



Published in final edited form as:

J Child Psychol Psychiatry. 2021 August ; 62(8): 949–960. doi:10.1111/jcpp.13348.

Natural language markers of social phenotype in girls with autism

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Abstract

Background: Girls with autism spectrum condition (ASC) are chronically under-diagnosed compared to boys, which may be due to poorly understood sex differences in a variety of domains, including social interest and motivation. In this study, we use natural language processing to identify objective markers of social phenotype that are easily obtained from a brief conversation with a non-expert.

Methods: 87 school-aged children and adolescents with ASC (17 girls, 33 boys) or typical development (TD; 15 girls, 22 boys) were matched on age (Mean=11.35y), IQ estimates (Mean=107), and – for ASC participants – level of social impairment. Participants engaged in an informal 5-minute “get to know you” conversation with a non-expert conversation partner. To measure attention to social groups, we analyzed first-person plural pronoun variants (e.g., “we” and “us”) and third-person plural pronoun variants (e.g., “they” and “them”).

Results: Consistent with prior research suggesting greater social motivation in autistic girls, autistic girls talked more about social groups than did ASC boys. Compared to TD girls, autistic girls demonstrated atypically heightened discussion of groups they were not a part of (“they”, “them”), indicating potential awareness of social exclusion. Pronoun use predicted individual differences in the social phenotypes of autistic girls.

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Conflict of interest statement: No conflicts declared.

Supporting information

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Conclusions: Relatively heightened but atypical social group focus is evident in autistic girls during spontaneous conversation, which contrasts with patterns observed in autistic boys and TD girls. Quantifying subtle linguistic differences in verbally fluent autistic girls is an important step toward improved identification and support for this understudied sector of the autism spectrum.

Keywords

Autism spectrum condition; language; social phenotype; sex differences; pronouns

Introduction

Autism spectrum condition (ASC) is a complex, heterogeneous neurodevelopmental challenge that affects 1 in 54 children (Maenner & et al., 2020), and is characterized by social communication difficulties and repetitive behaviors (American Psychiatric Association, 2013). The majority of individuals with ASC acquire spoken language (Rose et al., 2016; Tager-Flusberg & Kasari, 2013), but nonetheless face a variety of challenges in fitting into society (Friedman, Sterling, et al., 2019; Müller et al., 2008; Rotheram-Fuller et al., 2010). Girls are diagnosed less often with ASC than are boys (Baio et al., 2018) even when they have comparable symptom profiles (Dworzynski et al., 2012), which may be due to minimally understood sex differences in the way ASC manifests (Cola et al., 2020). For example, recent research suggests that autistic girls and boys present distinct symptom profiles in a variety of domains including social attention (Harrop et al., 2019, 2020), gesture (Rynkiewicz et al., 2016), imaginative play (Beggiato et al., 2017), social motivation (Sedgewick et al., 2016), and language (Boorse et al., 2019; Goddard et al., 2014; Kauschke et al., 2016; Parish-Morris et al., 2017; Sturrock et al., 2019). Failure to understand the ways in which autistic girls present similarly to (or differently from) autistic boys likely contributes to systematic under-diagnosis (Loomes et al., 2017) and critical missed opportunities to support autistic girls and women.

Given that language is a window into the human mind, closely analyzing language use in this population could shed light on how children and adolescents on the spectrum perceive the world. In particular, words produced during natural conversations might reflect individual differences in social phenotype for girls and boys with ASC. Motivation to engage socially has been argued to be a core deficit in autism (Chevallier et al., 2012), but research in this area does not always produce consistent results – perhaps due to unmeasured heterogeneity in study samples (Clements et al., 2018). One important source of heterogeneity in social motivation research may stem from autistic girls and women, who have been argued to demonstrate enhanced social motivation relative to autistic boys (Sedgewick et al., 2016). Although it is currently unknown whether differences in social motivation can be detected in natural language, examining how much children talk about other people (as indexed by personal pronouns) could provide initial insights.

Personal pronouns

Traditionally, when analyzing language, researchers have focused on semantically rich content words like nouns and verbs (Crandall et al., 2019; McDuffie et al., 2006). Function words, including pronouns, articles, prepositions, conjunctions, and auxiliary verbs, are

often overlooked or discarded from lexical analyses. However, more than half of all spoken words are function words (Rochon et al., 2000), and these “throwaway” words contain meaningful individual variation that predict a variety of compelling outcomes (Chung & Pennebaker, 2007; Gorman et al., 2016; Irvine et al., 2016; Pennebaker, 2011; Pennebaker et al., 2003, 2015). Personal pronouns, in particular, typically refer to individuals or groups of people (Kitagawa & Lehrer, 1990). Variants include first person singular (“I”), first person plural (“we”), third person singular (“he/she”), third person plural (“they”), and second person (“you”) forms, and have been studied in relation to a wide variety of social and cognitive topics (Davis & Brock, 1975; Simmons, Gordon, & Chambless, 2005; Twenge, Campbell, & Gentile, 2012; Badr et al., 2016; Neysari et al., 2016; Nook, Schleider, & Somerville, 2017). For example, leadership status and power relationships are reflected in personal pronoun use, such that leaders with greater power use more first-person plural pronouns (e.g., *we*, *us*) than those with less power (Kacewicz et al., 2014). Patterns of personal pronoun use also vary according to audience characteristics. In private accounts of relationship breakups (journal entries), people use more first person singular (I, me) and third person plural (they, them) pronouns than in public accounts (blog posts) of these same breakups, where they use more first-person plural pronouns (we, us) (Blackburn et al., 2014). Together, these results suggest that personal pronouns may be sensitive indicators of interpersonal dynamics that vary according to contextual factors such as target audience.

