Special Issue Article

Look duration at the face as a developmental endophenotype: elucidating pathways to autism and ADHD

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Abstract

Identifying developmental endophenotypes on the pathway between genetics and behavior is critical to uncovering the mechanisms underlying neurodevelopmental conditions. In this proof-of-principle study, we explored whether early disruptions in visual attention are a unique or shared candidate endophenotype of autism spectrum disorder (ASD) and attention-deficit/hyperactivity disorder (ADHD). We calculated the duration of the longest look (i.e., peak look) to faces in an array-based eye-tracking task for 335 14-month-old infants with and without first-degree relatives with ASD and/or ADHD. We leveraged parent-report and genotype data available for a proportion of these infants to evaluate the relation of looking behavior to familial (n = 285) and genetic liability (using polygenic scores, n = 185) as well as ASD and ADHD-relevant temperament traits at 2 years of age (shyness and inhibitory control, respectively, n = 272) and ASD and ADHD clinical traits at 6 years of age (n = 94).

Results showed that longer peak looks at the face were associated with elevated polygenic scores for ADHD (β = 0.078, *p* = .023), but not ASD (β = 0.002, *p* = .944), and with elevated ADHD traits in mid-childhood (*F*(1,88) = 6.401, *p* = .013, η_p^2 =0.068; ASD: *F* (1,88) = 3.218, *p* = .076), but not in toddlerhood (*ps* > 0.2). This pattern of results did not emerge when considering mean peak look duration across face and nonface stimuli. Thus, alterations in attention to faces during spontaneous visual exploration may be more consistent with a developmental endophenotype of ADHD than ASD. Our work shows that dissecting paths to neurodevelopmental conditions requires longitudinal data incorporating polygenic contribution, early neurocognitive function, and clinical phenotypic variation.

Keywords: attention, endophenotypes, eye-tracking, infant siblings, polygenic score

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Introduction

One of the big questions in psychiatry broadly is why conditions often overlap and whether this overlap reflects shared underlying mechanisms (Gandal et al., 2018; Thapar, Cooper, & Rutter, 2016; The Brainstorm Consortium, 2018). It could be that there are common environmental or genetic factors that trigger comparable compensatory or adaptive brain processes subsequently emerging as psychiatric conditions at a phenotypic level (with specificity depending on interactions with other factors, Bishop, 2010; Frankenhuis et al., 2016; Johnson, 2017; Johnson et al., 2015; Karmiloff-Smith et al., 2014; Thomas et al., 2016).

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Alternatively, it could be that symptoms of one condition lead to a behavioral profile characteristic of another (Bishop, 2017; Neale & Kendler, 1995; Sokolova et al., 2017). Addressing such questions requires a developmental approach, since genetic and environmental risk factors act prenatally and disorders are commonly only diagnosed in childhood or later (Johnson, Jones, & Gliga, 2015). The field of developmental psychopathology has long focused on uncovering the origins and course of "individual patterns of behavioral maladaptation" (Sroufe & Rutter, 1984) through a multidisciplinary integration of research approaches across the lifespan. Within this framework, mapping the "similarities and differences underlying diverse groups of risks and pathology" (Cicchetti, 1993, p. 474) is critical both scientifically and clinically.

From a clinical perspective, common vulnerability, protective or resilience factors could be an efficient target for prodromal screening procedures and non-specific interventions (Cicchetti, 1993). A focus on shared vulnerability is central to the Early Symptomatic Syndromes Eliciting Neurodevelopmental Clinical Examinations (ESSENCE) framework, which advocates for clinical

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examination and intervention targeting a range of behavioral problems emerging before age 3-5 years without the need to dissect conditions at early stages (Gillberg, 2010). Similarly, the Research Domain Criteria (RDoC) framework encourages researchers to focus their efforts on investigating transdiagnostic phenotypes, as a classification system of mental conditions based on biobehavioral dimensions cutting across current diagnostic categories might better reflect our understanding of mechanisms underlying psychopathology (Cuthbert & Insel, 2013). Conversely, identifying condition-specific etiological causes of neurobehavioral manifestations in some cases is essential to implement successful interventions, for example when medications targeting defined biological systems are available (Thapar et al., 2016). With regards to protective factors, the developmental psychopathology framework stresses the importance of identifying resilience factors that may contribute to positive adaption in the face of developmental risk and could be targets for preventative intervention programs (Cicchetti, 2013). However, it is important to note that adaptation may in some cases result in the amplification of behavioral differences and so interventions must be carefully designed (Johnson et al., 2015).

Scientifically, studying whether early signs of behavioral variation lie on condition-specific or general pathways is crucial to understand developmental processes leading to the manifestation of clinical symptoms (Cicchetti, 1993; Dick, 2018). This allows us to start to distinguish brain systems that might act as protective or resilience factors against a range of developmental risk from systems that act more specifically to produce a specific behavioral outcome (Johnson, 2012; Johnson, Gliga, Jones, & Charman, 2014). Observing pathways prior to symptoms is a powerful approach to disentangle whether different conditions are associated in terms of early signs and vulnerability factors (Elsabbagh & Johnson, 2010; Jeste & Geschwind, 2014; Wade, Prime, & Madigan, 2015). Conversely, if we could separate out patterns of cognitive, biological, or behavioral features of different conditions even in infancy, then this would suggest that they may be etiologically dissociable (Johnson et al., 2014). In this proof-of-principle study we combined longitudinal behavioral and genotype data (a multimodal approach considered essential to making progress in developmental psychopathology; Cicchetti, 2013) to make a step forward in understanding developmental processes underlying the emergence of neurodevelopmental conditions.

Autism spectrum disorder (ASD) and attention-deficit/ hyperactivity disorder (ADHD) are two of the most common neurodevelopmental conditions. ASD diagnosis is assigned typically between 3 and 5 years of age (Baio et al., 2018; Brett, Warnell, McConachie, & Parr, 2016) based on the presence of impairments in social interaction and communication, and restricted interests and repetitive behaviors as well as signs of sensory hyper- or hyposensitivity (American Psychiatric Association, 2013). ADHD is defined through clinical observation of the emergence, typically after 6 years of age (Halperin & Marks, 2019), of two types of behavioral manifestations: inattentiveness and/or hyperactivity and impulsiveness (American Psychiatric Association, 2013). Twin, family, and DNA-based studies showed that both ASD and ADHD are highly heritable, indicating that genetic factors explain most of the liability of these conditions (Hidalgo-Lopez, Gomez-Alzate, Garcia-Valencia, & Palacio-Ortiz, 2019; Larsson, Chang, D-Onofrio, & Lichtenstein, 2014; Miller et al., 2019; Tick, Bolton, Happé, Rutter, & Rijsdijk, 2016). Substantial clinical overlap has been found between ADHD and other neurodevelopmental conditions, in particular ASD

(Hollingdale, Woodhouse, Young, Fridman, & Mandy, 2019; Lai et al., 2019). Importantly, between 20 and 50% of children who have received a diagnosis of ADHD also meet criteria for ASD and between 30 and 80% of children who have been diagnosed with ASD also meet criteria for ADHD, raising the question whether common causal mechanisms might underlie behavioral manifestations of the two neurodevelopmental conditions (Rommelse, Franke, Geurts, Hartman, & Buitelaar, 2010).

Symptoms of both ADHD and ASD likely result from a complex interaction between emerging neurodevelopmental vulnerabilities and aspects of the child's prenatal and postnatal environment (Geschwind, 2011; Thapar, Cooper, Eyre, & Langley, 2013). However, research so far has produced mixed evidence on whether common or distinct developmental pathways underlie these conditions (Johnson et al., 2014; Visser, Rommelse, Greven, & Buitelaar, 2016). On the one hand, twin and molecular research studies indicate that phenotypic overlap between the two conditions is partly explained by shared genetic factors (Rommelse et al., 2010; Stergiakouli et al., 2017). Similarly, familial studies indicate that family members of people with ASD show increased levels of ADHD symptoms, compared to relatives of individuals with no neurodevelopmental condition (Chien et al., 2017). This suggests that familial factors are likely to have a general effect on ASD and ADHD symptomatology, possibly due to shared attention-related problems linked to pleiotropic risk factors underlying attention and social difficulties (Sokolova et al., 2017). On the other hand, specific genetic and environmental influences have been found for the two conditions, suggesting that they are partly etiologically distinct and that co-occurrence of features, rather than complete comorbidity, is often observed in individuals who show both symptoms of ASD and ADHD (Ronald, Larsson, Anckarsater, & Lichtenstein, 2014; The Brainstorm Consortium, 2018). Evaluating whether early phenotypes reflecting genetic effects are specifically associated with ASD versus ADHD could shed light on the mechanisms underlying clinical manifestations of these two conditions and the role of early factors contributing to increased susceptibility.

The concept of "developmental endophenotype"

In seeking to identify the factors that mediate between genetic variation and later symptomatology, the developmental psychopathology framework has several natural points of intersection with the effort to identify endophenotypes in psychiatry. Endophenotypes are conceptualized as quantitative measures that are closer to the biological bases of the disorder or condition than clinical phenotypes; these measures must be reliably quantifiable, state-independent, that is they can be observed when clinical symptoms are not, and they are found to a higher extent in unaffected relatives of affected individuals than in the typical population (Gottesman & Gould, 2003). The concept of endophenotype in psychiatry has been introduced as a potential tool to help resolve questions about etiological models, because it provides a genetically tractable target lying in the gap between genetic liability and neurodevelopmental process (Flint & Munafò, 2007). Thus, both the concept of endophenotypes and the field of developmental psychopathology originated from the recognition that linking the distal etiology of neurodevelopmental disorders to their proximal symptoms required an intermediate level of analysis.

