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Recognising autism: a latent transition analysis of parental reports of child autistic spectrum disorder 'red flag' traits before and after age

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8 Abstract

⁹ **Purpose** It has been proposed that parents should be educated about child autistic spectrum disorder (ASD) 'red flag' traits

to help professionals identify and address concerning behaviours as early as possible. This study aimed to empirically dem onstrate that established/recognised 'red flag' traits in the first 3 years of life would reliably predict ASD risk severity in later
 childhood, associated with established ASD risk correlates and mirroring functioning diagnostic categories.

¹³ **Methods** Using retrospective parental report data from the Mental Health of Children and Young People in Great Britain ¹⁴ survey (N=7977), latent class analysis (LCA) and a quasi -latent transition analysis were used to (1) identify profiles of

- ¹⁵ variation in parent reports of child 'red flag' traits before and after age 3 and (2) model transitions in risk from 3 years and
- ¹⁶ below to ≥ 3 years, respectively, per the 'optimal outcome' model.

¹⁷ **Results** Three distinct classes, each characterised by variation in parent 'red flag' trait reporting were identified for the '≤

¹⁸ 3 years of age' and the ' \geq 3 years of age' data. Both LCA class profiles comprised groups of children characterised by low,

¹⁹ medium and high ASD risk. Dose-response effects for a number of recognised ASD correlates across the low, moderate

²⁰ and high risk ' \geq 3 years of age' classes seemed to validate older classes in terms of ASD relevance. Over 54% of children

²¹ characterised by the highest levels of ASD 'red flag' trait probability at 3 years and below (2% of sample), also populate

²² the high-risk class evidenced in the ' \geq 3 years of age' LCA.

²³ Conclusions Retrospective parental reports of child ASD 'red flag' traits ≤3 years of age were reliable indicators of ASD
 ²⁴ risk in later childhood.

²⁵ Keywords Autism spectrum disorders · Red flag traits · Epidemiology · Latent class analysis

²⁶ Introduction

27 Autism spectrum disorder (ASD) is a lifelong neurodevelop-28 mental disorder characterized by difficulties in social inter-29 action, communication, and repetitive behaviours [1]. It is 30 commonly described as a childhood disorder, as symptoms 31 often first become apparent during early development. Its 32 symptoms are diverse and behaviours associated with ASD 33 vary in expression among those with the disorder, which can 34 often make diagnosis difficult [2]. Recently, diagnostic cat-35 egories for variants of autism, e.g. pervasive developmental

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disorder not otherwise specified (PDD-NOS) and Asperger's syndrome (AS), have been reclassified as ASD in the DSM-5 [1], (see [3–5] for re-diagnosis review). ASD has been recognised as a more meaningful and sufficiently inclusive construct to describe the variations in behaviour, functioning, and presentation that commonly characterise the phenotype [6–8]. However, there is evidence that individuals with these variant diagnoses differ significantly from more severe ASD in intelligence [9–11], verbal ability [12], and overall cognitive profile [13, 14], including discreet differences in brain morphology [15]. The diagnostic definitions used in assessment have changed despite evidence of differences in symptomology between PDD-NOS/AS and ASD [16] with these differences in behavioural trait severity evident in early life and showing trait stability [17].

During the first years of a child's life, parents and caretakers are most likely to be the first to observe, evaluate and

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interpret a child's behaviour. They are also often the first to 53 seek professional advice when a child's behaviour seems 54 'odd' or 'unusual' [18, 19]. While developmental variation 55 56 in the population is to be expected, a cluster of behaviours or missed milestones ('red flags') can signal the presence of a 57 potential underlying problem and may be indicative of disor-58 dered behaviour [20]. Parental 'prediction' of ASD diagno-59 sis via problematic behaviours has been shown to be reliable, 60 both in prospective and longitudinal studies [21, 22] and in 61 studies utilising retrospective population data [23, 24]. 62

It has been proposed, therefore, that assessment should 63 take place as soon as developmental issues become apparent 64 [25, 26]. The average ASD diagnosis age in the US is 4 years 65 [27] though diagnosis can be made as early as 2 years [28] 66 with predictive diagnostic tools existing for those as young 67 as 12 months [29]. Early intervention strategies have been 68 shown to be advantageous in capitalising on toddlers' devel-69 opmental plasticity [30] and have shown significant benefits 70 71 in adaptive behaviour, language, and overall functioning [31-33]. 72

While critics of early diagnosis cite 'normal' slow devel-73 74 opment and ASD false-positive diagnoses [34] the benefits of early diagnosis and intervention have been strongly advo-75 cated. Initial diagnoses are routinely revisited and show early 76 behavioural symptoms to be consistent with ASD outcomes 77 [35–37]. Early intervention has been shown to be beneficial 78 for the development of cognitive, social, and communica-79 tion skills [38] and because further refinement of these skills 80 comes with growth and experience, an early ASD diagno-81 sis does not always predict diagnostic outcomes or level 82 83 of deficit in later childhood [36]. A favourable or 'optimal outcome' (OO) of improvement in functioning to the point 84 the child loses the ASD diagnosis is not a recent concept 85 [39]. Recent research has highlighted that OO children still 86 show deficits in social relationships and some developmental 87 issues that affect social functioning [40, 41] but can function 88 normally with typically developing children. Higher initial 89 functioning in combination with early intervention seems 90 to be the strongest predictor of OO [42-44] and while trait 91 expression and behaviour improve out of the clinical range, 92 physical brain activity is closer to an ASD population [45]. 93

The current study, therefore, utilised retrospective data 94 95 with the aim to explore the variation in parent reports of child 'red flag' traits, before and after age 3, in the general 96 population, to test (1) whether a spectrum of presentation 97 98 in behavioural ('red flag') traits could be identified in both early and later childhood while displaying the variance of 99 previous autism diagnostic categories, (2) whether sever-100 ity in 'red flag' traits ≥ 3 years would be associated with 101 established ASD risk correlates and (3) whether severity 102 in 'red flag' traits ≤ 3 years of age would meaningfully cor-103 relate with severity in later childhood or an 'optimal out-104 come'. It was predicted that distinct profiles of 'red flag' 105

