**Prenatal valproic acid-exposed autism marmosets increase**

**mutual gaze and reduce inter-individual distance during**

**dyadic social interactions**

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# Abstract

Autism spectrum disorder (ASD) is characterized by difficulties in social interaction. While most assessments of ASD remain individual-centric, dyad-level evaluation may reveal features not apparent in individual profiling. We examined dyadic coordination in a non-human primate ASD model under experimentally controlled yet naturalistic conditions. Markerless pose estimation was used to quantify frame-by-frame gaze behavior and inter-individual distance during first encounters between unfamiliar common marmosets. Dyads with a prenatal valproic acid-exposed animal and an unexposed partner (VPA-UE) were compared with unexposed controls (UE-UE). VPA-UE pairs showed a higher proportion and greater number of mutual gaze episodes, whereas overall gaze shift was similar across groups. VPA marmosets made fewer unreciprocated looks; however, when the partner looked at them, they more often returned the look within 1 s, indicating heightened gaze reactivity. VPA-UE dyads maintained shorter inter-individual distances, and the closer proximity destabilized mutual gaze more strongly than in UE-UE dyads. These findings indicate a distinct dyadic-coordination pattern in VPA-UE pairs: rapid responsiveness combined with reduced tolerance for close spacing, consistent with distance-dependent differences rather than a global deficit in social motivation. This dyad-centric markerless framework provides scalable, ecologically grounded measures and intervention targets that leverage intact responsiveness while accommodating altered spatial coordination.

# Introduction

Autism spectrum disorder (ASD) is characterized by persistent difficulties in social interaction and communication[1,2], yet these difficulties are seldom captured by a single behavior measured in isolation. Rather, they emerge from subtle misalignments in how two individuals coordinate gaze, responses to partner cues, and interpersonal distance during face-to-face encounters[3]. A large body of research on ASD has documented atypical gaze patterns, including reduced eye contact, diminished initiation of mutual gaze, and, in some cases, context-dependent atypically persistent gaze[4,5], as well as heterogeneity in preferred interpersonal distance[6,7]. However, most of this evidence comes from single-participant paradigms that measure individual responses to static faces or virtual agents[8,9], limiting the ability to capture the interactive nature of ASD-related social challenges[10].

Recent theoretical work in social neuroscience emphasizes that social behavior is fundamentally dyadic: it arises from continuous, mutual adjustment between interaction partners rather than solely from independent processing within a single individual[3]. This framework, often described as the "double empathy problem"[11], argues that coordination depends on the abilities and expectations of both partners[12,13]. For ASD, this implies that difficulties may lie not only in individual perceptual responses but also in how two agents dynamically align their gaze and movement patterns during real encounters. Only a handful of studies have directly measured mutual gaze dynamics in ASD. Recent dual eye-tracking studies, including Tönsing et al.[14], which demonstrated altered initiation and termination of eye contact during real conversations, suggest that the temporal coordination of gaze itself may be a key locus of social difficulty.

Despite the theoretical importance of dyadic coordination, empirical paradigms allowing two

individuals to respond freely to each other remain scarce. Most human studies restrict bodily

movement, impose scripted conversation, or rely on head-mounted eye trackers that can constrain

natural interaction[9,10,15]. As a result, it remains largely unknown how ASD-related misalignments

in gaze and distance unfold when both individuals can spontaneously approach, withdraw, orient,

and reorient their attention. A paradigm that preserves ecological validity while retaining

experimental control is therefore essential to uncover the real-time dynamics of alignment and

misalignment.

Non-human primate models offer a tractable bridge between ecological validity and experimental

rigor[16–19]. The common marmoset (*Callithrix jacchus*), in particular, exhibits a rich repertoire of

social behaviors, including coordinated vocal communication[20–22], cooperative breeding[23–25], and

frequent face-directed gaze[26], that closely parallel core aspects of human social interaction.

Marmosets routinely direct their gaze toward conspecific faces and bodies[26,27], and unlike many

other primates, direct eye contact is generally tolerated and often embedded in affiliative

interactions[28]. Consequently, they can extract detailed social information from others' actions and

interactions[29,30]. Prenatal exposure to valproic acid (VPA) produces a validated marmoset model

of ASD, with alterations in social engagement, repetitive behavior, inequity aversion, and

hormonal profiles[31–34]. Although marmosets can be trained for complex tasks, training-based

procedures often exclude individuals who do not reach criterion, reducing analyzable samples and

risking selection bias. A paradigm requiring minimal pre-training and allowing natural movement

is therefore essential for capturing spontaneous social coordination.