Personal pronouns also reveal information about people’s mental states and personalities, suggesting that pronoun use might be informative for understanding individuals with psychiatric and neurodevelopmental differences (Boals & Klein, 2005; Brockmeyer et al., 2015; Watson et al., 2012; Kleim et al., 2018; Lyons, Aksayli, & Brewer, 2018). For example, college students with current or past depression use more first-person singular pronouns in written essays than students who were never depressed (Rude et al., 2004). In a study of narcissistic personality, participants spoke for 5 minutes about any topic they chose, and then completed a narcissism personality inventory. Greater narcissism was associated with the presence of more first-person plural pronouns (we, us) in participant monologues (Raskin & Shaw, 1988).

Personal pronouns in ASC

A significant body of research suggests that individuals with ASC use personal pronouns differently than matched control participants without ASC (Baltaxe & D’Angiola, 1996; Charney, 1980; Hauser et al., 2019; Kanner, 1943; Naigles et al., 2016) or with other conditions (Friedman, Lorang, et al., 2019), particularly at younger ages (Arnold et al., 2009). For example, children with ASC have been reported to produce fewer first and second person pronouns (“me”, and “you”) than intellectually disabled and typically developing comparison groups (Jordan, 1989). In 1994, Lee and colleagues showed that children with ASC produced the pronouns “you” and “me” at atypical rates, despite having no difficulties with pronoun comprehension. Rather than using pronouns, children were instead more likely than non-autistic control group subjects to use proper nouns to refer to the experimenters and themselves (Lee, Hobson, & Chiat, 1994). The gap between intact comprehension on one hand, and atypical production on the other, has also been reported in third person pronoun production (e.g., “him”, “her”; (Hobson et al., 2010)).

Studies hinting at a connection between social impairment and pronoun use suggest that differences in personal pronoun use could be an objective metric for assessing social phenotypes in children with ASC (Loveland & Landry, 1986). In the same study that examined third-person pronoun use by autistic children (Hobson et al., 2010), researchers examined the relationship between pronoun production and communicative engagement. A rater, blind to children's diagnostic status, reviewed videotapes of the pronoun production tasks, and rated participants' eye gaze direction during the tasks (i.e., orienting toward a third person or not), as well as interpersonal connectedness with their conversational partner. They found that subjects with autism and limited third-person pronoun production looked less at experimenters, and autistic participants who said "we" more often were rated higher on interpersonal connectedness (Hobson et al., 2010). These results suggest a potential link between pronoun use and social behavior in ASC, such that subtle verbal communication patterns – captured by first person and third person pronouns – might serve as objective markers of social phenotype.

Us vs. Them

Given that word choice is an index of attentional focus (Klin, 2000), and individuals with ASC show reduced social interest and motivation compared to TD controls (Chevallier et al., 2012), social deficits may be measurable in the words autistic children produce during natural conversations. First person plural and third person plural pronouns ("we" and "they" and their variants), in particular, could mark children's degree of attentional focus on social groups, and may indicate awareness of membership in ("we") – or exclusion from ("they") – social groups. Indeed, prior literature suggests that first- and third-person plural pronouns are differentially associated with whether one perceives oneself to be part of a group – also known as one's collective self-identification (Brewer & Gardner, 1996; Cramer & Schuman, 1975) – wherein "we" is associated with self-identified group membership, and "they" is associated with non-membership. This potentially meaningful social distinction has never been studied in ASC.

Current study

This study compares first- vs. third-person plural pronoun production in girls and boys with and without ASC during a short naturalistic conversation with a non-expert interlocutor. We specifically examine sex differences, because although a large literature exists on pronoun use in ASC, it is currently unknown whether pronoun use differs for *all* autistic children, since the aforementioned studies on pronoun use in ASC included few – if any – girls and women. Given diagnostic group differences in social motivation reported in the literature (ASC < TD; (Chevallier et al., 2012)), we hypothesized that autistic children and adolescents would produce fewer personal pronouns than TD children and adolescents (marking reduced social motivation and less attentional focus on social groups). However, recent research suggests that autistic girls may be more socially motivated than autistic boys (Sedgewick et al., 2016), leading us to hypothesize that ASC girls would produce more personal pronouns than ASC boys. We further hypothesized greater relative use of third-person plural pronouns ("they", "them") by autistic girls compared to autistic boys, given research suggesting that ASC girls often "hover" around the edges of social groups in school settings (Dean et al., 2017) and therefore might maintain heightened awareness of groups for which they

are non-members (excluded). To understand the larger verbal context of potential pronoun differences, we analyzed “social” words to determine whether girls and boys also differed on their production of words from this broader language category. Finally, we hypothesized that pronoun use would correlate with social phenotype, such that greater attentional focus on social groups would be associated with fewer (or milder) autism symptoms. Given the paucity research on typical sex differences in plural pronoun use, we did not have specific sex-related hypotheses for the TD group. Of note, sex differences were expected in the ASC group despite the lack of hypotheses about sex differences in the TD group, as prior research suggests that more girls with ASC experience heightened social motivation and are more likely to camouflage their autism symptoms or engage in social compensation as compared to boys (Wood-Downie et al., 2020); these differences were expected to result in sex-differentiated social communication patterns for the ASC group specifically.

