# Exome sequencing in sporadic autism spectrum disorders identifies severe *de novo* mutations

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**Evidence for the etiology of autism spectrum disorders (ASDs)** has consistently pointed to a strong genetic component complicated by substantial locus heterogeneity<sup>1,2</sup>. We sequenced the exomes of 20 individuals with sporadic ASD (cases) and their parents, reasoning that these families would be enriched for *de novo* mutations of major effect. We identified 21 de novo mutations, 11 of which were protein altering. Protein-altering mutations were significantly enriched for changes at highly conserved residues. We identified potentially causative de novo events in 4 out of 20 probands, particularly among more severely affected individuals, in FOXP1, GRIN2B, SCN1A and LAMC3. In the FOXP1 mutation carrier, we also observed a rare inherited CNTNAP2 missense variant, and we provide functional support for a multi-hit model for disease risk<sup>3</sup>. Our results show that trio-based exome sequencing is a powerful approach for identifying new candidate genes for ASDs and suggest that de novo mutations may contribute substantially to the genetic etiology of ASDs.

ASDs are characterized by pervasive impairment in language, communication and social reciprocity and restricted interests or stereotyped behaviors<sup>1</sup>. Several new candidate loci for ASDs have recently been identified using genome-wide approaches that discover individually rare events of major effect<sup>2</sup>. A number of genetic syndromes with features of the ASD phenotype, collectively referred to as syndromic autism, have also been described<sup>4</sup>. Despite this progress, the genetic basis for the vast majority of cases remains unknown. Several observations support the hypothesis that the genetic basis for ASDs in sporadic cases may differ from that of families with multiple affected individuals, with the former being more likely to result from *de novo* mutation events rather than inherited variants<sup>1,5–7</sup>. In this study, we sequenced the protein-coding regions of the genome (the exome)<sup>8</sup> to test the hypothesis that *de novo* protein-altering mutations contribute substantially to the genetic basis of sporadic ASDs. In contrast with array-based analysis of large *de novo* copy number variants (CNVs), this approach has greater potential to implicate single genes in ASDs.

We selected 20 trios with an idiopathic ASD, each consistent with a sporadic ASD based on clinical evaluations (**Supplementary Table 1**), pedigree structure, familial phenotypic evaluation, family history and/or elevated parental age. Each family was initially screened by array comparative genomic hybridization (CGH) using a customized microarray<sup>9</sup>. We identified no large (>250 kb) *de novo* CNVs but did identify a maternally inherited deletion (~350 kb) at 15q11.2 in one family (**Supplementary Fig. 1**). This deletion has been associated with increased risk for epilepsy<sup>10</sup> and schizophrenia<sup>11,12</sup> but has not been considered causal for autism.

Similar to researchers from a previous study<sup>13</sup>, who reported exome sequencing on ten parent-child trios with sporadic cases of moderate to severe intellectual disability, we performed exome sequencing on each of the 60 individuals separately by subjecting whole-blood derived genomic DNA to in-solution hybrid capture and Illumina sequencing (Online Methods). We obtained sufficient coverage to call variants for ~90% of the primary target (26.4 Mb) (Table 1). Genotype concordance with SNP microarray data was high (99.7%) (Supplementary Table 2), and on average, 96% of proband variant sites were also called in both parents (Supplementary Table 3). Given the expected rarity of true de novo events in the targeted exome (<1 per trio) (Supplementary Table 4) $^{14}$ , we reasoned that most apparently de novo variants would result from under calling in parents or systematic false positive calls in the proband. We therefore filtered variants previously observed in the dbSNP database, 1000 Genomes Pilot Project data<sup>15</sup> and 1,490 other exomes sequenced at the University of Washington (Supplementary Fig. 2). We performed Sanger sequencing on the remaining *de novo* candidates (<5 per trio), validating 18 events within coding sequence and three additional events mapping to 3' untranslated regions (Table 2). A list of predicted variant sites within these genes from the 1000 Genomes Pilot Project data<sup>15</sup> is provided for comparison (Supplementary Table 5).