Here we established a minimally constrained, naturalistic dyadic interaction paradigm for first-

encounter interactions between two marmosets, pairing a VPA-exposed target with an unexposed

partner (UE). Using overhead video recording combined with frame-by-frame DeepLabCut

(DLC) tracking[35,36], we quantified fine-grained gaze direction and moment-to-moment changes

in inter-individual distance. By comparing VPA-UE dyads with UE-UE controls, we examined

whether VPA-exposed marmosets exhibit ASD-like signatures in the dynamics of mutual gaze

and distance regulation. This approach enabled us to evaluate both short-timescale responsiveness

and longer-timescale spatial positioning within the same interaction, describing social difficulties

not as uniform deficits but as distance-dependent alterations in dyadic coordination.

# Results

We investigated whether prenatal VPA-exposed ASD model marmosets display distinctive gaze patterns when encountering an unfamiliar conspecific for the first time, and further examined whether their typically developing partners also exhibited altered gaze patterns in this interactive context. In a first-encounter test with a transparent barrier allowing visual and auditory contact but preventing physical interaction (Fig. 1a), either a VPA-exposed or an unexposed (UE) marmoset (n = 10 per group; Supplementary Table S1) was placed in a rectangular arena as the target individual and paired with an unfamiliar, same-sex UE partner confined in a circular container positioned to the left or right of the target arena (Fig. 1a). Head positions (forehead, left ear, and right ear) were tracked frame by frame using DLC (Fig. 1b), and the gaze angle ($\theta$) was defined relative to the vector pointing toward the partner's forehead (Fig. 1c).

Across groups, the frame-wise frequency distributions of gaze angles showed a pronounced peak at 0°, indicating that looking directly at conspecifics was the most common orientation during the trial (one-sample V tests against 0° on pooled frame-wise data, all $p < 0.0001$; Watson's $U^2$ values $\approx$ 370–1587; Fig. 1d). Total gaze shift, defined as the cumulative sum of absolute frame-to-frame changes in gaze angle over the trial, did not differ significantly between groups, indicating that the way subjects oriented and redirected their gaze during the trial did not differ between groups (*linear mixed model*, LMM: $\beta$ = -299.8 ± 1208.8, t(18) = -0.248, $p = 0.807$ for target individuals, Mann-Whitney U test: U = 117, $p = 0.385$ for partners; Fig. 1e).

**Fig 1.** Experimental setup and quantification of gaze angle and gaze shifts. (**a**) Overhead view of the experimental apparatus. The target individual (either VPA or UE) was placed in a rectangular arena, and an unfamiliar partner was placed in a circular container positioned to the left or right of the target arena. The partner's position was counterbalanced across trials. The partition between the two individuals was lifted upward by the experimenter at the start of the experiment, enabling them to see each other. (**b**) Head orientations of both subjects were tracked using DLC: forehead (red), right ear (green), and left ear (purple). Rostral-caudal orientation is indicated by arrows. (**c**) The gaze angle (θ) was calculated as the angle between two vectors: one from the midpoint of the left and right ears to the forehead of the subject, and the other from the midpoint of the left and right ears to the forehead of the other conspecific. (**d**) Frequency (number of frames) distributions of gaze angles (θ) for all target individuals and their partners in the two groups. (**e**) Total gaze shift (deg) for the target individuals (left) and their partners (right), defined as the trial-wise sum of absolute frame-to-frame changes in gaze angle.

**VPA-UE pairs exhibit an elevated proportion of mutual gaze compared to UE-UE pairs**

When defining "looking at the conspecific" as a gaze angle ($\theta$) within ±30°, the proportion of time spent looking at the partner did not differ significantly between VPA and UE target individuals (LMM: $\beta$ = 4.76 ± 3.75, t(18) = 1.27, $p$ = 0.22; Fig. 2a). Among partners, the proportion was slightly higher in those paired with VPA target individuals, but the difference was not statistically significant (Mann-Whitney U test: U = 126, $p$ = 0.121; Fig. 2a). However, VPA target individuals exhibited more looking events than UE target individuals (LMM: $\beta$ = 12.27 ± 5.39, t(18) = 2.28, *$p$ = 0.0353; Fig. 2b). Interestingly, partners also looked more frequently when paired with a VPA target than with a UE target (Mann-Whitney U test: U = 134.5, *$p$ = 0.0282; Fig. 2b).

When "mutual gaze" was defined as both individuals simultaneously having gaze angles within ±10°, a more stringent criterion intended to isolate face-to-face orientation, VPA-UE pairs exhibited a significantly higher proportion of mutual gaze than UE-UE pairs (LMM: $\beta$ = 1.42 ± 0.63, t(18) = 2.23, *$p$ = 0.0385; Fig. 2c). Consistently, the number of mutual gaze events was also significantly greater in VPA-UE pairs compared with the controls (LMM: $\beta$ = 9.27 ± 3.59, t(18) = 2.58, *$p$ = 0.0189; Fig. 2d). These group-level differences were also apparent at the level of single sessions; representative dyadic gaze timelines from each pair are shown in Supplementary information (Supplementary Fig. S1). To characterize how mutual gaze ceased, we examined whether the target or the partner tended to terminate it. In both pair types, target individuals ended mutual gaze more often than partners, and the rate for target individuals was comparable between VPA and UE groups (Supplementary Fig. S2a).