Since the original framework was proposed by Gottesman and Gould (2003), the endophenotype construct has been revised to improve its utility in clinical practice and scientific discovery

(Iacono, Malone, & Vrieze, 2017). One approach is to test whether endophenotypes share genetic bases with the psychiatric phenotype through using molecular genetic data, such as polygenic risk scores (Dick, 2018; Iacono et al., 2017). In line with the RDoC approach (Insel, 2014), it has been proposed that endophenotypes should be tested for association with dimensional traits and clinical characteristics, rather than limiting the analysis to categorical Diagnostic and Statistical Manual of Mental Disorders (DSM) diagnosis (Beauchaine & Constantino, 2017; Iacono et al., 2017). Further, the criterion of state-independence has been elaborated as the possibility that an endophenotype is observed earlier in development than the behavioral manifestation of a clinical condition (Flint & Munafò, 2007; Skuse, 2001). This latter point resonates with the developmental psychopathology approach, where there is explicit recognition of the need to study age-dependent manifestations of particular characteristics and how they may combine to produce cascading outcomes (Cicchetti, 1993). Measures obtained at critical developmental time-points that reflect emerging components of cognition or affect and are linked to genetic effects have been defined as "developmental endophenotypes" (Johnson & Fearon, 2011). Studying developmental endophenotypes in populations with a higher likelihood of developing a neurodevelopmental condition can help understand risk and protective mechanisms underlying individual variability in cognitive and affective functions and identify target functions for early interventions (Green et al., 2017; Skuse, 2001).

Identifying developmental endophenotypes of ASD and ADHD

Prospective studies of infants with an older sibling with ASD have uncovered a range of potential developmental endophenotypes (Jones, Gliga, Bedford, Charman, & Johnson, 2014; Szatmari et al., 2016). Infants with an older sibling with ASD are considered at elevated likelihood of neurodevelopmental conditions, having a 20% chance of developing ASD themselves (Messinger et al., 2013; Ozonoff et al., 2011), and up to a 30% chance of developing related conditions (Charman et al., 2017; Ozonoff et al., 2014). Such work has shown a range of early alterations that could represent developmental endophenotypes, including delayed attainment of motor milestones, faster head circumference growth, different temperamental characteristics, and difficulties in disengaging and maintaining attention (Johnson et al., 2014). Infant sibling studies offer unique opportunities to investigate the dynamic interaction between susceptibility and resilience factors underlying developmental trajectories (Szatmari, 2018). However, such studies thus far have typically focused on infants with a familial history of ASD without specifically accounting for the presence of related conditions like ADHD in the family. Thus, the current literature does not allow us to evaluate whether these measures reflect atypicalities that are involved in the pathway to neurodevelopmental conditions in general, or whether they indicate condition-specific signs of a diverse developmental trajectory.

Measures of attention as potential developmental endophenotypes

The present paper is a proof-of-principle study to explore how we can study the specificity or universality of developmental endophenotypes in the early emergence of ASD and ADHD. To do this, we chose to focus on a domain that is closely linked to both ASD and ADHD: attention. Visual attention is a domaingeneral cognitive function which serves to prioritize processing of certain stimuli over others in order to select environmental information for learning and memory (Amso & Scerif, 2015; Scerif, 2010). Importantly, attention is listed in the RDoC framework as a construct of transdiagnostic relevance (Cuthbert & Insel, 2013). In early development, changes in attention reflect the gradual development of the interaction between neurocognitive control mechanisms and salient perceptual characteristics of the sensory world (Scerif, 2010). The development of attention is influenced by the organization of the maturing brain so that during the first year of life infants start to build the ability to direct or inhibit attention on a volitional basis (endogenous attention). The study of individuals with rare monogenic disorders such as Fragile X and Williams syndromes, which often present with elevated ASD and/or ADHD traits, suggests that molecular pathways involved in ASD and ADHD might disturb this process. In fact, these syndromes are characterized by early disruptions of the hierarchical organization of the neural networks underlying the development of attention (Amso & Scerif, 2015; Atkinson & Braddick, 2011). In line with this idea, shared genetic factors have been found to underlie inattention and attentional switching capacity in adults and children with co-occurring symptoms of ASD and ADHD (Polderman et al., 2013; Sinzig, Morsch, Bruning, Schmidt, & Lehmkuhl, 2008). Thus, correlates of attention could represent candidate developmental endophenotypes for both ASD and ADHD, and early disruptions to attention could theoretically contribute to the overlap between the two conditions. However, to date there is very little direct empirical evidence concerning the development of early attention skills in relation to both genetic risk and later symptom profiles for ASD and ADHD.

Aims of the study and analytical approach

In the present study we aimed to explore analytical approaches for using developmental endophenotypes to understand pathways to neurodevelopmental conditions. We operationalized this by examining if and at what level (liability or later traits) differences in attention are specifically involved in the developmental path to ASD and ADHD. To quantify attention, we used eye-tracking to measure look duration to a selected object or stimulus despite the presence of distractors. This measure is thought to reflect endogenous attention (Conejero & Rueda, 2017; Gliga, Elsabbagh, Andravizou, & Johnson, 2009) involving processes that require selective attention and maintenance of engagement to a particular stimulus as well as inhibition of exogenous effects of the competing stimuli (Colombo & Cheatham, 2006). Look durations to a selected object or item in infancy correspond to brain (event-related potentials of the scalp field) and physiological (heart rate) measures associated with states of attention (Richards, 2008). This suggests that this behavioral measure can be used as an endophenotype because it is closely related to brain and physiological states in the organism. Moreover, a recent twin study showed that a large proportion of the variance in how long toddlers look at areas of a visual scene is genetically related (Constantino et al., 2017).

Our candidate developmental endophenotype was peak look duration at faces in an eye-tracking face pop-out task at 14 months of age. We selected this measure because it has already been well studied in infants with familial liability for ASD (de Klerk, Gliga, Charman, & Johnson, 2014; Elsabbagh et al., 2013; Hendry et al., 2018; Wass et al., 2015). Earlier work had suggested (counter to expectations) that longer unbroken episodes of looking to faces were present in 18- to 30-month-old children with ASD relative to neurotypical controls, and that this was dimensionally related to poorer language skills and higher symptom levels within the ASD group (Webb et al., 2010). Interestingly, this was consistent with the observation that in typical development, peak unbroken look duration to faces typically decreases in the infant population across the first year of life and that infants who do not show this decline also have worse outcomes at 18, 24, and 36 months (Colombo, Shaddy, Richman, Maikranz, & Blaga, 2004). This early work also showed that typically developing toddlers with a sibling with an ASD diagnosis also showed a longer duration of looking to faces than do typically developing toddlers without an older sibling with ASD, albeit with a smaller effect size (Webb et al., 2010; see also Jones, Dawson, Kelly, Estes, & Webb, 2017). This raises the possibility that peak look duration is an endophenotype that fulfils the criteria for being present in nonaffected family members at a higher rate than in the typical population.

We selected the 14-month time-point because prospective studies have subsequently shown that peak looks to faces within an array are longer at 14-15 months for infants with older siblings with ASD than those without. This effect was less pronounced in the same infants tested at 8 months (Elsabbagh et al., 2013). A subsequent study with a larger but overlapping cohort indicated that the effect was only significant at 14 but not 8 months; further, the change between 8 and 14 months predicted later parent report of effortful control (Hendry et al., 2018). Indeed, at 6- to 8-months shorter fixation durations in the same task were linked to later ASD (Wass, Scerif, & Johnson, 2012), suggesting that the nature of this putative endophenotype may change over the developmental period in which endogenous influences on visual attention strengthen (Colombo, 2001). Further, within the group of infants with older siblings with ASD there were no significant differences in peak look to faces at 14 months between children with and without a later diagnosis of ASD (Elsabbagh et al., 2013 section 4.3.2; replicated in an expanded cohort in Hendry et al., 2018, p. 8). This further supports the evidence from Webb et al. (2010) that longer peak looks are not driven solely by children with a diagnostic outcome of ASD, but are rather shared across siblings as a group. Building on this work, Hendry and colleagues showed in a partially overlapping cohort that longer looks to faces in infancy were associated with reduced effortful control in toddlerhood, suggesting that differences between infants with and without siblings with ASD may be related to their risk for later effortful control difficulties, rather than categorical ASD (Hendry et al., 2018). Interestingly, these effects were not observed in relation to other competing non-social stimuli, possibly indicating that these effects only emerge in response to the stimuli that primarily capture the attention of infants with and without later ASD within a particular task (Elsabbagh et al., 2013).

Previous work thus indicates that a longer peak look to faces is present in typically developing toddlers with a sibling with ASD (Webb et al., 2010); is present in 14-month-old infants with an older sibling with ASD and is not specific to later ASD diagnosis (Elsabbagh et al., 2013; Hendry et al., 2018); emerges between 8 and 14 months (Hendry et al., 2018); and may be dimensionally related to later effortful control (Hendry et al., 2018). However, this work thus raises the question: what then is this measure of visual attention an endophenotype *for*? Possibly, this disruption in visual attention does relate to ASD outcome, but sufficient power is required to demonstrate this. Alternatively, longer peak looks to faces may relate to conditions that highly co-occur with ASD but have partially distinct aetiologies, such as ADHD. This may explain why the association with diagnostic status is much clearer in clinically referred samples, where co-occurrence is likely greater (Webb et al., 2010). Alternatively, longer peak looks may reflect a domain-general protective factor like executive attention (or effortful control, Hendry et al., 2018) that would be expected to be impaired in children with both later ASD and ADHD symptoms.

In the present study, we introduce one operationalization of a developmental psychopathology framework for beginning to examine whether longer peak looks to faces are a putative endophenotype for ASD, ADHD, or both. Specifically, in a large sample we ask whether longer peak looks to faces are related to specific risk factors or outcome measures of ASD once sample sizes are large enough; or whether peak looks to faces are related to specific risk factors or outcome measures of the strongly co-occurring and aetiologically overlapping condition ADHD; or whether data are more consistent with peak looks to faces representing a general protective factor that acts in the pathway to both conditions (Johnson et al., 2014). To do this, we use four different approaches: (a) familial liability based on family history and symptoms in first-degree family members; (b) genetic liability measured with polygenic scores; (c) temperament traits in toddlerhood which are found in individuals with later symptoms of the two clinical conditions; (d) elevated ASD and ADHD traits at 6 years of age.

