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1 **Cognitive Function in People with Familial Risk of Depression: Evidence from Four**
2 **Cohorts Across the Lifespan**

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Key Points

38 **Questions:** Are hypothesized associations between familial risk of depression and lower
39 cognitive performance evident across the lifespan, for both family history and genetic risk
40 measures?

41 **Findings:** In three younger cohorts (TGS, ABCD, and Add Health; age range 6-42y), family
42 history of depression was primarily associated with lower performance in the memory
43 domain, whereas in the older UK Biobank cohort (age range 44-83y) the associations were
44 stronger for processing speed, attention and executive function; effect sizes were largest in
45 the deeply-phenotyped TGS cohort. Associations were similar in the polygenic risk score
46 analyses and were evident even in participants who had never been depressed themselves but
47 had a family history of depression.

48 **Meaning:** Whether assessed by family history or genetic data, there is evidence that
49 depression in prior generations is associated with lower cognitive performance in offspring,
50 which has important implications for understanding and addressing potentially modifiable
51 risk factors.

Abstract

52

53 **Importance:** Cognitive impairment in depression is poorly understood. Family history of
54 depression is a potentially useful risk marker for cognitive impairment, facilitating early
55 identification and targeted intervention in those at highest risk, even if they do not themselves
56 have depression. Several research cohorts have emerged recently which enable findings to be
57 compared according to varying depth of family history phenotyping, in some cases also with
58 genetic data, across the lifespan.

59 **Objective:** To investigate associations between familial risk of depression and lower
60 cognitive performance in four independent cohorts with varied depth of assessment, using
61 both family history and genetic risk measures.

62 **Design:** Longitudinal or cross-sectional analyses conducted in March-June 2022, of data
63 from the ‘Three Generations’ family study (TGS; data collected 1982-2015) and three large
64 population cohorts: ABCD (2016-2021), Add Health (1994-2018), and UK Biobank (2006-
65 2022).

66 **Setting:** Family and population-based research cohorts.

67 **Participants:** Children and adults with or without familial risk of depression.

68 **Exposures:** Family history (across one or two prior generations) and polygenic risk of
69 depression.

70 **Main Outcome(s) and Measure(s):** Neurocognitive tests at follow-up. Regression models
71 were adjusted for confounders and corrected for multiple comparisons.

72 **Results:** The sample sizes for analysis were 87 in TGS (mean age 19.71y, SD 6.55; 48%
73 female), 10,258 in ABCD (mean age 12.00y, SD 0.66; 48% female), 1,064 in Add Health
74 (mean age 37.75y, SD 1.88; 49% female), and 45,899 in UK Biobank (mean age 63.99y, SD
75 7.71; 51% female). In the younger cohorts (TGS, ABCD, and Add Health), family history of
76 depression was primarily associated with lower performance in the memory domain and there

77 were indications that this may be partly related to educational and socioeconomic factors. In
78 the older UK Biobank cohort, the associations were stronger for processing speed, attention,
79 and executive function, with little evidence of education or socioeconomic influences. These
80 associations were evident even in participants who had never been depressed themselves.
81 Effect sizes were largest in TGS: largest standardized mean differences in primary analyses
82 were -0.55, 95% CI -1.49 to 0.38 (TGS); -0.09, 95% CI -0.15 to -0.03 (ABCD); -0.16, 95%
83 CI -0.31 to -0.01 (Add Health); -0.10, 95% CI -0.13 to -0.06 (UK Biobank). Results were
84 generally similar in the polygenic risk score analyses. In UK Biobank, several tasks showed
85 statistically significant associations in the polygenic risk score analysis that were not evident
86 in the family history models.

87 **Conclusions and Relevance:** Whether assessed by family history or genetic data, there is
88 evidence that depression in prior generations is associated with lower cognitive performance
89 in offspring. There are opportunities to generate hypotheses about how this arises through
90 genetic and environmental determinants and moderators of brain development and brain
91 aging, and potentially modifiable social and lifestyle factors across the lifespan.

92

Introduction

93

94 Cognitive impairment is a key cause of disability in adults with depression. It is evident at the
95 first depressive episode¹ and persists even after remission² leading to worse functioning³ and
96 lower quality of life.⁴ Cognitive impairment in depression is poorly understood, but likely
97 involves a complex interplay between background risk factors for both depression and
98 cognitive dysfunction, and other factors that operate further downstream after depression
99 onset.

100 Background risk can be elucidated by studying biological relatives of people with
101 depression. A meta-analysis of studies of never-depressed first-degree relatives of people
102 with major depressive disorder⁵ showed consistent effect sizes across all cognitive domains
103 (standardized mean difference -0.2), which were statistically significant for intelligence,
104 memory, and language but not attention, speed, or executive function. Family history of
105 depression therefore has potential to be a clinically useful risk marker, opening the possibility
106 of early identification and targeted prevention or intervention for cognitive dysfunction in
107 those at highest risk.

108 There are challenges with studying familial risk of depression. Retrospective
109 reporting of family history is liable to missingness and recall bias, but direct prospective
110 assessment is resource-intensive and difficult to implement at scale. The family study known
111 as ‘Three Generations at High and Low Risk of Depression Followed Longitudinally’⁶
112 (hereon, Three Generations, TGS) offers a unique opportunity to investigate family history
113 and cognitive function using gold-standard methods. Prospective clinical assessment of
114 depression by trained clinical interviewers has been undertaken on multiple occasions across
115 more than 30 years, together with high quality cognitive testing and neuroimaging. The
116 inclusion of multiple generations enables family risk to be characterized in greater detail than
117 the majority of studies to date, which have included only first-degree relatives. We have

118 shown that there is a ‘dose’ effect in this cohort whereby offspring with both a parent and
119 grandparent with major depression were at highest risk for developing depression
120 themselves.⁶ No study to date has investigated whether a dose effect is also present for
121 offspring cognitive outcomes. If that were found to be the case, it would enable better
122 targeting of early intervention on the basis of number of prior generations affected.

123 Although the TGS cohort is uniquely well-placed to enable this research, it is essential
124 that findings are replicable and generalizable to the wider population, especially where direct
125 assessment of relatives is not feasible. We have demonstrated that a dose effect on offspring
126 depression outcomes is also evident in the general population-based Adolescent Brain
127 Cognitive Development study (ABCD Study®),^{7,8} which relied on family history reported
128 retrospectively by a single informant, and similar research is needed on cognitive outcomes.

129 It is also important to include cohorts with different age ranges; there are indications
130 that processing speed deficits are less prominent (compared with deficits in other domains) in
131 unaffected relatives⁵ and emerge later in life in those with depression,² implicating
132 downstream effects of depressive illness or differential aspects of brain aging. A further
133 advantage of studying large population cohorts such as ABCD is that many include
134 genotyping data, enabling the derivation of polygenic risk scores (PRS). Polygenic risk for
135 depression represents genetic aspects of familial depression risk based on common genotypic
136 variants, and has been shown to be associated with a wide range of phenotypes relating to
137 mental and physical health and brain structure in independent cohorts.⁹ Socially diverse
138 population cohorts can also shed light on non-genetic aspects of familial risk; for example,
139 lower socioeconomic resources in families affected by depression may reduce opportunities
140 for cognitive development in offspring,^{5,10} as well as modifying genetic risk in an interactive
141 manner.⁹

142 In this study we quantified the association of familial risk of depression with
143 cognitive outcomes, in TGS and in three general population cohorts spanning childhood to
144 old age: ABCD,⁷ the National Longitudinal Study of Adolescent to Adult Health (‘Add
145 Health’),¹¹ and UK Biobank.¹² Our aims were to ascertain whether the hypothesized
146 associations with lower cognitive performance were evident in all cohorts and for both family
147 history and genetic data, and to elucidate the patterns of association across cognitive domains
148 and across the lifespan.