**Fig 2.** VPA-UE marmoset pairs exhibit increased mutual gaze compared to UE-UE pairs. (**a**)
Proportion of time spent looking at the partner (gaze angle within ±30°) in target individuals (left) and
their partners (right). No significant differences were found between VPA and UE groups ($p = 0.298$)
and between the partners ($p = 0.121$). (**b**) Number of looking events during dyadic interaction. Target
VPA individuals exhibited more looking events compared with UE controls (*$p = 0.0353$), and their
partners also looked more frequently when paired with a VPA target than with a UE target (*$p =
0.0282$). (**c**) Proportion of mutual gaze (both individuals having gaze angles within ±10°) in UE-UE
and VPA-UE pairs. VPA-UE pairs showed significantly higher mutual gaze (*$p = 0.0385$). (**d**) Number
of mutual gaze events was significantly higher in VPA-UE pairs (*$p = 0.0189$). Statistical differences
were assessed using a linear mixed model (LMM) for repeated-measures data obtained from the target
individuals and the target-partner pairs, and the Mann-Whitney U test for independent measurements
from the partners. * = $p < 0.05$.

**ASD-model marmosets exhibit fewer one-sided looks and heightened gaze responses**

To further investigate the fine-grained dynamics of interactive gaze, we focused on the reciprocal relationship of looking and being looked at between target subjects and their partners (see Methods). One-sided looks were computed for each individual as the fraction of its looking events for which the other individual did not simultaneously orient toward it. The proportion of one-sided looks was significantly lower in VPA target individuals, while no difference was observed in partners (LMM: $\beta$ = -7.61 $\pm$ 3.42, t(58) = -2.23, *$p$ = 0.0299 for target individuals; Mann-Whitney U test: U = 91, $p$ = 0.308 for partners; Fig. 3a). We then examined gaze responses, defined as orienting toward the partner within 1 second after being looked at. VPA marmosets demonstrated a significantly higher proportion of rapid gaze responses compared with UE controls (LMM: $\beta$ = 8.803 $\pm$ 4.187, t(58) = 2.102, *$p$ = 0.0399; Fig. 3b). This heightened responsiveness was not observed in their partners (Mann-Whitney U test: U = 125, $p$ = 0.1405; Fig. 3b).

**Fig 3.** Prenatal VPA-exposed ASD model marmosets exhibit fewer one-sided looks and heightened gaze responses. (**a**) Proportion of one-sided looks (%). One-sided looking was defined as the fraction of one individual's looking events during which the other conspecific did not simultaneously orient toward it. VPA target individuals showed a significantly lower proportion of one-sided looks than UE controls (*$p = 0.0299$), whereas no difference was observed in partners ($p = 0.308$). (**b**) Gaze response within 1 s (%). A gaze response was defined as an event in which one animal oriented toward the other within 1 second after being looked at. VPA target marmosets exhibited significantly higher responsiveness compared with UE controls (*$p = 0.0399$), whereas no difference was observed in partners ($p = 0.1405$). Statistical differences were assessed using a linear mixed model (LMM) for repeated-measures data obtained from the target individuals and the target-partner pairs, and the Mann-Whitney U test for independent measurements from the partners. * = $p < 0.05$.

**VPA-UE pairs maintain shorter inter-individual distances than UE-UE pairs**

We next quantified inter-individual distance between the two subjects during the trial. As

illustrated by representative trajectories from a UE-UE pair and a VPA-UE pair, target individuals

in both conditions often occupied the side of the arena adjacent to the partner (Fig. 4a). To assess

spatial occupancy patterns more systematically, we generated two-dimensional heat maps of

target individuals' positions across the entire trial, which confirmed this side preference across

both groups (Supplementary Fig. S2b). However, despite this shared side preference, the median

target-partner distance was significantly shorter in VPA-UE pairs than in UE-UE pairs (LMM: $\beta$

= -85.15 ± 35.11, t(18) = -2.426, *$p$ = 0.026; Fig. 4b). When distances were computed with respect

to a fixed environmental reference (the midpoint of the partner-facing wall; Fig. 4c) rather than

to the other animal, no significant group differences were observed for target individuals or for

partners (LMM: $\beta$ = -2.06 ± 1.22, t(18) = -1.695, $p$ = 0.107 for target individuals; Mann-Whitney

U test: U = 83, $p$ = 0.104 for partners; Fig. 4d), indicating that the group effect was specific to

dyadic spacing rather than to the absolute positions of either individual. Additionally, gross

locomotor measures were comparable: neither total distance moved nor movement area differed

significantly for target individuals or for partners (all $p$ > 0.05; Supplementary Fig. S2c, d),

suggesting that the shorter target-partner distance in VPA-UE pairs is specific to dyadic spacing,

rather than reflecting group differences in general locomotor activity or arena-level occupancy.