For familial liability (a), we considered the presence of ASD and/or ADHD symptomatology in first-degree family members. This allowed us to identify groups of infants with a familial history of ASD, ADHD, both conditions and neither. Additionally, we were interested in complementing the familial liability analysis by making use of genetic information (b). Genome-wide association studies (GWASes)-that test the association between known variations of the DNA sequence that are common in the population and the trait of interest in very large samples-have demonstrated that many psychiatric conditions, including ASD and ADHD, are polygenic, meaning that they are influenced by many common genetic variants each of which has an individually small effect (Hong et al., 2013; Visscher et al., 2017). However, even though DNA sequence variants identified in GWASes individually have very little effect on outcome, they act independently and additively and can be aggregated into a single genetic "score," termed polygenic score (Dudbridge, 2013). Polygenic scores provide an individual-specific estimate for genetic propensity for a phenotypic trait or condition (such as ASD or ADHD), and correspond to the sum of trait-related effects sizes of genetic variants across the genome identified in the original GWAS (Wray et al., 2014). The application of polygenic scores has become widespread in genetic research because they can be utilized to empirically assess genetic liability for psychiatric conditions, as genetic predictor variables. We evaluated the association between peak look duration at the face and polygenic score for ASD and ADHD. For comparability to the familial liability analysis, we also took a categorical approach where we identified individuals who were in the extreme tail of the distribution for ASD/ ADHD polygenic score, considering them at elevated genetic liability for ASD or ADHD, respectively.

Although endophenotypes can be present when the clinical symptoms are not, one requirement is that they are linked to a clinical condition. However, a critical point emerging from studies of infants with elevated likelihood of ASD is that developmental

trajectories are dynamic and children show different profiles of the nature and timing of symptom development (Ozonoff et al., 2018). Thus, it may be that an endophenotype is stable/state independent, but the symptom profile that it is related to changes over developmental time. At the group level, early signs of emerging symptomatology can be robustly identified by two years of age (Ozonoff et al., 2015). However, in some cases clinical manifestations might not emerge until age five years (Ozonoff et al., 2018). Moreover, the effect of genetic factors on ASD and ADHD traits, though present across childhood, becomes stronger with age (Stergiakouli et al., 2017). One way to capture the link between genetic factors, developmental endophenotypes and clinical condition even if timing of emergence of the latter is variable is to test the association between endophenotype and symptom emergence at different time-points in development (Iacono et al., 2017). In order to evaluate whether our developmental endophenotype was informative of the earliest behavioral signs of a neurodevelopmental condition, we then tested whether peak look duration in infancy was associated with having ASD- and ADHD-related temperament traits in toddlerhood (c). Previous research on children with a first-degree relative with ASD and ADHD has shown that temperament characteristics at 2 years of age were predictive of later ASD and ADHD symptomatology (Auerbach et al., 2008; Shephard et al., 2019). In a cohort that is partly overlapping with the present one, Shephard et al. (2019) found that high parent-report levels of shyness at 2 years of age were associated with ASD symptoms in mid-childhood, while low inhibitory control in toddlerhood was predictive of later ADHD symptoms (Shephard et al., 2019), in line with other research (see Visser et al., 2016 for a review). Therefore, we used these temperament measures as early indicators of clinical characteristics. Implementing the same categorical approach that we used in the familial and genetic liability analysis, we dichotomized parent-report measures of temperament and tested the effect of elevated ASD and ADHD-related traits in toddlerhood. Additionally, we tested the linear association between our candidate developmental endophenotype and parent-report levels of shyness and inhibitory control at 2 years. Last, we examined our developmental endophenotype in relation to clinical traits in mid-childhood (d), when symptoms of neurodevelopmental conditions usually have clearly emerged (Ozonoff et al., 2018). We compared children with typical versus elevated ASD/ ADHD, defined based on clinical thresholds for diagnosis for parent-report questionnaires commonly used in clinical and research practice: the Social Responsiveness Scale for ASD (Constantino & Gruber, 2012) and the Conners for ADHD (Conners, 2008). Additionally, in line with the views of Beauchaine and Constantino (2017) and Iacono et al. (2017) on the importance of examining the association between endophenotypes and dimensional variation in psychiatric traits, we tested the relationship between peak look duration at the face and continuous ASD and ADHD traits. Finally, to verify the specificity of our results to the particular a priori measure we selected, we repeated all analyses for the mean peak look duration across all stimuli.

Materials and methods

Participants

The sample for the present study included 335 participants who took part in Phase 1, 2, and 3 of the British Autism Study of Infant Siblings (BASIS, http://www.basisnetwork.org) and

provided eye-tracking data for the face pop-out task at around 14 months of age (M = 14.37, SD = 1.17). The sample from Phases 1 and 2 included 155 infants with an elevated-likelihood of developing ASD (EL, 75 females) defined by having at least one older sibling with a community diagnosis of ASD, and 67 infants with a typical likelihood of developing ASD (TL, 38 females), defined by having at least one older sibling and no family history of ASD. Phase 3 participants were recruited for the Studying Autism and ADHD Risks (STAARS) project, that included infants with (n = 95, 44 females) and without (n = 18, 100)7 females) an older sibling or a parent with a community clinical diagnosis of ASD and/or ADHD or a research classification of probable ADHD (n = 2; as summarized in Supplementary Table SM.1 and Methods details section 4). For all Phases, infants with no family history of ASD or ADHD were recruited from a volunteer database at the Centre for Brain and Cognitive Development, Birkbeck University of London and had no known medical or developmental condition at the time of enrolment. Informed written consent was provided by the parent(s) prior to the commencement of the study.

Table 1 provides information relative to the number of male and female participants, peak look duration at the face, age (in months) and Early Learning Composite and Visual Reception scores of the Mullen Scales of Early Learning (MSEL) as measures of developmental level and visual skills, respectively, at the time of eye-tracking data collection by recruitment group (EL vs. TL). Supplementary Table SM.2 shows the total number of participants involved in the present study divided by Phase and recruitment group.

Measures

Peak look duration

The candidate developmental endophenotype used in the present study consisted of the average peak look duration at the face stimulus across all valid trials of a face pop-out task. The face pop-out task (described in Elsabbagh et al. (2013) and Gliga et al. (2009)) uses arrays of five pictures presented such that when placed at a distance of approximately 60 cm from the infant the five individual pictures on one slide had an eccentricity of 9.3° and covered an approximate area of $5.2^{\circ} \times 7.3^{\circ}$. The pictures included: a face with direct gaze, a mobile phone, a bird, a car and a control stimulus defined as "noise" or "scrambled-face," obtained by randomizing the phase spectra of the face stimulus while keeping the amplitude and color spectra constant (Halit, Csibra, Volein, & Johnson, 2004). An example of the array is presented in Figure 1.

During the task, infants were seated on their caregivers' lap approximately 60 cm from the screen. For Phases 1 and 2, a 17-inch monitor with a 5:4 aspect ratio was used. For Phase 3 a 23" 16:9 monitor was used and for comparability with previous phases stimuli were presented within a fixed 17-inches 5:4 virtual display surrounded by black borders (34.5 cm \times 25.9 cm, 32.1° \times 24.4° @ 60 cm viewing distance). All data were acquired on Tobii infra-red eye trackers (Phase 1, 1750 at 50Hz; Phase 2, T120 at 60Hz; Phase 3, TX-300 at 120 Hz). Online feedback as to the position of the child's eyes relative to the center of the eye tracker head box allowed experimenters to adjust the position of the arm-mounted eye trackers for optimal data quality. A fivepoint calibration sequence was run and recording only started when at least four points were successfully calibrated for each eye. Fourteen (Phase 1), seven (Phase 2) or six (Phase 3) different slides, containing arrays of five stimuli, were presented for 15 s Table 1. Composition characteristics of the participants included in the present study by recruitment group (EL vs. TL) and mean scores of the behavioral measures collected at 14 months of age.

	EL	TL	Total N
N current study	250	85	335
Males/Females	131/119	40/45	171/164
	Mean (<i>SD</i>)	Mean (<i>SD</i>)	Total Mean (<i>SD</i>)
	Min–Max	Min–Max	Min-Max
Peak look duration at the face	1739.75 (839.74)	1508.25 (688.12)	1681.01 (809.30)
	516.59–5717.52	377.86–3975.45	377.86–5717.52
Peak look duration at the noise stimulus	652.55 (304.82)	660.48 (267.54)	654.57 (295.38)
	186.65–3796.71	130.00–2023.35	130–3796.71
Peak look duration at the car	847.46 (520.50)	883.71 (835.75)	856.68 (614.99)
	99.87–4799.37	148.89–6906.39	99.87–6906.39
Peak look duration at the phone	781.82 (455.51)	795.34 (455.83)	785.31 (454.93)
	99.98–3647.12	66.61–3056.09	66.61–3647.12
Peak look duration at the bird	788.18 (448.31)	987.98 (473.81)	838.88 (462.46)
	183.28–3682.88	237.44–2643.00	183.28–3682.88
Mean peak look duration at all stimuli	966.36 (255.41)	966.67 (291.70)	966.44 (264.64)
	485.04–2239.83	208.42-2254.00	208.42–2254.00
Age (months)	14.40 (1.11)	14.28 (1.33)	14.37 (1.17)
	11-18	11–20	11–20
N valid trials	7.79 (3.04)	10.21 (3.42)	8.40 (3.31)
	3-14	3-14	3-14
MSEL Visual Reception score	43.55 (10.69)	50.46 (12.07)	45.31 (11.44)
	20–80	20–80	20-80
MSEL Early Learning Composite score	88.59 (16.78)	99.75 (18.38)	91.42 (17.85)
	49–147	53–154	49–154

EL: elevated likelihood of autism spectrum disorder (ASD) and/or attention-deficit hyperactivity disorder (ADHD) based on familial history of first-degree family members, TL: typical likelihood of ASD and/or ADHD based on familial history of first-degree family members, N = number of participants or trials, SD = standard deviation, MSEL: Mullen Scales of Early Learning.











Figure 1. Example of one slide containing an array of five stimuli presented during the face pop-out eye-tracking task.

each. To ensure that the infant's gaze was directed to the center, a small animation was presented in the center of the screen before each slide presentation. Visual presentation was accompanied by music to assist infants in maintaining attention throughout the task. Gaze data were processed using Tobii Studio in Phase 1 (T.G.) and using custom-written MATLAB scripts in Phases 2 and 3 (L.M.). Tobii eye trackers will acquire binocular gaze coordinates where possible, and monocular where only one eye is detected. The X and Y coordinates of binocular samples were averaged. Gaze to off-screen locations was marked as missing. Fixations <100 ms (Phase 1) or <50 ms (Phases 2 and 3) were removed. For Phases 2 and 3, raw data were first assigned to Area Of Interests (AOIs). Following this, missing data up to 200 ms were assigned to the AOI if gaps occurred within the same AOI. In both procedures, where gaps occurred between different AOIs, data were not interpolated.