Methods

Participants

Eighty-seven matched participants with ASC and typically developing (TD) controls were selected from a pool of verbally fluent individuals who participated in one of many studies conducted at a large hospital-based research center. The larger series of studies included diagnostic tests, cognitive assessments, and language and motor tasks. To match groups, participants with complete data (age, sex, race, ADOS, IQ testing) were first selected from the larger pool; participants with full-scale IQ estimates below 78 were excluded; participants were excluded if they were younger than 8 years old, and excluded if they were older than 17 years old. ASC diagnoses were made by expert PhD-level clinicians using the clinical best estimate (CBE) approach (Lord, Petkova, et al., 2012), with support from a research-reliable administration of the ADOS-2 (Lord et al., 2012). The CBE method prioritizes DSM-V criteria informed by family/medical history and an evaluation by an autism specialist. The Center for Autism Research does not rely solely on ADOS cutoffs or SCQ scores when diagnosing ASC, nor do subthreshold scores lead to automatic disqualification for receiving an ASC diagnosis. This is because many conditions can result in elevated scores on these metrics (e.g., ADHD; (Grzadzinski et al., 2016)), and individuals – particularly girls – may exhibit profiles that do not hit algorithm items on standard ASC diagnostic measures (Ratto et al., 2017) but do meet DSM-V criteria. Thus, participants were included in the ASC group if they met DSM-V criteria as evaluated by PhD-level clinicians with specific expertise in ASC using the CBE method, and not included if they did not (some participants were excluded from the ASC group despite elevated scores on ADOS or SCQ, because the CBE diagnosis was not ASC). Participants were recruited through a variety of mechanisms, including public advertising, word of mouth, and re-recruitment from previous studies. Participants were excluded if they had a known genetic syndrome, history of concussion or brain injury that impacted current functioning, a gestational age below thirty-four weeks, or if English was not their primary language. Additionally, participants were excluded if parents reported that the child or adolescent had permanent motor damage from prior medication use (e.g., methamphetamines). Current medication use reported by parents of participants in the ASC group included SSRIs for 9 out of 50 participants, and antipsychotics for 6 out of 50 participants, with one participant

taking both kinds of medications. The final sample included four groups, matched on age and IQ (girls with ASC, boys with ASC, TD girls, and TD boys; Table). ASC girls and boys were additionally matched on ADOS-2 total calibrated severity scores (CSS) and SCQ scores. Parents or primary caregivers were given an informed consent packet to review, and completed written informed consent upon arrival. Participants and parents were compensated for their time. All participants in this sample consented to their data being used for future studies; this study was overseen by the Children's Hospital of Philadelphia Institutional Review Board.

Study procedure

Linguistic data were drawn from a 5-minute conversation between the participant and study personnel (confederate), administered as part of a larger study. The conversation was completely unstructured with no specific topics provided to either speaker. Twenty-three young adult confederates (21 females; undergraduate students and research assistants) were assigned to each participant based on availability (there were no significant differences in confederate sex distribution by participant sex or diagnostic group). Confederates were not informed of participant diagnosis, and their only instructions were to act natural and avoid dominating the conversation. To account for potential individual differences in confederate behavior, a random effect of confederate ID was included in all analyses. At the start of the conversation, the research assistant in charge of the visit said a variation of the phrase, "You two just chat and get to know each other. I'm going to finish getting a few things set up." Conversations were audio/video recorded using a device with two HD video cameras and mics facing opposite directions, placed on a table between participants and confederates for simultaneous capture of both speakers (Parish-Morris et al., 2018).

Measures

Participants in the study were administered a battery of diagnostic and cognitive tests including the Autism Diagnostic Observation Schedule Second Edition (ADOS-2; (Lord, DiLavore, et al., 2012). Either ADOS-2 module 3 or 4 was administered to participants in this study by a research-reliable clinician. ADOS-2 scores index two domains, Social Affect (SA) and Restricted and Repetitive Behaviors (RRBs), with higher scores indicating greater symptoms (Hus et al., 2014). The Social Communication Questionnaire (SCQ) – Lifetime version is a yes/no parent response questionnaire that asks parents or primary caregivers to assess their child's social behaviors associated with ASC (Rutter et al., 2003), and was given to a parent/primary caregiver to fill out prior to clinical assessment.