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Table 1 Summary of the exome sequencing results from 20 sporadic ASD probands

Family	Proband	Paternal	Maternal	Trio bases <sup>c</sup>	Percent	Coding SNVs <sup>e</sup>	Rare disruptive	Coding	Rare	Protein coding
11048	M	358	358	23 901 726	88.10	14 095 (752)	131		27	0
11307	M	421	407	23,501,720	86.89	13,509 (583)	75	64 (40)	10	0
11580	M	421	305	23,343,330	87.90	13,912 (642)	89	62 (36)	24	1
11666	M	398	370	23,023,712	89.21	14 306 (622)	77	59 (40)	24	1
12325	M	363	313	24,175,474	88.88	13,866 (629)	79	65 (43)	20	1
12323	M	425	372	25,217,651	93.04	14,479 (634)	86	80 (47)	24	3
12575	M	351	317	24 259 870	89.51	14 568 (679)	78	80 (55)	26	0
12647	M	541	413	24,200,070	91.02	14,300 (07.5)	78	68 (42)	22	1
12680	M	502	471	24 437 989	90.16	14 124 (642)	69	70 (42)	24	2
12681	F	399	375	24 723 806	91 22	14,750 (691)	93	68 (39)	20	2
12817	M	485	430	24 520 475	90.47	14 364 (656)	83	72 (38)	24	2
12974	M	366	365	24 235 164	89.42	13,990 (555)	52	54 (37)	23	0
13095	M	337	322	24 460 239	90.25	14 605 (645)	66	89 (54)	29	0
13253	M	436	427	24,070,345	88.81	13,775 (610)	96	41 (25)	16	2
13284 <sup>h</sup>	M	300	302	24,911,060	91.91	17,806 (639)	111	151 (79)	53	1
13466	M	353	385	24,676,574	91.05	14.023 (591)	72	58 (39)	23	0
13683	M	470	402	24,139,439	89.06	14,419 (725)	7.3	72 (49)	22	0
13708	M	.397	382	23,933,169	88.30	13,997 (686)	77	78 (41)	26	2
13970	M	313	234	24 465 009	90.26	14,293 (626)	84	89 (58)	31	0
SAGE4022	 F	271	283	24,130,743	89.03	14,538 (713)	141	86 (56)	29	0
Average	18M:2F	397	362	24,319,694	89.73	14,378 (658)	86	74 (45)	25	0.9

<sup>a</sup>Simons Simplex Collection (SSC) or Study of Autism Genetics Exploration (SAGE) family number. <sup>b</sup>Paternal and maternal ages (in months) at time of conception were estimated based on month-year birth information assuming a 9-month pregnancy. <sup>c</sup>Number of bases covered at 8× and Q30 in all three individuals. <sup>d</sup>±2 bp. <sup>e</sup>Numbers in parentheses denote variants not present in dbSNP or 1000 Genomes Project pilot data. <sup>f</sup>Not observed in 1,490 other exomes sequenced at the University of Washington. <sup>e</sup>Not equal to 3*n*. <sup>h</sup>Included additional RefSeq targets.

We observed subtle differences with respect to mutation rate and characteristics when compared to the previous study<sup>13</sup> (**Supplementary Note**). The overall protein-coding *de novo* rate (0.9 events per trio) was slightly higher than expected<sup>14</sup> (0.59 events per trio), suggesting that we identified the majority of the *de novo* events in these trios (**Supplementary Table 4**). The transition to transversion ratio was highly skewed (18:2), with eight transitions mapping to hypermutable CpG dinucleotides<sup>14</sup>. The proportion of synonymous events was higher than expected based on a neutral model and may reflect selection against embryonic lethal non-synonymous variants. We successfully determined the parent of origin for seven events, six of which occurred on the paternal haplotype (**Table 2**). Notably, the eight probands with two or more validated *de novo* events corresponded to families with higher parental age (Mann-Whitney U, combined age, one-sided P < 0.004).

Eleven of the 18 coding de novo events are predicted to alter protein function. Each of these mutations occurred in a different gene, precluding a statistical assessment for any specific locus despite their deleterious nature (for example, using PolyPhen-2)<sup>16</sup>. We assessed whether proband de novo mutations were enriched in the aggregate for disruptive events by considering two independent quantitative measures: the nature of the amino-acid replacement (Grantham matrix score<sup>17</sup>) and the degree of nucleotide-level evolutionary conservation (Genomic Evolutionary Rate Profiling (GERP)<sup>18,19</sup>) (Fig. 1a,b). For comparison, we sequenced 20 exomes from unrelated ethnically matched controls (from HapMap) and applied the same filters to identify coding-sequence mutations that were common or private to each of the samples. These control DNA samples were isolated from immortalized lymphoblasts; however, the counts of private variants in the cases and controls were highly similar, suggesting that the contribution of new somatic events is likely minimal (Supplementary Fig. 3).