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traits would emerge for both time periods and that these 106 profiles would reflect variation in ASD risk mirroring the 107 PDD-NOS/AS/HFA variant diagnoses. It was also predicted 108 that parental reporting of 'red flag' traits would be a reliable 109 indicator of ASD risk and that this would be demonstrated 110 via dose-response associations with established ASD risk 111 correlates. Finally, given that extant evidence supports the 112 'parental concern' model, with concerns raised in specific 113 developmental domains between the ages of 1 and 3 years 114 correlating with ASD diagnosis and later diagnostic out-115 comes [46-50] it was hypothesised that the most severe 116 'red flag' trait profiles, retrospectively reported by parents, 117 at ≤ 3 years of age, would be associated with the severity of 118 'red flag' trait reporting in later childhood in keeping with 119 previous 'optimal outcome' findings. 120

Method

Sample

Data for this study were sourced from the national survey, 123 Mental Health of Children and Young People in Great Brit-124 ain (GB), 2004 [51], collected by the Office of National 125 Statistics (ONS; all analyses were performed in accordance 126 with ONS ethical and data handling regulations); the survey 127 was a thorough census of medical, emotional, and social 128 health of young people in GB. A sample was obtained from 129 the Department for Work and Pensions' Child Benefit Centre 130 (CBC) based on Child Benefit records and from this, a sam-131 ple of postal areas in England, Scotland, and Wales, and ulti-132 mately a random sample of addresses was selected, exclud-133 ing any household where the CBC had an 'action' open such 134 as child death or CBC involvement, describing these cases as 135 'sensitive'. This census was multiphasic, conducted in 1999 136 and 2004. As the chosen measure did not appear in the 1999 137 phase, this study utilises only the 2004 data. 138

The resultant sample of 12,294 households was contacted 139 via post by the CBC with survey details/opt-out instructions 140 with 1085 (9%) opting out, 631 (5%) having moved, 82 (1%) 141 being found ineligible, and 1798 (15%) not approached for 142 an interview. Of the 10,496 approached for an interview, 143 2183 (21%) refused and 313 (3%) could not be contacted, 144 leaving a sample of 7977 households where an ONS rep-145 resentative conducted interviews with a parent. The final 146 interview sample (N=7977) was 52% male (4111) with a 147 mean age of 10.54 (SD 3.40) and range of 4-17. 148

Measures

A general development questionnaire was created by the ONS for this survey, containing a parent/caregiver directed autism sub-questionnaire of 43 items. Led by five

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- 153 binary-answer anchor questions pertaining to the parent/car-
- egiver's child before the age of 3, each concerned an area of
- 155 potential autistic behaviour:
- 156 1. Was there anything that seriously worried you or anyone
- else about the way his/her speech developed?
- 158 2. Was there anything that seriously worried you or anyone159 else about how s/he got on with other people?
- Was there anything that seriously worried you or anyone
 else about the way his/her pretend or make-believe play
 developed?
- 4. Was there anything that seriously worried you or anyone
 else about any odd rituals or unusual habits that were
 very hard to interrupt?
- 166 5. Was there anything that seriously worried you or anyone
 167 else about his/her ability to learn and do new things—
 168 such as puzzles or helping get dressed?
- such as puzzles or helping get dressed?

Following was a binary-answer gatekeeper question 169 'Have the things that seriously worried you or someone else 170 now cleared up completely?' A positive answer ended the 171 autism section while a negative answer led to the remain-172 ing autism questions. Ten questions were selected from the 173 body of this questionnaire; two questions to approximate 174 each of the five behaviours detailed in the anchor questions 175 (see "Appendix 1") acting as broad early 'red flag' behav-176 ioural markers [37]. 177

178 Additional data

The Mental Health of Children and Young People in Great 179 Britain, 2004 [51] survey also involved a full health ques-180 tionnaire, including ICD-10 criteria of mental and physical 181 health issues. Four known comorbid conditions for autism 182 were chosen as covariates for analysis; epilepsy, learning dif-183 ficulties, poor coordination, and any anxiety disorder. These 184 were scored as binary variables indicating either presence or 185 absence of each condition. In addition, an ICD-10 diagnosis 186 of autism spectrum disorder was also used as a validator in 187 support of the latent factor typified by 'red flag' behaviours 188 being autistic behavioural traits. 189

190 Analytic strategy

LTA is a longitudinal modelling technique used to examine 191 whether individuals transition between latent classes over 192 time. LTA consists of two components; a measurement 193 model and an autoregressive model [52, 53]. In LTA, the 194 measurement model (i.e. LCA) describes the structure of 195 the latent classes at the various time points. The autoregres-196 sive model (i.e. Markov model) examines individual-level 197 transitions between these classes over time [52, 53]. For a 198 much more detailed description of LTA and its applications 199

in social and behavioural sciences see Nylund [54]. LTA was conducted in the following steps. 201

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Step 1: determine the best measurement model

To determine the best measurement model, a series of 203 LCAs were specified and tested separately at the two time 204 points using available binary red flag ASD trait variables as 205 observed indicators. The first LCA was used to determine the 206 number and qualities of sub-types of autistic trait variation 207 (red flags) based on endorsement of each of the five behav-208 ioural anchor questions (≤ 3 years of age) from the general 209 development questionnaire devised by the ONS. These five 210 items were binary and treated as categorical. Three latent 211 class models were tested (a 2-through a four-class latent 212 class model). The second LCA was used to determine the 213 number and qualities of sub-types of autistic trait variation 214 based on endorsement of each of the ten behavioural ques-215 tions from the body of the questionnaire relating to red flag 216 traits \geq 3 years of age. These items were treated as categori-217 cal. Three latent class models were tested (a 2 through to a 218 four-class latent class model). 219

Models were compared using a range of common fit sta-220 tistics. The Akaike information criterion (AIC) [55], the 221 Bayesian information criterion (BIC) [56], and the sample 222 size-adjusted Bayesian Information Criterion (ssaBIC) [57] 223 were used to compare model fit, with lower values indica-224 tive of better fit. The Lo-Mendel-Rubin likelihood ratio test 225 (LMR-LRT) is used to compare a solution with k number of 226 classes with a solution with k-1 classes [58]. A non-signif-227 icant p value indicates that the model with k-1 classes pro-228 vides a better fit [58]. Model fit was also assessed using the 229 entropy criterion [59]. This statistic determines how accu-230 rately individuals were assigned to their classes based on the 231 posterior probabilities [59]. Entropy values range from 0 to 232 1, with higher values reflecting more accurate classification 233 [59]. To ensure that the models converged on global rather 234 than local solutions, 100 random sets of starting values and 235 50 final stage optimizations were used. 236

It remains debated whether the LMR-LRT or BIC is more 237 useful when it comes to determining the optimal number 238 of classes in an LCA [54]. A number of simulation studies 239 suggest that the BIC is highly effective at identifying the 240 correct underlying class structure, while the LMR-LRT can 241 occasionally extract too many classes when the sample size 242 is large (N > 1000) [54, 60]. Given that the sample size was 243 relatively large in the present study, the BIC was considered 244 a more reliable indicator of the optimal class solution. 245

Step 2: validate classes using ASD diagnosis and clinicalcorrelates

Multinomial logistic regression was used to test whether the red flag trait classes/typologies at time one were meaningful in relation to ASD. Associations between class membership and an ASD diagnosis variable and four common clinical correlates of ASD was conducted.