To test whether this group effect depended on engagement state, we split frames by gaze state.

Outside mutual gaze (frames in which at least one individual's gaze angle fell outside ±10°), the

median target-partner distance was shorter in VPA-UE pairs than in UE-UE pairs (LMM: $\beta$ = -

2.294 ± 0.937, t(18) = -2.448, *$p$ = 0.025; Fig. 4e). During mutual gaze (both individuals within

±10°), the median dyadic distance did not differ between groups (LMM: $\beta$ = -1.988 ± 1.789,

t(15.956) = -1.112, $p$ = 0.283; Fig. 4f). Thus, the overall reduction in spacing for VPA-UE pairs

was primarily driven by periods without mutual gaze, rather than by the distance maintained

during mutual gaze itself.

To investigate the relationship between spatial positioning and gaze behavior, we examined how

inter-individual distance during mutual gaze episodes related to the time spent in mutual gaze. In

UE-UE pairs, no significant correlation was observed between mean distance during mutual gaze

and the percentage of time spent in mutual gaze (r = -0.038, *p* = 0.8449; Fig. 4g). In contrast,

VPA-UE pairs showed a significant positive correlation between these measures (*r* = 0.417, \**p* =

0.0217; Fig. 4g), indicating that when VPA-UE pairs maintained greater inter-individual distances,

they also spent proportionally more time engaged in mutual gaze.

**Fig 4.** VPA-UE pairs exhibit shorter inter-individual distance compared to UE-UE pairs. (**a**) Overhead

view of trajectories from representative trials of a UE-UE pair (top) and a VPA-UE pair (bottom).

Trajectories were reconstructed from the frame-by-frame forehead coordinates. (**b**) Violin plots

showing median target-partner distance (cm) during the trial. Distances were computed frame by frame

from the two individuals' forehead coordinates and converted to centimeters using arena calibration

(1 px = 0.02659 cm). VPA-UE pairs maintained significantly shorter inter-individual distances than

UE-UE pairs (*$p$ = 0.026). (**c**) Overhead schematic of the apparatus. The fixed point (black X) on the

partner-facing wall of the target arena served as a session-invariant reference and was defined as the

midpoint of that wall; a single coordinate was obtained by averaging across trials (x = 1089.98, y =

520.15). (**d**) Median distance (cm) from each individual's forehead to the fixed point, computed

separately for the target and the partner. Distances were converted to centimeters using spatial

calibration. Although differences did not reach statistical significance, both targets and partners tended

to be closer to the fixed point in VPA than in UE ($p$ = 0.107 for target individuals; $p$ = 0.104 for

partners). (**e**) Median target-partner distance outside mutual gaze, computed as in (b) but restricted to

frames in which at least one individual's gaze angle fell outside ±10° relative to the other. VPA-UE

pairs maintained shorter distances than UE-UE pairs (*$p$ = 0.025). (**f**) Median target-partner distance

during mutual gaze, defined as frames in which both individuals' gaze angles were within ±10° of

each other. No significant group difference ($p$ = 0.283). (**g**) Relationship between time spent in mutual

gaze and mean inter-individual distance during mutual gaze episodes. UE-UE pairs showed no

significant correlation (left; r = -0.038, $p$ = 0.8449), while VPA-UE pairs exhibited a significant

positive correlation (right; r = 0.417, *$p$ = 0.0217). Gray shading indicates 95% confidence intervals.

Statistical differences were assessed using a linear mixed model (LMM) for repeated-measures data

obtained from the target individuals and the target-partner pairs, and the Mann-Whitney U test for

independent measurements from the partners. * = $p < 0.05$.

# Discussion

Our findings reveal a specific pattern of dyadic coordination in a non-human primate model of ASD-like behavior, detectable only when the unit of analysis is the pair rather than the individual. VPA-UE dyads displayed a larger proportion and greater frequency of mutual gaze than UE-UE dyads, despite no group differences in overall gaze shifting. At the same time, VPA-exposed ASD marmosets showed fewer one-sided looks and, when they were looked at by their partner, a markedly higher probability of rapid (within 1 s) gaze responses. Spatially, VPA-UE dyads maintained shorter inter-individual distances than UE-UE dyads; this reduction was specific to dyadic spacing rather than to absolute positioning (no group difference in distance from a fixed environmental reference). When distances were parsed by gaze state, the group difference was evident outside mutual gaze but disappeared during mutual gaze. Moreover, only in VPA-UE pairs did the time spent in mutual gaze increase with greater dyadic distance, whereas UE-UE pairs showed no association. These results indicate a coordination profile that is highly contingent, swiftly responsive to a partner's cue, yet less tolerant of very close-range engagement. Rather than a blanket "deficit" in social motivation, the pattern suggests context-dependent constraints on how mutual engagement is initiated and sustained.