149

150

Method

151 This study used a cohort design within TGS, ABCD, and UK Biobank, with family history
152 data collected at one assessment wave and cognitive outcomes measured at a later wave. In
153 Add Health the family history data and cognitive data were only available at the same wave,
154 and so these analyses were cross-sectional. Reporting follows STROBE guidelines.¹³

155

Participants

157 Each cohort’s study procedures were approved by the relevant Institutional Review Board or
158 Ethics Committee and participants gave written informed consent. Full details regarding the
159 design and composition of each cohort are provide in eMethods in the Supplement.

160

Familial Risk Exposures

162 Familial risk of depression was measured using two sources of data: reported/assessed
163 biological family history and PRS.

164

165 *Family History of Depression*

166 TGS was the only cohort in which depression was directly assessed in all generations by
167 direct interview with the subject. In the other cohorts, family history was ascertained from
168 retrospective reporting by the participant or their parent. The cohorts varied in how
169 depression was defined (details in eMethods): TGS used a best-estimate major depressive
170 disorder diagnosis with an additional requirement of impaired functioning; ABCD asked
171 about “depression, that is, have they felt so low for a period of at least two weeks that they
172 hardly ate or slept or couldn't work or do whatever they usually do?”; Add Health asked
173 about “depression” (not further defined); and UK Biobank asked about “severe depression”
174 (not further defined). The primary family history measure used in the main analyses was a
175 binary variable based on lifetime parental history (at least one biological parent with
176 depression versus no parent with depression); this is in keeping with the previous meta-
177 analysis, in which parental history was the exposure in most studies.⁵ Three of the cohorts
178 (not UK Biobank) also collected data on biological grandparent history, enabling the creation
179 of secondary exposure measures: (i) binary variable for at least one parent/grandparent with
180 depression versus no parent/grandparent with depression and (ii) four-category dose variable⁸
181 representing the number of prior generations with depression (both generations; parent only;
182 grandparent only; neither generation).

183

184 *Polygenic Risk for Depression*

185 This was available in three cohorts (not TGS). In ABCD, we created LDpred PRS¹⁴ based on
186 a 2019 genome-wide association study (GWAS) meta-analysis of various depression
187 phenotypes (self-reported or clinically confirmed).¹⁵ Details are provided in eMethods. The
188 Add Health PRS was created centrally by the Add Health team¹⁶ based on the same 2019
189 meta-analysis. The UK Biobank PRS was not created from the 2019 meta-analysis because
190 UK Biobank was a discovery cohort in that GWAS. We instead created the UK Biobank

191 LDpred PRS from a 2018 GWAS of various depression phenotypes,¹⁷ using summary
192 statistics that excluded UK Biobank participants. Details are provided in eMethods. All PRS
193 were standardized as z-scores (mean 0, SD 1) within each analysis sample.

194

195 **Cognitive Outcome Measures**

196 In each cohort, all available tests of neurocognition were analyzed (details in eMethods).
197 TGS Wave 6 follow-up included a detailed battery of assessor-administered gold-standard
198 tests of speed, reasoning/intelligence, attention, executive function, and memory. This was
199 administered only to participants who were assessed in person. ABCD Year 2 follow-up
200 included assessor-administered brief computerized tests of vocabulary, speed,
201 attention/executive function, and memory, using a mix of in person and videoconferencing
202 assessment. Add Health Wave V follow-up included three assessor-administered brief
203 bespoke measures of attention/executive function and memory, administered only to a
204 representative subsample who were assessed in person. The UK Biobank imaging visit
205 follow-up (in person) included self-administered brief computerized touchscreen tests of
206 speed, reasoning, attention, executive function, and memory. Composite scores (representing
207 the mean performance across tests within a cognitive domain) were also analyzed.

208

209 **Covariates**

210 Age, sex, ethnicity, country of birth (as an indicator of linguistic/cultural variation which may
211 affect performance on US/UK-designed cognitive tests), and duration between exposure and
212 outcome waves were analyzed as potential confounders. We also extracted data on highest
213 level of educational qualifications (except in ABCD, where all participants were still in
214 education) and socioeconomic status (SES); these may act as mediators rather than
215 confounders (i.e. if they are influenced by parental/grandparental depression and in turn

216 affect opportunities for cognitive development in offspring), and their potential role was
217 evaluated by adding them as additional covariates in sensitivity analyses. For the purpose of
218 secondary analyses, we classified participants according to whether they had a lifetime
219 history of depression or of neurological disorders that may affect cognitive performance (see
220 eMethods).

221

222 **Statistical Analyses**

223 Analyses were conducted in Stata¹⁸ v15 or v17 and took account of complex survey structure
224 and relatedness in the datasets using weighting and cluster standard errors. Descriptive
225 statistics are reported for the whole sample and split by family history status. The validity of
226 the familial risk exposure measures was checked by examining their association with lifetime
227 history of depression in the analysis sample. Analyses of the association between familial risk
228 of depression and cognitive outcome were conducted using unadjusted and adjusted
229 regression models. All but one of the cognitive outcome measures were z-scores, so these
230 were analyzed in linear models and the coefficients can be interpreted as standardized mean
231 differences in cognitive score per unit of the exposure. The Prospective Memory score in UK
232 Biobank was binary, so this was analyzed in a logistic model with results expressed as the
233 odds ratio (OR) for a correct response per unit of the exposure. We report 95% confidence
234 intervals (CI), and two-tailed *P* values are reported with and without correction for multiple
235 comparisons (false discovery rate [FDR] maintained at .05). Full details of all models are
236 provided in the eMethods.

237

238

Results

239 **Characteristics of the Samples**

240 Demographic, health, and family history characteristics in each cohort are summarized in
241 Table 1. Further descriptive statistics for all measures, stratified by family history status, are
242 provided in eTables 1-4. The validity of the family history and PRS exposures was
243 demonstrated by their clear associations with lifetime depression history in each analysis
244 sample (see eResults).

245

246 **Association Between Family History of Depression and Cognitive Outcomes**

247 *Three Generations*

248 Sample sizes were small and so estimates have relatively wide confidence intervals and
249 should be interpreted with caution. In the primary adjusted models (parental history of
250 depression; Figure 1), the only task with an estimate tending towards lower performance was
251 dual-task decrement, with an effect size of medium magnitude. Additional adjustment for
252 SES showed similar results on most tasks, but shifted the results for IQ in a positive direction
253 (eFigure 1(C) in Supplement). Using the dose exposure measure, the specific contrast
254 analysis between the subgroups with both versus neither prior generations affected was
255 strongest for dual-task decrement (eFigure 2(B)). The exclusion of individuals with
256 depression attenuated some estimates towards the null, with the exception of the visual
257 delayed memory task (eFigure 3(A)). After taking account of missing data, results again
258 suggested possibly lower performance on some attention/executive tasks (eFigure 4). It was
259 not possible to conduct sensitivity analyses in an unrelated subgroup due to very small
260 sample sizes.