253 Step 3: specify latent transition model

In this step, the LTA model is specified, producing a matrix 254 of latent transition probabilities. This model affords the 255 opportunity to classify individuals as 'movers' (i.e. those 256 who transition from one class to a different class over time) 257 or 'stayers' (i.e. those who remain in the same class across 258 time) [52, 53]. Mover-stayer models more accurately 259 describe transitions between classes, as transition probabili-260 ties are estimated for 'movers' only [52, 53]. 261

All analyses included the first-stage sampling were made weighted variables to account for non-equal probabilities of selection. This standardising technique adds an additional 'weight' to under-represented sub-populations that may not be accurately represented due to missing data and was used rather than excluding cases listwise. Analyses were conducted using Mplus 4 [61].

269 **Results**

Table 1 Fit indices for th

class analyses

Table 1 (section a) shows the fit indices for the first latent class analysis (≤ 3 years of age). The three-class solution was the model of best fit; the likelihood ratio Chi square was non-significant, the AIC was lower for the three-class solution than for the two-class solution, and the Lo-Mendell-Rubin's LRT showed that the four-class solution was not significantly better than the three-class solution. The 277

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entropy value (0.83) also showed a meaningful classification of cases.

The three-class model, shown in Fig. 1, revealed a 279 'High endorsement class' comprised of 1.9% of the popu-280 lation where the probability of 'red flag' trait endorse-281 ment was > 70% for all five traits. A larger 'Moderate 282 endorsement class' also emerged, representing 10.8% of 283 the population and was characterised by moderate endorse-284 ment probabilities of language, social, and developmen-285 tal problem behaviours. A large 'Low endorsement class' 286 (baseline class) comprised of 87.3% of the population was 287 characterised by extremely low endorsement probabilities 288 (<10%) across all 'red flag' traits. 289

A second LCA was carried out to identify distinct 290 groups characterised by red flag traits after the age of 3 291 using 10 questions from the body of the questionnaire 292 (see "Appendix 1"); two exemplifying each of the five 293 behaviours described by the anchor questions. Another 294 three-class solution emerged. Table 1 (section B) shows 295 the fit indices for the second latent class analysis. The 296 three-class solution was the model of best fit; the AIC 297 was lower for the three-class solution than for the two-298 class and the Lo-Mendell-Rubin's LRT showed that the 299 four-class solution was not significantly better than the 300 three-class solution. The entropy value (0.72) showed a 301 meaningful classification of cases. Probability estimates 302 for class membership in both LCAs were robust. 303

The three-class model for the ' \geq 3 years of age' data, 304 shown in Fig. 2, revealed a small moderate presenta-305 tion class; 16.7% of the sample characterised by varied 306 endorsement of the five 'red flag' behaviour categories. 307 A larger high presentation class emerged, where 31.5% of 308 the sample were characterised by high endorsement prob-309 abilities of most items. A larger low presentation class was 310 also evident, 51.8% of the sample which was characterised 311 mainly by moderate endorsement probabilities relating to 312

	$LR\chi^2 (df) p$	AIC	BIC	SSABIC	LRT (p)	Entropy
A (≤3	years)					
2 clas	s 229.81 (20) < 0.01	16,831.08	16,907.72	16,872.77	2557.63 (<0.01)	0.91
3 clas	s 50.10 (14) < 0.01	16,661.71	16,780.16	16,726.14	178.06 (<0.01)	0.83
4 clas	s 16.41 (8) 0.03	16,639.72	16,799.98	16,726.89	33.36 (0.02)	0.85
5 clas	s 1.32 (2) 0.51	16,636.51	16,838.58	16,746.42	14.93 (0.01)	0.85
B (≥3	years)					
2 clas	s 888.92 (981) 0.98	8950.98	9047.81	8981.12	510.67 (<0.01)	0.67
3 clas	s 800.25 (970) 1.0	8880.38	9027.92	8926.31	91.34 (0.08)	0.72
4 clas	s 744.87 (959) 1.0	8849.06	9047.32	8910.78	52.59 (0.33)	0.67
5 clas	s 716.87 (951) 1.0	8839.72	9088.69	8917.22	30.91 (0.51)	0.73

 $LR\chi^2$ likelihood ratio Chi square, AIC Akaike information criterion, BIC Bayesian information criterion, SSABIC sample size adjusted BIC, LRT Lo-Mendell-Rubin's adjusted likelihood ratio test

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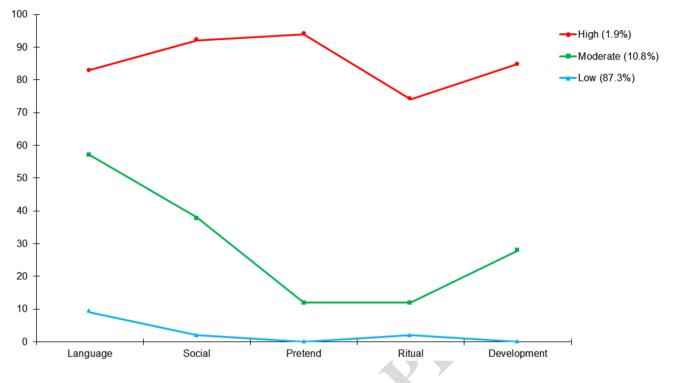


Fig. 1 Endorsement probability plot for autism anchor questions

Table 2ASD risk for high,moderate, and low presentationsat ≤ 3 years of age

	Odds ratio (95% confidence interva	ls)
	High	Moderate
Epilepsy (absence)	36.72*** (8.96–150.58)	4.94*** (2.02-12.08)
Learning D (absence)	70.36*** (33.63–147.22)	8.23*** (5.87-11.52)
Coordination (absence)	26.55*** (11.36-62.08)	14.37*** (7.41-27.87)
Anxiety (absence)	3.47** (1.36-8.88)	3.40*** (2.11-5.48)
ASD diagnosis (absence)	954*** (57.61-15,830.94)	20.73* (1.12-382.38)

p*<0.05; *p*<0.01; ****p*<0.001

pretend/play and ritual/habit traits, with a higher endorse-ment of language issues.

