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Postzygotic single-nucleotide mosaicisms contribute to the etiology of autism spectrum disorder and autistic traits and the origin of mutations

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Abstract

The roles and characteristics of postzygotic single-nucleotide mosaicisms (pSNMs) in autism spectrum disorders (ASDs) remain unclear. In this study of the whole exomes of 2,361 families in the Simons Simplex Collection, we identified 1,248 putative pSNMs in children and 285 *de novo* SNPs in children with detectable parental mosaicism. Ultra-deep amplicon resequencing suggested a validation rate of 51%. Analyses of validated pSNMs revealed that missense/loss-of-function (LoF) pSNMs with a high mutant allele fraction (MAF \geq 0.2) contributed to ASD diagnoses (*P* = 0.022, odds ratio [OR] = 5.25), whereas missense/LoF pSNMs with a low MAF (MAF<0.2) contributed to autistic traits in male non-ASD siblings (*P* = 0.033). LoF pSNMs in parents were less likely to be transmitted to offspring than neutral pSNMs (*P* = 0.037), and missense/LoF pSNMs in parents with a low MAF were transmitted more to probands than to siblings (*P* = 0.016, OR = 1.45). We estimated that pSNMs in probands or *de novo* mutations inherited from parental pSNMs increased the risk of ASD by approximately 6%. Adding pSNMs into the transmission and *de novo* association test model revealed 13 new ASD risk genes. These results expand the existing repertoire of genes involved in ASD and shed new light on the contribution of genomic mosaicisms to ASD diagnoses and autistic traits.

KEYWORDS

autism spectrum disorder, autistic traits, parental mosaicism, single-nucleotide mosaicism

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1 | INTRODUCTION

Autism spectrum disorder (ASD) is a neurodevelopmental disorder characterized by impairments in social communication and interaction and restricted repetitive behavior or interests (American Psychiatric Association, 2013). Severe subclinical cognitive or behavioral problems have been reported in relatives of patients with ASD (Davidson et al., 2014; Losh, Childress, Lam, & Piven, 2008). Broadly speaking, both genetic and environmental factors contribute to the etiology of ASD (Gaugler et al., 2014; Hallmayer et al., 2011). However, known ASD risk factors explain the cause of the condition for only a fraction of ASD patients, and much of the genetic etiology of ASD remains unknown (Devlin & Scherer, 2012; Ronemus, Iossifov, Levy, & Wigler, 2014; Sanders et al., 2012). Over the last decade, the key role of de novo germline mutations in the etiology of ASD was established, which led to the discovery of many ASD risk genes (De Rubeis et al., 2014; Dong et al., 2014; lossifov et al., 2014; Kong et al., 2012; Neale et al., 2012; Sanders et al., 2015; Sanders et al., 2012). The Simons Simplex Collection (SSC), a cohort of simplex ASD families designed to facilitate studies of de novo variations (Fischbach & Lord, 2010), remains a valuable resource for genetic studies of ASD.

Genomic mosaicism describes a phenomenon where an individual developed from a single fertilized egg harbors two or more cell populations with distinct genomes resulting from postzygotic mutations (Strachan & Read, 2004). It has long been known that cancer is predominantly caused by postzygotic mutations (Watson, Takahashi, Futreal, & Chin, 2013; Yates & Campbell, 2012). Recently, mosaicism was shown to play a critical role in many noncancer disorders (Biesecker & Spinner, 2013), and sporadic cases of mosaicism have been reported in clinically unremarkable individuals (Huang et al., 2014; Youssoufian & Pyeritz, 2002). Although the genomic characteristics of postzygotic mosaicism have been thoroughly explored in cancer studies (Alexandrov et al., 2013), its characteristics in individuals not afflicted with cancer require further investigation. Evidence suggesting that some heterozygous lethal mutations could be nonlethal in mosaic form and result in noncancer disorders (Bryant & Zornetzer, 1973; Weinstein et al., 2016) supports a distinct etiological contribution of postzygotic mutations from germline mutations to genetic disorders. Mosaic mutations in causal genes of genetic disorders have also been linked to mild phenotype traits of genetic disorders, but not full diagnosis (Parrini, Mei, Wright, Dorn, & Guerrini, 2004; Xu et al., 2015). Finally, many studies have shown that parental mosaicisms could contribute to recurrent risk of genetic disorders in their children, which were previously under-recognized (Campbell et al., 2014; Parrini et al., 2004; Xiong et al., 2016; Xu et al., 2015).

In recent years, sporadic case reports (Castermans et al., 2008; Fontenelle, Mendlowicz, Bezerra de Menezes, dos Santos Martins, & Versiani, 2004; Meyer, Axelsen, Sheffield, Patil, & Wassink, 2012; Papanikolaou et al., 2006; Sauter et al., 2003) and one larger study (Yurov et al., 2007) linked mosaicism of large-scale events such as structural variation and copy-number variation (CNV) to ASD. More recently, a study explored the contribution of mosaic single-nucleotide variations (SNVs) to ASD using the whole exomes of 2,388 families in SSC (Freed & Pevsner, 2016). They found a strong bias for mosaic mutations in ASD probands relative to their unaffected siblings. However, their detection strategy, which began with a list of previously identified *de novo* germline mutations, limited the sensitivity of their study for detecting mosaic mutations with a relatively low mutant allele fraction (MAF). They only validated a small subset of their putative mosaic sites by Sanger sequencing or pyrosequencing, and thus had a limited capacity to distinguish mosaic SNVs from heterozygous SNVs (Contini et al., 2015; Huang et al., 2014; Yamaguchi et al., 2015); therefore, *de novo* germline mutations could not be convincingly ruled out. Their study focused on ASD probands and their siblings, but they did not investigate the roles of mosaicisms from the parents of their subjects.