261

262 *ABCD*

263 The primary adjusted models (parental history; Figure 2(A)) showed that performance on the
264 picture memory task was lower in the group with a family history of depression, with verbal

265 memory, the memory composite score, and processing speed also suggestive of slightly lower
266 performance. Effect sizes were very small. These differences attenuated towards the null after
267 additional adjustment for SES (eFigure 5(B) in Supplement). Participants with a family
268 history of depression showed relatively higher performance on vocabulary tasks in the
269 unadjusted model and in the adjusted model including SES (eFigure 5). Compared with the
270 primary models, the pattern of results across cognitive domains was similar in models that
271 took into account grandparental as well as parental history, that excluded participants with
272 depression or neurological disorders, that were restricted to unrelated participants, and that
273 took account of missing data (eFigures 6-8).

274

275 *Add Health*

276 Delayed memory and the memory composite score showed suggestive evidence of lower
277 performance in those with a family history (primary adjusted analysis for parental history,
278 Figure 3(A)), with small effect sizes. This attenuated slightly after additional adjustment for
279 education and SES (eFigure 9 in Supplement). Results were similar in secondary models
280 taking into account grandparental history (eFigure 10), in models that excluded people with
281 depression or neurological conditions (eFigure 11), and after accounting for missing data
282 (eFigure 12(B)). In models restricted to unrelated participants, all estimates shifted towards
283 the null or positive direction (eFigure 12(A)).

284

285 *UK Biobank*

286 Figure 4(A) shows associations in the primary adjusted analyses between family (parental)
287 history and lower performance on tests of processing speed, attention and executive function.
288 Effect sizes were very small. Results were essentially the same after additional adjustment for
289 education and SES (eFigure 13 in Supplement). Results attenuated after excluding people

290 with depression (though still showed lower performance) but there was little or no evidence
291 of attenuation after excluding those with neurological conditions (eFigure 14), or restricting
292 to unrelated participants (eFigure 15(A)). Results were the same after accounting for missing
293 data (eFigure 15(B)).

294

295 **Association Between Polygenic Risk for Depression and Cognitive Outcomes**

296 *ABCD*

297 Primary adjusted models in the White subgroup (Figure 2(B)) showed lower performance on
298 picture memory, similar to the family history models, but also showed lower performance on
299 picture vocabulary and a tendency towards lower performance on other tasks except verbal
300 memory. Effect sizes were very small. After additional adjustment for SES (eFigure 16(B) in
301 Supplement), the picture memory result was essentially unchanged but the vocabulary
302 estimates attenuated towards the null. Results were virtually the same in the larger multi-
303 ancestry sample (eFigure 17). Compared with the primary models, results were almost the
304 same in models that excluded participants with depression or neurological disorders, that
305 were restricted to unrelated participants, and that took account of missing data (eFigures 18
306 and 19).

307

308 *Add Health*

309 Primary adjusted models in the European subgroup (Figure 3(B)) showed no association with
310 memory performance, but there was a positive association of small magnitude on the
311 attention task (digit span) that had not been evident in the family history analyses. This
312 remained evident after additional adjustment for education and SES (eFigure 20 in
313 Supplement), and was also seen in the larger multi-ancestry sample (eFigure 21). Excluding
314 participants with depression or neurological disorders, restricting to unrelated participants,

315 and taking account of missing data did not make any appreciable difference to the results
316 (eFigures 22 and 23).

317

318 *UK Biobank*

319 Lower performance was seen on all but two of the cognitive tests in the primary adjusted
320 models (Figure 4(B)). The general pattern of performance across domains was quite similar
321 compared with the family history results, with similarly small effect sizes, but several tasks
322 showed statistically significant associations in the PRS analysis only (reasoning, digit span,
323 memory). Additional adjustment for education and SES did not change the results (eFigure
324 24 in Supplement); nor did excluding participants with depression or neurological disorders
325 (eFigure 25), restricting to unrelated participants (eFigure 26(A)) or accounting for missing
326 data (eFigure 26(B)).

327

328

Discussion

329 This study provides evidence for lower cognitive performance in people with familial risk of
330 depression, which appears to manifest differently across the lifespan. In the younger cohorts
331 (primarily ABCD and Add Health), family history of depression was associated with lower
332 performance in the memory domain, albeit inconsistently, and there were indications that this
333 may be partly related to educational and socioeconomic factors. In contrast, family history in
334 the older UK Biobank cohort was associated with lower performance in the domains of
335 processing speed, attention and executive function, but not memory, and there was little
336 evidence of an influence of education or SES. Although there was a dose effect for
337 depression itself, with participants with two prior generations affected showing greater odds
338 of depression, this effect was not clearly evident with regard to the strength of association
339 with cognitive performance.

340 The largest effect sizes were found in TGS, albeit with wider confidence intervals due
341 to the small sample size. Effect sizes in the other cohorts were smaller than in TGS and the
342 previous systematic review.⁵ Larger effect sizes in TGS may reflect the gold-standard
343 assessments used for both family history and cognitive testing, which increases measurement
344 reliability, as well as the strict eligibility criteria in the first generation at cohort inception.
345 The other cohorts had broader inclusion criteria and relied on responses from the participant
346 or their parent to retrospective questions about family history; similarly, the PRS were
347 created from GWAS of a broad depression phenotype. These factors may have biased
348 associations towards the null, although the large sample sizes nevertheless enabled weaker
349 associations to be detected from less reliable measures. This demonstrates the value of using
350 population cohorts for this type of research, where gold-standard phenotyping is not feasible
351 at such a large scale. A major strength of our study is that we have used small-scale, carefully
352 phenotyped data alongside big datasets with less detailed phenotyping. Using only the former
353 may mean that results might not be replicable, while using only the latter risks generating
354 large numbers of statistically significant yet trivial results that are not clinically meaningful.

355 This study is the first to examine both polygenic risk and family history of depression
356 in multiple cohorts: we found that both exposures showed similar results, although the PRS
357 models tended to show associations with lower performance on a greater number of cognitive
358 tests. An exception was the digit span test in Add Health, on which higher PRS was
359 associated with better performance. We did not directly compare the contribution of family
360 history and polygenic risk in the same models, and so we cannot infer the relative strength of
361 their distinct associations with cognitive outcome. This would require detailed multivariate
362 modelling to take account of the mediating paths between genetic and non-genetic aspects of
363 family history, and their interactions.