Each trial was processed, then those with <25% valid samples or <5 s trial length (due to potential skipping) were marked as invalid. Only valid trials were included in subject averages. Subjects with <3 valid trials were excluded from analysis.

For each valid trial, peak look was calculated by taking the duration of the longest contiguous run of samples within an AOI (i.e., each look may be formed by multiple fixations, so long as they occur within an AOI). If no look was available for a particular stimulus, the trial was excluded from the mean peak calculations for that AOI. For each participant with at least three valid trials for the face stimulus (M = 8.38, SD = 3.29, range: 3–14), an average of peak look duration across trials was calculated and used as variable in subsequent analyses. The same procedure was applied to obtain peak look durations to each of the other four stimuli. Subsequently, peak look durations were averaged across trials and further averaged across stimuli in order to obtain a general measure of sustained attention which was not specific to the social stimulus (see Supplementary Figure SM.1B).

Peak look durations were averaged across the trials to provide a more stable characterization of individual differences (Colombo & Mitchell, 1990; Wass, 2014), and following previous research (Hendry et al., 2018; Jones et al., 2016). In our sample, peak look duration was moderately correlated with mean look duration at the same stimulus (r(1667) = .466, p < .001), for the face stimulus only: r(335) = .460, p < .001). Supplementary Figure SM.1A shows that the distribution of peak look duration at the face varies across the three Phases of BASIS. Of note, a different ratio of children with and without familial liability for neurodevelopmental conditions were recruited across Phases. However, Phase had an effect on peak look duration at the face when restricting the analysis to TL children (Kruskal–Wallis test: $\chi^2(2) = 13.84$, p = .001). While acknowledging that correcting for Phase could have biased the results given the different composition of likelihood-groups in the three cohorts, all subsequent analyses were repeated including Phase as a covariate to verify whether results were robust to this effect.

Familial liability

Familial liability was defined as having records of ASD or ADHD symptomatology among first-degree relatives. For ASD, liability was determined based on parent report of clinical diagnosis from a UK clinician in at least one of the older siblings (all Phases, n = 229, where six of the Phase 3 children had also a parent with a condition) or parents (Phase 3 only, n = 21, including 15 where the diagnosis was assigned to parent only and six where a condition was diagnosed in both parent and sibling, see

Supplementary Table SM.1 for details), supported when possible with diagnostic letters and questionnaire data. Specifically, a diagnosis of ASD was confirmed if the older sibling met the ASD threshold on the Development and Well-Being Assessment (DAWBA, Goodman, Ford, Richards, Gatward, & Meltzer, 2000) and/or had a score >15 on the Social Communication Questionnaire (SCQ, Rutter, Bailey, & Lord, 1993). For ADHD, parent report of clinical diagnosis of ADHD was required in at least one of the first-degree family members, or a first-degree relative had to meet clinical cut-offs on the Conners 3-Parent questionnaires (Conners, 2008) as outlined in SM 4. Participants were excluded from this analysis if there was no recent information on the presence of ADHD traits in the family and no questionnaire on ADHD available for the older siblings (n = 36 for Phase 1, n = 14 for Phase 2).

Overall, of the 285 participants who had both valid peak look at the face data and data on familial liability, 179 had at least one family member with a diagnosis of ASD (n = 94 EL-ASD + n = 85EL-ASD/ADHD), 106 had at least one family member with ADHD (n = 21 EL-ADHD + n = 85 EL-ASD/ADHD) and 85 were TL infants with no familial history of ASD or ADHD in the first-degree relatives.

Genetic liability

Saliva and/or cheek-swab DNA samples were collected from the Phase 1, 2, and 3 participants as detailed in the Supplementary Materials (section 1). Following genotyping and quality control procedures (summarized in Supplementary Table SM.3), good quality genetic data were available for 243 BASIS infants of European ancestry. Polygenic scores for ASD and ADHD were constructed using LDpred (Vilhjálmsson et al., 2015) based on the most recent GWASes for ASD and ADHD, both metaanalyses of data collected by the Lundbeck Foundation Initiative for Integrative Psychiatric Research (iPSYCH) and Psychiatric Genomic consortia. Specifically, the ASD GWAS reports results from 18,382 ASD cases and 27,969 controls (Grove et al., 2019) while the ADHD GWAS comprised 19,099 ADHD cases and 34,194 controls (Demontis et al., 2019). Details of polygenic score construction and validation are reported in the Supplementary Materials (section 2, Figures SM.2 and SM.3).

Polygenic scores data calculated with PT = 1 were standardized (ASD: M = 0, SD = 1, range: -2.73 to +3.52; ADHD: M = 0, SD = 1, range: -2.71 to +2.54) and tested for association with peak look data. Additionally, for the categorical approach illustrated above, we defined infants as having elevated genetic liability for ASD or ADHD if they were in the top quartile for ASD and/or ADHD polygenic score in our sample, respectively. ASD liability was assigned to individuals who were in the top quartile of the ASD polygenic score distribution (polygenic score above 0.554). Similarly, ADHD liability was assigned to individuals in the top quartile of the ADHD polygenic score (polygenic score above 0.604).

Of the 335 participants with valid peak look duration data, 185 also provided good-quality genotype data for polygenic score analysis. Of these, 44 were classified as having high ASD genetic liability (n = 27 ASD + n = 17 ASD/ADHD), 44 as having high ADHD genetic liability (n = 27 ADHD + n = 17 ASD/ADHD) and 114 for neither (see Table 3 for descriptives and mean scores). Supplementary Figure SM.4 illustrates the ASD and ADHD top-quartile polygenic scores' thresholds for the individuals with good quality peak look duration data.

Toddler temperament traits

The Early Childhood Behavior Questionnaire (ECBQ) was collected for a total of 321 participants across Phases 1, 2, and 3 when they were around 2 years of age (M = 24.87 months,SD = 1.64). The ECBQ is a parent-report questionnaire designed to evaluate temperament traits in the first three years of life (Rothbart, Ahadi, Hershey, & Fisher, 2012). It includes 18 subscales whose scores are constructed by clustering items assessing different dimensions of temperament (Putnam, Gartstein, & Rothbart, 2006). For the present research, the shyness subscale scores (M = 3.32, SD = 1.16, range: 1–7) and the inhibitory control subscale scores (M = 4.11, SD = 1.18, range: 1–6.6) were used as indices of temperament traits predictive of later ASD and ADHD symptomatology, respectively (Shephard et al., 2019; Visser et al., 2016). Individuals in the top quartile of our sample distribution for shyness (score above 4.00) were classified as having ASD-related temperament traits; individuals in the bottom quartile for inhibitory control (score below 3.33) were classified as having ADHD-related temperament traits in toddlerhood. Of the 335 participants with valid peak look data, 272 provided ECBQ data. Of those, 65 had ASD-related temperament traits (n = 42 ASD + n = 23 ASD/ADHD), 59 had ADHD-related temperament traits (n = 36 ADHD + n = 23 ASD/ADHD) and 171 neither elevated ASD- or ADHD-related temperament traits (see Table 3 for descriptives and mean scores, Supplementary Figure SM.5 for sample characterization based on the quartile thresholds). Additionally, we tested the linear association between peak look and ECBQ shyness and inhibitory control scores.

Mid-childhood clinical traits

The second edition of the Social Responsiveness Scale (SRS, Constantino & Gruber, 2012) School Age version was administered to the parents of Phase 1 and 2 infant siblings when they were 6-year-old (N = 105). This questionnaire provides a quantitative measure of autistic-like behavior that has been extensively used in both clinically ascertained and population-based samples of subjects (Constantino & Todd, 2005; Frazier et al., 2014). Raw scores are converted to *t* scores to reflect age and gender norms. The total *t* score was used as a measure of ASD traits.

The third edition of the Conners Parent form, created to evaluate ADHD traits in school-age children aged between 6 and 18 years (Kao & Thomas, 2010), was administered to parents of Phase 1 and 2 infant siblings when they reached mid-childhood (N = 103). Additionally, the Conners Early Childhood form was used for 12 Phase 2 participants who were younger than 6 at the time of recruitment for this part of the data collection. The Conners Global Index was computed for the two versions of the questionnaire. This score is recommended for detailed examination of ADHD and related features such as executive functioning, learning, aggression, hyperactivity/impulsivity, peer relations, and inattention. For this study, the Global Index total t scores were calculated and used as a measure of ADHD clinical traits.

The sample for this analysis included 102 participants for whom both SRS-2 and Conners measures were obtained (mean age = 6.77, SD = 0.78). Of the 335 participants with valid peak look duration data, 94 provided both SRS (M = 54.46, SD = 17.04, range: 38–104) and Conners (M = 57.32, SD = 15.76, range: 40–91) data for this study. Twenty-two participants with SRS total *t* score above the standard clinical thresholds for mild to moderate difficulties in the autism spectrum of 60 were classified

as having elevated ASD traits (n = 6 ASD + n = 16 ASD/ADHD). Twenty-nine participants scoring above the conventional clinical threshold of 65 on the Conners Global Index *t* score were classified as having elevated levels of ADHD traits (n = 13 ADHD + n = 16ASD/ADHD). Fifty-nine participants were considered typically developing ("neither" group, see Supplementary Figure SM.6).

Table 2 summarizes the variables used and sample sizes for all the analyses. Table 3 describes the sample and measures divided into ASD only, ADHD only, ASD/ADHD and neither ASD nor ADHD liability/traits for the four analyses. A correlation table between the continuous variables (polygenic scores, toddler temperament traits and mid-childhood clinical traits) can be found in the Supplementary Materials (Figure SM.7).

Statistical analyses

All analyses were conducted using peak look duration at the face at 14 months as dependent variable. Peak look data were nonnormally distributed (Shapiro–Wilk normality test: W = 0.879, p < .001), with the presence of extreme, though plausible, values. Therefore, the log-transformed peak look data were used in subsequent analyses. In addition, to test the specificity of results for the face condition, analyses were repeated using the log-transformed average peak look duration at all five stimuli (face, noise, car, phone, and bird) as the dependent variable.

