# **Supplementary Information**

# Methods

### GeoPref eye tracking test

Eye tracking was conducted using Tobii software (Tobii Studio and Tobii Pro Lab), and fixation data were collected using a velocity threshold of 0.42 pixels/ms (Tobii Studio Tobii Fixation Filter) or 0.03 degrees/ms (Tobii Pro Lab Tobii IV-T Fixation Filter). Percent fixation to dynamic social images was used as an index of social visual attention and was computed by dividing fixation duration within an area of interest drawn around the dynamic social images by the total fixation duration across the entire video. In order to control for spatial biases, spatial location of stimuli presentation (left/right) was randomly assigned across subjects. A total of 28 different geometric/social scenes of variable duration (0.8–3.7 seconds) were presented and lasted 62 seconds.

Of the total 86 subjects with resting-state fMRI data, 65 (32 ASD/33 non-ASD) had moderate or good eye tracking performance and total looking time > 50%. The other 21 subjects either failed to complete the eye tracking session, or the data quality was poor. For the demographic characteristics and clinical testing scores in ASD and non-ASD subjects with and without successful eye tracking data, see **Table S2**. Fifty-nine of these 65 subjects completed the GeoPref test prior to the fMRI scan, and 6 completed the test after the fMRI scan.

### **ME-ICA procedure**

Multi-echo principle component analysis (ME-PCA) was then applied as a dimensionality reduction technique before application of ME-ICA denoising. ME-ICA takes the ME-PCA reduced data and identifies independent components (ICs) that are then scored by pseudo-F statistics rho ( $\rho$ ) and kappa ( $\kappa$ ), which denote degree of non-BOLD and BOLD-related signal weightings based on TE-dependence analysis [2,3]. ICs with high rho ( $\rho$ ) and low kappa ( $\kappa$ ) are components of non-BOLD related signal and are removed as part of the denoising process, while ICs with low rho ( $\rho$ ) and high kappa ( $\kappa$ ) scores are components with high levels of BOLD-related signal and are retained. This ME-ICA denoising procedure has been shown to be effective at

substantially increasing temporal signal-to-noise ratio (tSNR) and successfully removes a large proportion of the head-motion related and other complex non-BOLD artifacts [2–6] and vastly improves test-retest reliability of functional connectivity measures [7].

#### Group comparisons of head motion

Head motion was quantified via framewise displacement (FD) [8]. The group average FD was minimal (mean FD < 0.11 mm) in both ASD (mean  $\pm$  SD = 0.081  $\pm$  0.036 mm, range 0.031– 0.19 mm) and non-ASD subjects (mean  $\pm$  SD = 0.11  $\pm$  0.1 mm, range 0.038–0.58 mm). There were no significant group differences between ASD and non-ASD subjects (t(84) = -1.57, p = 0.13) in two-tailed two-sample *t*-tests.

#### **Characteristics of Mullen and Vineland subtests**

Mullen expressive and receptive language tap different aspects of language abilities, with expressive language tapping speaking and receptive language tapping auditory comprehension [9]. As expressive language is related to social skills [10,11], Vineland communication which taps language abilities including both expressive and receptive language and written language is an interaction of language and social constructs [12]. Vineland socialization indexes social functioning within age-normed contexts.

#### Calculation of Mullen adjusted age equivalent scores

For Mullen T scores, 23.5% of young children with ASD (12 out of 51) in our study performed at levels that were below 20, and in order to enhance accuracy for brain-behavior correlations, we used the age equivalent adjusted language scores to reflect their ability, rather than artificially assigning all such children a score of 20. Specifically, we converted all young children's raw scores to Mullen age equivalent values in months and then divided that by the child's chronological age at testing and multiplying by 100. Thus, a 20 month old child with a Mullen age equivalent of 20 months would have a score of 100, while a 40 month old child with the same Mullen age equivalent of 20 months would have a score of 50.

Group/Contrast	Behavior (scores)	Region	Peak MNI coordinates			Cluster size			
			X	у	Z	(voxels)			
Left temporal ROI									
ASD subjects	Vineland communication	Left cuneus	-15	-67	3	155			
Right temporal R									
Non-ASD vs. ASD subjects	Mullen age equivalent adjusted expressive language	ACC, DLPFC	8	40	16	211			
		Right LPC	35	-60	36	95			
Non-ASD vs. ASD subjects	Vineland communication	Right LPC	32	-60	36	142			
Non-ASD vs. ASD subjects	Vineland socialization	Right LPC	35	-60	36	287			
		Right cerebellum	22	-50	-38	242			
		ACC, DLPFC	8	40	19	197			
Non-ASD subjects	Mullen age equivalent adjusted expressive language	ACC, DLPFC	8	40	16	698			
		Right LPC	25	-57	46	111			
Non-ASD subjects	Vineland communication	ACC, DLPFC	8	40	16	145			
		Right cerebellum	18	-50	-38	113			
		Right LPC	32	-60	40	79			
Non-ASD subjects	Vineland socialization	ACC, DLPFC	8	40	-16	584			
		Right LPC	32	-60	40	234			
		Right cerebellum	22	-47	-38	225			
ASD subjects	Mullen age equivalent adjusted expressive language	Left precuneus	-5	-54	30	78			

## Table S1. Clusters showing significant connectivity-behavior relationships.

Note: Clusters were corrected for multiple comparisons with voxel-wise p = 0.001 and cluster size > 63 voxels (cluster-wise p < 0.05, FWE corrected). Abbreviations: ACC, anterior cingulate cortex; DLPFC, dorsolateral prefrontal cortex; LPC, lateral parietal cortex.