A multinomial logistic regression was conducted to test 315 whether severity in 'red flag' traits ≤ 3 years would be asso-316 ciated with established ASD risk correlates (see Table 2). 317 The ASD risk variables showed significant odds ratios 318 across the high and moderate classes when compared to the 319 low class. Moderate presentation was described by highly 320 significant odds ratios of epilepsy, learning difficulties, poor 321 coordination, and anxiety and by significant odds ratios of 322 ASD diagnosis. High presentation showed very highly sig-323 nificant odds ratios of epilepsy, learning difficulties, poor 324 coordination, and ASD diagnosis and highly significant odds 325 ratios of anxiety. 326

A latent transition analysis (LTA) was used to identify transitions in class membership from early to later childhood (see Tables 3, 4).

Members of the ' \leq age 3' high class were more likely 330 to remain in the high class \geq age 3 (82.3%) than transition 331 to the moderate (15.1%) or low (2.6%) classes. The mod-332 erate class showed a mixed effect, with 22.6% remaining 333 moderate, 33.1% transitioning 'up' to high and 44.2% tran-334 sitioning 'down' to low. The low class were more likely 335 to remain low (74.2%) than to transition into either the 336 moderate (14.5%) or high (11.3%) classes. When examined 337 in the context of a move-or-stay model (see Table 5), the 338 majority of the overall sample (89.9%) fell into the stayer 339 category; beginning and remaining low. Movers showed a 340 'downward' transitional trend, with 72.7% of this sample 341 category transitioning from high to moderate or moderate 342 to low. 343

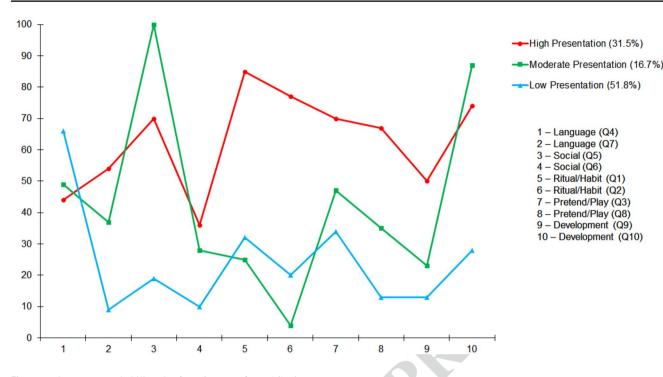


Fig. 2 Endorsement probability plot for > 3 years of age ASD items

 Table 3
 Average latent class probabilities for most likely latent class membership

	High (%)	Moderate (%)	Low (%)
A (\leq 3 years)			
High	88.4	11.6	0
Moderate	3.6	81.7	14.7
Low	0	5.3	94.7
B (\geq 3 years)			
High	87.1	5.9	7
Moderate	11.7	80.8	7.5
Low	4.6	5.3	90.1

Table 4 Latent transition probabilities from ≤ 3 years of age to > 3 years of age

\leq 3 years of age	> 3 years of age			
	High	Moderate	Low	
High	0.823	0.151	0.026	
Moderate	0.331	0.226	0.442	
Low	0.113	0.145	0.742	

344 **Discussion**

The first analysis revealed three profiles characterised by behaviours that would strongly reflect 'red flag' risk at an

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age where initial assessment is common. The scale ques-347 tions narrowed in focus, helping to present a better pic-348 ture of these behaviours, for example, going from 'speech 349 development' to correct application of speech to the situ-350 ation and appropriate phrase use. The differences in func-351 tioning between the classes may have demonstrated varied 352 expression of ASD in accordance with older diagnostic 353 categories, however, it is important to note that they were 354 only approximations of ASD 'red flags'. Variation in the 355 latent class profiles after the age of 3, however, showed 356 levels of expression in specific traits that were consistent 357 with variation in ASD presentation [62]. The Low Pres-358 entation profile, largest at 51.8% of the subsample, was 359 described by in/formal language use problems and some 360 repetitive play and obsession behaviours but low instances 361 of the other traits. These issues were enough for parents to 362 report when asked, but may not have constituted an actual 363 clinical threshold for ASD, as such traits vary naturally in 364 the population [8]. The line between 'personality quirk' 365 and 'symptom' is often quite thin [63], especially for the 366 atypical functioning of individuals formerly categorised 367 under PDD-NOS [16]. The Low Presentation profile rep-368 resents a group that varies from a baseline population ('no 369 ongoing concerns' or minimal trait expression) to just over 370 the cusp of an older clinical designation. The moderate 371 presentation profile, smallest at 16.7%, was typified by 372 all-cause developmental problems, repetitive play, and in/ 373 formal language use problems in keeping with the presen-374 tation of AS. This profile also showed a 100% endorsement 375

Table 5 Count and relative percent of mover-stayer patterns

	\leq 3 years of age	> 3 years of age	n	% within movers/ stayers (%)	% of total sample (%)
Movers	High	Moderate	23	3.9	<1
	High	Low	1	<1	<1
Moderate Moderate	Moderate	High	95	15.9	1.2
	Moderate	Low	411	68.8	5.2
	Low	High	30	5	<1
	Low	Moderate	37	6.2	<1
Stayers	High	High	133	1.8	1.7
-	Moderate	Moderate	65	<1	<1
	Low	Low	7054	97.3	89.9

of eye contact issues, one of the hallmarks of ASD [64, 376 65], though it was low in other domains. The high pres-377 entation profile, 31.5% of the subsample, showed overall 378 higher endorsements of more behaviours at levels which 379 could be interpreted as past the clinical threshold for dis-380 order and fitting the perception of 'classical' autism. 381

The LTA exposed a rough estimation of 'red flag' behav-382 383 iour before the age of 3 and the second analysis focused on a more nuanced picture of these behaviours after the age 384 of 3. A quasi-latent transitional analysis between those two 385 386 'time points' described transition between the latent classes, representing changes in symptom severity and occurrence 387 over time. Those with membership in the ' \leq age 3' high 388 class had the highest probability of remaining high \geq age 389 3 while the greatest percentage of the sample population 390 were those classified as low \leq age 3 who remained so after. 391 Those classified as moderate showed the greatest variance 392 of transition > age 3 as would be expected from this class, 393 having the lowest overall classification probabilities in both 394 LCAs. These results showed a clear relationship between ini-395 tial 'red flag' behaviour severity (ASD risk) and behaviour 396 persistence. Wolff et al. [66] observed this effect in the per-397 sistence of repetitive behaviour in toddlers over time, with 398 the most severe behaviour persisting in an ASD sample. It 399 is important to note, however that possible interventions, 400 401 family/school socialisation, and general development [36] may have accounted for the downward trend in symptom 402 severity over time but detailed intervention/treatment data 403 404 was not available (see limitations below).