A central implication is that social interaction differences in ASD model animals may be mischaracterized if measured only as individual propensities without regard to the partner's simultaneous state. In our data, VPA target marmosets oriented toward their partners more often (Fig. 2b), but these looks were less likely to occur in isolation (reduced one-sided looking) and more likely to occur as contingent responses (Fig. 3a, b). Partners also altered their behavior: they looked more frequently when paired with a VPA target animal (Fig. 2b), indicating that the dyad's coordination emerges from both sides. This aligns with interaction-first accounts of social

difficulty, emphasizing that measurable differences often reflect dyadic contingencies rather than

stable individual traits[3,11,13]. From this perspective, VPA-UE dyads are not "less social"; rather,

they appear to occupy a different pattern, in which reciprocal coupling is strong at the sub-second

timescale, but close proximity destabilizes sustained engagement. Conceptually, such a regime

can generate the seemingly paradoxical combination of more frequent mutual-gaze onsets

alongside briefer or more fragile mutual-gaze episodes at short distances, reconciling heightened

moment-to-moment responsiveness with reduced tolerance for dense interactional load.

The spatial dynamics observed in our study add another layer of complexity to ASD-related social

behavior. VPA-UE pairs maintained significantly shorter inter-individual distances compared to

UE-UE controls, suggesting altered preferences for social proximity that may reflect differences

in personal space regulation[6,7,37]. Notably, the positive correlation between inter-individual

distance and mutual gaze duration specifically in VPA-UE pairs indicates that spatial and gaze

coordination are interdependent in VPA-UE dyads. This relationship suggests that when VPA

marmosets maintain greater physical distance, they may compensate by increasing visual

engagement, potentially representing an adaptive strategy to optimize social information

processing while managing proximity preferences[38,39]. Alternatively, overly close spacing during

mutual gaze may introduce aversive stimulation or discomfort in VPA-UE pairs, making sustained

visual engagement more difficult; however, the identity of the breaker (the individual who

terminates the mutual-gaze episode) did not differ between near- and far-distance episodes. These

effects were specific to dyadic spacing: distances to a fixed environmental reference did not differ

by group, and gross locomotor metrics, including total distance traveled, were comparable,

arguing against general activity differences as an explanation. Taken together, the data suggest

that for VPA-UE pairs, a small buffer of inter-individual space may function as a stabilizer that

enables the pair to capitalize on intact rapid responsiveness without tipping into destabilizing

overload.

A characteristic pattern emerged in the marmosets: they returned gaze rapidly when looked at, yet

disengaged quickly at very close distances, suggesting heightened sensitivity to being the target

of gaze and early avoidance of near face-to-face contact. In human ASD, difficulties in regulating

interpersonal distance are widely reported[6,37,40–42], with seemingly divergent findings of both

enlarged interpersonal space and tendencies to approach others too closely. In adults with ASD,

stop-distance paradigms often reveal larger preferred or comfortable distances than in controls,

accompanied by reduced heart-rate variability, consistent with elevated autonomic arousal and a

need for greater space[40,41,43]. At the same time, abnormalities in distance regulation are

heterogeneous, and some individuals prefer unusually close spacing[6,7,37]. In our dataset, VPA-UE

dyads were on average closer (Fig. 4b), yet mutual gaze was less stable at near distances (Fig. 4g).

This combination points to imprecise distance regulation and implies that maintaining an

appropriate buffer may be a prerequisite for stable mutual gaze. More broadly, our findings argue

against a simple lack of social motivation: VPA animals responded swiftly to partner cues and

frequently initiated mutual gaze, but they were less able to sustain it at near distances or for long

durations. This profile is consistent with accounts in which social interest is intact but processing

of dense social or sensory input is fragile[44,45]. It also accords with reports that ASD individuals

modulate eye contact depending on partner and context, as well as with the amygdala hyper-

arousal account of gaze avoidance[46,47].

The present approach demonstrates how pose-estimation-based tracking can recover fine-grained

contingency structure in naturalistic social exchanges. By quantifying head-based gaze proxies

frame by frame, we resolved who oriented first, how often one-sided versus reciprocal looks

occurred, and how quickly responses followed the partner's look. These measures extend beyond

static "time looking" metrics to capture the kinetics and symmetry of social coupling. Notably,

these dyad-centric metrics are partner-relative by design. That design choice exposes specificity:

the absence of group differences in distance to a fixed wall, together with the presence of robust

group differences in distance to the partner, clarifies that the observed effects concern relational

organization rather than absolute positioning. More broadly, the pipeline illustrates a path toward

standardized, scalable behavioral endpoints that are both ecologically grounded and analytically

tractable, providing an important bridge between experimental rigor and the reciprocal nature of

real social interaction.