We determined by simulation the expected mean GERP and Grantham distributions for ten randomly selected common or

private control single nucleotide variants (SNVs) (Online Methods). When we compared the observed means of the ten *de novo* proteinaltering ASD proband variants to the distribution of common control SNVs (**Fig. 1a**), they corresponded to more highly conserved (GERP, P < 0.001) and disruptive amino acid mutations (Grantham, P = 0.015). If we limited the analysis to the private control SNVs, which serve as a proxy for evolutionarily young mutation events (**Fig. 1b**), we again found that the *de novo* events were at the right tail of these distributions. Only the mean GERP score, however, remained significant (GERP, P = 0.02; Grantham, P = 0.115). In total, these results suggest that these *de novo* mutation sites are subjected to stronger selection and are likely to have functional impact.

We identified a subset of trios (4 out of 20) with disruptive de novo mutations that are potentially causative, including genes previously associated with autism, intellectual disability and epilepsy (Table 2 and **Supplementary Note**). We examined the available clinical data for these four families and found that they were among the most severely affected individuals in our study based on intelligence quotient (IQ) measures and on calibrated severity score<sup>20</sup> (CSS), which is largely independent from IQ and focuses specifically on autistic features, with a score of 10 being the most severe (Fig. 1c,d). For example, in proband 12681, we identified a single-base substitution (IVS9-2A>G) at the canonical 3' splice site of exon 10 in GRIN2B (encoding glutamate receptor, ionotropic, N-methyl D-aspartate 2B) (Supplementary Fig. 4a,b). This subject is severely affected (CSS 9), with evidence of early onset, possible regression and co-morbidity for mild intellectual disability. Expression and association studies have suggested that glutamatergic neurotransmission may play a role in ASDs<sup>4</sup>. Recently, a study<sup>21</sup> described *GRIN2A* and *GRIN2B* as sites of recurrent de novo mutations in individuals with mild to moderate intellectual disability and/or epilepsy, suggesting variable expressivity. Our data suggest that *de novo* mutations in *GRIN2B* may also lead to an ASD presentation.

Table 2	Summary	of	confirmed	de	novo	mutation	events
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		Chromosome:				GERP	Grantham				Mutation
Proband	Туре	position	Gene symbol	Variant	Amino acid change	score	score	PolyPhen-2	CpG	Ts/Tv	origin
SNVs											
11580.p1	Missense	Chr20:2,239,665	TGM3	R	p.Val144IIe	5.15	29	Probably damaging	Y	Ts	Maternal
11666.pl	Missense	Chr9:132,904,111	LAMC3 <sup>a</sup>	R	p.Asp339Gly	4.92	94	Probably damaging	Ν	Ts	Paternal
12325.p1	3' UTR	Chr12:55,708,658	MYO1A	R		2.23			Ν	Ts	
12325.p1	Missense	Chr16:19,951,169	GPR139	Y	p.Ser151Gly	1.71	56	Benign	Ν	Ts	
12499.p1	Missense	Chr2:166,556,317	SCN1A <sup>a</sup>	R	p.Pro1894Leu	5.55	98	Probably damaging	Ν	Ts	Paternal
12499.p1	Synonymous	Chr3:38,033,207	PLCD1	K		-8.24			Y	Τv	
12499.p1	Missense	Chr6:152,865,504	SYNE1	Y	p.Tyr282Cys	4.48	194	Probably damaging	Ν	Ts	
12575.p1	3′ UTR	Chr9:32,619,906	TAF1L	R		-1.02			Y	Ts	
12647.p1	3′ UTR	Chr16:23,585,994	DCTN5	Y		-0.989			Ν	Ts	
12647.p1	Missense	Chr5:68,453,390	SLC30A5	S	p.Ser561Arg	4.6	110	Possibly damaging	Ν	Τv	
12680.p1	Synonymous	Chr2:101,992,478	IL1R2	Y		-1.53			Ν	Ts	
12680.p1	Synonymous	Chr5:132,251,451	AFF4	Y		-11.2			Y	Ts	Paternal
12681.p1	3' splice	Chr12:13,614,220	GRIN2B <sup>a</sup>	Y		4.17	215 <sup>b</sup>		Ν	Ts	Paternal
12681.p1	Synonymous	Chr7:142,274,902	EPHB6	Y		-3.14			Y	Ts	Paternal
12817.pl	Synonymous	Chr2:143,724,639	ARHGAP15	R		3.51			Ν	Ts	
13253.p1	Missense	Chr3:39,204,494	XIRP1	Y	p.Val483Met	2.04	21	Probably damaging	Ν	Ts	
13253.pl	Synonymous	Chr16:74,121,475	CHST5	Y		-3.22			Y	Ts	
13284.p1	Synonymous	Chr2:179,145,956	TTN	Y		0.328			Y	Ts	
13708.p1	Missense	Chr17:58,033,198	TLK2	Y	p.Ser595Leu	5.43	145	Probably damaging	Y	Ts	
13708.p1	Missense	Chr3:30,004,687	RBMS3	Y	p.Thr383Met	5.44	81	Probably damaging	Y	Ts	
Indels											
12817.p1	Frameshift	Chr3:71,132,860	FOXP1 <sup>a</sup>	+T	p.Ala339Ser <i>fs</i> X4	5.38 <sup>c</sup>	215 <sup>b</sup>		NA	NA	Paternal