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The aims of our study were to accurately identify and rigorously validate postzygotic single-nucleotide mosaicisms (pSNMs) in ASD families, explore the genomic characteristics of pSNMs, investigate the etiological contributions of child pSNMs and *de novo* SNPs with detectable parental mosaicism to ASD, determine the contributions of pSNMs to autistic traits, and discover new ASD risk genes.

2 | MATERIALS AND METHODS

2.1 | Subjects

pSNMs in children ("child pSNMs") and pSNMs in parents that were transmitted to their offspring as heterozygous mutations ("*de novo* SNPs with detectable parental mosaicism") were collected from the WES data in the SSC, a large collection of simplex ASD pedigrees (Fischbach & Lord, 2010). Complete WES data were obtained for 2,374 families, including 1,776 quartet pedigrees, 598 trio pedigrees, 1,156 from CSHL, 763 from Yale, and 455 from the Eichler dataset (Supp. Table S1). All Yale whole-blood samples available for validation are listed in Supp. Table S1.

2.2 | Detection of child pSNMs and *de novo* SNPs with detectable parental mosaicism

The bioinformatics pipeline used to detect child pSNMs and *de novo* SNPs with detectable parental mosaicism is summarized in Supp. Figure S1. The detection scheme followed a MosaicHunter-based pipeline as described previously (Huang et al., 2014; Huang et al., 2017). Sequence data from three centers were aligned against the GRCh37.p13 human reference genome by BWA (Li & Durbin, 2009), after which Picard (http://broadinstitute.github.io/picard/) and GATK (McKenna et al., 2010) were used to remove PCR duplicates and perform indel realignment and base quality recalibration. Candidate indels were identified by GATK's UnifiedGenotyper, after which the involved regions were masked for subsequent analyses. Finally, the processed reads were utilized as the input of MosaicHunter.

For child pSNMs, all putative sites were first detected using the trio mode of MosaicHunter. Children with dramatically more putative mosaic mutations (>50 putative pSNMs/subject) than the average number were excluded to remove potential noise from technical artifacts. After exclusion of these individuals, 2,361 families remained for

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the subsequent analyses, including 1,739 guartet pedigrees and 622 trio pedigrees (Supp. Table S1). We observed significantly more singlestranded G>T mutations than C>A mutations in the Yale dataset only (P<2.2e-16, binomial test; Supp. Fig. S2A). Among the singlestranded G>T mutations, approximately 99% had fewer than eight T alleles, whereas more than 90% had a MAF of less than 10% in the WES data. We randomly selected 80 putative pSNMs for validation using PGM amplicon resequencing, which revealed that 97% (62/64) of the validated single-stranded G>T mutations were false-positive sites (Supp. Table S2; Supp. Fig. S2B). The excessive single-stranded G>T mutations might have been due to oxidative DNA damage during the exome library preparation process (Schmitt et al., 2012), so we removed them by applying an additional filter, which removed Yale putative G>T pSNMs with fewer than eight T alleles. Putative pSNMs existing in more than one individual tended to cluster together and occur in genome regions enriched with CNVs or tandem repeats (Supp. Fig. S3); these putative pSNMs were also filtered from the set used for subsequent analyses. Moreover, child pSNMs having mutant alleles in the WES data from either parent were also filtered. All putative child pSNMs are listed in Supp. Table S3.

For *de novo* SNPs with detectable parental mosaicism, all genomic sites that were heterozygous in the child and mosaic in at least one parent (posterior probability of parental mosaic genotype \geq 0.05) were first detected by using the trio mode of MosaicHunter. Next, the single mode of MosaicHunter was applied to the WES data of the corresponding mosaic parent to confirm the mosaic genotype. The pSNMs with mutant alleles that were common in the NCBI Single Nucleotide Polymorphism database (dbSNP) (population allele frequency >0.05) or multiple unrelated ASD pedigrees were also filtered. All putative *de novo* SNPs with detectable parental mosaicism are listed in Supp. Table S3. The variants were submitted to Database of Single Nucleotide Polymorphisms (dbSNP). Bethesda (MD): National Center for Biotechnology Information, National Library of Medicine. dbSNP accession: {ss2137510534, ss2729283267-ss2729284734}. Available from: http://www.ncbi.nlm.nih.gov/SNP/.

2.3 Validation of pSNMs

Ultra-deep amplicon-based resequencing methods are widely used to validate mosaic variants and are highly accurate (Contini et al., 2015; Nota et al., 2013; Sala Frigerio et al., 2015; Yamaguchi et al., 2015). We employed PGM amplicon sequencing of mosaicism (PASM) (Xu et al., 2015), a PGM ultra-deep amplicon sequencing method, followed by a Bayesian model to validate putative pSNMs identified in Yale's SSC samples. The average depth-of-coverage was approximately 10,000X (Supp. Table S4). All primers used for pSNM validation are listed in Supp. Table S5.