	With ET test		Without ET test		With vs. without ET test							
	Mean (SD)	Range	Mean (SD)	Range	t value	<i>p</i> value	Conen's d					
ASD subjects												
Sample size (M/F)	25/7		16/3		$\chi 2 = 0.03$	0.87						
Age at MRI scan, months	28.94 (9.17)	14–55	27.89 (9.46)	16–52	0.385	0.703	0.112					
Age at clinical tests, months	27.62 (8.12)	12–45	27.33 (9.63)	15-51	0.111	0.912	0.034					
ADOS social affect	14.12 (3.55)	6–20	13.47 (3.79)	8–19	0.607	0.548	0.179					
ADOS restricted and repetitive behavior	5.38 (2.01)	2–9	5.84 (1.8)	3–8	-0.856	0.397	0.241					
ADOS Total	19.5 (4.79)	8–27	19.32 (4.88)	11–27	0.131	0.896	0.038					
Mullen visual reception	37.62 (13.41)	10–63	34.74 (13.9)	1–58	0.727	0.472	0.213					
Mullen fine motor	37.81 (13.19)	20-60	38.74 (12.07)	20–57	-0.255	0.8	0.072					
Mullen receptive language	33.25 (14.37)	11–59	25.47 (13.99)	1–56	1.9	0.065	0.546					
Mullen expressive language	33.91 (16.61)	7–63	23.89 (14.82)	1–56	2.229	0.031	0.627					
Mullen early learning composite	75.59 (19.9)	42–115	65.37 (20.03)	29–105	1.767	0.085	0.513					
Vineland communication	82.81 (19.24)	35-126	79.42 (11.77)	55–99	0.781	0.439	0.201					
Vineland daily living skills	87.44 (13.02)	63–116	84.68 (9.51)	68–100	0.868	0.39	0.232					
Vineland socialization	85.88 (11.94)	57-108	77.79 (10.98)	60–97	2.461	0.018	0.697					
Vineland fine motor	94.84 (10.05)	74–117	85.78 (8.22)	74–105	3.448	0.001	0.96					
Vineland adaptive behavior composite	83.84 (12.69)	58–111	78.58 (7.79)	67–94	1.835	0.073	0.472					
Non-ASD subjects												
Sample size (M/F)	21/12		0/2		$\chi 2 = 1.08$	0.3						
Age at MRI scan, months	25.12 (8.03)	14-46	38.5 (7.78)	33–44	-2.357	0.231	1.667					
Age at clinical tests, months	26.21 (7.84)	13–37	28.5 (17.68)	16-41	-0.182	0.885	-0.275					
ADOS social affect	3.06 (1.64)	0-8	1.5 (0.71)	1–2	2.711	0.13	0.965					
ADOS restricted and repetitive behavior	1.61 (1.52)	0–5	0.5 (0.71)	0-1	1.955	0.217	0.737					
ADOS Total	4.67 (2.15)	0–9	2 (1.41)	1–3	2.498	0.194	1.254					
Mullen visual reception	54.3 (12.11)	30-80	47.5 (0.71)	47–48	3.14	0.004	0.57					
Mullen fine motor	49.85 (8.34)	35–67	50 (9.9)	43–57	-0.021	0.986	0.018					
Mullen receptive language	47.24 (11.84)	23–73	37 (2.83)	35–39	3.566	0.022	0.878					
Mullen expressive language	44.09 (12.14)	25-70	27 (5.66)	23-31	3.778	0.086	1.425					
Mullen early learning composite	98.03 (16.57)	71–130	81.5 (7.78)	76–87	2.662	0.145	1.009					
Vineland communication	96.67 (10.69)	70–122	89.5 (10.61)	82–97	0.927	0.51	0.67					
Vineland daily living skills	96.58 (10.64)	76–122	91.5 (17.68)	79–104	0.402	0.755	0.465					
Vineland socialization	96.67 (9.9)	79–126	95.5 (12.02)	87–104	0.135	0.914	0.117					
Vineland fine motor	98.25 (9.8)	71–115	101 (1.41)	100-102	-1.374	0.194	0.285					
Vineland adaptive behavior composite	95.18 (9.58)	79–128	91 (15.56)	80–102	0.376	0.769	0.426					

Table S2. Demographic characteristics and clinical testing scores in ASD and non-ASD subjects with and without successful eye tracking (ET) test.



**Figure S1.** Regions of interest (ROIs) for the functional connectivity analysis. The upper row shows the original ROIs mapped onto the adult brain, and the lower row shows the transformed ROIs with linear registration mapped onto the 2-year-old toddler brain. The ROIs, i.e., left and right temporal regions, were extracted from the Neurosynth 'language' meta-analysis map (<u>https://neurosynth.org/</u>).

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