Similarly to other research studying comorbid neurodevelopmental disorders (Banaschewski, Neale, Rothenberger, & Roessner, 2007; Greimel et al., 2011; Tye et al., 2014), we used a 2×2 factorial design to evaluate the contribution of the two conditions (additive effects) and of their interaction (multiplicative effect) to peak look duration. A nonsignificant interaction would provide evidence in favor of the additive model (Bedford et al., 2014). Given that our groups were often unbalanced for size, we used Type II analysis of variance (ANOVAs) to test for the main effects and interaction effect of having elevated ASD (ASD/ADHD + ASD vs. ADHD + neither) or ADHD (ASD/ADHD + ADHD vs. ASD + neither) familial liability, genetic liability, temperament traits in toddlerhood, and clinical traits in mid-childhood, respectively.

Partial eta-squared (η_p^2) were used as measures of the effect sizes.

Three linear regressions were used to test for the relationship between log-transformed peak look data and the continuous variables for genetic liability (ASD and ADHD polygenic scores), temperament traits in toddlerhood (shyness and inhibitory control ECBQ scores) and clinical traits in mid-childhood (SRS and Conners total *t* scores).

Number of valid trials for the face pop-out task was significantly different between recruitment groups (t(132.1) = 5.800, p < .001, see Table 1) and was thus included as a covariate in all ANOVA and regression analyses. Age (in months) was also included as a covariate in all analyses. Additionally, all analyses were repeated including Phase as a covariate, given the slight differences in processing parameters.

Results

Familial liability

Familial liability analyses were conducted on the 285 participants for whom it was possible to define the presence of ASD and ADHD in first-degree relatives, as described in the methods section. For peak look duration at the face, log-transformed peak look durations met the assumptions of normality of the distribution (Shapiro–Wilk test: W = 0.997, p = .801) and homogeneity of

Table 2. Instruments ar	d sample sizes fo	or the analyses conducted	in this study.
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		ASD	ADHD	N tot	N peak look	N (%) ASD	N (%) ADHD
Liability	Familial liability	Family history	Family history, Conners symptoms in the older sibling	235	285	179 (63%)	106 (37%)
	Genetic liability	Polygenic score based on ASD GWAS (Grove et al., 2019)	Polygenic score based on ADHD GWAS (Demontis et al., 2019)	243	185	44 (24%)	44 (24%)
Later traits	Toddler temperament traits (2 years)	ECBQ shyness	ECBQ inhibitory control	321	272	65 (24%)	59 (22%)
	Mid-childhood clinical traits (6 years)	SRS total t score	Conners 3 Parent/Early Childhood Global Index total t score	102	94	22 (23%)	29 (31%)

ADHD: attention deficit-hyperactivity disorder; ASD: autism spectrum disorder; N tot: number of participants with information on the measure of interest; N peak look: number of participants included in the study as providing both information on the measure of interest and valid peak look at the face data. N (%) ASD: number (percentage of the sample included in the study, i.e., N peak look) of participants with elevated ASD liability/traits (ASD + ASD/ADHD); N (%) ADHD: number (percentage of the sample included in the study) of participants with elevated ADHD liability/traits (ADHD + ASD/ADHD); GWAS: Genome-Wide Association Study; ECBQ: Early Childhood and Behavior Questionnaire; SRS: Social Responsiveness Scale.

Table 3. Descriptives and mean scores of the measures used in the four analyses by group: attention-deficit hyperactivity disorder (ADHD) liability/traits only, autism spectrum disorder (ASD) only, both ASD and ADHD (ASD/ADHD) and neither. Results of the analysis of variance (ANOVAs) comparing the four groups are reported for the continuous measures.

		ADHD	ASD	ASD/ADHD	Neither	ANOVA
Familial liability	Ν	21	94	85	85	
	Males/females	14/7	44/50	50/35	40/45	
Genetic liability	Ν	27	27	17	114	
	Males/females	10/17	16/11	11/6	62/52	
	polygenic score ASD	-0.20 (0.58) -1.87-0.55 ^a	1.26 (0.73) 0.57–3.16 ^{a,b,c}	1.20 (0.70) 0.58–3.52 ^{b,d}	-0.45 (0.73) -2.73-0.53 ^{c,d}	F(3,181) = 61.3, p < .0001
	Polygenic score ADHD	1.16 (0.51) 0.62–2.53 ^{a,b}	-0.22 (0.66) -1.87-0.6 ^{a,c}	1.43 (0.58) 0.65–2.33 ^{c,d}	-0.49 (0.73) -2.71-0.58 ^{b,d}	F(3,181) = 71.56 p < .0001
Toddler temperament traits (2 years)	Ν	36	42	23	171	
	Males/females	23/13	15/27	13/10	85/86	
	age	25.75 (2.12) 23-34 ^{a,b}	24.54 (1.57) 23-32 ^a	25.39 (1.27) 24–29	24.72 (1.53) 21–30 ^b	F(3,261) = 5.478 p = .001
	ECBQ shyness	2.71 (0.83) 1.0-3.92 ^a	4.78 (0.61) 4.0-6.50 ^{a,b,c}	5.17 (0.81) 4.0-6.67 ^{b,d}	2.76 (0.67) 1.2–3.92 ^{c,d}	F(3,268) = 160.7 p < .0001
	ECBQ inhibitory control	2.47 (0.55) 1.00-3.22 ^{a,b}	4.48 (0.94) 3.33–6.56 ^{a,c}	2.59 (0.52) 1.20–3.27 ^{c,d}	4.65 (0.79) 3.33–6.60 ^{b,d}	F(3,268) = 113.9 p < .0001
	MSEL visual reception	44.79 (13.68) 20-74 ^{a,b}	53.59 (13.34) 24–80 ^a	46.62 (14.52) 20-74 ^c	56.85 (11.81) 20-80 ^{b,c}	F(3,256) = 11.37 p < .0001
	MSEL early learning composite	87.94 (22.27) 49-140 ^{a,b}	106.05 (22.08) 57–144 ^a	93.05 (22.05) 53–132 ^c	110.22 (16.50) 66–144 ^{b,d}	F(3,251) = 16.48 p < .0001
Mid-childhood clinical	Ν	13	6	16	59	
traits (6 years)	Males/females	4/9	4/2	8/8	26/33	
	age	6.92 (0.76) 5–8	6.83 (0.41) 6-7	6.31 (0.79) 5-8	6.86 (0.78) 4-8	<i>F</i> (3,90) = 2.42, <i>p</i> = .071
	SRS Total t score	50.38 (5.12) 43–59 ^a	75.33 (15.60) 61–101 ^{a,b,c}	84.12 (10.75) 69–104 ^{b,d}	45.36 (4.74) 39–59 ^{c,d}	F(3,90) = 143.2, p < .0001
	Conners 3 Parent/ Early Childhood Global Index total <i>t</i> score	73.85 (7.46) 66–90 ^{a,b}	53.83 (6.34) 44–60 ^{a,c}	81.25 (9.49) 66–91 ^{c,d}	48.00 (6.87) 40–63 ^{b,d}	F(3,90) = 108.3, p < .0001

ECBQ: Early Childhood and Behavior Questionnaire; MSEL: Mullen Scales of Early Learning; SRS: Social Responsiveness Scale. confidence level.

variance (Levene's test: F(3,281) = 2.010, p = .113). There was a significant main effect of having a family history of ADHD (F $(1,279) = 4.150, p = .043, \eta_p^2 = 0.015)$, but not of ASD (F(1,279) = 0.757, p = .385, $\eta_p^2 = 0.003$). Similarly, the nonsignificant result of the interaction term did not support a multiplicative effect of having elevated familial liability for both conditions on peak look duration at the face (F(1,279) = 0.340, p = .528, $\eta_p^2 = 0.001$). When removing Phase as a covariate, we found no significant main effect of having a family history of ASD (F(1,277) = 0.129, $p = .719, \ \eta_p^2 < 0.001)$ or ADHD $(F(1,277) = 1.162, \ p = .282, \ \eta_p^2 =$ 0.004) and no significant interaction between ASD and ADHD $(F(1,277) = 0.578, p = .448, \eta_p^2 = 0.002)$. To further explore whether our results were due to the fact that Phase 3 only included individuals with familial liability for ADHD and not ASD, we repeated the analyses in the Phase 3 cohort only. Results confirmed there was no main effect of either condition (ASD: F(1,107) = 1.136, p = .289, $\eta_p^2 = 0.010$, ADHD: F(1,107) =1.767, p = .187, $\eta_p^2 = 0.016$), nor significant interaction between ASD and ADHD $(F(1,107) = 1.536, p = .218, \eta_p^2 = 0.218)$.

For mean peak look duration at all stimuli, analyses revealed that was no significant effect of ASD (F(1,279) = 0.730, p = .394, $\eta_p^2 = 0.003$; with Phase as covariate: F(1,277) = 1.105, p = .294, $\eta_p^2 = 0.004$), ADHD (F(1,279) = 0.338, p = .562, $\eta_p^2 = 0.002$) and no significant interaction effect (F(1,279) = 0.649, p = .421, $\eta_p^2 = 0.002$; with Phase as covariate: F(1,277) = 0.023, p = .880, $\eta_p^2 < 0.001$).