Our study has several limitations that should be acknowledged. First, head orientation is a

validated but indirect proxy for eye gaze; brief eye-only deviations cannot be captured without

eye tracking[48]. Nonetheless, our ±10° mutual-gaze criterion and consistent geometric definitions

reduce ambiguity in classifying interactive looks. Second, the barrier apparatus restricts tactile

interaction and imposes a specific spatial affordance; while this control clarifies the visual channel,

future work should examine whether the same distance-dependent stabilization holds in fully open

encounters or in affiliative contexts that dilute arousal. Third, our paradigm examined initial

encounters between unfamiliar individuals, and it remains unclear whether similar patterns would

emerge in established relationships or repeated interactions. The marmoset model, while offering

valuable phylogenetic proximity and sophisticated social behaviors[17,26,31,32,49,50], may not capture

all aspects of human ASD presentation, particularly those involving language and complex

cognitive processes. Additionally, our analysis focused primarily on target individuals while

treating partners as typical controls, potentially overlooking important bidirectional effects that

could emerge with more detailed partner characterization. The temporal scope of our observations

was also limited to initial interaction periods, and longer-term dynamics or habituation effects

remain unexplored.

In sum, the present study reframes ASD-linked social differences in marmosets as an altered

pattern of dyadic coordination rather than a simple decrease in engagement. The therapeutic

implications of our findings center on dyadic interventions that recognize social difficulties as

emerging from interactive dynamics rather than individual deficits alone[11–13]. Current

interventions often focus on training individuals with ASD to modify their behavior to better

match neurotypical expectations[51,52]. Our results suggest that approaches considering both

partners' contributions to successful interaction—including environmental modifications that

accommodate altered spatial-visual coordination preferences—may be more effective. For

instance, interventions could help neurotypical partners recognize and adapt to different spatial-

proximity preferences while supporting individuals with ASD in developing flexible strategies

for managing multiple social channels simultaneously. Future research should not only examine

how the coordination patterns develop over time and whether they are modifiable, but also

integrate concurrent profiling of peripheral physiology and gut microbiome composition and

metabolites to test how specific biological states predict or mediate fluctuations in dyadic

coordination[53–56]. Such multimodal designs in marmosets could link interactive gaze and spacing

dynamics to circulating hormones, inflammatory signals, and microbial diversity or function,

generating mechanistic hypotheses for targeted interventions. Understanding the neural

mechanisms underlying these dyadic coordination patterns will be crucial for developing targeted,

mechanism-based therapeutic approaches that leverage intact social responsiveness while

accommodating individual differences in social information processing and regulation.

# Materials and methods

### Animals

Twenty common marmosets (*Callithrix jacchus*) participated as target individuals: 10 prenatal valproic-acid-exposed (VPA) ASD-model animals and 10 unexposed (UE) controls (5 males and 5 females in each group; Supplementary Table S1). Dyads (target and partner) were formed under two conditions, VPA-UE and UE-UE. For each target, three unfamiliar, same-sex UE partners were available; each target completed three sessions, one with a different partner on each occasion. Although the pool of 12 UE partners was reused across targets, every session involved a first-encounter dyad; no target-partner pairing recurred. To minimize carryover from previous encounters, we deliberately scheduled the three sessions months apart (May–July 2023, September–October 2023, and January–February 2024). Partners were pre-screened by experimenters and selected for calm behavior, specifically for remaining composed and not panicking when placed in the apparatus. Target individuals were born and reared in family cages and were then transferred to individual stainless-steel home cages (Natsume Manufacturing Co., Ltd., Tokyo, Japan) at least 2 months before testing. Animals were maintained at $29 \pm 2$ °C on a 12 h:12 h light:dark cycle (lights on at 07:00 and off at 19:00) with *ad libitum* access to food and water. All animals were habituated to routine handling and readily approached experimenters to obtain food rewards. All experimental animal care procedures were conducted under approved protocols according to the regulations of the National Center of Neurology and Psychiatry (NCNP), Tokyo, Japan (protocol no. 2023033).

### Prenatal VPA-exposed ASD marmoset model

Procedures are in accordance with those we have previously reported[31,34]. Briefly, serum progesterone levels in dams were monitored to determine the date of fertilization. VPA was

prepared as a 4% solution in 10% glucose and administered intragastrically once daily for seven

consecutive days starting on postconception day 60 (200 mg/kg/day). UE dams received no VPA.

After birth, regardless of group, infants were housed with both parents in the home cage until

weaning.

