it may not orient children to notice errors on academic-style
267 tasks as effectively.

268 The social-affective orientation toward errors in Montessori and traditional classrooms
269 may further contribute to our effects. Montessori students' reliance on direct sensory
270 perceptions as feedback may be reinforced by the culture of the Montessori classroom, which
271 emphasizes non-competitive peer-to-peer teaching within classes of students of different ages.
272 Previous research has demonstrated that cooperative environments lead to more effective

273 shared learning from errors, and hence to better transfer of knowledge (Koban, Pourtois,
274 Vocat, & Vuilleumier, 2010). By contrast, the delayed, teacher-provided evaluative feedback
275 in traditional classrooms may lead students to become increasingly reactive to errors, which
276 come to be negatively valenced, privately conveyed from the teacher to the student, and
277 socially stigmatized. As formal instruction is instituted and the grading system for external
278 valuation of work takes hold, traditionally-schooled children learn to value correct answers
279 provided by their teachers and to avoid, rather than productively engage with, errors (Hayek,
280 Toma, Guidotti, Oberlé, & Butera, 2017; Hayek, Toma, Oberle, & Butera, 2014, 2015).
281 Indeed, a study suggests that correct answers are selectively associated with positive valence
282 in traditionally-schooled children, while Montessori students show no such effect (Denervaud
283 et al., *in review*).

284 Our interpretation builds from the basic distinction between internally-derived,
285 sensory learning and externally-derived, value-based learning that is fundamental to learning
286 theories, including for example to work on extrinsic versus intrinsic motivation (Oudeyer,
287 Gottlieb, & Lopes, 2016; Ryan & Deci, 2000) and reinforcement learning (Dolan & Dayan,
288 2013; Frank, Worocho, & Curran, 2005; Glascher et al., 2010; Worthy, Cooper, Byrne,
289 Gorlick, & Maddox, 2014). If we are correct, it would suggest that many types of experiences
290 that support children in building skills for safe and adaptive self-directed learning should
291 support children's performance monitoring development. It is possible that, for example, the
292 strong outcomes found with well-designed and supported project-based learning (Condliffe et
293 al., 2017; Knecht, Gannon, & Yaffe, 2016) could have a similar effect, or, for that matter,
294 increased proportions of productive self-directed time during childhood (Barker et al., 2014).
295 This study has two main limitations. First, the study is cross-sectional. Though the study
296 includes a continuous age range of students, longitudinal work with children experiencing
297 different styles of pedagogy would increase confidence in the developmental trajectories

298 described here. Second, the study has a non-randomized design. It is possible that parents who
299 value self-directed behavior themselves are more likely not only to enroll their children into
300 Montessori schools but also to encourage their child to err and autonomously correct
301 themselves on academic tasks at home. That said, we find it unlikely that the effects we report
302 here are entirely due to selection biases. A study of scholastic, social-emotional and creativity
303 measures in students from the schools included here produced similar effect sizes as have
304 existing randomized studies in other Montessori and traditional schools (Lillard & Else-Quest,
305 2006; Lillard et al., 2017; Denervaud, Knebel, Hagmann, & Gentaz, 2019).

306 In conclusion, our findings suggest that children from 4 to 15 years of age develop
307 performance monitoring, and that this development may be influenced by the pedagogical
308 approach they experience at school. Our findings provide preliminary evidence that
309 inconsistencies in previous studies may be due in part to classroom experience. Our results
310 also suggest the possibility that early and strong development of the capacity to discriminate
311 errors, though this requires time in young children, may have downstream developmental
312 effects on the ability to efficiently self-correct in adolescence.

313 Debates in education often focus on the most appropriate ways to optimally provide
314 content-area knowledge to students. Our findings reiterate the importance of understanding
315 how pedagogical orientations toward the learning process, and not simply curricular content
316 itself, are important factors shaping children's development. The findings also point to the
317 need for nuanced developmental studies of children's cognitive, affective and social
318 capacities and their interactions in various school contexts (Immordino-Yang, Darling-
319 Hammond, & Krone, 2019). Given the rapid pace of societal change youth face, it is of
320 utmost importance that educational experiences equip children not simply with knowledge but
321 with abilities to effectively and flexibly learn independently. Our study provides a small step

322 toward connecting research on performance monitoring with the development of mental
323 processes in children's educational environments.

324

325 **Data availability**

326 The data that support the findings of this study are available from the corresponding author
327 upon motivated request.

328

329 **Competing interests**

330 The authors declare no competing interests.

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463

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471

472

Control variables	Group		χ^2 or t-test
	Montessori (n=123)	Traditional (n=111)	
Age, mean (SD)	8.89 (2.34)	9.17 (2.53)	$t(232)=-0.87, p=.39, ns$
Age min, max	4.40, 15.2	4.50, 15.3	ns
Gender (N girls)	52	59	$\chi^2(1,231)=2.23, p=.14, ns$
Socio-Economic Status (SD)	0.70 (0.11)	0.70 (0.12)	$t(182)=-0.006, p=.99, ns$
Fluid Intelligence, mean (SD)	30.1 (7.81)	29.6 (6.61)	$t(209)=0.56, p=.58, ns$
Mean RT (SD)	878.28 (199.52)	878.09 (191.28)	$t(232)=0.007, p=.99, ns$
Error rate (SD)	20.95 (14.72)	20.94 (12.79)	$t(232)=0.08, p=.99, ns$