Participant IQ estimates were calculated using one of the following tests, which were administered based on the protocol requirements of individual studies that were pooled across a large research center to generate the current sample: 57 participants (35 TD, 24 ASC) received the Wechsler Abbreviated Scale of Intelligence, Second Edition (Wechsler, 2011), 3 participants (3 ASC) received the Wechsler Intelligence Scale for Children, Fifth Edition (Wechsler, 2014), 21 participants (21 ASC) received the Stanford-Binet Intelligence Scales (Roid, 2003), 4 participants received the Differential Ability Scales, Second Edition (DAS-II, DAS-II School version (2 TD, 1 ASC)), or DAS-II Early version (1 ASC) used depending on age; Elliot, 2007). Scores were standardized by a licensed neuropsychologist

(J. Pandey) to create an overall cognitive estimate, a verbal estimate, and a nonverbal estimate.

Data processing

Audio recordings of each conversation were segmented, labeled by speaker, and orthographically transcribed using XTrans (Linguistic Data Consortium, 2018) (see Appendix S1). Average word-level transcription reliability was calculated for 20% of the samples, and averaged 97.22% (range: 95.70% - 98.53%). After segmentation, speaker labeling, and transcription, words produced by participant and confederate were separated using an in-house R script. Files were fed into LIWC software (Pennebaker et al., 2015), which calculated the overall number of words produced, as well as the number of first- and third-person plural pronouns and “social” category words produced by each speaker (see Dependent variables, below).

Statistical approach

Data were analyzed using generalized linear mixed effects regression (GLMER) models in R (‘lme4’ package; R Core Team and contributors worldwide) with age and IQ (mean centered) as covariates, a random effect of confederate ID for separate “we”, “they”, and “social” variant analyses, and random effects of both participant ID and confederate ID for the primary omnibus test comparing “we” versus “they” production (since participants produced both types of pronouns during every conversation). Estimated effects, standard errors (SE), z -values, and p -values are provided. Variables were coded as follows: TD=0, ASC=1; Female=0, Male=1. Dependent variables were positive, interval, and non-normally distributed (Shapiro-Wilk test $ps < .001$), so these data were modeled using a Poisson distribution with a log link. Significance values for planned pairwise tests of GLMER estimated marginal means were corrected for multiple comparisons using the Tukey method. Effect sizes for GLMER are reported as unstandardized effects (estimates; Pek & Flora, 2018), while Cohen’s d is reported for group mean differences on clinical and demographic variables (Table). Following Cohen (1988), $d=0.2$ is considered a “small” effect, $d=0.5$ a “medium” effect, and $d=0.8$ a “large” effect (Cohen, 1988). GLMER was used to assess relationships between pronoun production and clinical phenotype (ADOS-2 Social Affect and Repetitive Behaviors domain scores).

Dependent variables

Preliminary analyses controlling for age and IQ (mean centered), and confederate ID revealed that participant groups produced significantly different numbers of words during the 5-minute conversations (Table S1). Thus, subsequent analyses were conducted on the number of first-person plural pronouns (“we”, “us” and variants), third-person plural pronouns (“they”, “them” and variants), and “social” category words as calculated by LIWC (see Appendix S2), normalized per 1000 words to account for varying word production across conversations and to facilitate interpretation. We decided to normalize word use per 1000 words based on the average range of words produced by participants in our study, and to illustrate relative frequency without reporting percentages that could be misinterpreted when participants produced fewer overall words. We further avoided the use of proportions because they tend to violate the underlying assumptions of common statistical tests, can be

misleading when the number of words produced varies widely (as in this study and most studies of productive language in ASC), and do not generally adhere to the way words are counted (usually full words are counted as words, and thus are better represented as count data than as decimals). Clinical phenotype was measured using ADOS-2 CSS scores.

Results

A generalized linear mixed effects regression predicting pronoun use revealed a significant three-way interaction between sex, diagnosis, and pronoun type (estimate: $-.94$, $SE=.18$, $z=-5.13$, $p<.001$; controlling for age and IQ (centered), with participant and confederate IDs as random effects to account for repeated measures). Conditional main effects of diagnosis (estimate: $-.71$, $SE: .24$, $z=-2.91$, $p=.004$), sex (estimate: $-.43$, $SE: .23$, $z=-1.91$, $p=.056$), and pronoun type (“they” estimate: $-.94$, $SE: .10$, $z=-9.53$, $p<.001$) on overall pronoun use emerged. To clarify the nature of the interaction, subsequent analyses were conducted within each pronoun type separately.

First person plural (“we” variants)

A GLMER including confederate ID, age, IQ, sex, diagnosis, and the interaction between sex and diagnosis revealed a nonsignificant interaction effect, so this factor was removed from the model. The final model with sex and diagnosis predicting “we” production per 1000 words revealed a significant main effect of diagnosis (estimate: $-.31$, $SE: .07$, $z=-4.25$, $p<.001$; Table S1), such that participants with ASC produced less “we” than TD participants. A significant effect of sex also emerged; boys were less likely to produce “we” variants than girls (estimate: $-.28$, $SE: .07$, $z=-4.28$, $p<.001$). Tukey-corrected pairwise comparisons of estimated marginal means revealed that “we” production differed significantly in all subgroups except ASC girls and TD boys, who did not differ significantly from one another (TD girls>TD boys=ASC girls>ASC boys; Figure; Table S1).