364 The memory domain findings in the younger cohorts are congruent with
365 neuroimaging markers in depression that also underpin memory function: hippocampal
366 volumes are lower on average¹⁹ and cortical gray matter is thinner on average in various
367 regions including the temporal lobes²⁰ in people with depression, and we have previously
368 shown in TGS that family history of depression is associated with hippocampal
369 microstructure differences,²¹ cortical thinning,²² and default mode network
370 hyperconnectivity.²³ The speed, attention, and executive function findings in the older UK
371 Biobank cohort may point to differences in brain aging (e.g. white matter disease), even in
372 never-depressed participants, although evidence is currently lacking on neuroimaging in older
373 people with high familial risk of depression and this should be investigated in future UK
374 Biobank analyses. It should also be borne in mind that the different pattern of results in UK
375 Biobank may not be fully attributable to older age, but rather to the other differences in the
376 methods used in this cohort, including the use of a bespoke test battery with an emphasis on
377 timed and executive function tasks.

378 There was little impact on the results after excluding participants who themselves had
379 depression. Only UK Biobank showed clear evidence of attenuation in those models, but not
380 enough to negate the findings. This suggests that lifetime experience of depression may have
381 some influence on cognitive outcomes, especially in older participants, but other factors must
382 be at play.

383 Education and SES may explain some of the association: this was evident in the three
384 younger cohorts and may reflect a mediating role of household/neighborhood environment,
385 resource access and opportunities, in influencing cognitive development and reserve, in
386 families affected by parental or multi-generational depression. This warrants further research
387 within a mediation framework, with important implications for early intervention on
388 potentially modifiable intermediate risk factors.

389

390 **Limitations**

391 The four cohorts we analyzed have various strengths and limitations with regard to sample
392 size, representativeness, and depth and completeness of measures, which means that it is
393 difficult to disentangle age-related and generational effects from methodological differences
394 when interpreting the patterns of findings. TGS was the only cohort with clinically confirmed
395 depression diagnoses in all generations, but PRS data are not available at present in this
396 cohort. We focused on biological family history and so have not captured the influence of
397 non-biological relatives, such as step-parents, in the household. It would also be of interest to
398 analyze the number of affected biological relatives in detail (e.g. whether one or both parents
399 had a depression history), but this was not feasible owing to the amount of missing data. We
400 aimed to analyze exposures and outcomes from different assessment waves (to reduce the
401 possibility of reverse causality and allow for future mediation analyses to examine
402 intermediate measures such as brain imaging) but data from different waves were not
403 available in Add Health.

404

405 **Conclusions**

406 Whether assessed by family history or genetic data, there is evidence that depression in prior
407 generations is associated with lower cognitive performance in offspring. The next challenge
408 is to elucidate the pathways by which this arises, which may include genetic and
409 environmental determinants and moderators of brain development and brain aging, and
410 potentially modifiable social and lifestyle factors at play across the lifespan. These and other
411 cohorts enable such research at a scale and depth never before possible, opening new research
412 directions for prevention and early intervention in at-risk individuals.

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413

414 **Conflicts of Interest**

415 M.M. Weissman in the last three years has received research funding from NIMH, Brain and
416 Behavior Foundation, and Templeton Foundation, and has received book royalties
417 from Perseus Press, Oxford Press, and APA Publishing, and receives royalties on the Social
418 Adjustment Scale from Multihealth Systems; none of these represent a conflict of interest. All
419 other authors declare that they have no conflicts of interest.

420

421 **Author Contributions**

422 Dr Cullen had full access to all the data in the study and takes responsibility for the integrity
423 of the data and the accuracy of the data analysis.

424 Study concept and design: Cullen, van Dijk, Weissman.

425 Acquisition, analysis, or interpretation of data: All authors.

426 Statistical analysis: Cullen.

427 Drafting of the manuscript: Cullen.

428 Critical revision of the manuscript for important intellectual content: All authors.

429 Approval of final version: All authors.

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432

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444

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446 The funders had no role in the design and conduct of the study; collection, management,
447 analysis, and interpretation of the data; preparation, review, or approval of the manuscript;
448 and decision to submit the manuscript for publication.

449

450 **Additional Information**

451 *ABCD*

452 Data used in the preparation of this article were obtained from the Adolescent Brain
453 Cognitive DevelopmentSM (ABCD) Study (<https://abcdstudy.org>), held in the NIMH Data
454 Archive (NDA). This is a multisite, longitudinal study designed to recruit more than 10,000
455 children age 9-10 and follow them over 10 years into early adulthood. The ABCD Study® is
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463 listing of the study investigators can be found at https://abcdstudy.org/consortium_members/.
464 ABCD consortium investigators designed and implemented the study and/or provided data
465 but did not necessarily participate in the analysis or writing of this report. This manuscript
466 reflects the views of the authors and may not reflect the opinions or views of the NIH or
467 ABCD consortium investigators. The ABCD data repository grows and changes over time.
468 The ABCD data used in this report came from Annual Release 4.0 (study number 1299).
469 NIMH Data Archive Digital Object Identifier (DOI) <http://dx.doi.org/10.15154/1528043>.

470

471 *Add Health*

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480

481 *UK Biobank*

482 This research has been conducted using the UK Biobank Resource under Application
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484 charity, Medical Research Council, Department of Health, Scottish Government, and the
485 Northwest Regional Development Agency. It has also had funding from the Welsh
486 Government, British Heart Foundation, Cancer Research UK, and Diabetes UK.

487

488 **Data Availability**

489 Data from the Three Generations cohort are not yet available for sharing as the study is still
490 ongoing; these data will become available after 2023. ABCD is an open access resource and
491 access procedures are described at <https://abcdstudy.org/scientists/data-sharing/>. Add Health
492 is an open access resource and access procedures are described at
493 <https://addhealth.cpc.unc.edu/data/>. UK Biobank is an open access resource and access
494 procedures are described at <https://www.ukbiobank.ac.uk/enable-your-research>. The
495 statistical analysis code for the ABCD, Add Health and UK Biobank analyses in this study is
496 available at <https://osf.io/tngqh/>.

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567

568 **Figure Legends**

569

570 **Figure 1. Association Between Familial Risk of Depression and Cognitive Function in**
571 **the Three Generations Cohort (age 6-38y)**

572 Primary family history exposure (at least one parent with depression versus none), adjusted
573 for age, sex, ethnicity, and duration between exposure and outcome measurement.

574 Plot shows point estimates and 95% CI. Estimates are in z-score units and can be interpreted
575 as standardized mean differences. Higher scores represent better performance. FDR
576 correction was applied across the set of *P* values within the forest plot.

577 Abbreviations: Attn/Exec, Attention & Executive; Aud/Ver, Auditory/Verbal; CI, confidence
578 interval; Comm. Err., commission errors; comp., composite; CPT, Continuous Performance
579 Test; C-W Interf., color-word interference; Decr., decrement; FDR, false discovery rate;
580 Immed., immediate; IQ, intelligence quotient; RT, reaction time.

581

582 **Figure 2. Association Between Familial Risk of Depression and Cognitive Function in**
583 **the ABCD Cohort (age 10-13y)**

584 (A) Primary family history exposure (at least one parent with depression versus none),
585 adjusted for age, sex, ethnicity, birth country, duration between exposure and outcome
586 measurement, and mode of cognitive test administration (in-person or remote). (B) Polygenic
587 risk score for depression, in the White subgroup, adjusted for age, sex, birth country, mode of
588 cognitive test administration, and first 10 genetic principal components.