473

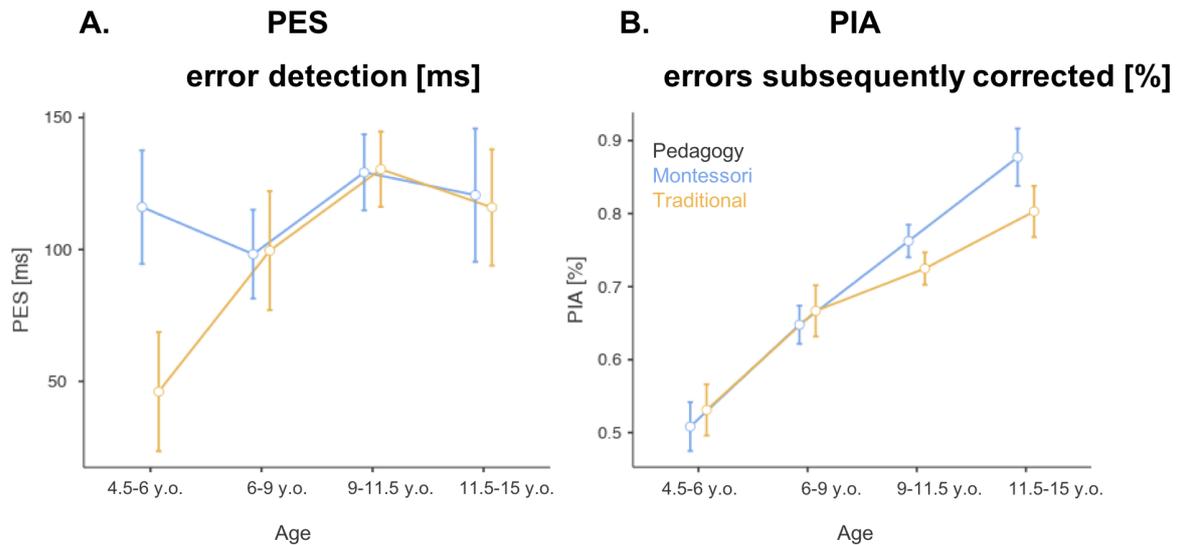
474 **Table 1: Participant demographics and control variables.**

475

Pedagogy	Age-group	Mean Age	SE
Montessori	4.5-6 y.	5.35	0.159
	6-9 y.	7.75	0.125
	9-11.5 y.	10.19	0.107
	11.5-15 y.	12.36	0.187
Traditional	4.5-6 y.	5.31	0.167
	6-9 y.	7.29	0.167
	9-11.5 y.	10.04	0.106
	11.5-15 y.	12.56	0.163

476

477 **Table 2: Groups per pedagogy.** To complement our continuous analysis, we additionally ran an age-
 478 group discrete analysis. Accordingly, children were divided into four groups. A two-way ANOVA
 479 confirmed that mean ages did not differ by pedagogical group ($F(3,226)=1.49, p=.217$). SE stands for
 480 standard error.

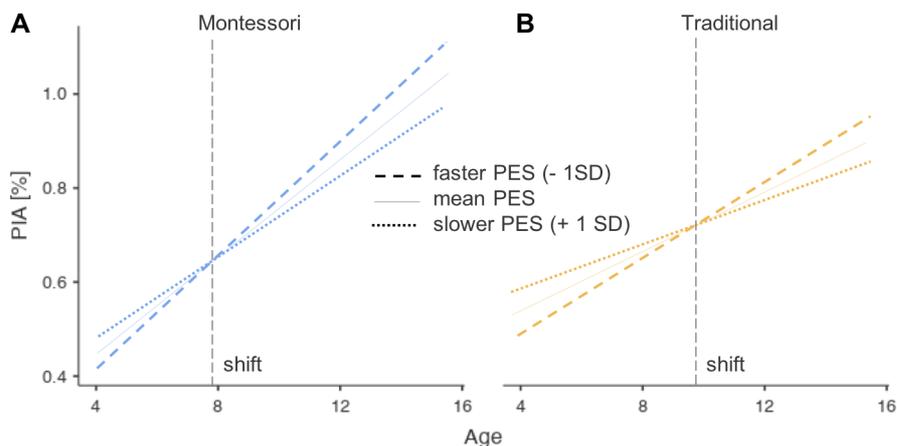


481

482 **Figure 1A Post-Error Slowing (PES) as a measure of error-detection.** ΔRT (MRT of trials_{incorrect} - trials_{correct}[ms] over all valid trials) as a function of age-group showing that young children differ in
 483 their PES pattern according to their pedagogical experience, while older students do not. **1B Post-**
 484 **Error Improvement in Accuracy (PIA) as the percentage of errors that were subsequently**
 485 **corrected.** Post-error correct trials over the total number of errors as a function of age-group boxplots
 486 showing that 9-15 year-old students differ in PIA pattern according to their pedagogical experience,
 487 while younger students do not. For both graphs, error-bars display standard-error (SE).
 488

489

ERROR DETECTION AND CORRECTION



490

491 **Figure 2: Pedagogical influence on the relationship between error detection (PES) and**
 492 **error correction (PIA).** PIA was reliably predicted by age and age*PES, such that younger
 493 children who slowed more after errors (slower PES; mean RT+1SD) were more likely to self-
 494 correct, while older children who slowed less after errors (faster PES; mean RT-1SD) were
 495 more likely to self-correct. Pedagogy effected this developmental shift, which happened
 496 earlier in Montessori than in traditionally schooled students.

497