Third person plural (“they” variants)

A GLMER including confederate ID, age, IQ, sex, diagnosis, and the interaction between sex and diagnosis revealed a significant interactive effect of sex and diagnosis on “they” variants produced per 1000 words (estimate: $-.88$, $SE: .18$, $z=-4.92$, $p<.001$). Tukey-corrected pairwise comparisons of estimated marginal means revealed that the interaction was driven by significantly increased relative “they” production in autistic girls (Figure; Table S1), such that autistic girls used significantly more “they” than autistic boys (estimate: $.90$, $SE: .12$, $z=7.39$, $p<.0001$; Table S1), TD girls (estimate: $-.34$, $SE: .13$, $z=-2.65$, $p=.04$), and TD boys (estimate: $.36$, $SE: .11$, $z=2.98$, $p=.02$). “They” production by TD girls and boys did not differ from one another (estimate: $.02$, $SE: .13$, $z=.13$, $p=.99$; ASC girls > TD girls = TD boys > ASC boys; Figure; Table S1).

“Social” category words

To understand the broader context of differences in pronoun use, we explored the amount of social talk produced by each participant by analyzing “social” category words as measured by LIWC. A GLMER including age, IQ, sex, diagnosis, confederate ID, and the interaction between sex and diagnosis revealed a significant interactive effect of sex and diagnosis on

“social” words produced per 1000 words (estimate: $-.25$, SE: $.06$, $z=-4.52$, $p<.001$). Tukey-corrected pairwise comparisons of estimated marginal means revealed that the interaction was driven by reduced social word production in ASC boys (Mean= 71.47) compared to ASC girls (Mean= 92.45 , $z=6.77$, $p<.0001$), TD boys (Mean= 94.62 , $z=7.48$, $p<.0001$), and TD girls (Mean= 95.26 , $z=7.58$, $p<.0001$). Rates of social word use by ASC girls, TD girls, and TD boys did not differ significantly from one another (all $ps>.88$). Thus, we found that ASC boys produced distinctly lower levels of social talk, while ASC girls, TD girls, and TD boys produced patterns of social talk that did not differ significantly from one another. This analysis provides convergent evidence for differential social language phenotypes in boys and girls with and without ASC, and suggests a connection between differential rates of pronoun production and social language more broadly.

Predicting clinical phenotype

To determine whether pronoun production was associated with clinical phenotype in ASC, pronouns were used to predict ADOS-2 scores in the ASC group alone. After controlling for age and IQ (centered), with random effects of participant ID and confederate ID, a GLMER revealed that “we” variants and “they” variants significantly predicted ADOS-2 social affect (SA) CSS scores in the ASC group (“we” estimate: $-.01$, SE= $.006$, $z=-2.38$, $p=.02$; “they” estimate: $-.01$, SE: $.007$, $z=-2.21$, $p=.03$). A separate GLMER revealed that “we” and “they” variants did not significantly predict ADOS-2 repetitive behavior (RRB) scores (all $ps>.19$), suggesting that pronoun use is specifically associated with social function and not repetitive behaviors. Exploratory subgroup analyses in ASC boys and girls separately showed that the relationship between ADOS-2 SA scores in the overall ASC sample was driven by significant linkages between pronoun use and ADOS-2 SA scores in autistic girls (“we” estimate: $-.02$, SE= $.01$, $z=-1.87$, $p=.06$; “they” estimate: $-.03$, SE: $.01$, $z=-2.75$, $p=.006$). Prediction in autistic boys was nonsignificant (all $ps>.21$), although these results should be viewed with caution due to the small sample sizes in each subgroup.

Discussion

This study is the first to compare plural pronoun use by girls and boys with and without ASC, and one of the few in the literature to analyze language produced by autistic children and adolescents during brief conversations with non-expert interlocutors. A number of notable findings emerged: First, we found that as a group, autistic children and adolescents used significantly fewer plural personal pronouns than matched TD peers. This main effect of autism on personal pronoun production is broadly consistent with reports of reduced social motivation and social attention in autism (Chevallier et al., 2012). Based on this finding and consistent with prior research, reduced or atypical personal pronoun use appears to be a good diagnostic marker for ASC, and may – pending future research in younger children – prove clinically useful for lowering the age of first autism diagnosis. Our second finding revealed important – and previously unreported – nuances in personal pronoun use that varied by sex in ASC.

Sex differences in word use emerged for both first- and third-person plural pronouns in ASC, with girls consistently producing more social group-related talk compared to boys.

One explanation for this finding is that autistic girls are hyperaware of groups they are (and are not) not included in, while ASC boys – who produced diminished social group talk across the board – are comparatively less likely to talk about social topics, regardless of group membership status. This conclusion is consistent with research showing that girls with ASC tend to hover around social groups on the playground and be neglected socially – in contrast to ASC boys who tend to be alone and rejected (Dean et al., 2014, 2017). Our pattern of findings could also be interpreted as evidence of social camouflage or compensation, which may be more common in females than males with ASC (Allely, 2018) and may or may not be consciously deployed. From that perspective, ASC girls with heightened “they” production might have learned to match TD levels of social talk as a way to blend in linguistically with peers – thus partially “normalizing” natural speech (Parish-Morris et al., 2017).