In seeking external validation for the hypothesis of the 405 latent factor being ASD risk, the resultant high and moder-406 ate profiles were examined against the low category as a 407 baseline in terms of four known ASD comorbidities (learn-408 ing difficulties, poor coordination, any anxiety disorder, 409 410 and epilepsy) and instances of ICD-10 ASD diagnosis in the sample. Odds ratios were highly significant as empiri-411 cal predictors of ASD risk and confirmation that it was the 412 latent factor. ASD diagnosis odds were 954 times higher 413

than baseline for the high class and 20.73 times higher for 414 the moderate class, indicating that 'red flag' behaviour traits 415 are a predictor of ASD risk. Higher odds ratios were found 416 in the High class than the moderate class for all items, further confirming a difference in severity in accordance with the hypothesis of multiple levels of severity and functioning aligning with older variant diagnoses. Epilepsy rates are important to note here as the relationship between ASD and epilepsy is well established with research indicating a potential genetic relationship [67–70]. 423

These results support the hypothesis of parental percep-424 tion of 'red flag' behaviours before the age of 3 being pre-425 dictive of ASD risk and severity. Analysis revealed distinct 426 behavioural profiles with variance in expression of ASD 427 conducive with variant diagnostic categories, validated by 428 the presence of known comorbidities and gender rates. The 429 data from this survey are from 2004 and the sample's mean 430 age was 10.51 (SD 3.39), indicating that most children from 431 the sample were below the age of 3 in the mid to late 1990s. 432 Research into ASD as a developmental disorder increased 433 during the 1970s-1980s, challenging the notion of autism 434 resulting from 'refrigerator mothers' [71]. The 1990s saw a 435 wider awareness of variation in ASD and the concept of a 436 spectrum of behaviours/diagnoses but the true tipping point 437 of media awareness (and perhaps over-awareness) would not 438 come until the early 2000's [72]. The survey asked about 439 'red flag' behaviours worrying parents at that time, mean-440 ing before widespread ASD awareness and media coverage 441 of the 'autism epidemic', removing an element of potential 442 contamination in parental perception. 443

There is a solid foundation of research supporting the 444 stability of ASD behaviours in early diagnosis \leq age 3 to 445 later reassessment \geq age 4 in both general population [73, 446 74] and high risk samples [75, 76]. That stability does not 447 contradict the OO model of improvement through early 448 intervention programs and socialisation based on severity 449 of initial symptomology. The trend for functioning-based 450 improvement [40, 42] was replicated in this study as severe 451

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individuals tending to stay severe and moderate-to-lowseverity individuals tended to improve.

The evidence presented should be evaluated with the study's limitations in mind.

The ASD section of the general development question-456 naire designed by the ONS was in nonclinical language, was 457 not a measure intended for clinical diagnosis, and was not a 458 pre-existing, tested psychometric. The latent classes in the 459 first LCA had a large catchment due to the general 'red flag' 460 ASD terminology used; intended for parents rather than cli-461 nicians. The wording, "Was there anything that seriously 462 worried you or anyone else about the way his/her speech 463 developed?" failed to differentiate between language use and 464 speech disorder. "Odd rituals or unusual habits that were 465 very hard to interrupt" could have described the repetitive 466 behaviours of ASD but could also have described the ritual-467 istic learning behaviour common in toddlers [77, 78]. Issues 468 of 'learning development' could have referred to any devel-469 opmental delay or learning disability; even the traditional 470 'late bloomer' who goes on to develop with no impairment 471 [79, 80]. While this may have seemed like a limitation to the 472 validity of the study, the non-clinical language was actually 473 considered a strength of the analysis, in that it described 474 issues in a way that might be considered consistent with 475 parental disclosures of concern to GPs/paediatricians. No 476 health professionals were involved in the interviews and 477 questionnaire responses were only parental perception/inter-478 pretation of the child's behaviour. No data were collected 479 concerning any treatment the children may have received 480 for their issues after the age of 3, any effects that treatment 481 may have had, or the presence of other developmental dis-482 orders. In addition, this parental-report data was susceptible 483 to hindsight bias as no prospective screening was performed 484 to isolate an ASD risk sample. Hindsight bias appears in 485 diagnosis amongst clinicians trained to use diagnostic crite-486 ria and conduct assessments [81, 82] so its effect cannot be 487 understated in non-clinical individuals. As there was little 488 diagnostic outcome information available for the sample, 489 the model of change in ASD behaviours over time could 490 only be described as a trend model; further studies would 491 benefit from a longer longitudinal design. In addition, the 492 LTA performed was only a quasi-LTA, as the data used for 493 each time period differed, and the items in the second model 494 attempted only to approximate those in the first. 495

Parents' perception of early 'red flag' behaviours cer-496 tainly seem to act as valid predictors of future ASD risk 497 while reinforcing the variation in expression of ASD that 498 had been previously described by variant diagnosis. While 499 many missed milestones or developmental delays can often 500 clear up in time, some behavioural symptomology may per-501 sist and signify developmental disorder. Meaningful transi-502 tion from disorder to a typical development population is 503 the hoped-for OO model depending on the initial level of 504

functioning. Further studies of large general population data505with a longitudinal design, featuring clinical measures and506clinician involvement could help create a clearer picture of507ASD variation and transition in the population. Such paren-508tal report data would be valuable assets in the development509and testing of future diagnostic tools.510

Compliance with ethical standards

Conflict of interestOn behalf of all authors, the corresponding author512states that there is no conflict of interest.513