Genetic liability

Genetic liability analyses were conducted on the subset of 185 participants who provided good-quality genotype data for polygenic score analysis. Log-transformed peak look duration at the face data had a normal distribution (W = 0.994, p = .619) and homogeneous variance between groups (F(3,181) = 1.328, p= .267). Our categorical analysis revealed that there was a significant main effect of increased genetic liability for ADHD (F $(1,179) = 4.05, p = .045, \eta_p^2 = 0.021$, but not for ASD (*F*(1,179) = 0.017, p = .898, $\eta_p^2 < 0.001$, Figure 2). The interaction effect was also non-significant (F(1,179) = 0.809, p = .370, $\eta_p^2 = 0.005$), indicating that having increased polygenic factors for both conditions did not influence peak-look durations at the face. When including Phase as a covariate, peak look duration at the face was not significantly different between infants with and without elevated polygenic score for ASD (F(1,177) = 0.017, p = .895, η_p^2 < 0.001) or ADHD (F(1,177) = 1.623, p = .204, $\eta_p^2 = 0.009$). The interaction term was also nonsignificant (F(1, 177) = 1.274, p= .260, η_p^2 = 0.007). When examining the linear relationship with the two polygenic scores, we found that peak look duration at the face was significantly associated with polygenic score for ADHD ($\beta = 0.078$, standard error = 0.034, p = .023, Figure 3; with Phase as covariate: $\beta = 0.068$, SE = 0.032, p = .035) but not for ASD ($\beta = 0.002$, SE = 0.034, p = .944; with Phase as covariate: $\beta = 0.006, SE = 0.033, p = .864).$

When examining mean peak look to all stimuli, our categorical analysis revealed that there was no significant main effect of having elevated ASD (F(1,179) = 0.341, p = .559, $\eta_p^2 = 0.002$) or ADHD genetic liability (F(1,179) = 0.402, p = .527, $\eta_p^2 = 0.002$) and no significant interaction effect (F(1,179) = 2.108, p = .148, $\eta_p^2 = 0.012$). The same pattern of results was found when including Phase as a covariate (ASD: F(1,177) = 0.033, p = .857, $\eta_p^2 < 0.001$; ADHD: F(1,177) = 0.269, p = .605, $\eta_p^2 = 0.002$; ASD*ADHD: F(1,177) = 1.963, p = .163, $\eta_p^2 = 0.011$). When

testing their linear relationship, we found no association between mean peak look duration at all stimuli and polygenic score for ASD ($\beta = 0.005$, SE = 0.021, p = .805; with Phase as covariate: $\beta = <0.001$, SE = 0.020, p = .993) and ADHD ($\beta = 0.006$, SE = 0.021, p = .781; with Phase as covariate: r = .008, SE = 0.020, p = .682).

Toddler temperament traits

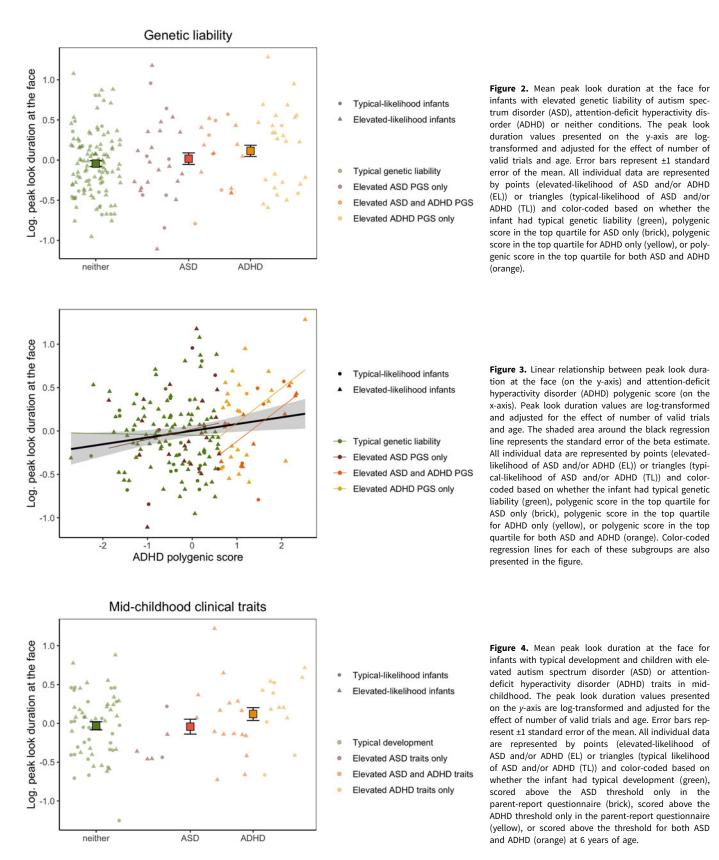
Of the 335 infants with valid peak look data at 14 months, 272 also had ECBQ scores at 2 years. For these children, log-transformed peak look durations were normally distributed (W = 0.997, p = .918) and variance homogenous between groups for the 2 × 2 factorial design (F(3,268) = 1.286, p = .279). We found that having elevated levels of shyness at two years was not significantly associated with peak look duration (F(1,266) = 0.739, p = .391, $\eta_p^2 = 0.003$, with Phase as covariate: F(1,264) = 0.055, p = .815, $\eta_p^2 < 0.001$). There was also no effect of having elevated ADHD-related temperament traits, that is poor inhibitory control (F(1,266) = 1.311, p = .253, $\eta_p^2 = 0.005$, with Phase as covariate: F(1,264) = 0.269, p = .605, $\eta_p^2 = 0.001$) and interaction result did not support a multiplicative model where having elevated traits in both conditions significantly related to peak look duration (F(1,266) = 0.603, p = .438, $\eta_p^2 = 0.002$, with Phase as covariate: F(1,264) = 0.534, p = .465, $\eta_p^2 = 0.0012$).

The lack of evidence for an association between peak look durations at the face at 14 months and the selected temperament traits at 2 years was confirmed by the results of the multiple regression including continuous ECBQ shyness ($\beta = -0.004$, *SE* = 0.023, *p* = .850; with Phase as covariate: $\beta = 0.014$, *SE* = 0.022, *p* = .537) and inhibitory control scores ($\beta = -0.030$, *SE* = 0.027, *p* = .274; with Phase as covariate: $\beta = -0.010$, *SE* = 0.027, *p* = .703).

For mean peak look at all the stimuli in the array, we found no main effect of having elevated ASD traits (F(1,266) = 0.217, p = .642, $\eta_p^2 < 0.001$, with Phase as covariate: F(1,264) = 0.592, p = .442, $\eta_p^2 = 0.002$) nor ADHD traits (F(1,266) = 1.235, p = .267, $\eta_p^2 = 0.005$, with Phase as covariate: F(1,264) = 0.839, p = .361, $\eta_p^2 = 0.003$). Further, there was no significant interaction effect (F(1,266) = 0.086, p = .770, $\eta_p^2 < 0.001$, with Phase as covariate: F(1,264) = 0.101, p = .751, $\eta_p^2 < 0.001$). While there was no linear association between mean peak look duration at all stimuli and ECBQ shyness scores ($\beta = -0.011$, SE = 0.015, p = .471, with Phase as covariate: $\beta = -0.013$, SE = 0.015, p = .392), we found that longer looking times at the stimuli in the array at 14 months of age was associated with reduced inhibitory control at 2 years ($\beta = -0.026$, SE = 0.018, p = .146).

Mid-childhood clinical traits

With our categorical approach, we tested whether peak look duration at the face in infancy was associated with elevated levels of ASD and/or ADHD clinical traits during mid-childhood defined using conventional clinical thresholds of the SRS and Conners Global Index total *t* scores (Figure 4) in 94 children with available questionnaire data at 6 years of age. The log-transformed peak look duration data had normal distribution (W = 0.988, *p* = .577) and equal variance between groups (F(3,90) = 0.607, *p* = .612). We found a trend of association between peak look duration at the face in infancy and elevated ASD traits at 6 years (*F* (1,88) = 3.218, *p* = .076, $\eta_p^2 = 0.035$), which became statistically



significant when including Phase as covariate (*F*(1,87) = 4.202, *p* = .043, $\eta_p^2 = 0.046$). Longer peak look duration at the face was observed in infants who later showed elevated ADHD traits (*F*(1,88) = 6.401, *p* = .013, $\eta_p^2 = 0.068$, with Phase as covariate: *F*

(1,87) = 4.948, p = .029, $\eta_p^2 = 0.053$). The interaction effect was not significant, indicating that children with elevated levels of traits of both ASD and ADHD at 6 years did not show a specific pattern of peak look duration at the face in infancy (*F*(1,88) =

0.049, p = .826, $\eta_p^2 < 0.001$, with Phase as covariate: F(1,87) = 0.018, p = .893, $\eta_p^2 < 0.001$).

When examining the linear relationship with continuous *t* scores, we found no association with SRS *t* scores ($\beta = -0.003$, SE = 0.004, p = .271; with Phase as covariate: $\beta = -0.004$, SE = 0.003, p = .237) and a trend of positive association with Conners Global Index *t* scores ($\beta = 0.007$, SE = 0.004, p = .083) which was weaker when including Phase as a covariate ($\beta = 0.005$, SE = 0.004, p = .163).

Analyses on mean peak look duration at all the stimuli in the pop-out array revealed that there was no significant main effect of ASD (*F*(1,88) = 1.575, *p* = .213, $\eta_p^2 = 0.018$) or ADHD (*F*(1,88) = 1.803, *p* = .183, $\eta_p^2 = 0.020$) outcome in mid-childhood. Additionally, there was no significant interaction effect (*F*(1,88) = 0.045, *p* = .832, $\eta_p^2 < 0.001$). All these results were confirmed when including Phase as a covariate in the ANOVA models (ASD: *F*(1,87) = 1.790, *p* = .184, $\eta_p^2 = 0.020$; ADHD: *F*(1,87) = 1.351, *p* = .248, $\eta_p^2 = 0.015$; ASD*ADHD: *F*(1,87) = 0.066, *p* = .798, $\eta_p^2 < 0.001$).

No significant associations were found between mean peak look duration and the SRS ($\beta = -0.003$, SE = 0.002, p = .181; with Phase as covariate: $\beta = -0.003$, SE = 0.002, p = .174) or Conners ($\beta = 0.004$, SE = 0.003, p = .176; with Phase as covariate: $\beta = 0.003$, SE = 0.003, p = .243) total *t* scores.

Discussion

The focus of this study was to develop a new framework for assessing how infant metrics reflecting emerging components of cognition might relate to different susceptibility and outcome profiles and how they can be used to study specificity of developmental trajectories, and thereby to evaluate whether they partially fulfil criteria for endophenotypes. As a proof-of-principle, we looked at early attention in the pathway to ASD and ADHD in infants considered at elevated likelihood of ASD and ADHD because of the presence of these conditions in first-degree family members. A series of analyses were conducted to investigate the relationship between familial and genetic liability factors, looking behavior in a face pop-out task recorded with eye-tracking at 14 months of age and later behavioral signs of the two neurodevelopmental conditions. Longer peak look duration at the face was found in infants with elevated polygenic score for ADHD, but not ASD. Further, longer peak look duration at the face in infancy was significantly associated with increased severity of ADHD traits in mid-childhood, while a weaker association was found with later ASD traits.