Sex differences in plural pronoun use by TD children and adolescents were also revealed, such that TD girls talked more about social groups they were a part of (“we” variants) than did TD boys. Long-researched sex differences in friendship structure during childhood and adolescence may underlie the greater amounts of “we” talk observed in girls relative to boys in both diagnostic groups, which is also consistent with recent research showing that the friendship structures of ASC girls and boys differ along typical lines (Sedgewick et al., 2016, 2019). In contrast to the sex-differentiated patterns of “they” production observed in ASC, however, there was no effect of sex on the amount of talk by TD boys and girls about social groups they are not a part of (i.e., both sexes were equally likely to use “they” variants). This suggests that sex differences in “they” production by children and adolescents in the ASC group may be autism-specific.

Interestingly, autistic girls in our sample produced significantly more third-person plural pronouns (“they”, “them”) than TD girls, which could indicate even greater-than-average social interest and motivation. However, autistic girls’ heightened *focus* on social groups (increased “they”) may be complicated by their diminished *membership* in those groups (diminished “we”) relative to same-sex TD peers. This tension – between heightened awareness of social groups on one hand, and reduced membership on another – could index social exclusion, which may contribute to elevated levels of depression and anxiety in girls with ASC (Bargiela et al., 2016). Recent research supports this interpretation, as the friendship structures of girls and boys have been shown to vary systematically in ways that drive sex-differentiated friendship experiences in ASC (Sedgewick et al., 2019). Thus, when it comes to identifying girls with ASC vs. typical girls, our results suggest that while the overall *amount* of talk about social groups is high in both populations, and might therefore not be a reliable marker for whether or not a girl should be referred for an autism evaluation, *how* girls talk about social groups might be a good indicator of social function that could be used to guide clinical decision-making.

In line with recent research showing that autistic girls experience enhanced social motivation relative to autistic boys (Sedgewick et al., 2016), we found that autistic girls produced significantly more social words than autistic boys did – not just personal pronouns – indicating generally heightened conversational attention to social topics. Sex differences in language markers of social motivation in autism are especially important in light of the late

(Baio et al., 2018) or missed (Loomes et al., 2017) diagnoses that are common for autistic girls and women. Specifically, heightened talk about social topics could complicate ASC referral and diagnosis when observers expect a male-centric “autistic” behavioral pattern of reduced social motivation and attention to social groups, which ASC girls do not necessarily exhibit.

Finally, our study showed that pronoun use predicts social phenotype in autistic girls, such that greater attentional focus on social groups predicts fewer (or milder) autism symptoms as rated by an expert clinician. This relationship was not present in autistic boys, perhaps due to the restricted range of pronoun production in that subgroup. Despite deliberately matching boys and girls on overall autism symptoms, boys in our sample were significantly less likely than girls to use both types of plural pronouns. Thus, while the social phenotype of girls with ASC appears measurable via personal pronoun production during brief conversations, it may be more difficult to assess in boys (at least, using personal pronouns as a metric).

Limitations and future directions

A number of notable strengths distinguish this study from prior research, including sufficient numbers of ASC and TD girls and boys to analyze diagnosis- and sex-based differences in pronoun use. However, certain limitations should be considered when interpreting our results. First, although our sample included a greater-than-average percentage of autistic girls (33% of the ASC group), this study bears replication with larger samples. Future research in our lab is planned, which will expand this approach to include more participants in semi-structured question-and-answer formats, such as the ADOS-2 social interview section. This approach – with standardized social prompts – would increase the likelihood that social prompting is conducted in approximately the same way across participants and would reduce the need to control for variable confederate behavior. However, a standardized interview administered by an expert is also less generalizable to everyday life experiences. Second, it is still unknown whether these effects will hold in older and younger samples, and in samples with lower IQ estimates. A developmentally-matched comparison group (e.g., with Down syndrome) would allow us to extend our IQ range, and pilot research using this approach with ASC and TD children as young as 5 years old is currently underway. Our sample also lacked the power to determine whether medication use (e.g., SSRIs) may have an effect on pronoun use, which is a promising avenue for future research. Third, the girls in this sample were identified as autistic during childhood despite a recognized problem of late and missed diagnoses for females (Baio et al., 2018; Loomes et al., 2017). Thus, the girls in this sample may differ systematically from autistic girls who are diagnosed later, during adolescence in adulthood, and it is unknown whether or not these findings generalize to later-diagnosed or undiagnosed girls and women on the spectrum. Fourth, it is important to further analyze what *kind* of group-focused talk children produced. Although girls with ASC produced social category words at rates that did not differ from TD girls, it is nonetheless possible that girls with ASC spoke about social groups in ways that differed qualitatively – if not quantitatively – from TD girls (e.g., differential reliance on proper nouns vs. pronouns (Lee et al., 1994), variable talk about friends vs. family, or use of *they* as a gender neutral pronoun). Future research will examine qualitative differences in the social group-related talk in ASC and TD boys and girls. Fifth, our study did not measure the real-world effects of

variable pronoun production, which may differentially impact the peer experiences of boys vs. girls; future research is necessary to tease apart relationships between sex-differentiated peer social contexts and demands on the one hand, and language behavior on the other. Sixth, our measure of social phenotype (ADOS-2 social affect total score) is not designed to be a dimensional measure of social phenotype. A targeted questionnaire about social interest and motivation, or a behavioral measure like attention to social stimuli during eye tracking, might correlate more strongly with pronoun use. Finally, given the lack of validated social camouflaging or compensation measures for participants in our age range, we do not have self-report of this behavior; this limits our ability to interpret word-level differences as being due to this phenomenon.