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Appendix 1

Q1. (Pretend/Play) "Some children spend a lot of their play521time repeating the same action over and over again, for522example spinning the wheels on a toy car, turning taps or523light switches on and off, or opening and shutting doors. Has524this ever been true of CHILD?"525

Q2. (Pretend/Play) "Children are sometimes very interested in unusual aspects of toys or other things. For example, rather than playing with a toy, they may spend their time sniffing it, or running their fingers over its surface, or listening to any noise or vibration that it makes. Has this ever been true of CHILD?" 528

Q3. (Ritual/Habit) "Some ^Children/teenagers enjoy 532 putting a lot of time into collecting things, or get a lot of 533 pleasure out of focusing on just one topic, such as sport, 534 cars or a particular pop group. In everyday language, we 535 often say that these ^Children/teenagers are 'obsessed' by 536 their interest, but this is not an unpleasant obsession-this 537 is something they like and usually enjoy talking about. Has 538 CHILD had any long-lasting obsessions of this sort?" 539

Q4. (Language) "Some ^Children/teenagers have trouble adjusting their language to suit different social occasions. For example, they may speak too casually to a teacher or too formally to other children. Does CHILD change the way ^s/he speaks according to whether it is a formal or informal situation?"

Q5. (Social) "When we're talking with someone face-toface, eye contact is very important. It generally makes us feel uneasy, or as if there's something wrong, if the other person makes too little eye contact, or too much, or makes it at the wrong time. Has CHILD ever been through a phase of making too little or too much eye contact, or making it in the wrong sort of way?"

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Q6. (Social) "^Children/Teenagers respond in different ways to other people's emotions. For example, if their mother is upset because she has cut her finger badly with a knife, children can be sympathetic, or not pay much attention, or respond in unusual ways such as laughing. What would CHILD typically do in this sort of situation?"

Q7. (Language) "Another way in which children repeat 559 themselves is by using the same catch-phrase or cliché over 560 and over again. For example, almost every sentence may 561 begin 'If you want my opinion...' or 'Logically speaking...' 562 Occasionally the phrase is appropriate, but it is used far 563 more than is really needed. Has CHILD ever filled ^his/ 564 her speech with a lot of these fairly empty catch-phrases or 565 clichés?" 566

Q8. (Ritual/Habit) "Some children enjoy routines and want things to be the same every day. For example, they may want to eat the same food off the same plate while sitting in the same chair every single day. Or there may be very fixed routines for dressing or undressing. Has CHILD ever had strong or unusual routines that ^s/he has insisted on because ^s/he enjoyed doing it that way?"

Q9. (Development) "Some preschool children go through a phase of flapping or waving their hands or arms up and down if they are excited or upset. Some continue doing this for years. Since CHILD has been going to school, has ^s/he tended to flap ^his/her arms when excited or upset?"

Q10. (Development) "You have answered a lot of questions about CHILD's pattern of development - focusing particularly on language, play, routines and ^his/her ability to get along with other people. Are you concerned at present about any of these aspects of CHILD's development?"

584 References

- American Psychiatric Association (2013) Diagnostic and statistical manual of mental disorders, 5th edn. American Psychiatric Publishing, Arlington
- Chawarska K, Paul R, Klin A, Hannigan S, Dichtel L, Volkmar F
 (2007) Parental recognition of developmental problems in toddlers
 with autism spectrum disorders. J Autism Dev Disord 37(1):62–72
- McPartland J, Reichow B, Volkmar F (2012) Sensitivity and specificity of proposed DSM-5 diagnostic criteria for autism spectrum disorder. J Am Acad Child Adolesc Psychiatry 51(4):368–383
- 4. Volkmar F, Reichow B (2013) Autism in DSM-5: progress and challenges. Mol Autism 4(13):13
- 596 5. Blumberg S, Zablotsky B, Avila R, Colpe L, Pringle B, Kogan M (2016) Diagnosis lost: differences between children who had and who currently have an autism spectrum disorder diagnosis.
 599 Autism 20(7):783–795
- 600
 6. Constantino J, Todd R (2003) Autistic traits in the general popula601 tion: a twin study. Arch Gen Psychiatry 60(5):524–530
- 602 7. Constantino J, Todd R (2005) Intergenerational transmission of
 603 subthreshold autistic traits in the general population. Biol Psychia 604 try 57(6):655–660

- Lundström S, Chang Z, Råstam M, Gillberg C, Larsson H et al (2012) Autism spectrum disorders and autistic-like traits: similar etiology in the extreme end and the normal variation. Arch Gen Psychiatry 69(1):46–52
- 9. Ghaziuddin M, Mountain-Kimchi K (2004) Defining the intellectual profile of Asperger syndrome: comparison with highfunctioning autism. J Autism Dev Disord 34(3):279–284
- functioning autism. J Autism Dev Disord 34(3):279–284
 Munson J, Dawson G, Sterling L, Beauchaine T, Zhou A, Koehler
 E et al (2008) Evidence for latent classes of IQ in young children
 with autism spectrum disorder. Am J Ment Retard 113(6):439–452
 614
- Chiang H-M, Tsai L, Cheung Y, Brown A, Li H (2013) A metaanalysis of differences in IQ profiles between individuals with Asperger's disorder and highfunctioning autism. J Autism Dev Disorders 44(7):1577–1596
- Koyama T, Tachimori H, Osada H, Takeda T, Kurita H (2007)
 Cognitive and symptom profiles in Asperger's syndrome and high-functioning autism. Psychiatry Clin Neurosci 61:99–104
- Ozonoff S, Rogers S, Pennington B (1991) Asperger's syndrome: evidence of an empirical distinction from high-functioning autism. J Child Psychol Psychiatry 32(7):1107–1122
- Tsai L (2013) Asperger's disorder will be back. J Autism Dev Disord 43(12):2914–2942
- McAlonan G, Suckling J, Wong N, Cheung V, Lienenkaemper N, Cheung C et al (2008) Distinct patterns of grey matter abnormality in high-functioning autism and Asperger's syndrome. J Child Psychol Psychiatry 49(12):1287–1295
- 16. American Psychiatric Association (2000) Diagnostic and statistical manual of mental disorders, 4th edn. American Psychiatric Publishing, Washington, DC
- 17. Robinson E, Munir K, Munafò M, Hughes M, McCormick M, Koenen K (2011) Stability of autistic traits in the general population: further evidence for a continuum of impairment. J Am Acad Child Adolesc Psychiatry 50(4):376–384
- Osborne L, Reed P (2008) Parents' perceptions of communication with professionals during the diagnosis of autism. Autism 12(3):309–324
- Bolton P, Golding J, Emond A, Steer C (2009) Autism spectrum disorder and autistic traits in the Avon longitudinal study of parents and children: precursors and early signs. J Am Acad Child Adolesc Psychiatry 51(3):249–260
- 20. Beighley J, Matson J (2013) Encyclopaedia of autism spectrum disorders. Springer, New York
- Hess CR, Landa RJ (2012) Predictive and concurrent validity of parent concern about young children at risk for autism. J Autism Dev Disord 42(4):575–584
- Miller LE, Perkins KA, Dai YG, Fein DA (2017) Comparison of parent report and direct assessment of child skills in toddlers. Res Autism Spectr Disorders 41–42:57–65
- Richards M, Mossey J, Robins DL (2016) Parents' concerns as they relate to their child's development and later diagnosis of autism spectrum disorder. J Dev Behav Pediatr 37(7):532–540
- Zablotsky B, Colpe LJ, Pringle BA, Kogan MD, Rice C, Blumberg SJ (2017) Age of parental concern, diagnosis, and service initiation among children with autism spectrum disorder. Am J Intell Dev Disabil 122(1):49–61
- 25. Warren Z, McPheeters M, Sathe N, Foss-Feig J, Glasser J, Veenstra-VenderWeele J (2011) A systematic review of early intensive intervention for autism spectrum disorders. Pediatrics 127(5):1303–1311
- Fernell E, Eriksson MA, Gillberg C (2013) Early diagnosis of autism and impact on prognosis: a narrative review. Clin Epidemiol 5:33–43
- 27. Christensen D, Baio J, Braun K, Bilder D, Charles J, Constantino J et al (2016) Prevalence and characteristics of autism spectrum disorder among children aged 8 years—autism and developmental 669