589 Plot shows point estimates and 95% CI. Estimates are in z-score units and can be interpreted
590 as standardized mean differences. Higher scores represent better performance. FDR
591 correction was applied across the set of *P* values within each forest plot. *P* values reported as
592 0.000 in the figure should be taken as $P < .001$.

593 Abbreviations: CI, confidence interval; comp., composite; FDR, false discovery rate; NIH,
594 National Institutes of Health Toolbox; RAVLT, Rey Auditory Verbal Learning Test.

595

596 **Figure 3. Association Between Familial Risk of Depression and Cognitive Function in**
597 **the Add Health Cohort (age 32-42y)**

598 (A) Primary family history exposure (at least one parent with depression versus none),
599 adjusted for age, sex, ethnicity, and birth country. (B) Polygenic risk score for depression, in
600 the European subgroup, adjusted for age, sex, birth country, and first 10 genetic principal
601 components.

602 Plot shows point estimates and 95% CI. Estimates are in z-score units and can be interpreted
603 as standardized mean differences. Higher scores represent better performance. FDR
604 correction was applied across the set of *P* values within each forest plot.

605 Abbreviations: CI, confidence interval; FDR, false discovery rate; immed., immediate.

606

607 **Figure 4. Association Between Familial Risk of Depression and Cognitive Function in**
608 **the UK Biobank Cohort (age 44-83y)**

609 (A) Primary family history exposure (at least one parent with depression versus none),
610 adjusted for age, sex, ethnicity, birth country, and duration between exposure and outcome
611 measurement. (B) Polygenic risk score for depression, in the White British subgroup,
612 adjusted for age, sex, birth country, first 10 genetic principal components, and batch.

613 Some tests were added to the battery part-way through the assessment wave and so sample
614 sizes vary. The 8-pair version of the Visual Memory task was only administered to
615 participants who had made ≤ 2 errors on the 6-pair version. Plot shows point estimates and
616 95% CI. Estimates are in z-score units and can be interpreted as standardized mean
617 differences. Higher scores represent better performance. FDR correction was applied across

618 the set of P values within each forest plot as well as the Prospective Memory results. P values
619 reported as 0.000 in the figure should be taken as $P < .001$. Prospective Memory results are not
620 shown in plots as these are expressed as odds ratios for a correct response: family history OR
621 1.01 (95% CI 0.93 to 1.10, $P = .79$, $P_{\text{FDR}} = .91$); polygenic risk score OR 0.95 (95% CI 0.92 to
622 0.97, $P < .001$, $P_{\text{FDR}} < .001$).

623 Abbreviations: assoc., associates; Attn/Exec, Attention & Executive; CI, confidence interval;
624 comp., composite; FDR, false discovery rate; Proc., Processing.

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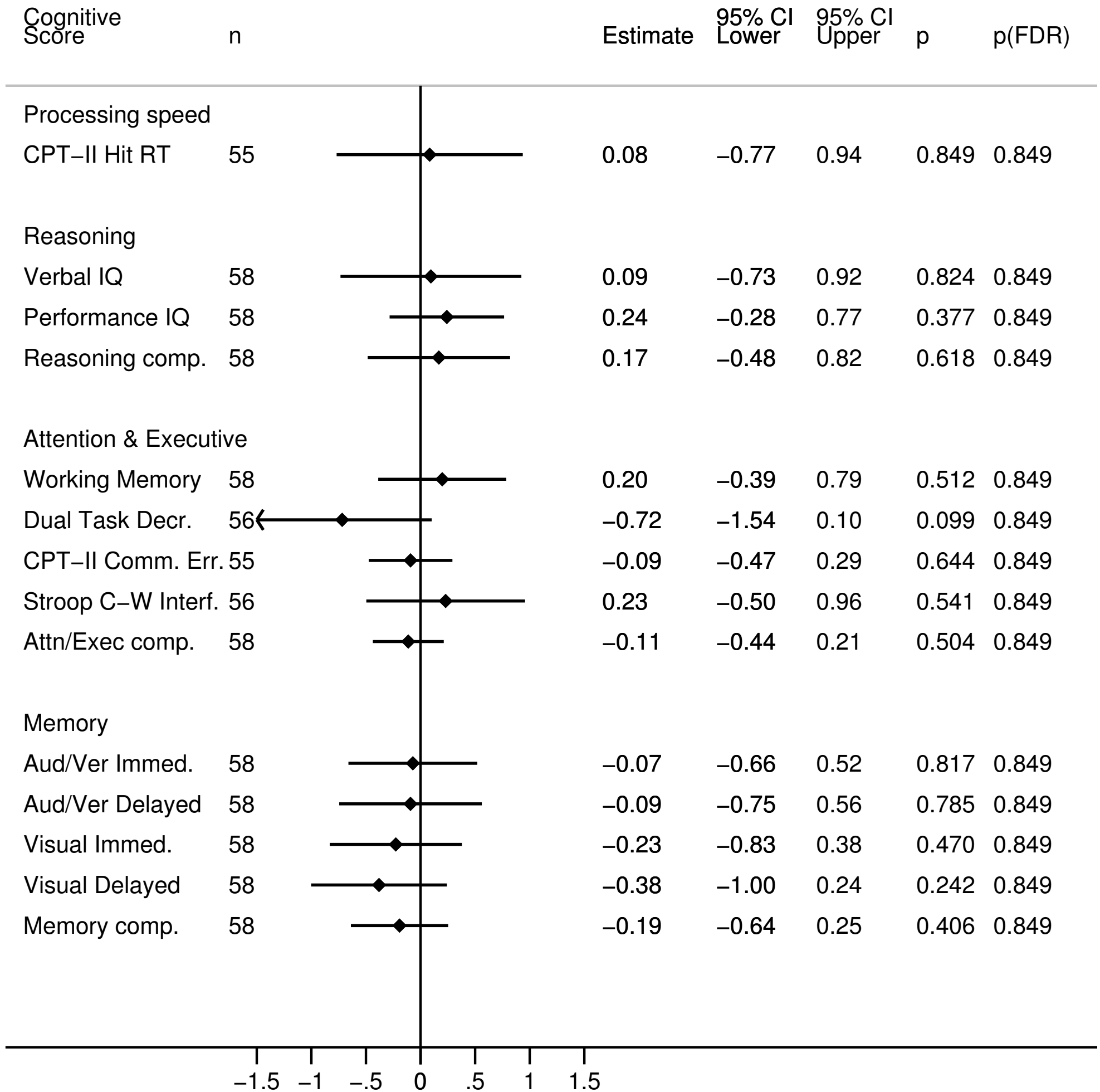
Table 1. Demographic, Health, and Family History Characteristics in Each Cohort

