

Convergent microstructural brain changes across genetic models of autism spectrum disorder—A pilot study

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ARTICLE INFO

Keywords:

Diffusion tensor imaging
Autism spectrum disorder
Fmr1
Pten
Nrxn1
Convergence

ABSTRACT

Autism spectrum disorder (ASD) is a complex and genetically heterogeneous neuropsychiatric disease affecting as many as 1 in 68 children. Large scale genetic sequencing of individuals along the autism spectrum has uncovered several genetic risk factors for ASD; however, understanding how, and to what extent, individual genes contribute to the overall disease phenotype remains unclear. Neuroimaging studies of ASD have revealed a wide spectrum of structural and functional perturbations that are thought to reflect, in part, the complex genetic heterogeneity underpinning ASD. These perturbations, in both preclinical models and clinical patients, were identified in preclinical genetic models and ASD patients when compared to control populations; however, few studies have directly explored intrinsic differences between the models themselves. To better understand the degree and extent to which individual genes associated with ASD differ in their contribution to global measures of white matter microstructure, diffusion tensor imaging (DTI) was acquired from three novel rat genetic models of ASD (*Fmr1*, *Nrxn1*, and *Pten*) and DTI parameters of fractional anisotropy, mean, axial, and radial diffusivity were measured. Subsequent whole-brain voxel-wise analysis comparing each genetic model to each other (*Fmr1:Nrxn1*; *Fmr1:Pten*; *Nrxn1:Pten*) identified no significant differences in any comparison for all diffusion parameters assessed (FA, AD, MD, RD).

1. Introduction

Autism spectrum disorder (ASD) is a complex clinically heterogeneous neurodevelopmental disability affecting as many as 1 in 68 children (Christensen et al., 2016). While the clinical diagnosis of ASD continues to rely on behavioral classifications and patient symptomatology and remains primarily understood as a behavioral disorder, emerging evidence has recast our understanding of ASD as a highly complex and heterogeneous biological disorder (Christensen et al., 2016; Edmiston et al., 2017). In particular, genome wide association (GWA) studies of ASD (Codina-solà et al., 2015) have identified numerous candidate gene-susceptibility factors as contributors to the overall disease state. These include *Chd8* and *Ptchd1* (Bernier et al., 2014; Tora et al., 2017) as well as epigenetic and transcriptional regulators such as *Mecp2* (Witteveen et al., 2016), post-transcriptional protein modifiers and regulators such as *Fmr1* (Fragile X Syndrome)

(Haberl et al., 2015; Lai et al., 2016; Lee et al., 2016), *Pten* (PTEN hamartoma tumor syndromes and non-syndromic ASDs) (Butler, 2005; Silverman et al., 2010), and synaptic organizing and scaffolding proteins such as Shanks and neurexins (*Nrxn*) (Dachtler et al., 2015; Voineskos et al., 2011). While whole exome sequencing has not established any definitive causal genetic sequence variant for ASD, several highly penetrant *de novo* mutations—leading to partial or total loss of function—have been consistently reported in individuals with ASD that are otherwise absent in typically developing children.

To investigate the potential impact of these genetic mutations on neural microstructure, several groups have generated murine genetic knockout models to study the monogenetic influence of these candidate genes in the neuropathogenesis of ASD. Parallel neuroimaging efforts in these murine models and in humans have utilized advanced magnetic resonance imaging (MRI) techniques to quantitatively evaluate differences in neural structure between typically developing individuals and

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<https://doi.org/10.1016/j.psychresns.2018.12.007>

Received 18 July 2018; Received in revised form 7 December 2018; Accepted 7 December 2018

Available online 08 December 2018

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individuals with genetic mutations conferring increased susceptibility to ASD. Notable efforts toward the identification of gene-specific neuroimaging biomarkers of ASD have included volumetric analyses that have shown increased prefrontal cortex brain volume in both humans and murine models with impaired *Pten* function and fronto-temporal hyperconnectivity in both adolescent functional MRI studies of children with Fragile X Syndrome (FXS) and in studies involving murine hemizygous models of *Fmr1*.

While these and other human and murine neuroimaging studies of ASD have revealed significant differences between control and affected populations (Foss-Feig et al., 2017; Hull et al., 2017; Ismail et al., 2016; Li et al., 2017), a relative paucity has explicitly investigated the degree and extent of structural differences between cohorts of genetic models with previous work from Ellegood et al. being the most complete neuroanatomical phenotyping study of ASD (Ellegood et al., 2015). However, no studies, to the best of our knowledge, have utilized diffusion tensor imaging (DTI) to compare differences in white matter microstructure across different genetic variants of ASD. Furthermore, no equivalent studies have been performed in a rat model of ASD. The rat model would be anticipated to provide a more translatable imaging appraisal of gene-specific changes in ASD than previously reported murine neuroimaging studies due to the closer degree of similarity in physiology and behavior between humans and rats relative to mice (Gibbs et al., 2004; Smith and Alloway, 2013). The use of rat models in our study also reflects the resurgence of rats as the model of choice in neuroscience research due to the growing use and availability of genome-editing technologies. To explore differences in brain white matter microstructure across different genetic variants of ASD, three novel monogenetic rat models of ASD were imaged with diffusion tensor brain imaging.