<sup>a</sup>Disruptive *de novo* mutations that are po UTR, untranslated region.

Proband 12499 has a missense variant (p.Pro1894Leu) at a highly conserved position in *SCN1A* (encoding sodium channel, voltagegated, type I, alpha subunit) that is predicted to be functionally deleterious (**Supplementary Fig. 4c**). This subject is severely affected (CSS 8), with evidence of early onset, possible regression, language delay, a diagnosis of epilepsy and mild intellectual disability. *SCN1A* was previously associated with epilepsy and has been suggested as an ASDs candidate gene<sup>22,23</sup>, although limited screening has been conducted in idiopathic ASDs. Hundreds of disease-associated mutations have been described in epilepsy, and typically individuals with *de novo* events show more severe phenotypes<sup>24</sup>. The proband also carries the maternally inherited 15q11.2 deletion that increases the risk for epilepsy<sup>10</sup>.

Proband 11666 has a missense variant (p.Asp399Gly) at a highly conserved position within the second laminin-type epidermal growth factor-like domain of *LAMC3* (encoding laminin, gamma 3) that is predicted to be functionally deleterious (**Supplementary Fig. 4d**). This subject is severely affected (CSS 10), with evidence of early onset and moderate intellectual disability. *LAMC3* is not known to be involved in neuronal development; however, human microarray data have shown expression in many areas of the cortex and limbic system<sup>25</sup>. Additional study is warranted, as laminins have structural similarities to the neurexin and contactin-associated families of proteins, both of which have been associated with ASDs<sup>2</sup>.

The fourth example of a potentially causative mutation is a singlebase insertion in *FOXP1* (encoding forkhead box P1) introducing a frameshift and premature stop codon (p.Ala339Ser*fs*X4) in proband 12817 (**Fig. 1e**). This subject is severely affected (CSS 8), with evidence for regression, language delay and co-morbidity for moderate intellectual disability and nonfebrile seizures. Recently, rare occurrences of large *de novo* deletions and a nonsense variant disrupting *FOXP1* were reported in individuals with mild to moderate intellectual disability and language defects, with or without ASD features<sup>26,27</sup>. *FOXP1*  encodes a member of the forkhead-box family of transcription factors and is closely related to *FOXP2*, a gene implicated in rare monogenic forms of speech and language disorder<sup>28–31</sup>. Functional evidence of heterodimer formation and overlapping neural expression patterns suggests that FOXP1 and FOXP2 can co-regulate gene expression in the brain<sup>32,33</sup>. We assessed relative levels of the mutant transcript in proband-derived lymphoblasts and found strong evidence for nonsense-mediated decay (NMD) (**Supplementary Fig. 5a**). HEK293T cell-based functional assays further showed that, if translated, the protein would be truncated and mislocalized from the nucleus to the cytoplasm, similar to results obtained with *FOXP2* mutations<sup>31</sup> (**Supplementary Fig. 5b,c**).