In addition to the experimental validation described above, phasing of the putative pSNMs relative to nearby inherited heterozygous SNVs (informative SNPs), as well as SSC whole-genome sequencing (WGS) data, were also used as auxiliary *in silico* validation methods for putative pSNMs (Supp. Table S6). Putative pSNMs were phased to nearby high-quality heterozygous variants (P>0.05, binomial test, mapping quality \geq 20, base quality \geq 20) on reads covering putative pSNMs or read pairs to validate their mosaic status and determine their parental haplotype. For WGS data validation, only those variants that were significantly different from the binomial expectation were classified as mosaic sites ($P \le 0.05$, binomial test), whereas variants without mutant alleles and variants following the binomial expectation with a probability of 0.5 were classified as homozygous and heterozygous sites, respectively.

2.4 | Extending TADA to include pSNMs

The estimation of the Bayes factor for each gene was performed using the strategy described in the original TADA model (He et al., 2013). We combined evidence from PASM-validated child pSNMs in Yale's SSC samples, as well as all SSC *de novo* SNPs with detectable parental mosaicism, with *de novo* SNVs reported by the Autism Sequencing Consortium and Autism Genome Project (Iossifov et al., 2014). We assumed that the data from each type of mutation were independent. In the first step, we estimated the prior parameters of each type of mutation using the strategy described in the original TADA model (He et al., 2013). Next, we computed the Bayes factor of each gene as the product of the Bayes factor from each type of mutation. In the case of combining *de novo* mutations, child pSNMs and *de novo* SNPs with detectable parental mosaicism, the Bayes factor was calculated as follows:

$$B = B_{denovo} \times B_{pSNM} \times B_{denovo_pm}$$

where B_{denovo} is the Bayes factor of each gene from *de novo* loss-offunction (LoF) mutations and *de novo* missense mutations with deleterious effects, which have been described and calculated previously (He et al., 2013; Sanders et al., 2015); B_{pSNM} is the Bayes factor from functional pSNMs with a high MAF; and B_{denovo_pm} is the Bayes factor from *de novo* functional SNPs with detectable parental mosaicism.

We considered the exonic length, base pair composition, and observed mosaic mutation rate of each gene in non-ASD siblings (Supp. Table S7) to calculate the expected per-gene mosaic mutation rate, following the strategy of a previous study of de novo mutations in ASD (Sanders et al., 2012). The mean prior relative risk (γ) of child pSNMs and de novo SNPs with detectable parental mosaicism was estimated using their relative burdens in the SSC. Burden (λ) is defined as the ratio of the number of mutations (child pSNMs or de novo SNPs with detectable parental mosaicism) per ASD proband to the number of mutations per unaffected sibling (Table 1). Based on a previous estimation that 1,000 out of 18,665 Refseq genes contribute to ASD (He et al., 2013), 5.4% (π) of human genes would be randomly considered as ASD risk genes under the null hypothesis. As a result, the mean prior relative risks for missense/LoF child pSNMs with a high MAF and de novo missense/LoF mutations with a low MAF and detectable parental mosaicism were 36.35 and 22.22, respectively, according to the following equation (see details in the Supp. Methods of He et al. [2013]):

 $\pi\left(\gamma-1\right)=\lambda-1$

 TABLE 1
 Increased burden of pSNMs in ASD probands versus unaffected siblings

			Total number of pS	NMs		
			Proband	Sibling		
Category			N = 732/2,321	N = 571/1,779	OR (95% CI)	P value
Yale PGM-validated child pSNMs	Child pSNMs with high MAF	All	25	18	NA	0.447
		Missense/LoF	15	4	5.25 (3.88, 6.62)	0.022
		Other	10	14	NA	0.926
	Child pSNMs with low MAF	All	85	71	NA	0.606
		Missense/LoF	39	38	0.74 (0.10, 1.37)	0.801
		Other	46	33	NA	0.295
SSC <i>de novo</i> SNPs with detectable parental mosaicism (only present in one child)	Parental pSNMs with high MAF	All	25	17	NA	0.351
		Missense/LoF	8	8	0.53 (0, 1.80)	0.704
		Other	17	9	NA	0.183
	Parental pSNMs with low MAF	All	59	26	NA	0.012
		Missense/LoF	28	10	1.45 (0.50, 2.39)	0.016
		Other	31	16	NA	0.143

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Thee expression profiles of new ASD risk genes in different brain regions and developmental stages were obtained from the GTEx (GTEx Consortium, 2013) Portal on April 20, 2017 and two previous studies (Johnson et al., 2009; Kang et al., 2011).

2.5 | Estimating the contributions of pSNMs to ASD in probands from the SSC

lossifov et al. (2014) previously described a model for *de novo* variations in which siblings have a baseline *de novo* mutation rate, whereas probands have the same baseline rate and an additional burden of mutations. They used the "ascertainment differential" to estimate the contribution of *de novo* mutations to ASD (lossifov et al., 2014). The same strategy was applied in our study to estimate the contribution of child and *de novo* SNPs with detectable parental mosaicism to ASD diagnoses in the SSC.

The occurrence rate of validated missense/LoF pSNMs with a high MAF was about 0.02 in affected probands and about 0.007 in unaffected siblings (P = 0.022, Table 1), so the "ascertainment differential" was about 0.013 (0.02-0.007 = 0.013). Therefore, we estimated that approximately 65.8% of missense/LoF pSNMs with a high MAF in probands contribute to ASD diagnosis. Given that the occurrence rate of pSNMs in probands and the sensitivity of MosaicHunter for detecting child pSNMs with a high MAF in 80X WES data were approximately 40%, we roughly estimated that child pSNMs with a high MAF increased the risk of ASD by approximately 3.4% in SSC probands. Similarly, since the rate of missense/LoF pSNMs among parental pSNMs with a low MAF (only transmitted to one child) was about 0.012 in affected probands and 0.0056 in unaffected siblings (P = 0.016, Table 1), the ascertainment differential was about 0.0064. Therefore, we estimated that approximately 53.4% of parental missense/LoF

pSNMs with a low MAF that were only transmitted to probands contribute to ASD diagnoses. Given the occurrence rate of *de novo* SNPs with detectable parental mosaicism in probands and the sensitivity of MosaicHunter for detecting *de novo* SNPs with detectable parental mosaicism with low MAF in 80X WES data (approximately 25%), we roughly estimated that *de novo* SNPs with detectable parental mosaicism increased the risk of ASD by approximately 2.6% in SSC probands. In total, we estimated that pSNMs might contribute to approximately 6% of the ASD diagnoses in the SSC.