	Three Generations (n=87)^a	ABCD (n=10,258)^a	Add Health (n=1,064)^{a,b}	UK Biobank (n=45,899)^a
Demographics				
Age at baseline				
No. missing	27 ^c	0	NA	0
Mean (SD), y	14.22 (4.98)	9.92 (0.63)	NA	55.02 (7.55)
Age at follow-up				
No. missing	0	0	0	0
Mean (SD), y	19.71 (6.55)	12.00 (0.66)	37.75 (1.88)	63.99 (7.71)
Duration from baseline to follow-up				
No. missing	27	0	NA	0
Mean (SD), y	7.84 (1.69)	2.08 (0.22)	NA	8.97 (1.78)
Sex, No. (%)				
No. missing	0	0	0	0
Female	42 (48)	4,899 (48)	584 (49)	23,605 (51)
Male	45 (52)	5,359 (52)	480 (51)	22,294 (49)
College degree, No. (%)				
No. missing	35 ^d	NA	0	747
Yes	11 (21)	NA	415 (36)	21,154 (47)
Health Status				
Lifetime depression, No. (%)				
No. missing	0	184	2	0
Yes	18 (21)	662 (7)	347 (24)	5,507 (12)
Lifetime neurological condition, No. (%)				
No. missing	0	0	0	0
Yes	12 (14)	1,558 (15)	17 (2)	2,212 (5)
Family History of Depression				
Parental history, No. (%)				
No. missing	12	566	185	4,415
At least one parent with depression	21 (28)	3,059 (32)	344 (41)	4,401 (11)
Multi-generation history, No. (%)				
No. missing	6	570	293	NA
At least one parent or grandparent with depression	53 (65)	4,447 (46)	392 (54)	NA
Multi-generation 'dose', No. (%)				
No. missing	12	901	427	NA
Neither generation	28 (37)	5,241 (56)	379 (56)	NA
Grandparent only	26 (35)	1,324 (14)	34 (5)	NA
Parent only	8 (11)	1,026 (11)	122 (23)	NA
Both generations	13 (17)	1,766 (19)	102 (16)	NA

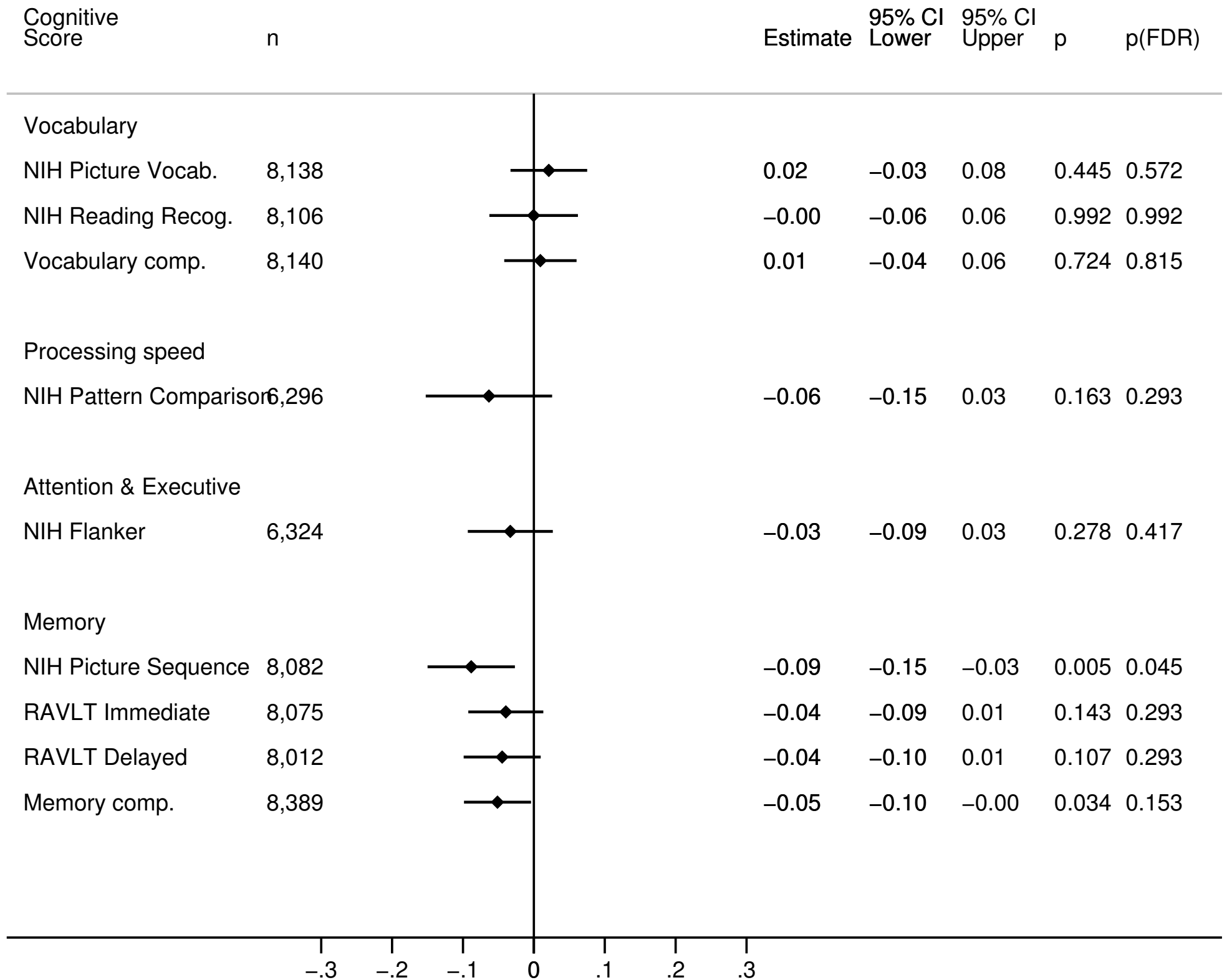
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Abbreviations: ABCD, Adolescent Brain Cognitive Development study; Add Health, National Longitudinal Study of Adolescent to Adult Health; NA, not applicable; No., number; SD, standard deviation.
 Note: Ethnic categories, birth country categories, socioeconomic status measures, and cognitive measures were different in each cohort and so are presented separately in eTables 1-4 in the Supplement. Descriptive statistics for polygenic scores are also provided in the eTables.
 a. Total sample size refers to participants with data on at least one cognitive test. Within that, sample sizes available for analysis varied from model to model, depending on which exposure measures and covariates were being analyzed.
 b. Summary statistics (% , mean, SD) are weighted using `svy` commands in Stata. Sample sizes are reported as observed (unweighted).
 c. Some participants did not attend Wave 5 themselves but did have family history data from their relatives at Wave 5 and so were included in the analysis sample.
 d. Only available for adult participants.