Conclusion

Our study addresses multiple gaps in the literature by exploring personal pronouns as linguistic markers of social phenotype in brief spontaneous conversations of autistic girls and boys, as compared to an adequately powered sample of matched typically developing peers. Building on previous research demonstrating correlations between personal pronoun use and social ability in ASC, this study showed that markers of social phenotype can be extracted from short natural language samples – at least for girls; boys may require different metrics. Understanding and quantifying sex differences in expressive language in ASC will lead to more accurate phenotyping for boys *and* girls, which is necessary to improve early identification and inform personalized, sex-sensitive interventions that maximize long-term outcomes.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

Acknowledgements

In this paper, the authors' terminology is drawn from World Health Organization definitions, such that the word "sex" refers to genetic makeup, and "gender" refers to a socio-cultural construct (World Health Organization, 2015); the authors use the words "girl" and "boy" to refer to sex as reported by parents. In line with preferences expressed by self-advocates and parents within the autistic community (Brown, 2011; Dunn & Andrews, 2015; Kenny et al., 2016), this paper uses both identity-first language (i.e. autistic girls and boys) and person-first language (i.e. girls and boys with autism). The authors thank the children and families who participated in this study, as well as students, interns, volunteers, postdocs, clinicians, and administrative staff at the Center for Autism Research, as well as their funding sources: NIDCD R01DC018289 (PI: J.P.-M.) and a CHOP Research Institute Director's Award to J.P.-M.; and the Allerton Foundation (PI: R.T.S.), and NICHD 5U54HD086984 (MPI: Robinson & R.T.S.) to R.T.S. The authors have declared that they have no competing or potential conflicts of interest.

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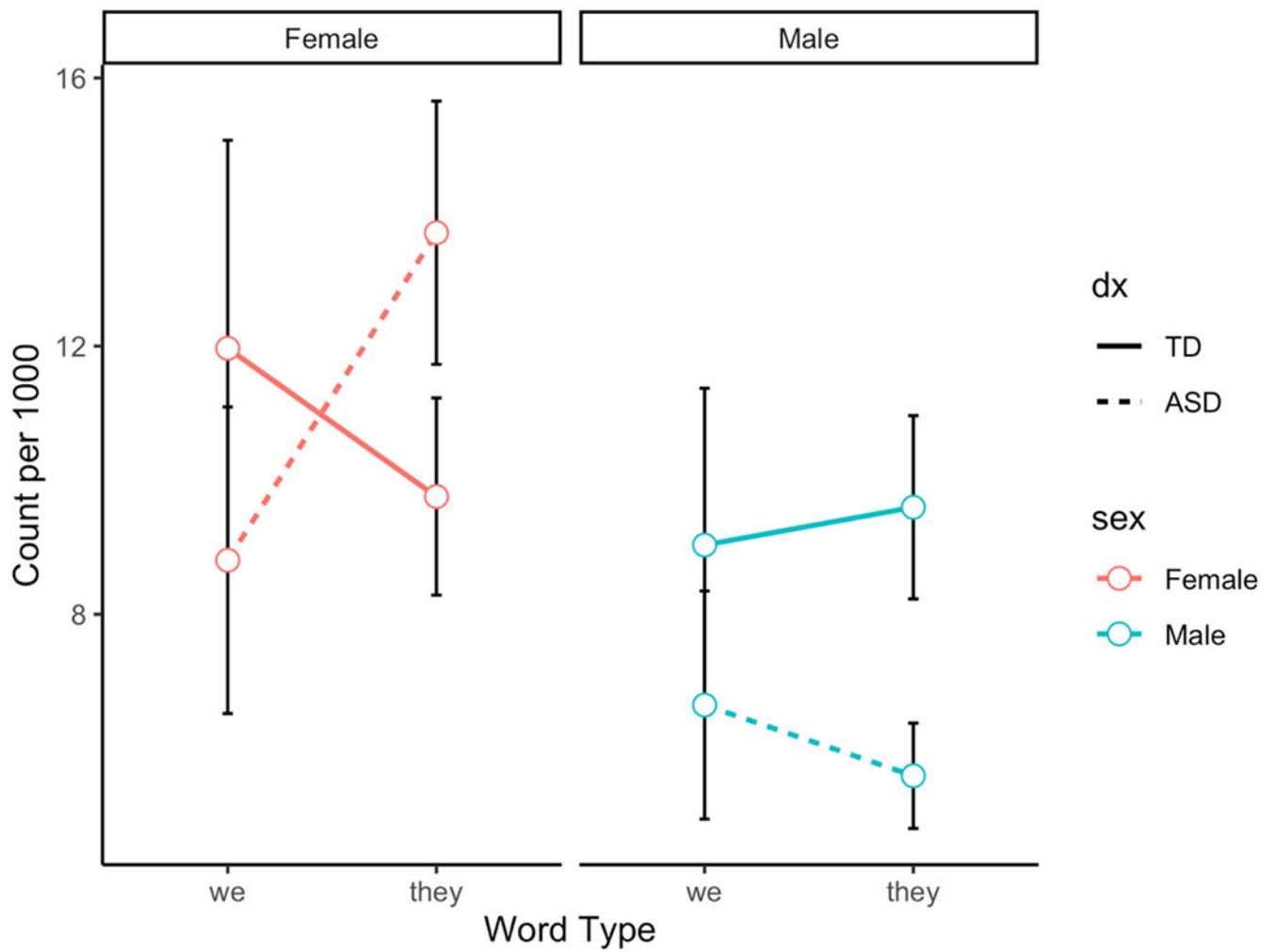