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2.6 | Protein-protein interaction network analysis

Protein-protein interaction networks were analyzed with DAPPLE (Reich et al., 2006; Rossin et al., 2011) and plotted with Cytoscape (Shannon et al., 2003). The input for the analysis was the combination of the ASD risk genes from Sanders et al. (2015), which were extracted using the original TADA-Denovo model, and new ASD risk genes identified in this study. All genes within each subnetwork were input into DAVID (Huang da, Sherman, & Lempicki, 2009) to analyze network enrichment in gene ontology terms. We also used the STITCH (Kuhn, von Mering, Campillos, Jensen, & Bork, 2008) and STRING (Szklarczyk et al., 2015) tools to analyze the protein-protein interaction network.

3 | RESULTS

3.1 | Identification of child pSNMs and *de novo* SNPs with detectable parental mosaicism

We began our study by detecting pSNMs in children ("child pSNMs") and pSNMs in parents that were transmitted to offspring as heterozygous mutations ("*de novo* SNPs with detectable parental mosaicism")

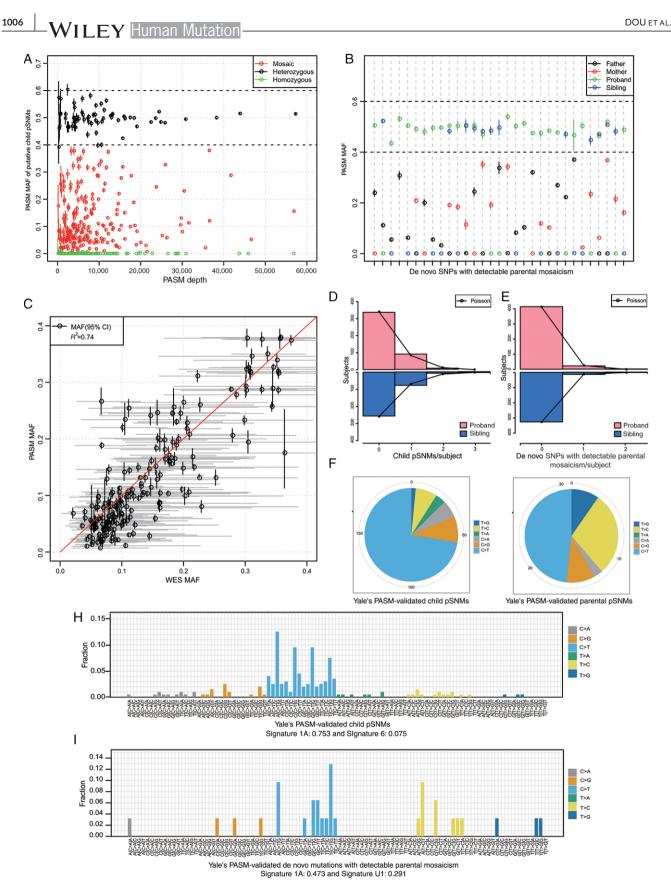


FIGURE 1 Validation results and characteristics of pSNMs. **A** and **B**: PASM validation results of putative child pSNMs (**A**) and PASM-validated *de novo* SNPs with detectable parental mosaicism in all family members (**B**). **C**: The mutant allele fractions of the validated pSNMs estimated by PASM had good concordance with the fractions from the WES data. **D** and **E**: The per subject distribution of child pSNMs (**D**) and *de novo* SNPs with detectable parental mosaicism (**E**) followed the Poisson distribution. **F** and **G**: Decreased ratio of C:G>T:A to T:A>C:G transitions from child pSNMs (**F**) to *de novo* SNPs with detectable parental mosaicism (**G**). **H** and **I**: The mutation signatures of child pSNMs (**H**) and *de novo* SNPs with detectable parental mosaicism (**I**) were consistent with the previously reported Signature 1A of cancer mutations (Alexandrov et al., 2013)

from SSC whole-exome sequencing (WES) data using a Bayesian genotype named MosaicHunter (Huang et al., 2014; Huang et al., 2017) that we had previously developed. We identified 1,248 putative child pSNMs and 285 putative de novo SNPs with detectable parental mosaicism from the WES data of 2,361 SSC families (Supp. Table S3). We were able to obtain whole-blood DNA samples from 753 of the SSC families from Yale University ("Yale's SSC families") and performed experimental validation on their 376 putative child pSNMs and 71 putative de novo SNPs with detectable parental mosaicism using ultradeep amplicon resequencing by PGM, a method (named PASM) that we had previously reported (Xu et al., 2015). The study was approved by the Internal Review Boards at Peking University and Yale University. 53% (199/376) of the putative child pSNMs and 44% (31/71) of the putative de novo SNPs with detectable parental mosaicism were validated as true (Fig. 1A and B; Supp. Table S4). As shown in Figure 1C, the mosaic allele fractions estimated by PASM had overall good concordance with the allele fractions estimated from WES data, but mostly due to the much higher depth-of-coverage, MAFs estimated by PASM had much narrower 95% credible intervals and higher accuracy. Because we could not obtain the rest of the SSC samples, we performed in silico validations of all putative SSC pSNMs using SSC WGS data and phasing information from informative SNPs (see Materials and Methods), and found similar validation rates (Supp. Table S8).