Remarkably, in addition to the FOXP1 mutation, proband 12817 also carried an inherited missense variant (p.His275Arg) at a highly conserved position in CNTNAP2 (encoding contactin associated protein-like 2) that is predicted to be functionally deleterious. This variant is likely to be extremely rare or private, as it was not observed in 942 previously sequenced controls<sup>34</sup> or in 1,490 other exomes. CNTNAP2 is directly downregulated by FOXP2 (ref. 35) and has been independently associated with ASD and specific language impairment<sup>34-37</sup>. In HEK293T cells, we found that wild-type FOXP1 significantly reduced expression of CNTNAP2 (P = 0.0005), whereas the truncated protein was associated with a threefold expression increase (P = 0.0056) (Supplementary Note and Supplementary Fig. 5d). Overall, we hypothesize that FOXP1 haploinsufficiency (caused by NMD), combined with dysfunction of FOXP1 mutant proteins that escape this process, may result in overexpression of CNTNAP2 protein, amplifying any deleterious effects of p.His275Arg in the proband.

Among the ~110 (85 SNVs and 25 indels) previously unreported inherited protein-altering variants in each proband, we identified several rare inherited variants in genes overlapping SFARI Gene<sup>38</sup>, a curated database of potential ASD candidate loci, but we saw no excessive

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Figure 1 Evaluation of *de novo* mutations by simulation and proband severity and pedigree of family 12817. (a,b) We compared the mean Grantham (black x axis) and GERP scores (black y axis) of the ten proband de novo protein-changing substitutions to 20 HapMap control samples by building a distribution of the mean values of ten randomly selected common or private variants over 1,000 trials. Splice-site and nonsense events were given a maximum Grantham score (215); we did not include indels in the simulation. Histograms show the relative frequency (blue axes) of each distribution. Points show the proband variants, with variants from the same individual highlighted (blue, 13708.p1; red, 12499.p1). The proband mean values were 4.349 for GERP and 104.3 for Grantham. \* FOXP1 was not included in proband mean values. (a) Control common variants (GERP, P < 0.001; Grantham, P = 0.015). (b) Control rare variants (GERP, P = 0.02; Grantham, P = 0.115). (c,d) We evaluated the disease severity of the mutation carriers 12817.p1 (FOXP1; brown), 12681.p1 (GRIN2B; green), 12499 (SCN1A; blue) and 11666.p1 (LAMC3; red). (c) Box and whisker plot of full scale intelligence quotient (FSIQ) values. (d) Box and whisker plot of calibrated severity scores (CSS) based on the autism diagnostic observation schedule (ADOS). Data were available for 19 out of 20 probands; we estimated CSS for two probands based on ADOS module 4 data. (e) Pedigree of family 12817 showing chromatogram traces surrounding



the *FOXP1* (top) and *CNTNAP2* (bottom) mutation events. The proband carries a *de novo* single-base (+A relative to mRNA) frameshifting mutation (resulting in p.Ala339Ser*fs*X4) in *FOXP1* and an inherited missense variant (p.His275Arg) in *CNTNAP2*.

burden in cases relative to controls (**Supplementary Table 6**). Although the numbers of subjects from our pilot study are few, we did observe two cases with a notable *de novo* event and a potential inherited risk variant (12817.p1, *FOXP1* and *CNTNAP2*; 12499.p1, *SCN1A* and 15q11.2 deletion), highlighting that in some sporadic families a multi-hit model may be playing a role<sup>3</sup> (**Supplementary Table 7**). In the future, this hypothesis could be further explored by comparing burden in a much larger number of affected-unaffected sibling pairs.

The probands with the four potentially causative de novo events met strict criteria for a diagnosis of autistic disorder (Supplementary Note). Our finding of *de novo* events in genes that have also been disrupted in children with intellectual disability without ASD, intellectual disability with ASD features or epilepsy provides further evidence that these genetic pathways may lead to a spectrum of neurodevelopmental outcomes depending on the genetic and environmental context<sup>2,4</sup>. Recent data suggest that CNVs may also blur these lines, with diverse conditions all showing association to the same loci<sup>2,4</sup>. Distinguishing primary from secondary effects will require a better understanding of the underlying biology and identification of interacting genetic and environmental factors within the phenotypic context of the family. The identification of de novo events along with disruptive inherited mutations underlying 'sporadic' ASDs has the potential to fundamentally transform our understanding of the genetic basis of autism.