Overall, these findings suggest that peak look duration at the face amongst distractor items at the beginning of the second year of life should be further investigated as a specific developmental endophenotype of ADHD, as it is linked to genetic factors and to later traits associated with a clinical condition (Iacono et al., 2017). Further work should now explore whether it further co-segregates with categorical diagnosis of ADHD, and whether it is elevated in categorically unaffected siblings of children with ADHD as it is in typically developing children with an older sibling with ASD (Webb et al., 2010). The statistical models used in the present study provided no evidence of an additive or multiplicative effect of ASD, indicating that the presence of liability or emerging traits of both conditions was not predictive of atypical looking behavior to faces more than the effects of liability and traits of ADHD alone. However, there was also a marginally significant association between early peak look to faces and later

elevated ASD traits categorically (though not dimensionally, and the categorical effect was only significant when Phase was controlled). Below we present further considerations on the results obtained in this study and discuss possible models for the development of psychopathology arising from combining different type of data and multiple observations across childhood.

Polygenic effects

To validate a measure as an endophenotype, it is crucial to verify that it not only reflects increased familial liability for a clinical condition, but it also has a molecular genetic basis (Iacono et al., 2017). To this aim, we tested whether polygenic scores for ASD and ADHD explained any of the variance seen in our candidate developmental endophenotype, peak look duration at the face at 14 months of age. Polygenic scores, in which the effects of genotypes at many locations across the genome are summed, are increasingly used to query the genetic architecture of psychological traits and their correlates, where many genes of very small effect are responsible for heritability (Plomin, 2013). To our knowledge, no studies have investigated polygenic contributions to infant behavioral endophenotypes. However, there is suggestive evidence that polygenic scores for psychiatric conditions are significantly associated with neuroanatomical markers of atypical development in infants (Cullen et al., 2019) and with continuous phenotypes relying on social attention skills (Warrier et al., 2018) and cognitive test scores (Hagenaars et al., 2016) in childhood. Taken together, these and our findings suggest that characterization of genetic liability in (necessarily smaller) deeply phenotyped prospective longitudinal cohorts will be a powerful way in which to explore the developmental paths to neurodevelopmental and psychiatric conditions.

The present results demonstrated that polygenic contribution to our candidate developmental endophenotype was highest when considering common variants associated with ADHD. The base GWAS used for ADHD polygenic score calculation (Demontis et al., 2019) is larger (by ~700 cases and ~6,000 controls) than the one currently available for ASD (Grove et al., 2019). Moreover, while a polygenic score obtained from the ASD GWAS predicts 2.45% of the variability in the ASD clinical phenotype (Grove et al., 2019), the ADHD polygenic score explains around 5.5% of the variance in categorical diagnosis of ADHD (Demontis et al., 2019) in large populations. Thus, it is possible that the present result simply reflects the greater predictive power of a polygenic score obtained from the ADHD GWAS summary statistics, rather than indicating genetic specificity. It will be important to confirm whether the variance in peak look duration explained by the ASD polygenic score increases as larger discovery GWASes for ASD are reported and more powerful polygenic scores emerge (Anney et al., 2017; Geschwind & Konopka, 2009). Further, it should be noticed that GWASes capture common genetic contributions to clinical conditions identified in adult populations, which might not necessarily be informative of developmental effects.

In the main analyses looking at genetic liability as a categorical variable, we found that being in the top quartile of the distribution for ADHD polygenic score was significantly associated with peak look duration. Further, when examining the linear association between polygenic score and the continuous endophenotype obtained in the score construction (section 2 of the Supplementary Materials), we saw that the aggregate effect of variants known to be associated with ADHD predicted maximum

1.7% of the variance in peak look duration at the face in the BASIS infants. This effect is undoubtedly very small in absolute terms, and is unlikely to have clinical utility. However, if put in the context of similar research, the amount of variance explained is higher than that observed in studies using polygenic scores to predict ASD-relevant continuous traits tested during childhood in large cohorts. For example, an ASD polygenic score predicted 1.3% of the variance in autistic traits at 8 years of age (St Pourcain et al., 2018) in a sample of 5,553 children. A polygenic score for cognitive empathy significantly predicted 0.3% of the variance in the performance in a computerized test of "theory of mind" abilities in 4,577 13-year-olds (Warrier & Baron-Cohen, 2018). Our data suggest that a categorical approach comparing groups individuals at low and elevated genetic liability (i.e., the latter being defined as those at the tail of the polygenic score distribution, see also Li, 2019) could help identifying elements of atypical development that should be targeted by symptomatology-specific intervention (Jeste & Geschwind, 2014).

The effect of polygenic scores should not be considered an exhaustive evaluation of the genetic contributions to the examined developmental endophenotype. A more precise picture of genetic effects would be provided by assessing whether rarer genetic variants (including inherited and de novo copy number variants, or CNVs) also account for part of the variability seen in infant peak look duration. First-degree relatives of individuals with ASD have an increased rate of rare genetic variants and advanced paternal age is also associated with an increased risk of de novo mutations (Iossifov et al., 2012; Leppa et al., 2016); given the established role of de novo CNVs in liability to ASD, this is an avenue worth exploring in studies of infants at elevated likelihood of ASD. In the future, comprehensive genetic characterization of longitudinal infant cohorts would allow researchers to conduct a more powerful validation of developmental endophenotypes and provide more accurate information about the contribution of the full spectrum genetic factors underlying the emergence of psychopathology (Dick, 2018; Iacono et al., 2017).

Combining data to understand mechanisms

Examining the role of developmental endophenotypes in the pathway to neurodevelopmental conditions might inform on processes occurring during specific developmental periods when genetic factors have more powerful effects. Based on previous studies specifically examining infant peak look duration at faces (Hendry et al., 2018; Jones et al., 2017; Webb et al., 2010), we predicted that longer looking time in infancy would have been associated with behavioral characteristics of neurodevelopmental conditions later in childhood. Indeed, we found that longer peak look duration at 14 months of age related to both increased genetic vulnerability for ADHD and later ADHD clinical manifestations (Kao & Thomas, 2010). This is consistent with another study showing that infant siblings of children with ASD who later received a diagnosis of ADHD presented longer look durations at the screen during an eye-tracking task from three months of age compared to children without ADHD, and no change in duration across the first two years of life (Miller, Iosif, Young, Moore Hill, & Ozonoff, 2018). Thus, longer peak look durations in infancy could reflect genetically driven atypicalities of brain structure or function resulting in domain-general problems which affect sensory processing and attentional control often seen in individuals with ASD and ADHD (Gliga, Jones,

Bedford, Charman, & Johnson, 2014; Piven, Elison, & Zylka, 2017; Polderman et al., 2013).

Indeed, hypoactivation of brain networks involved in attention and executive functioning has been consistently reported by functional magnetic resonance imaging (fMRI) studies in children and adults with ADHD (Cortese et al., 2012). In line with the idea that longer look durations relate to emerging difficulties in executive functioning, in a previous study on a subset of the present cohort, change in peak look duration between 9 and 15 months significantly predicted later effortful control skills, whereby children with weaker effortful control at three years of age showed a smaller decline in peak look duration at faces with age in infancy (Hendry et al., 2018). A possible explanation for these findings could be that in the face pop-out task children with stronger attentional control became more successful (i.e., faster) in shifting the gaze away from the face stimulus and directing it to the other stimuli in the array in the second year of age. Similarly, in an independent typical-likelihood population, shorter duration of looks during infancy predicted better inhibitory control in adolescence (Sigman, Cohen, & Beckwith, 1997), providing further evidence of a possible link between early look duration profiles and emerging executive function (Conejero & Rueda, 2017). Of note, our toddlerhood analyses did not reveal a significant association between look duration at 14 months and inhibitory control at 2 years of age. As the effect of genotype in neurodevelopmental trajectories becomes stronger with age across childhood (Stergiakouli et al., 2017), our candidate developmental endophenotype might indeed reflect an effect of ADHD-related genetic variants that is only emerging later in development. A further critical question will be to address whether looking profiles may associate differentially with later ADHD across development. Indeed, previous work has linked shorter look durations measured in the first few months of life to later ASD (Wass et al., 2015) and ADHD (Papageorgiou, Farroni, Johnson, Smith, & Ronald, 2015). Developmental shifts in looking profiles are likely underpinned by the changing hegemony of the endogenous and exogenous attentional control systems over looking behavior (Colombo, 2001; Hendry, Johnson, & Holmboe, 2019). Within a developmental psychopathology framework, atypicalities may manifest in different ways at different ages. Statistical techniques designed to ask whether later effects are causally mediated through earlier effects will be important in this area.

When considering possible mechanisms linking early peak look duration profiles and ADHD it is worth notice that our results were specific to faces. Control analyses revealed that no significant relationships were observed when examining mean peak look duration at all the stimuli. Notably, infants generally looked longer at the face in the arrays presented in our study (see Supplementary Figures SM.1A and SM.1B). The face likely thus captured attention more strongly, which may have made it harder for infants to disengage from it to orient to distractor objects (see also Colombo et al., 2004). In fact, infants' arousal levels during alerting influence their ability to orient attention towards a stimulus among distractors (Kleberg, del Bianco, & Falck-Ytter, 2019). Thus, dysfunctional modulation in the alerting network may influence attentional capacity especially for faces, that are possibly over-arousing stimuli given their complex nature (Keehn, Müller, & Townsend, 2013; Senju & Johnson, 2009). Of note, an adult study reports dysregulation in the alerting systems and more distractibility due to conflicting stimuli in individuals with ADHD who also showed signs of mood disorder (Lundervold et al., 2011). We might have observed a similar pattern in our infants who later showed elevated ADHD traits using the face pop-out task. Moreover, aggregate effects of genetic variants involved in the dopamine/norepinephrine neurotransmission (regulating the alerting attention system, see Petersen & Posner, 2012) were specifically associated with severity of symptoms in the hyperactive/ impulsive domain in children with ADHD (Bralten et al., 2013). Thus, our findings could reflect ADHD-related atypicalities in the alerting system due to genetic factors that lead to difficulties in disengaging from the face to direct attention to competing stimuli. Further investigations on the role of the alerting system in individuals at elevated genetic liability for ADHD should include multiple neurocognitive measures to disentangle the different aspects of selective attention involved in the developmental endophenotype analyzed in the current study (Beauchaine & Constantino, 2017; Hommel et al., 2019).