3.2 | Characteristics of validated child pSNMs and *de novo* SNPs with detectable parental mosaicism

We studied the characteristics of the experimentally validated pSNMs. The prevalence of the validated pSNMs per subject was 0.152 for child pSNMs and 0.030 for de novo SNPs with detectable parental mosaicism: the pSNM distributions followed the expected Poisson distributions (Fig. 1D and E). We observed no biased parent-oforigin for child pSNMs or *de novo* SNPs with detectable parental mosaicism (Supp. Table S9). We also observed that the ratio of C:G>T:A to T:A>C:G transitions was much lower among de novo SNPs with detectable parental mosaicism compared with that among child pSNMs (Fig. 1F and G), likely due to the biased gene conversion, a meiotic repair bias that favors G/C over A/T alleles (Duret & Galtier, 2009). As shown in Figure 1H and I, the mutational signatures of both child and de novo SNPs with detectable parental mosaicism shared certain similarities with the previously reported mutational signature 1A in human cancers (Alexandrov et al., 2013; Rosenthal, McGranahan, Herrero, Taylor, & Swanton, 2016), with similarity weights of 0.753 and 0.473, respectively. This shared pattern between cancer and noncancer samples could be partly explained by the elevated rate of spontaneous deamination of 5-methyl-cytosine at NpCpG trinucleotides (Pfeifer, 2006).

3.3 Contribution of pSNMs to ASD diagnoses

Based on the 199 PASM-validated pSNMs in 732 probands and 571 siblings from the Yale dataset, the MAFs of probands were significantly higher than those of siblings for missense/LoF pSNMs, but

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not for other neutral pSNMs (Fig. 2A and B). As demonstrated in Figure 2C, missense/LoF pSNMs with higher MAFs have a higher odds ratio (OR) when probands and siblings are compared, and it reached the significance threshold (P<0.05) when the cut-off between high MAF and low MAF was 0.2 or higher (Fig. 2C; Table 1). As demonstrated in Figure 2C, we used a sliding-window strategy to study whether changing the cut-off value between high and low MAF pSNMs changed our conclusions. Our results suggest that the enrichment of missense/LoF pSNMs with higher MAFs when probands and siblings were compared reached the significance threshold (P<0.05) when the cutoff was 0.2, and the OR became even higher with greater cut-off thresholds. To further confirm this finding, we applied the Wilcoxon rank sum test to test the burden of functional pSNMs among many possible cutoffs (MAF cutoff = 0, 0.05, 0.10, 0.15, 0.16, 0.17, 0.18, 0.19, 0.20, 0.21, 0.22, 0.23, 0.24, 0.25), and observed a significant burden among many possible cutoffs from 0.15 to 0.25. These results suggested that the enrichment was real and not likely to be explained by chance effects. Interestingly, the significantly increased burden in probands versus siblings was only observed for missense/LoF pSNMs with a high MAF (P = 0.022, one-sided Wilcoxon rank sum test), but not for missense/LoF pSNMs with low MAF and other pSNMs with neutral functional effects (Fig. 2D; Table 1). We further confirmed our findings using all putative pSNMs identified in 2,321 probands and 1,779 siblings, which revealed a higher burden of pSNMs with high MAFs in probands relative to that of siblings for LoF mutations (P = 0.15, twotailed Wilcoxon rank sum test, OR = 2.5) and missense mutations with deleterious effects (Adzhubei et al., 2010) (Mis3 mutations, P = 0.009, two-tailed Wilcoxon rank sum test, OR = 2.2) (Supp. Table S10).

Unlike missense/LoF pSNMs with high MAFs that contribute to ASD diagnoses directly, LoF pSNMs with low MAFs in parents were less likely to be transmitted to offspring than other pSNMs in parents (P = 0.037, one-sided Fisher's exact test, OR = 5.36; Fig. 3A), and a similar trend was also observed for Mis3 missense pSNMs (OR = 1.63; Figure 3A). Since a large proportion of naturally arising missense/LoF pSNMs were predicted to have deleterious functional effects, they were more likely to be heterozygous lethal and thus could not be transmitted to offspring. Next, we analyzed the transmission bias of missense/LoF pSNMs not transmitted to multiple children (P = 0.016, one-sided Wilcoxon rank sum test; Fig. 3B; Table 1).

We next estimated the contribution of pSNMs to ASD diagnoses in the SSC following the strategy of lossifov et al. (2014) (see *Materials and Methods*). We estimated that approximately 65.8% of missense/LoF pSNMs with high MAFs in probands and approximately 53.4% of parental missense/LoF pSNMs with low MAFs only transmitted to probands contribute to ASD diagnoses. Taking into account the sensitivity of MosaicHunter for detecting pSNMs, we roughly estimated that child pSNMs with high MAFs increased the risk of ASD by approximately 3.4% in SSC probands, and missense/LoF parental pSNMs with low MAFs (only transmitted to one child) increased the risk of ASD by approximately 2.6% in SSC probands. Therefore, we estimate that pSNMs contribute to approximately 6% of ASD diagnoses in the SSC.