**URLs.** SeattleSeq server, http://gvs.gs.washington.edu/SeattleSeqAnnotation/; Primer3, http://frodo.wi.mit.edu/primer3/.

#### METHODS

Methods and any associated references are available in the online version of the paper at http://www.nature.com/naturegenetics/.

Accession numbers. Reference sequences are available from the NCBI CCDS database under the following accession codes: *CNTNAP2*, CCDS5889.1; *FOXP1*, CCDS2914.1; *GRIN2B*, CCDS8662.1; *LAMC3*, CCDS6938.1; *SCN1A*, CCDS33316.1. The raw sequence reads are available from the National Database for Autism Research under accession number NDARCOL0001878.

Note: Supplementary information is available on the Nature Genetics website.

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#### AUTHOR CONTRIBUTIONS

E.E.E., J.S. and B.J.O. designed the study and drafted the manuscript. E.E.E. and J.S. supervised the study. R.B. analyzed the clinical information and contributed to the manuscript. S.E.F. and P.D. designed cell-based functional experiments, analyzed data, interpreted results and contributed to the manuscript. S.G., C.B. and L.V. generated and analyzed array CGH data. C.L. performed Illumina GAILx sequencing. B.J.O. and E.K. developed the analysis pipeline and analyzed sequence data. A.P.M. and S.B.N. designed and optimized capture protocol. B.J.O., L.V., A.P.M. and S.B.N. constructed exome libraries. B.J.O., L.V., A.P.M. and J.J.S. performed mutation validation and haplotype characterization. B.J.O. and J.J.S. performed the evaluation of 12817 lymphoblast cell lines. P.D. performed functional experiments. M.J.R. and D.A.N. performed sequencing of control samples.

#### COMPETING FINANCIAL INTERESTS

The authors declare competing financial interests: details accompany the full-text HTML version of the paper at http://www.nature.com/naturegenetics/.

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#### **ONLINE METHODS**

**ASD samples.** We examined 20 families where there was a single child with a diagnosis of ASD obtained from the Simons Simplex Collection (SSC)<sup>39</sup> (n = 19) and the Study of Autism Genetics Exploration (SAGE) (n = 1). We required subjects to have at least one unaffected sibling with no history of ASD or intellectual disability based on medical history and/or pedigree evaluation. Parents showed no signs of a broader autism phenotype based on Broad Autism Phenotype Questionnaire<sup>40</sup> (cutoff  $\leq$  3) and Adult-Social Responsiveness Scale (SRS)<sup>41</sup> (cutoff  $\leq$  40). Siblings were discordant for the SRS and Vineland-II, with the unaffected sibling falling within the normal range.

**Control exomes.** Exome sequence data from 20 unrelated CEPH Utah samples of European ancestry were obtained from immortalized lymphoblast extracted genomic DNA and processed through the same variant calling pipeline.

**Control simulation.** Protein-altering control variants were randomly shuffled, and ten were selected over 1,000 trials to build an expected distribution of common or rare events, computing the mean Grantham and GERP scores for each trial. Empirical *P* values were then calculated based on the number of trials in which the control mean was greater than the observed mean of the ten proband disruptive *de novo* variants.

**Other control exomes.** Variants were screened against exome calls from 1,490 samples to remove common variants and systematic artifacts. Samples were obtained from the NHLBI Lung Cohort Sequencing Project (n = 635), the NHLBI WHI Sequencing Project (n = 744), NIEHS SNPs (n = 87) and NHLBI/NHGRI SeattleSeq and NHGRI Next Generation Mendelian Genetics (n = 24).

**Array CGH.** We designed custom targeted arrays comprising 135,000 probes (Roche NimbleGen) with higher density probe coverage (mean probe spacing 2.5 kb) in genomic hotspots and a lower probe density in genomic backbone (with mean probe spacing of 38 kb). Microarray hybridization experiments and CNV analysis were performed as described previously<sup>42,43</sup> using a single unaffected male reference (GM15724 from Coriell).