 Journal : Large 127
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 Dispatch : 9-2-2019

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609

610

622

623

624

625

626

627

628

- disabilities monitoring network, 11 sites, United States, 2012.
 morbidity and mortality weekly report. Surveill Summ 65(3):1–23
 28. Lord C, Risi S, DiLavore P, Shulman C, Thurm A, Pickles A
- 28. Lord C, Risi S, DiLavore P, Shulman C, Thurm A, Pickles A
 (2006) Autism from 2 to 9 years of age. Arch Gen Psychiatry
 63(6):694–701
- Baranek GT, Watson LR, Crais E, Reznick S (2003) First-Year
 Inventory (FYI) 2.0. University of North Carolina, Chapel Hill
- 30. Makrygianni M, Reed P (2010) A meta-analytic review of the
 effectiveness of behavioural early intervention programs for children with autistic spectrum disorders. Res Autism Spectr Disord
 4(4):577–593
- 31. McConhachie H, Diggle T (2006) Parent implemented early
 intervention for young children with autism spectrum disorder:
 a systematic review. J Eval Clin Pract 13(1):120–129
- 32. Remington B, Hastings R, Kovshoff H, Espinosa F, Jahr E et al (2007) Early intensive behavioral intervention: outcomes for children with autism and their parents after two years. Am J Ment Retardation 112(6):418–438
- 33. Dawson G, Rogers S, Munson J, Smith M, Winter J et al (2010)
 Randomized, controlled trial of an intervention for toddlers with
 autism: the early start Denver model. Pediatrics 125(1):17–23
- 34. Matson J, Wilkins J, González M (2008) Early identification
 and diagnosis in autism spectrum disorders in young children
 and infants: how early is too early? Res Autism Spectr Disord
 2(1):75–84
- 35. Baron-Cohen S, Cox A, Baird G, Swettenham J, Nightengale
 M, Morgan K et al (1996) Psychological markers in the detection of autism in infancy in a large population. Br J Psychiatry 168(2):158–163
- 36. Charman T, Taylor E, Drew A, Cockerill H, Brown J, Bai rd G
 (2004) Outcome at 7 years of children diagnosed with autism at age 2: predictive validity of assessments conducted at 2 and 3 years of age and pattern of symptom change over time. J Child Psychol Psychiatry 46(5):500–513
- 37. Jones E, Gliga T, Bedford R, Charman T, Johnson M (2014)
 Developmental pathways to autism: a review of prospective studies of infants at risk. Neurosci Biobehav Rev 39:1–33
- 38. Chawarska K, Klin A, Paul R, Macari S, Volkmar F (2009) A
 prospective study of toddlers with ASD: short-term diagnostic and
 cognitive outcomes. J Child Psychol Psychiatry 50(10):1235–1245
- 39. Lovaas OI (1987) Behavioral treatment and normal educational and intellectual functioning in young autistic children. J Consult Clin Psychol 55(1):3–9
- 40. Fein D, Barton M, Eigsti I-M, Kelley E, Naigles L, Schultz R et al
 (2013) Optimal outcome in individuals with a history of autism. J
 Child Psychol Psychiatry 54(2):195–205
- 41. Orinstein A, Suh J, Porter K, De Yoe K, Tyson K, Tryob K et al (2015) Social function and communication in optimal outcome children and adolescents with an autism history on structured test measures. J Autism Dev Disord 45(8):2443–2463
- 42. Sutera S, Pandey J, Esser E, Rosenthal M, Wilson L, Barton M et al (2007) Predictors of optimal outcome in toddlers diagnosed with autism spectrum disorders. J Autism Dev Disord 37(1):98–107
- Kelley E, Naigles L, Fein D (2010) An in-depth examination of optimal outcome children with a history of autism spectrum disorders. Res Autism Spectr Disord 4(3):526–538
- 44. Orinstein A, Helt M, Troyb E, Tyson K, Barton M, Eigsti I-M et al (2014) Intervention history of children and adolescents with high-functioning autism and optimal outcomes. J Dev Behav Pediatr 35(4):247–256
- 45. Eigsti I-M, Stevens M, Schultz R, Barton M, Kelley E, Naigels
 L et al (2016) Language comprehension and brain function in
 individuals with an optimal outcome from autism. Neuroimage:
 Clin 10:182–191