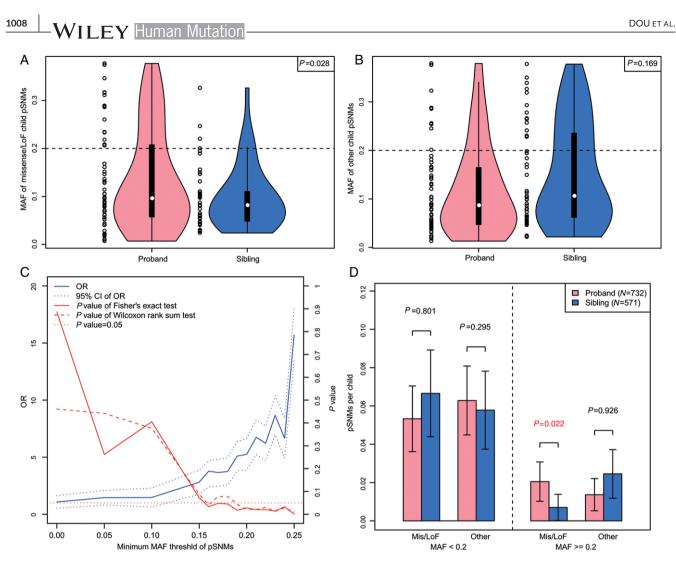


FIGURE 2 Contribution of missense/LoF child pSNMs with high MAFs to ASD diagnoses. **A** and **B**: Higher MAFs of validated pSNMs in ASD probands compared with unaffected siblings were observed for missense/LoF pSNMs (**A**), but not for other pSNMs with neutral functional effects (**B**). **C**: The increased burden of missense/LoF pSNMs with high MAFs between probands and siblings varied across different MAF cutoffs. The increased burden became significant when the MAF cutoff was 0.2 or larger. **D**: The enrichment of pSNMs in probands versus siblings was observed only for missense/LoF pSNMs with high MAFs

3.4 | Autistic traits in siblings carrying pSNMs

We assessed the potential contribution of pSNMs to broader autistic phenotypes in unaffected siblings. After excluding subjects who harbored reported *de novo* LoF germline mutations (lossifov et al., 2014) or *de novo* small deletions (Sanders et al., 2015), we observed that male siblings carrying missense/LoF pSNMs with low MAFs had teacher SRS scores significantly higher than those of male siblings without pSNMs (P = 0.033, one-sided Wilcoxon rank sum test; Fig. 3C). This increasing trend was not observed in male siblings carrying neutral pSNMs or missense/LoF pSNMs with high MAFs (Fig. 3C). The increasing trend was not observed in female siblings carrying missense/LoF pSNMs (Supp. Fig. S4A), which was consistent with the previously reported female protective effect for ASD (Constantino, 2016; Gockley et al., 2015).

3.5 | Autistic traits in parents carrying pSNMs

We also assessed the potential contribution of pSNMs to broader autistic phenotypes in parents carrying pSNMs. After exclusion of parents whose children harbored reported *de novo* LoF germline mutations (lossifov et al., 2014) or *de novo* small deletions, we observed that fathers transmitting missense/LoF pSNMs to probands also tend to have higher social responsiveness scale for adults (SRS-A) scores (P =0.173, one-sided Wilcoxon rank sum test), although this effect did not reach statistical significance, probably due to the small sample size of the analysis (Supp. Fig. S4B). In contrast, this increasing trend was not observed in mothers carrying pSNMs (P = 0.519, one-sided Wilcoxon rank sum test, Supp. Fig. S4C), which was also consistent with the previously reported female protective effect for ASD (Constantino, 2016; Gockley et al., 2015).

3.6 | New ASD risk genes revealed by integrating pSNMs into TADA

The increased burdens of child pSNMs and *de novo* SNPs with detectable parental mosaicism in ASD pedigrees suggested the hypothesis that, in addition to well-documented genetic factors such

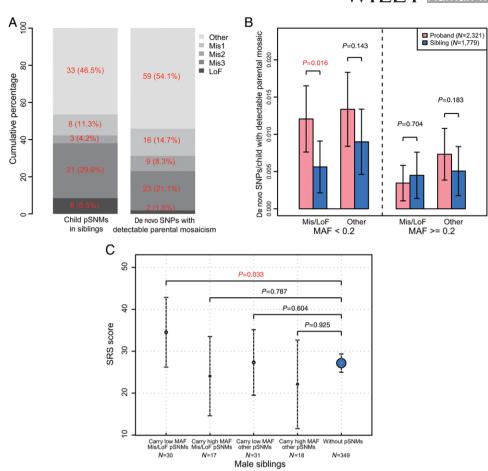


FIGURE 3 pSNMs with low MAFs contribute to autistic traits, whereas *de novo* SNPs with detectable parental mosaicism with low MAFs contribute to ASD diagnoses in offspring. **A**: LoF pSNMs in parents were less likely than other parental pSNMs to be transmitted to offspring. All pSNMs in siblings were validated using PASM, and the validation rate for putative *de novo* SNPs with detectable parental mosaicism with low MAFs was approximately 70%. **B**: Missense/LoF parental pSNMs with low MAFs that were transmitted to offspring (each pSNM here was transmitted to one child) showed approximately twofold enrichment in ASD probands versus unaffected siblings. **C**: Male siblings carrying missense/LoF pSNMs with low MAFs had teacher SRS scores significantly higher than those of male siblings without pSNMs, after all subjects carrying *de novo* LoF germline mutations (lossifov et al., 2014) or *de novo* small deletions were excluded (Sanders et al., 2015)

as *de novo* germline mutations, pSNMs could provide new insight into the identities of ASD risk genes.