ASD exome library construction. Exome shotgun libraries were prepared as described previously  $^{44}$  from 3  $\mu g$  whole-blood extracted genomic DNA with modifications for solution-based capture using either a standard or a barcoding protocol. Each member of a trio received matching protocols. In the standard protocol, pre-capture PCR was performed in four reactions per sample, with each reaction in a 40  $\mu l$  volume with 10  $\mu l$  of library, 1× iProof High Fidelity Master Mix (Bio-Rad) and 0.625 µM of each primer under the following conditions: 96 °C for 2 min, 16 cycles of 96 °C for 20 s, 63 °C for 30 s and 72 °C for 45 s and, finally, 72 °C for 5 min. Reactions for each sample were pooled and column purified (PCR Purification Kit, Qiagen). In the barcoded protocol, pre-capture PCR was performed in five reactions per sample, with each reaction in a 40  $\mu l$  volume with 10  $\mu l$  of library, 1× iProof High Fidelity Master Mix (Bio-Rad) and 0.625  $\mu M$  of each primer under the following conditions: 98 °C for 30 s, six cycles of 98 °C for 10 s, 60 °C for 30 s and 72 °C for 45 s and, finally, 72 °C for 5 min. Reactions for each sample were pooled and bead purified (AMPure, Agencourt).

Library capture and sequencing. For each library, 1 µg was hybridized for 72 h at 47 °C with SeqCap EZ Exome probes v1.0 (Roche) as per manufacturer's protocols and blocked with 100 µl human Cot1 DNA (Invitrogen) and 10 µl each blocker primer at 100 µM (**Supplementary Table 8**). For standard preps pre-sequencing PCR, ten reactions were performed per sample, with each reaction in a 50 µl volume with 4 µl of library, 1× iProof High Fidelity Master Mix (Bio-Rad) and 0.625 µM of each primer under the following conditions: 98 °C for 30 s, 20 cycles of 98 °C for 10 s, 60 °C for 30 s and 72 °C for 30 s and, finally, 72 °C for 5 min. Reactions for each sample were pooled and column purified. For barcode preps, five reactions were performed per sample, with each reaction in a 50 µl volume with 10 µl of library as above, but for only 13 cycles. Reactions for each sample were pooled and bead purified. Family 13284 was also captured using a custom RefSeq solid state array (Agilent) as described<sup>45</sup>. Libraries were sequenced on an Illumina Genome Analyzer IIx according to the manufacturer's instructions for single or paired-end 76-bp reads.

Estimating the expected mutation rate. We used mutation rates published by Lynch<sup>14</sup>, as he provides an estimate of substitution, insertion and deletion rates and is in close agreement with other recent estimates<sup>15,46</sup>. We first calculated the number of callable bases in the first six completed trios that directly overlapped or were within 2 bp of the ends of the exon coordinates from the current hg18 build of the Consensus Coding Sequence (CCDS) project. This analysis yielded 22,546,796 coding and 523,843 splice bases covered in an average trio. Using the following haploid mutation rates (substitution rate of  $1.28 \times 10^{-8}$ , deletion rate of  $5.80 \times 10^{-10}$  and insertion rate of  $2.00 \times 10^{-10}$ ), we calculated total number of substitutions based their probably of causing an amino acid change under a random model of 25% synonymous, 71.25% missense and 3.75% nonsense substitutions.