2. Methods

2.1. Animals and experimental design

Animals were housed and cared for in an AAALAC-accredited facility and all animal experiments were conducted in accordance with institutional IACUC-approved protocols and the National Institutes of Health guide for the care and use of Laboratory animals (NIH Publications No. 8023, revised 1978). Postnatal day 45 (P45) adolescent male *Fmr1*^{-/-}, *Nrxn1*^{-/-}, and *Pten*^{+/-} rats in a Sprague Dawley background (Horizon Discovery, St. Louis, USA) and postnatal day (P45) male outbred Sprague Dawley rats (Charles River, Wilmington, MA, USA) were used in all experiments ($n = 4$ for each genetic background; $n = 4$ for control animals; all intra-group animals are siblings from the same litter) with the age of the animals chosen to as closely match the periadolescent period (Sengupta, 2013); male animals were chosen to avoid potentially confounding estrous effects. Each of the three genetic models were generated via zinc finger nuclease (ZFN) genome editing yielding a hemizygous, homozygous, and heterozygous genotype for the *Fmr1*, *Nrxn1*, and *Pten* genetic variants, respectively. Endonuclease hemizygous deletion of the *Fmr1* gene mirrors the gene silencing observed with expansion of the CGG trinucleotide and monoallelic deletion of the *Pten* gene recapitulates the clinically encountered heterozygous genotype (the homozygous deletion is embryonic lethal). Animals were housed in a light-dark cycle, temperature- and humidity-controlled vivarium and maintained with *ad libitum* food and water diet supplied per institutional protocol. All experiments were performed with the experimenter blinded to genotype. At P45, animals were brought to a surgical plane of anesthesia and were transcardially perfused with ice-cold 4% paraformaldehyde (PFA). Brains were then cleanly dissected from the cranial vault, post-fixed in 4% PFA, and stored at 4C. 48 hours prior to imaging, brains were serially washed in 1X PBS to minimize the attenuating effects of fixative prior to being placed in a custom-built holder filled with Fluorinert (FC-3283, 3M, USA) to minimize magnetic susceptibility artifact. Briefly, a

custom-built 10cc cylindrical container is filled with Fluorinert, whereby each prepared brain is subsequently placed inside, all air evacuated, and sealed with Paraffin film (Parafilm M, Bemis, Neeah, WI, USA). All procedures mirror previously reported methods that have been shown to have no impact on the diffusion tensor (de Guzman et al., 2016).

2.2. Ex-vivo image acquisition and image preprocessing

For *ex-vivo* DTI acquisition, groups of 2 brains were simultaneously imaged using a 4.7-T Agilent MRI system and 3.5-cm diameter quadrature volume RF coil (brains were placed in a side-by-side configuration within a single coil). Diffusion-weighted imaging (DWI) data were acquired employing a multi-slice spin echo sequence with the following imaging parameters: repetition time: 2000 ms; echo time: 24.17 ms; slice thickness, 0.25-mm with final isotropic voxel size of 0.25-mm. Diffusion measurements were acquired with diffusion encoded along 30 non-collinear directions at $b = 1200 \text{ s} \cdot \text{mm}^{-2}$ and three additional non-diffusion weighted ($b = 0 \text{ s} \cdot \text{mm}^{-2}$) measurements. The acquisition was averaged across two repeats resulting in a total imaging time of approximately 11 hours.

An affine registration tool (Jenkinson et al., 2002) from the FMRIB software library suite was used to co-register individual diffusion images to correct for subtle eddy current distortions. Gradient directions were then corrected for rotations (Leemans and Jones, 2009). FSL DTI output volumes were converted to NifTI tensor and employed to first estimate a study-specific tensor template from all imaging datasets acquired from the control group. This template was then used as a target to which each subject tensor volume was spatially normalized using the DTI-TK tensor-based registration tools. DTI-TK's registration routine, which iteratively employs rigid-body, affine, and diffeomorphic transformations, was used as it has been shown to offer improved registration results over other registration algorithms (Wang et al., 2011).