This proof-of-principle study could help us to shed light on the overlap and specificity of developmental pathways to ASD and ADHD. In our sample, we found a high correlation between dimensional levels of ADHD and ASD traits at age 6 years (see Supplementary Figure SM.7), in line with previous reports (Chien et al., 2017; Shephard et al., 2019; Stergiakouli et al., 2017). However, while overlap of behavioral profiles is seen in mid-childhood, our results revealed that atypical look duration at the face among distractors is associated with later ADHD, while the link with later ASD is less strong (though possibly confounded by cohort-specific differences). This pattern of results indicates that our candidate developmental endophenotype could be more closely involved in the development of ADHD profiles. The fact that we saw little overlap between groups defined for the four levels of analysis (i.e., familial liability, genetic liability, toddler temperament traits, and mid-childhood clinical traits) indicates that in our sample elevated genetic liability for ADHD did not necessarily lead to high levels of ADHD traits in midchildhood. Indeed, individual developmental paths result from cascades of processes interacting across childhood (Marechal et al., 2007) and timing of genetic and environmental influences determines the effect of their contribution to trajectories over the course of development (Panchanathan & Frankenhuis, 2016). In one of their models of the developmental emergence of behavioral symptoms of ASD, ADHD and co-occurrence of the two conditions, Johnson et al. (2014) hypothesized that common susceptibility factors generate common adaptive processes that, depending on the developmental periods in which they are activated, produce condition-specific outcomes (Johnson et al., 2014). The approach proposed in this study could be further expanded leveraging data collected at multiple time-points within infant-sibling studies to explore longitudinal changes in the contribution of developmental endophenotypes to neurodevelopmental conditions.

Another of the models proposed by Johnson et al. (2014) assumes that, while susceptibility factors as well as early signs that precede symptoms are condition-specific, the relation between these and future outcome depends on the presence of general protective factors. Thus, either ASD, ADHD or overlapping symptomatology might emerge depending on the interaction with a domain-general protective factor. The proposition that our candidate endophenotype could reflect individual differences in executive functioning could be interpreted according to this model. In fact, Johnson (2012) theorized that executive function skills have a protective value across neurodevelopmental conditions, as individuals with strong executive function skills might be better able to compensate for early neural atypicalities related

to presence of susceptibility factors (Johnson, 2012). Indeed, although peak look duration was specifically related to polygenic risk scores for ADHD and not ASD, the relation with midchildhood traits of ASD was also significant if Phase was controlled. These findings provide preliminary evidence that should encourage future research to specifically test whether executive function skills mediate between ADHD-specific genetic liability factors and later broad neurodevelopmental traits.

Taken together, our results suggest that longer peak look duration at the face in infancy is a promising developmental endophenotype of ADHD, possibly reflecting enhanced vulnerability in early visual attention due to ADHD-related genetic factors that might affect alerting and/or executive function and contribute to the consolidation of ADHD-related behavioral features (Johnson et al., 2014). As we showed in this proof-of-principle, investigating the relationship between early signs of atypical behavior, molecular genetics data and later behavioral traits might advance our knowledge on mechanisms underlying neurodevelopmental conditions.

What is familial liability?

Our methodological approach for this analysis might not be very sensitive in capturing the different aspects that contribute to familial liability effects. In the present study, "familial liability" was measured as the presence of ASD and/or ADHD symptomatology in one of the first-degree family members reported by parents. While this approach has been widely used to obtain a proxy of increased genetic predisposition to psychopathology, it does not allow us to disentangle how different elements of the familial environment of the individual contribute to shaping their developmental trajectory. Individuals within the same family share not only part of their DNA sequence, but also the same rearing and socioeconomic environment. While examining the relationship between developmental endophenotypes and the presence of diagnosis in first-degree family members could serve as initial step of analysis, considerations on our results suggest that future investigations should aim to disentangle the different factors contributing to or confounding the effect of bio-ecological contexts underlying familial liability.

Differently from previous reports analyzing overlapping cohorts of Phase 1 and 2 participants (Elsabbagh et al., 2013; Hendry et al., 2018), in our study we did not find evidence for an association between familial liability for ASD and peak look duration at the face in a face pop-out task in the second year of age. However, we found that familial liability for ADHD was associated with the same measure. This result was not robust to including Phase as a covariate in the analysis nor when examining only the Phase 3 sample (which was the only cohort with individuals classified as having familial liability for ADHD but not ASD). This indicates that the observed result might primarily derive from having familial liability for the two neurodevelopmental conditions in the older sibling. Of note, recurrence for these neurodevelopmental conditions within families can vary by degree of relatedness (see Franke et al., 2012; Sandin et al., 2015). In fact, parental nonshared genetic variants (Kong et al., 2018), indirect effects of parental genome (Wertz et al., 2019) as well as parent-sibling relationships (Oliver & Alison, 2018) can have specific effects on the offspring's psychological traits. Future analyses should aim to study each element specifically to deeply understand whether any of these play an additional role that complement the effect of aggregate polygenic variation.

Limitations and further considerations for future research

A first challenge of this project was to reduce differences between Phases when defining familial liability groups. Our choice was to exclude the participants for whom we had no recent parent-report information on the presence of ADHD traits in the family, if no questionnaire on ADHD was available for the older siblings. This indeed led to the exclusion of a potentially informative subset of the sample and introduces additional risk of selection bias in our cohort (Wolke et al., 2009). Moreover, for one of the cohorts (Phase 3), our recruitment criteria were based on the presence of one of the two clinical conditions in the individual's parent and/or an older sibling. As recurrence might change by degree of relatedness and different mechanisms be involved in this process, as discussed above, future studies aiming to investigate these should consider eliminating or controlling for this difference. Using registries of routinely collected health data in large-scale cohorts might help to understand family-level differences and to identify potential confounders when examining effects of familial liability (Fearon, 2019).

In the present study, to have a consistent approach when evaluating ASD and ADHD-related liability and traits using data from different sources, we applied a categorical approach dichotomizing continuous variables used to measure the degree of ASD and ADHD liability/symptomatology. While pre-defined thresholds for ASD and ADHD clinical characterization exist for SRS and Conners total t scores, which were used to assess traits at age 6 years, there were no previous indications from normative samples for condition cut-offs for the polygenic and ECBQ scores. Therefore, we assigned, for each of the polygenic and ECBQ scores, value of 1 to ASD and ADHD dummy variables for individuals in the extreme quartile of the distribution. This approach allowed us to obtain a discrete number of individuals in each group and to use a unique method to define elevated genetic and behavioral burden for neurodevelopmental conditions. However, our quartile thresholds were based on all available BASIS data of each specific measure and are necessarily relative to the current sample. Given that the BASIS sample is mainly composed by individuals at elevated likelihood of ASD and/or ADHD, a replication on a population-based sample would be ideal to validate our results.

Another limitation of the present study is that clinical ASD and ADHD diagnosis was not available for a proportion of the participants. While recent revisions of the endophenotype concept suggested that examining relationships with dimensional transdiagnostic traits could provide more generalizable information on the role and clinical utility of candidate developmental endophenotypes (Beauchaine & Constantino, 2017; Iacono et al., 2017), a validation based on DSM diagnosis, as required by the original framework (Gottesman & Gould, 2003), was not possible in the present sample. This limitation indicates that future work using designs with diagnostic outcome will be required before peak looking duration as a condition-specific developmental endophenotype can be verified.

Importantly, observations on looking behavior based on the face pop-out screen-based paradigm used in the present study cannot be directly interpreted as endogenous attention directed to people during social interactions. Wass (2014) found that individual differences in peak look duration recorded with eye-tracking from 11-month-old typically developing infants were consistent across static and dynamic screen stimuli but were unrelated to individual differences in looking behavior during free play with objects. Indeed, susceptibility to high luminance contrasts

and sudden changes in stimulus onset-offset may trigger individual differences on screen-based tasks, but are not relevant in more naturalistic context. In the latter, the complexity of the visual scene might have a different impact to looking behavior compared to the limited number of uncontrolled distractors in screen-based tasks (Wass, 2014). These considerations illustrate that in future research it will be important to further investigate to what extent the measures selected as candidate developmental endophenotypes of neurodevelopmental conditions reflect responses obtained in ecologically valid contexts. Importantly, peak look duration differed by Phase and interpreting the effect of Phase is complicated in the BASIS sample. As explained in the Supplementary Methods section 4, Phases differed in the ratio of individuals with familial history for the conditions as well as in some aspects of the face pop-out task, and on the visit protocol the pop-out task was embedded. In this study, we considered as "robust" the results that were significant with and without the inclusion of Phase as a covariate. While combining cohorts in order to obtain large sample sizes may be advantageous to obtaining sufficient power and generalizability for the study of endophenotypes (Dick, 2018), this challenges researchers in finding ways to deal with between-cohort differences.

Accuracy and precision of eyetracking data were only recorded in the Phase 3 sample, but show that the quality of at least this proportion of the data is sufficient for the metrics calculated (see Supplementary Figure SM.9). While these metrics are important when interpreting the results of AOI analyses, we believe that the face pop-out task is relatively protected against spatial error for two reasons. First, the stimuli were large ($\sim 3.5^{\circ}-9^{\circ}$) and arranged in an annular array, with a minimum separation (between closest edges) of $\sim 3.5^{\circ}$. Even in cases of particularly poor calibration, accuracy drift of this magnitude would be substantial and is not expected. Second, the arrangement of each AOI within the annular array was balanced across slides. The influence of systematic spatial error should therefore not bias the results toward any particular AOI once averaged across all trials.

Conclusions

The present study combines three different cohort datasets of eyetracking measures as well as genotype data and parent-report questionnaire data for over 300 infants with and without a firstdegree family member with ASD or ADHD. We found that early alterations in visual attention, represented by longer look durations at face images among other items at 14 months of age, may lie on the path from genetic liability for ADHD to later traits of this condition, and that the early part of this developmental trajectory is not shared with ASD. Thus, a phenotype previously noted in elevated-likelihood infants as a group related to genetic risk for ADHD and later ADHD traits, although this emerged only by looking at symptoms in mid-childhood. This proof-of-principle study highlighted the importance of measuring multiple traits and having long-term follow-up data to uncover the role of developmental endophenotype on the trajectory to psychopathology. Future studies should use neurocognitive marker tasks (Beauchaine & Constantino, 2017) and longitudinal models (Dick, 2018; Fearon, 2019; Johnson et al., 2014) to evaluate the relationship between domain-general processes and early signs of divergent developmental trajectories.

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Conflict of Interest. The authors declare no conflict of interest

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