**Experimental apparatus**

All sessions were conducted in a sound-attenuating booth within the experimental room. The

booth interior was draped with white fabric to minimize visual distractions, and behavior was

monitored on an external display. A rectangular apparatus for target individuals (30.0 cm W ×

20.5 cm D × 21.0 cm H; Fig. 1a) and a cylindrical acrylic container for partners (18.5 cm D ×

21.0 cm H, wall thickness 0.6 cm; Fig. 1a) were used. The cylindrical case had five circular

breathing ports (diameter 0.5 cm) drilled along the lower sidewall in a horizontal row with 10 mm

center-to-center spacing. An opaque partition between the two compartments prevented visual

contact before trial onset and was operated from outside the booth via a pull cord, allowing trials

to commence without exposing the animals to human presence. A video camera (FDR-AX45;

Sony Corporation, Tokyo, Japan) was ceiling-mounted inside the sound-attenuating booth and left

in place throughout the study so that every trial was recorded from the same fixed viewpoint. The

floor was marked with tape to ensure identical placement of the target compartment and partner

cylinder across trials. Illumination was provided by two tripod-mounted LED panel lights

positioned outside the drape to deliver indirect lighting and avoid reflections in the video; lighting

was configured to achieve 2000-2200 lx at the arena surface.

**Procedure**

All experiments were conducted in the morning (09:00–12:00). Target individuals voluntarily

entered familiar transfer carrier cages from their home cages and were transported to the

experimental room. Upon arrival, they were gently guided to voluntarily enter a rectangular

testing apparatus. Partners were collected by familiar caregivers from their home cages,

voluntarily entered a cylindrical acrylic case designed for the experiment, and were then

transported to the experimental room. Transport of the two animals to the room was performed

simultaneously by two experimenters to avoid any waiting time for either animal and to minimize

differential arousal. Inside the booth, the target compartment and partner cylinder were placed on

their pre-marked locations; the partner's left/right position was counterbalanced across trials

according to a preset schedule. Video recording (30 fps) was started once two animals had settled

and ended at the conclusion of the 5-min trial. For analysis, we used the 5-min epoch beginning

when the partition was opened and both animals were in full, unobstructed view of each other. At

the end of each trial, animals were weighed and promptly returned to their home cages.

**Pose estimation (DeepLabCut)**

All pose estimation was performed on a Windows 10 Pro (22H2, Intel Core i7-12700KF, 3.60

GHz; 128 GB RAM; NVIDIA GeForce RTX 3090) using Python 3.9.21 (Anaconda 23.3.1),

NumPy 1.24.3, and DeepLabCut (DLC) version 2.3.7 with TensorFlow 2.10.0, CUDA 11.2, and

cuDNN 8. For network training, we used the first-session videos from each of the 20 target

individuals (5 min at 30 fps). Representative frames were selected per video using DLC's built-

in k-means sampling (20 frames/video), yielding 400 labeled frames in total. In every selected

frame, six keypoints were annotated: forehead, left ear, and right ear for each of the two animals.

The labeled dataset was split such that 95% of frames were used for training and 5% were held

out for testing. The network was trained for 150,000 iterations, reaching a final loss of under

0.0015. Pixel errors on the full set were 2.21 px (train) and 6.92 px (test). With a likelihood

threshold (p-cutoff) of 0.6 applied, the train error remained 2.21 px and the test error was 6.69 px.

The trained model was applied to all experimental videos. Before computing gaze and distance

measures, we addressed DLC dropouts on a per-coordinate basis. Short missing runs were linearly

interpolated within each time series (bidirectional linear interpolation), whereas longer gaps were

preserved as missing to avoid fabricating trajectories. Concretely, sequences of NaNs < 60 frames

were filled; sequences ≥ 60 frames (~2 s at 30 fps) were left as NaN and downstream analyses

ignored those frames. The procedure operates column-wise on the 4-level DLC CSV

(forehead/ears, x/y, etc.) and saves traceable outputs. After applying the interpolation procedure,

we computed detection rates, defined as the percentage of frames in which all required keypoints,

and these did not differ between training and held-out test videos for either the target or partner

individuals (Supplementary Fig. 2a). Agreement at the level of derived measures was also high:

the angular difference between gaze vectors computed from human labels versus DLC outputs

was sharply centered at 0° for both the target and partner (Supplementary Fig. S3b). Together,

these checks indicate good generalization and support using DLC-derived keypoints for all

downstream analyses.

**Behavioral measures and event definitions**

To evaluate whether one subject directed its gaze toward another during the experiment, we

employed a geometric method based on body part coordinates obtained via DLC[35]. This approach

is particularly justified in New World monkeys such as common marmosets, which rely heavily

on head movements for orienting behavior. Previous studies have shown that their eye-in-head

movement is limited to approximately ±5° under head-restrained conditions and even further

restricted to ±2.5° during free movement, making head orientation a reliable proxy for gaze

direction [15-18].