To test this hypothesis, we first analyzed the FDR scores of the genes identified by the original TADA model, which considered only de novo germline mutations (TADA-Denovo). We used a permutation test to estimate the expected distribution of TADA FDR scores. For each observed pSNM, a gene was selected randomly based on the mutation rates of all Refseq genes, which were calculated using base contents and gene lengths. The corresponding TADA FDR q-value of the randomly selected gene was obtained. The process was repeated 100 times, and the median of the highest FDR scores from 100 iterations was used as the expected value to compare with the highest observed FDR score. This procedure was repeated with the second highest FDR score, third highest FDR score, and so on to account for all observed genes carrying pSNMs. Our analysis was limited to only functional pSNMs with high MAFs in children and *de novo* functional SNPs in children with detectable mosaicism and low MAFs in parents. As shown in Figure 4A and B, a list of genes carrying pSNMs showed significantly lower FDR scores than expected, which suggested an overlap of the genetic basis of pSNMs and *de novo* germline mutations contributing to ASD. On the basis of these observations, we decided to integrate child pSNMs and *de novo* SNPs with detectable parental mosaicism into the TADA-Denovo model as factors. By applying our extended model, 58 ASD risk genes were identified with FDR≤0.1, including 13 new ASD risk genes that were not identified by the original TADA-Denovo model (Supp. Table S7). All 13 newly identified genes (ASXL3, CACNA2D3, MED13L, MEGF11, MYH10, MYO9B, PRKAR1B, PYHIN1, RIMS1, TANC2, TBL1XR1, TMEM39B, TSPAN4) had some evidences associated with ASD (Basu, Kollu, & Banerjee-Basu, 2009; Xu et al., 2012). Of particular interest, we found five genes (MFRP, MYO9B, PTK7, TANC2, MEGF11) carrying both Mis3/LoF de novo mutations (Dong et al., 2014; lossifov et al., 2014; Sanders et al., 2012) and functional pSNMs in probands, and one additional gene (C3orf35) carrying both a small de novo deletion (Sanders et al., 2015) and a functional pSNM in probands.

We next considered the functions of these newly identified ASD risk genes by analyzing protein-protein interactions using DAPPLE (Rossin et al., 2011). Eight of the nine newly identified ASD risk genes with

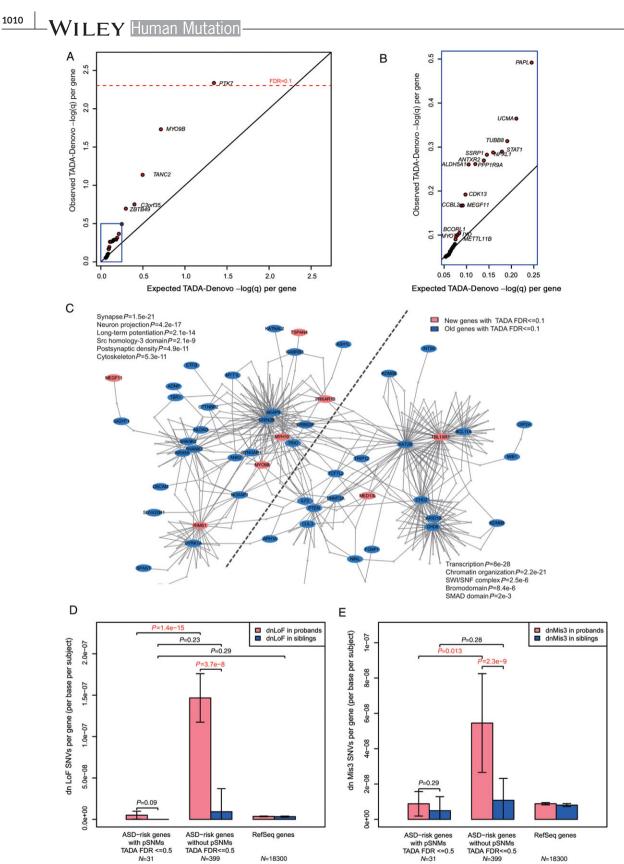


FIGURE 4 Extending the TADA-Denovo model with pSNMs revealed new ASD risk genes and protein–protein interaction network analysis. **A** and **B**: Genes carrying pSNMs showed significantly higher FDR scores in the original TADA-Denovo model. The left-bottom part of (**A**) is enlarged in (**B**). **C**: The new ASD risk genes (labeled in red) shown are highly connected via protein–protein interactions with previously reported ASD risk genes (labeled in blue). The network was divided into two subnetworks, with one subnetwork related to the functions of neurons, the synapse and the cytoskeleton, whereas the other was related to transcription and chromatin organization. **D** and **E**: ASD risk genes with pSNMs have more *de novo* germline LoF/Mis3 SNVs in ASD probands than in unaffected siblings, but these genes carrying pSNMs tend to have fewer *de novo* LoF/Mis3 germline mutations per base per subject

annotations in the DAPPLE database were joined into a single network of previously reported ASD risk genes, with the overall network firmi topology remaining unchanged (Fig. 4C). Consistent with previous findings (Sanders et al., 2015), the network consisted of two functionally related subnetworks, with one subnetwork enriched in genes functioning in neurons, the synapse or the cytoskeleton, whereas the other was enriched in genes related to transcription or chromatin organization (Fig. 4C). Network analysis using two additional tools, STITCH (Kuhn et al., 2008) and STRING (Szklarczyk et al., 2015), confirmed our

results. As shown in Supp. Figure S5, STITCH and STRING created network topologies similar to that created by DAPPLE, and most of the new ASD risk genes were robustly included in the network generated by all three tools.