Exome data analysis for SNVs and small indels. The exome definition was based on consensus coding sequence (CCDS 2009) of the human reference genome (build 36). For BWA (0.5.6)<sup>47</sup> mapped reads, we removed reads with mapping scores of zero, incorrect or unmapped pairs and potential duplicates. Consensus genotypes were generated using SAMtools (0.1.7)<sup>48</sup>. Variant positions were then pulled and filtered using the samtools.pl varFilter (all defaults except, -D 10000 and awk '(3 = "\*" & \$6 > = 50) || (3! = "\*" & \$6 > = 20)'). Variants were then run through a custom pipeline, Haystack, to identify Mendelian errors. For SNVs, proband variants were filtered to 8× and consensus or SNP quality 30 positions that were called in the entire trio. Possibly de novo events were then compared against 1,490 other exomes sequenced at University of Washington to remove systematic artifacts and rare population variants. Variants were then annotated using the SeattleSeq server (see URLs). Possibly de novo events were manually inspected using the IGV browser<sup>15</sup>. Base pair positions where >10% of the parental reads were concordant with the putative de novo event were excluded. We found that approximately one-third of on-target de novo calls mapped to exons within segmental duplications<sup>49</sup> and likely represent paralogous sequence variants from missing duplicated genes or variants of limited functional consequence<sup>50</sup>. For BWA called indels, variants were filtered to a high confidence set supported by at least 30% of the reads with a minimum of eight variant reads. Positions without an indel call or 8× and consensus or SNP quality 30 position in both parents were removed. Variants were then annotated using a custom script, compared to dbSNP129 and dbSNP130 and 1000 Genomes Pilot indels and manually inspected.

**Exome data analysis for large indels and CNVs.** We used a general splitread–based combinatorial algorithm (E.K., C. Alkan, B.J.O., D.A.N. & E.E.E., unpublished data) to detect structural variation in the form of insertions, deletions and copy number variants ranging in length from 1 bp to 1 Mb. This method identifies one-end anchored placements using *mrsFAST*<sup>51</sup> alignments. The unmapped ends of the one-end anchored reads are split into pieces at the breakpoints of possible indels. Our method computes the exact breakpoints of these splits and aims to map them back to the reference exome efficiently. The final set of indels is reported based on these consistent split mappings around these events within basepair resolution.

*De novo* validation. Possibly *de novo* variants were tested by designing custom primers with Primer3 (see URLs), performing standard PCR reactions using 10 ng of DNA from the proband, father, mother and for 19 out of 20 families an unaffected sibling, followed by Sanger sequencing.

Family 12817 complementary DNA (cDNA) analysis. Transformed live lymphoblast cell lines were obtained on the father, mother, proband and two siblings from family 12817. Cultures were grown as described<sup>52</sup> and split into two flasks, one of which was supplemented with 100  $\mu$ g/ml of emetine (Sigma) to inhibit NMD<sup>52</sup>. After 7 h of incubation, total RNA was extracted using RNeasy Mini Kit (Qiagen). First strand cDNA was generated using Transcriptor High Fidelity cDNA Synthesis Kit (Roche). *FOXP1* cDNA was amplified using standard PCR with primers spanning several exons and subjected to Sanger sequencing.

**Functional characterization of FOXP1.** Plasmids expressing full-length FOXP2 and FOXP1, as well as FOXP2.R553H and the FOXP2.10+ were

described elsewhere<sup>31</sup>. The FOXP1mut construct was directly synthesized by GenScript USA Inc. All constructs were expressed from the pcDNA4/ HisMax vector and were in frame with an N-terminal vector-encoded Xpress tag. The anti-Xpress mouse monoclonal antibody (Invitrogen) was used to detect protein expression of all FOXP constructs.  $\beta$ -actin mouse monoclonal antibody (Sigma) was used as loading control. HEK293T cells were cultured as described<sup>31</sup> and transfected with either empty pcDNA4/ HisMax vector or with pcDNA4/HisMax FOXP constructs using Genejuice (Novagen) transfection reagent according to the manufacturer's instructions. Forty-eight hours after transfection, cells were either lysed and resolved by SDS-PAGE or seeded on coverslips for immunofluorescence, as previously described<sup>31</sup> For quantitative PCR, total RNA was isolated using an RNeasy Mini Kit (Qiagen) following the manufacturer's instructions 48 h post transfection. Five hundred nanograms total RNA was reversetranscribed using the Superscript III Reverse Transcriptase and random primers (Invitrogen). Quantitative real-time PCR was performed on an iQ5 (Bio-Rad) (Supplementary Table 9).

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## Corrigendum: Exome sequencing in sporadic autism spectrum disorders identifies severe *de novo* mutations

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In the version of this article initially published, the missense variant in CNTNAP2 identified in proband 12817 was incorrectly listed as p.His275Ala in the main text and Figure 1. The correct notation for this variant is p.His275Arg. In addition, the raw sequence reads have now been deposited in the National Database for Autism Research under accession number NDARCOL0001878. These errors have been corrected in the HTML and PDF versions of the article.