The head orientation was estimated by calculating a directional vector from the midpoint of the

two ears to the forehead (black arrow; Fig. 1c). This vector was considered to represent the

subject's forward-facing direction. A second vector (blue arrow; Fig. 1c) was defined from the

subject's forehead to the other conspecific's forehead. This vector served as an estimate of the

direction in which the subject would be looking if attending to the other conspecific. To determine

whether the subject was looking toward the other animal, we calculated the angular deviation

between the head orientation vector and the gaze direction vector. Frames in which this angle fell

within 30 degrees were classified as "gaze" frames. An event was labeled "looking" when the

inter-vector angle was $\leq 30°$, and an event required $\geq 3$ consecutive "gaze" frames. To ensure

stable azimuth estimates, we required both forehead-left-ear and forehead-right-ear separations to

exceed 45 px (1.1966 cm; 1 px = 0.02659 cm); this threshold equals one-half of the empirically

measured mean forehead-ear baseline in horizontally oriented images of our subjects and excludes

frames in which the head was oriented nearly straight upward or downward in the image, for

which 2D gaze-angle estimates are unreliable. We examined the overall distribution of frame-

wise gaze angles (Fig. 1d) using circular statistics implemented in Python, pooling all frame-wise

angles across individuals and sessions for each pair type (UE–UE and VPA–UE) and role (target

vs. partner). Departure from circular uniformity around 0° (direct gaze toward the partner) was

evaluated using one-sample V tests against 0°, and Watson's $U^2$ statistics were computed as

omnibus measures of deviation from circular uniformity.

Mutual gaze (Fig. 2c, d) was defined more stringently to capture precise face-to-face alignment:

both individuals had to satisfy the "gaze" criterion simultaneously with an angular threshold of $\leq$

10°. We inspected the onset of every looking event (as defined above) and classified it as a one-

sided look (Fig. 3a) if, at that onset frame, the other conspecific did not concurrently satisfy the

gaze criterion toward the subject. The one-sided-look ratio was computed per subject and trial as

the proportion of looking events that met this condition. Gaze response (Fig. 3b) was recorded if

the subject satisfied the looking criterion within a 1-s ($\leq 30$ frames) window after the prompt

onset; otherwise, the prompt was coded as a non-response. Windows truncated by the end of the

video were treated as non-responses. At each frame, inter-individual distance (Fig 4b, e, f, g) was

computed as the Euclidean distance between forehead landmarks which is the square root of the

sum of the squared horizontal and vertical separations between the two foreheads and then

converted from pixels to centimeters (1 px = 0.02659 cm). We also computed the distance from

each individual's forehead to a fixed point in the target arena (Fig. 4c, d) using the same Euclidean

formula as for inter-individual distance, substituting the fixed-point coordinates.

**Statistical Analysis**

To compare group differences in behavioral indices measured from the subject individual, linear

mixed-effects models (LMMs) were applied separately to each behavioral variable. The variables

analyzed included median distance, frequency of gaze events, gaze duration, and other behavioral

indices derived from the subject individual. In each model, group (UE vs. VPA) was treated as a

fixed effect, and subject identity was included as a random intercept to account for repeated

measurements. Since each subject interacted with multiple different partner individuals across

sessions, this modeling approach allowed us to retain trial-level variability while appropriately

accounting for within-subject dependence. The models were fitted using the *lmerTest* package

(version 3.1.3) in R (version 4.3.3). Model assumptions regarding the normality and

homoscedasticity of residuals were evaluated using diagnostic plots and the Shapiro-Wilk test.

Fixed effects were assessed using Satterthwaite's approximation for degrees of freedom. For the

partner individual, who differed in each session and was not subject to repeated measurements,

group comparisons of behavioral indices were conducted using either parametric or

nonparametric tests, depending on the distribution of the data. Specifically, normality and

homogeneity of variance were assessed, and when parametric assumptions were not met,

nonparametric Mann-Whitney U tests were performed. These tests were conducted in JMP Pro

(version 17.2.0; SAS Institute Inc., Cary, NC, USA).

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**Data availability**

The datasets used and/or analyzed during the current study are available from the corresponding author on reasonable request.

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**Contributions**

M.N. designed the study, conducted experiments, analyzed the data, and wrote the manuscript; Tomoko S. conducted experiments and analyzed the data; T.K. designed and conducted experiments; K.S. conducted experiments; A.M.H. and S.S. carried out data collection; K.M. contributed to study design and provided comments on the manuscript; N.K. and Tsuyoshi S. provided comments on the manuscript; N.I. designed the study, acquired funding, and provided comments on the original draft. All authors provided critical revisions and contributed to the theoretical development of the study.

**Ethics declarations**

Competing interests

The authors declare no competing interests.