We observed that missense/LoF pSNMs with high MAFs in probands and missense/LoF de novo SNPs with detectable parental pSNMs in probands tended to be enriched in ExAC LoF-constraint exons (Lek et al., 2016; Samocha et al., 2014) (Supp. Table S11), whereas ASD risk genes with pSNMs tended to have fewer LoF/Mis3 de novo germline mutations per base per subject (Fig. 4D and 4E). Considering that some LoF-constraint genes and exons carrying pSNMs might not be able to bear heterozygous lethal de novo germline mutations, and thus the contribution of pSNMs to ASD might be underestimated using the TADA-Denovo model, we relaxed the FDR criterion for genes carrying child pSNMs with high MAFs to 0.5 and reanalyzed the proteinprotein interaction networks using DAPPLE. In this way, we found several other new, highly connected hub genes, including SSRP1, SREBF2, and STAT1, and connected the previously isolated network formed by WAC and TNRC6B to the large interaction network through SSRP1 (Supp. Fig. S6).

We further analyzed the expression profiles of the new ASD risk genes in different regions and developmental stages of the brain. As shown in Supp. Figure S7, the 25 new ASD risk genes carrying pSNMs in SSC probands tend to have higher expression in the cerebellar hemisphere (P = 0.057, two-tailed *t*-test) and cerebellum (P = 0.090, two-tailed *t*-test). In addition, most of the highly connected hub genes within the network showed elevated brain expression during the embryonic and fetal periods (Supp. Fig. S8). These results suggest that the newly identified ASD risk genes might play a role in the early development of the brain.

4 | DISCUSSION

In this study, we detected and validated child pSNMs and *de novo* SNPs with detectable parental mosaicism in the SSC dataset, the largest dataset of confident pSNMs in ASD cohorts. We found that pSNMs with varied MAFs have different risk effect sizes for ASD. While missense/LoF pSNMs with high MAFs contribute to ASD diagnoses directly, missense/LoF pSNMs with low MAFs contribute to broad autism phenotypes. In addition, we found that parents carrying missense/LoF pSNMs with low MAFs can transmit their mutant alleles to offspring and thus contribute to sporadic ASD cases, which highlights the importance of identifying pSNMs for genetic counseling. Elevated

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autistic traits were observed in non-ASD males, but not in females, confirming the female protective effect for ASD. In addition, we estimated that pSNMs contribute to the etiology of ASD in approximately 6% of ASD patients in the SSC dataset, revealed 13 new ASD risk genes, and included pSNMs in the TADA-Denovo model.

Missense/LoF pSNMs with higher MAFs had a higher OR when probands and siblings were compared, and it reached the significance threshold (P<0.05) when the cutoff between high MAF and low MAF was 0.2 or higher (Fig. 2C). However, we could not completely rule out the possibility of a chance effect, because there is a lack of publicly available data demonstrating depletion of functional pSNMs with high MAFs in the general population.

In comparison with the most recent work exploring the association of mosaics and ASD by Freed and Pevsner (2016), our study has much better precision (~53%) for pSNMs detection and much higher sensitivity for detection of pSNMs with relatively low MAFs (among 854 pSNMs we detected with a MAF <20%, they only found 54; among 156 PASM-validated pSNMs with a MAF <20%, they only found 17). For child mosaicisms, we identified approximately six times (1,248 vs. 221) as many putative pSNMs and experimentally validated approximately 17 times (376 vs. 22) as many pSNMs in comparison with Freed and Peysner (2016). Moreover, the mosaic sites we identified had a much broader range of MAFs (1%-40% vs. 15%-34%), which enabled us to study the different contributions of pSNMs with varied MAFs. In addition to child mosaicisms, we also systematically identified and validated pSNMs in the parents of ASD cohorts. Among the SNPs in Yale's dataset that were identified in our study, only 32/285 putative de novo SNPs with detectable parental mosaicism and 0/31 SNPs with validated parental mosaicism were present in a previous list of de novo mutations by lossifov et al. (2014). In addition, we demonstrated that both child and parental mosaicism contribute to ASD and autistic traits. Interestingly, we estimated that approximately 65.8% of missense pSNMs with high MAFs contribute to ASD diagnoses, which was much higher than the proportion (13%) for pathogenic missense de novo heterozygous SNVs (lossifov et al., 2014). We speculated that the extremely high ASD risk effect sizes of missense child pSNMs might be due to the lack of germline cell competition and natural selection. Our results also implied that mutations that occur at early cell divisions affect more tissues and are more likely to be transferred to the next generation; thus, they might play important roles in human evolution.

Our results highlight the fact that mosaicisms resulting from postzygotic mutations could explain a proportion of the unrecognized genetic etiology of ASD. Given the moderate validation rate of child pSNMs, we only considered child pSNMs that were validated by PASM in Yale's dataset when extending the TADA-Denovo model. With the development of next-generation sequencing technologies, identification and validation of pSNMs in larger ASD cohorts will provide a more precise estimation of the contribution of pSNMs to ASD and aid researchers in finding more ASD risk genes.

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DISCLOSURE STATEMENT

The authors declare no conflict of interest.

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SUPPORTING INFORMATION

Additional Supporting Information may be found online in the supporting information tab for this article.

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