- De Giacomo A, Frombonne E (1998) Parental recognition of developmental abnormalities in autism. Eur Child Adolesc Psychiatry 7(3):131–136
- Young R, Brewer N, Pattison C (2003) Parental identification of early behavioural abnormalities in children with autistic disorder. Autism 7(2):125–143
- 48. Watson L, Baranek G, Crais E, Reznick J, Dykstra J et al (2007) The First Year Inventory: retrospective parent responses to a questionnaire designed to identify one-year-olds at risk for autism. J Autism Dev Disord 37(1):49–61
- Ozonoff S, Heung K, Byrd R, Hanse R, Hertz-Picciotto I (2008) The onset of autism: Patterns of symptom emergence in the first years of life. Autism Research 1(6):320–328
- 50. Ozonoff S, Young G, Steinfeld M, Hill M, Cook I et al (2009) How early do parent concerns predict later autism diagnosis? J Dev Behav Pediatr 30(5):367–375
- Green H, McGinnity A, Meltzer H, Ford T, Goodman R (2005) Mental health of children and young people in Great Britain, 2004, Palgrave Macmillan, London
- 52. Nylund KL (2007) Latent transition analysis: modeling extensions and an application to peer victimization. Doctoral Dissertation. University of California, Los Angeles.
- 53. Nylund KL, Muthén B, Nishina A, Bellmore A, Graham S (2006) Stability and instability of peer victimization during middle school: using latent transition analysis with covariates, distal outcomes, and modeling extensions. Retrieved from: http://www.statmodel.com/download/LTA_DP_FINAL.pdf. Accessed 19 Oct 2019 (unpublished manuscript)
- 54. Nylund KL, Asparouhov T, Muthén BO (2007) Deciding on the number of classes in latent class analysis and growth mixture modeling: a Monte Carlo simulation study. Struct Equ Model 14(4):535–569
- 55. Akaike H (1987) Factor analysis and AIC. Psychometrika 52(3):317–332
- 56. Schwarz G (1978) Estimating the dimension of a model. Ann Stat 6(2):461–464
- Sclove SL (1987) Application of model-selection criteria to some problems in multivariate analysis. Psychometrika 52(3):333-343
- Lo Y, Mendell NR, Rubin DB (2001) Testing the number of components in a normal mixture. Biometrika 88(3):767–778
- Celeux G, Soromenho G (1996) An entropy criterion for assessing the number of clusters in a mixture model. J Classif 13(2):195–212
- Tofighi D, Enders CK (2008) Identifying the correct number of classes in growth mixture models. Advances in latent variable mixture models. Information Age Publishing Inc, Greenwich, pp 317–341
- 61. Muthén LK, Muthén BO (1998–2006) Mplus user's guide, 4th edn. Muthén, Los Angeles, CA
- Johnson CP, Myers SM (2007) Identification and evaluation of children with autism spectrum disorders. Pediatrics 120:1183–1215
- Greenberg G (2010) Inside the battle to define mental illness. Wired.com. https://www.wired.com/2010/12/ff_dsmv/. Accessed 19 Oct 2018
- 64. Lord C, Risi S, Lambrecht L, Cook B, Leventhal B et al (2000) The autism diagnostic observation schedule—generic: a standard measure of social and communication deficits associated with the spectrum of autism. J Autism Dev Disord 30(3):205–223
- 65. Ozonoff S, Iosif A, Baguio F, Cook I, Hill M et al (2010) A prospective study of the emergence of early behavioral signs of autism. J Am Acad Child Adolesc Psychiatry 49(3):256–266
- Wolff J, Botteron K, Dager S, Elison J, Estes A et al (2014) Longitudinal patterns of repetitive behavior in toddlers with autism. J Child Psychol Psychiatry 55(8):945–953

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735

- 804
 68. Russ S, Larson K, Halfon N (2012) A national profile of childhood
 epilepsy and seizure disorder. Pediatrics 129(2):256–264
- 69. Kohane I, McMurry A, Weber G, MacFadden D, Rappaport L et al
 (2012) The comorbidity burden of children and young adults with autism spectrum disorders. PLoS One 7(4):e33224
- 70. Van Eeghen A, Pulisifer M, Merker V, Neumeyer A, Van Eeghen
 810 E et al (2013) Understanding relationships between autism, intelligence, and epilepsy: a crossdisorder approach. Dev Med Child
 812 Neurol 55(2):146–153
- 71. Langan M (2011) Parental voices and controversies in autism.
 Bita Disabil Soc 26(2):193–205
- 72. Verhoeff B (2013) Autism in flux: a history of the concept from
 Leo Kanner to DSM-5. Hist Psychiatry 24(4):442–458
- 817 73. Woolfenden S, Sarkozy V, Ridley G, Williams K (2011) A systematic review of the diagnostic stability of autism spectrum disorder.
 819 Res Autism Spectr Disord 6:345–354
- 74. Guthrie W, Swineford LB, Nottke C, Wetherby AM (2013) Early
 diagnosis of autism spectrum disorder: stability and change in
 clinical diagnosis and symptom presentation. J Child Psychol
 Psychiatry 54(5):582–590
- 75. Charwarska K, Shic F, Macari S, Campbell DJ, Brian J, Landa
 R et al (2014) 18-month predictors of later outcomes in younger

siblings of children with autism spectrum disorder: a baby siblings research consortium study. J Am Acad Child Adolesc Psychiatry 53(12):1317–1327

- 76. Ozonoff S, Young GS, Landa RJ, Brian J, Bryson S, Charman T et al (2015) Diagnostic stability in young children at risk for autism spectrum disorder: a baby siblings research consortium study. J Child Psychol Psychiatry 56(9):988–998
- 77. Evans D, Leckman J, Carter A, Reznick J, Henshaw D et al (1997) Ritual, habit and perfectionism: the prevalence and development of compulsive-like behavior in normal young children. Child Dev 68(1):58–68
- Zohar A, Felz L (2001) Ritualistic behavior in young children. J Abnorm Child Psychol 29(2):121–128
- Rescorla L, Dahlsgaard K, Roberts J (2000) Late-talking toddlers: MLU and IPSyn outcomes at 3;0 and 4;0. J Child Lang 27(3):643–664
- Simonton D (2005) Giftedness and genetics: the emergenic-epigenetic model and its implications. J Educ Gift 28(3–4):270–286
- Arkes HR, Wortmann RL, Saville PD, Harkness AR (1981) Hindsight bias among physicians weighing the likelihood of diagnoses. J Appl Psychol 66(2):252–254
- 82. Graber ML, Franklin N, Gordon R (2005) Diagnostic error in internal medicine. Arch Intern Med 165:1493–1499
 848

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