Figure. Estimated marginal means (EMM) and standard errors (error bars) of “we” variant production and “they” variant production per 1000 words in girls and boys with and without ASC, in two separate models accounting for age, full-scale IQ, and confederate ID.

Participant characteristics showing sex ratio, self-reported racial group, and parental education distribution by diagnostic group, as well as mean (standard deviation), and minimum-maximum values for age, IQ, ADOS-2 calibrated severity scores (CSS), SCQ scores, and Vineland-2 (VABS-2) expressive vocabulary scaled scores by diagnostic group and sex. Chi-square tests were used to compare distributions of sex, race, and parent education between diagnostic groups, and t-tests compared mean values for continuous variables. The first subcolumn in the table (“Sex”) refers to overall comparisons between males and females collapsed across diagnostic group, the second (“Dx”) to overall comparisons between ASC and TD groups collapsed across sex, and the third (“Sex in ASC”) to a comparison of males and females in the ASC subgroup alone.

Table.

	ASC (N = 50)		TD (N = 37)		Effects	
	Female	Male	Female	Male	Sex	Sex in ASC
Sex ratio	17f, 33m (66% Male)		15f, 22m (59% Male)		$\chi^2=0.16, p=0.69$	
Race	Black/African American: 3 Asian or Pacific Islander: 1 White/Caucasian: 40 Multiracial: 4 Other: 1		Black/African American: 8 Asian or Pacific Islander: 1 White/Caucasian: 23 Multiracial: 5 Other: 0		$\chi^2=6.52, p=0.16$	
Maternal education (in years)	<=12 years: 3 13-16 years: 24 17+ years: 22 Unknown: 1		<=12 years: 2 13-16 years: 23 17+ years: 12		$\chi^2=1.52, p=0.47$	
Age (years)	11.48 (2.38) 8.90-16.35	11.79 (2.55) 8.25-16.66	11.38 (2.44) 8.22-15.51	10.58 (2.44) 8.16-16.64	p=.74 d=-.07	p=.68 d=.13
Full-Scale IQ	109.76 (11.99) 79-130	105.27 (13.03) 79-131	105 (13.07) 86-129	109.68 (13.70) 86-133	p=.88 d=-.03	p=.24 d=-.35
Verbal IQ	108.35 (11.66) 85-130	104.76 (13.17) 70-130	105.87 (14.34) 80-128	109.27 (14.78) 86-131	p=.87 d=-.04	p=.35 d=-.28
Non-verbal IQ	108.24 (14.48) 80-130	104.55 (12.43) 80-130	103.07 (12.93) 81-122	107.68 (11.49) 89-130	p=.997 d=0	p=.35 d=-.28
ADOS-2 CSS Total	6.59 (2.69) 1-10	6.97 (2.01) 2-10	1.07 (0.26) 1-2	1.27 (0.46) 1-2	p=.43 d=.09	p<2e-16 d=3.27
ADOS-2 SA CSS	6.47 (2.62) 1-10	7.36 (1.76) 3-10	1.40 (0.74) 1-3	1.73 (0.83) 1-3	p=.09 d=.20	p<2e-16 d=3.22
ADOS-2 RRB CSS	7.35 (1.66) 5-10	6.30 (2.39) 1-10	1 (0) 1-1	2.09 (2.11) 1-7	p=.82 d=-.03	p<2e-16 d=2.50
SCQ Total *	17.94 (7.11) 6-31	18.34 (6.79) 5-33	2.73 (2.52) 0-8	2.68 (3.27) 0-14	p=.87 d=.02	p<2e-16 d=2.81
VABS-2 * Expressive Voc	13.94 (3.51) 7-20	12.45 (3.15) 7-18	17.00 (1.35) 14-19	17.18 (1.68) 13-19	p=.24 d=.27	p<.001 d=1.52

* 1 male participant from the ASC group was missing an SCQ score; 2 female participants from the TD group were missing VABS-2 Expressive Vocabulary scaled scores.

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