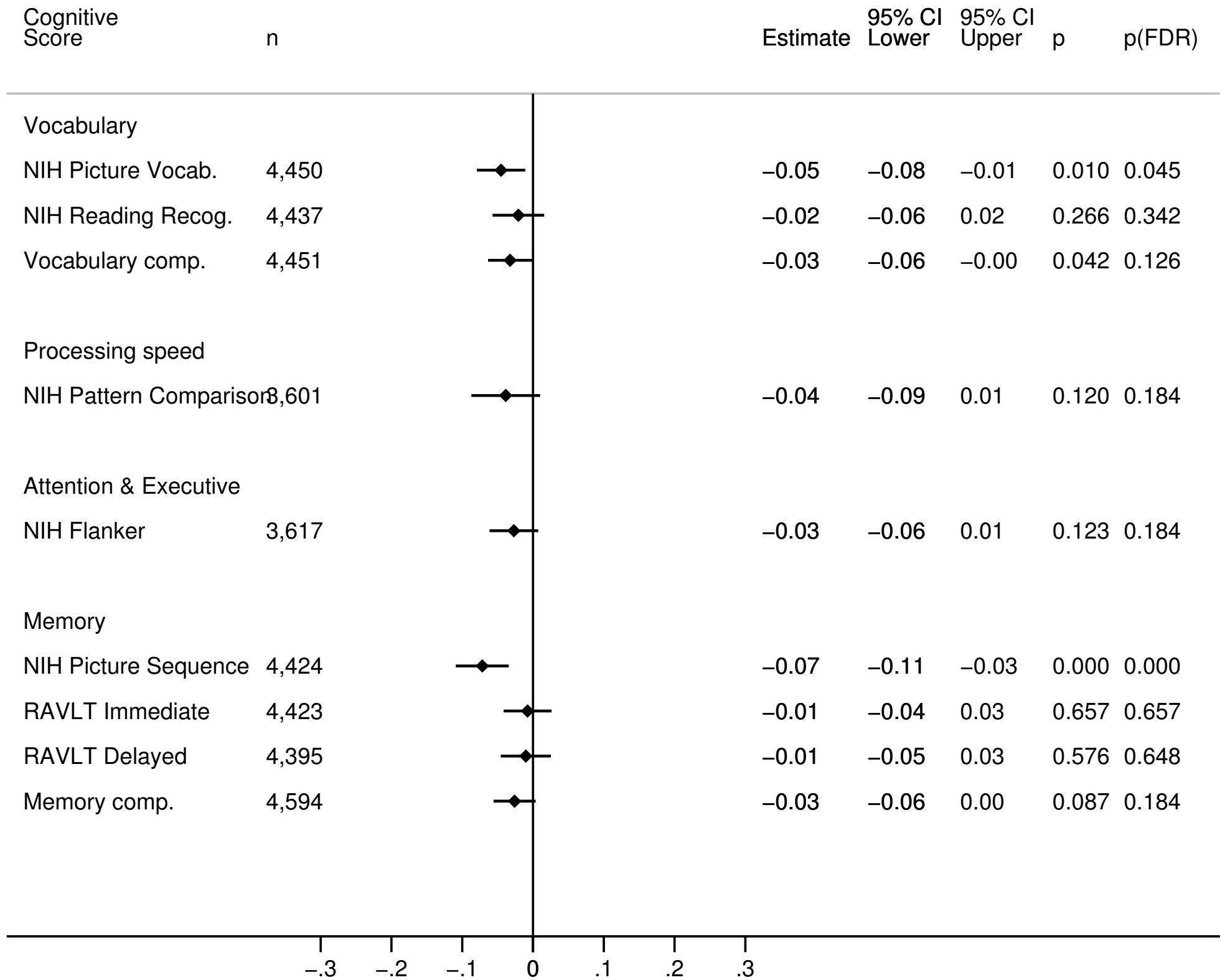
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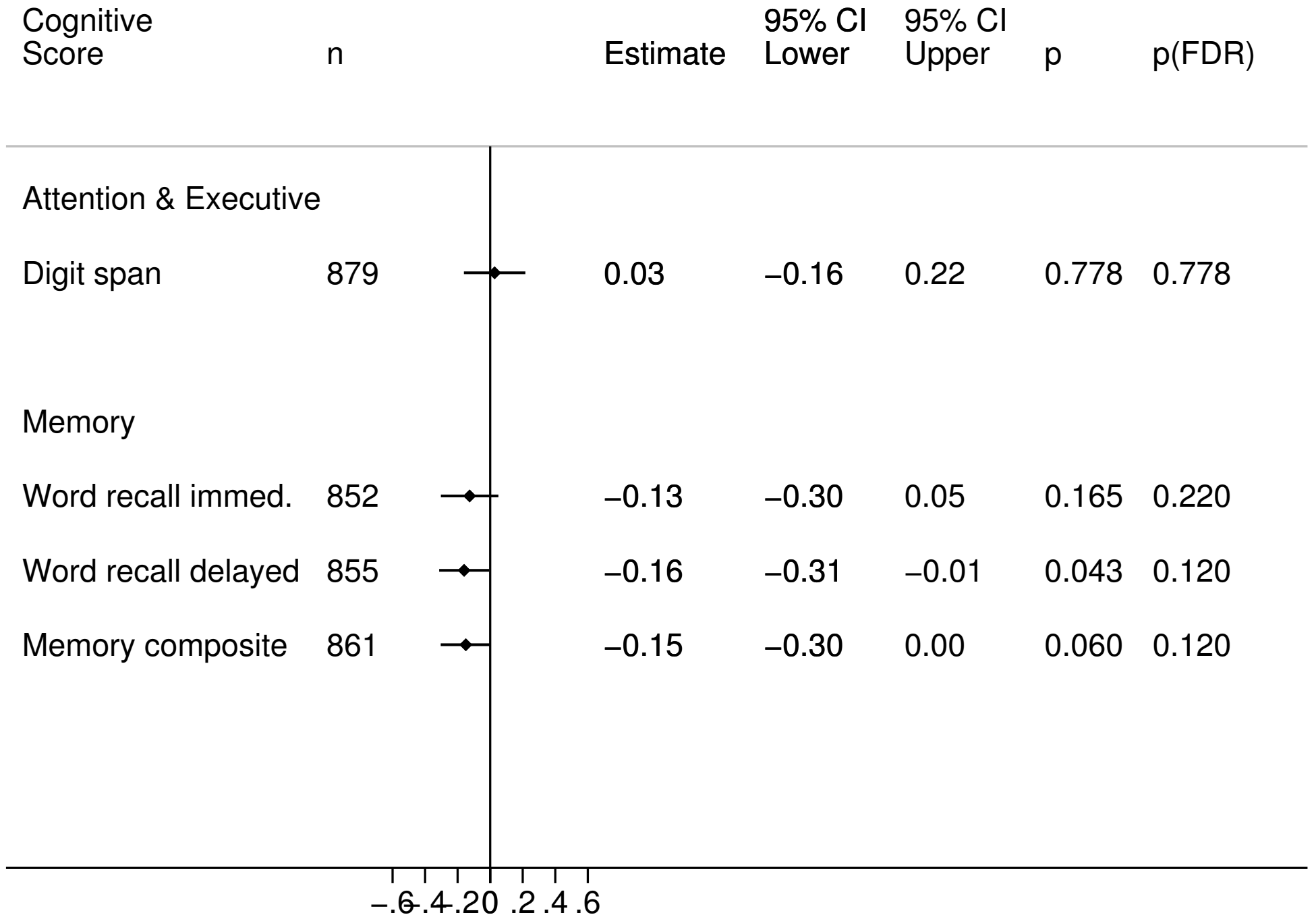
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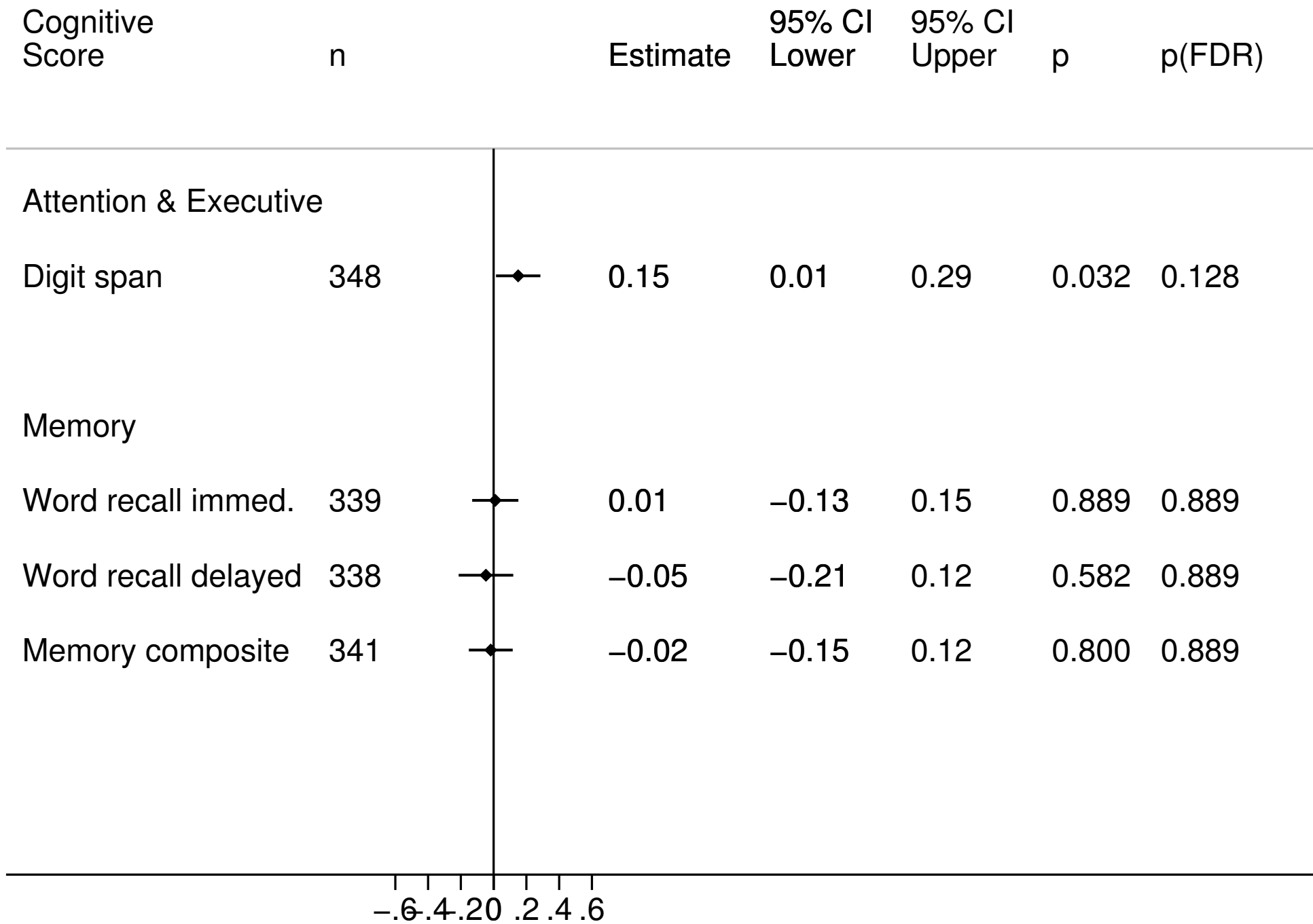
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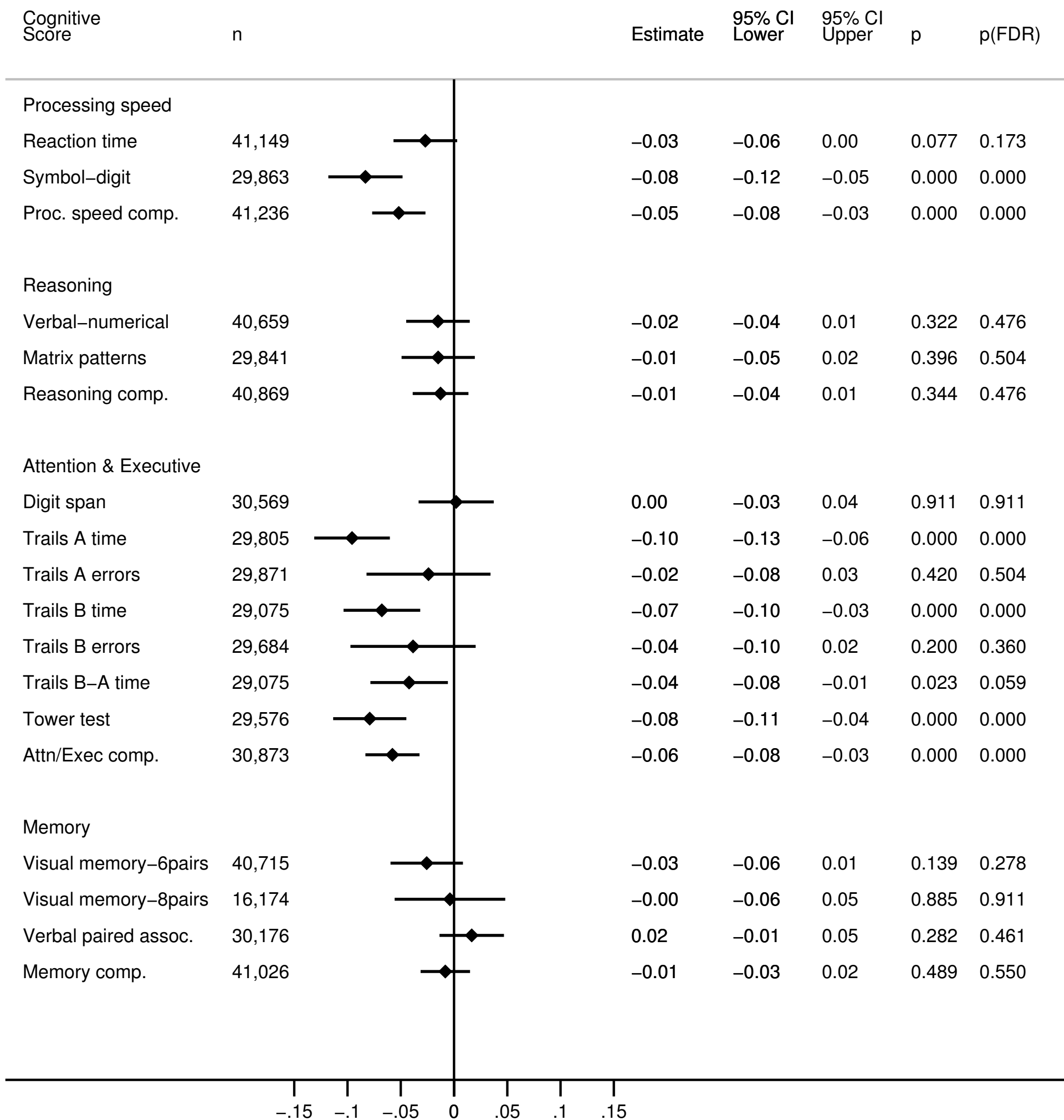
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