2.3. TBSS and ROI analysis

The tract-based spatial statistics (TBSS) formalism was implemented as recommended in Bach et al. (2014). The TBSS pipeline was applied utilizing the recommended parameters implemented in FSL, which includes using a 0.2 FA threshold for creating the white matter skeleton. Additionally, a permutation test with $n = 252$ corrected for multiple comparisons and threshold-free cluster enhancement (TFCE) (Smith and Nichols, 2009) was implemented with FSL's Randomize for inter-group comparisons with family-wise error corrected p values less than 0.05 as the threshold for significance. A standard atlas (Rumple et al., 2013) from which anatomical regions of interest (ROI) were derived and was non-linearly aligned to the group-wise template. The registration included elastic warping with a point-set based registration metric implemented in the Advanced Normalization Tools (ANTS) (Avants et al., 2011) software library. For use in the subsequent statistical analysis, mean values of the diffusion-tensor-derived indices, namely, fractional anisotropy (FA), RD (radial diffusivity), AD (axial diffusivity), and MD (mean diffusivity) were computed within each ROI for all individual samples. These values were computed in the group-wise template space. To further quantify and assess inter-subject variability, the UNC Rat Atlas was normalized to our subject common space and masked with regions-of-interest predefined by the UNC Rat Atlas (Rumple et al., 2013). Diffusion measures for all regions of interest from the atlas were extracted.

2.4. Statistical analysis

As previously detailed, TBSS data were processed per the recommended parameters implemented in FSL. Permutation tests and threshold-free cluster enhancement was implemented in FSL with

Table 1
Whole-brain voxel-wise TBSS results displaying FWE-corrected *p* values

| DTI measure | Control > <i>Fmr1</i> ^{-/-} | <i>Fmr1</i> ^{-/-} > control | Control > <i>Nrxn1</i> ^{-/-} | <i>Nrxn1</i> ^{-/-} > control | Control > <i>Pten</i> ^{+/-} | <i>Pten</i> ^{+/-} > control |
|-------------|--------------------------------------|--------------------------------------|---------------------------------------|---------------------------------------|--------------------------------------|--------------------------------------|
| FA | 0.0571 | 0.1 | 0.2143 | 0.0429* | 0.7 | 0.0143* |
| MD | 0.025* | 0.3286 | 0.0143* | 0.5286 | 0.0143* | 0.3857 |
| AD | 0.0286* | 0.1571 | 0.0857 | 0.4714 | 0.0286* | 0.5143 |
| RD | 0.0143* | 0.6429 | 0.0143* | 0.214 | 0.0143* | 0.6429 |

* Statistically significant FWE-corrected permutation tests comparing whole-brain voxel-wise analysis, *p* < 0.05.

p < 0.05 as the threshold for significance. Statistical comparisons were performed by a two-tailed, two-sample, and unequal variance Student's *t* test (ROI analysis). A two-tailed, two-sample, and unequal variance Student's *t* test was performed comparing the mean values of FA, AD, RD, and MD in all segmented ROIs in *Fmr1*^{-/-}, *Nrxn1*^{-/-}, and *Pten*^{+/-} rats against age-sex-matched controls and adjusted for multiple comparisons using the Benjamini-Hochberg false discovery rate (FDR) correction (FDR = 0.05). From these data, group mean and standard deviation were calculated (GraphPad, GraphPad Software, La Jolla, CA, USA).

3. Results

3.1. Tract-based spatial statistics

In each of the three genetic models, global differences in measures of the diffusion tensor (FA, AD, MD, and RD) were assessed between experimental and control animal groups at the *p* < 0.05 significance level (Table 1). TBSS results comparing an *Fmr1* model of ASD to control animals reveal widespread changes in white matter microstructure centered principally in the frontal lobe. Specifically, we observed decreased AD, MD, and RD values bilaterally in the frontal lobe, external capsule, and corpus callosum in the *Fmr1* model when compared to control animals (Fig. 1; Supplemental Fig. 1A). A bilateral decrease in both MD and RD were observed in the frontal lobe and external capsule, but additional unique decreases in RD were uncovered in the left forebrain, left midbrain, left fimbria, and right and left internal capsule (Fig. 1; Supplemental Fig. 1A; Supplemental Fig. 3). No statistically significant differences in FA were observed between the *Fmr1* model and control animals.

TBSS analyses from *Nrxn1* animals yielded significantly greater FA values than controls in small clusters of voxels in the left hemisphere in the frontal lobe, brainstem, and external capsule (Fig. 2; Supplemental Figs. 1B, 2). Furthermore, MD values were significantly decreased in the left external capsule (Supplemental Fig. 3) and RD values were significantly decreased in the right frontal lobe and right thalamus and left external capsule (Fig. 1). Decreases in AD for *Nrxn1* trended towards but did not reach statistical significance after family-wise error correction for multiple comparisons (*p* = 0.08). Substantial differences in white matter structural properties were also detected when comparing our *Pten* model to control animals. These include significantly decreased AD in the right external capsule and decreased MD in nearly the entire right external capsule as well as portions of the frontal lobe (Supplemental Fig. 1C, Supplemental Fig. 3). Additionally, regions encompassing the right external capsule and right amygdala showed significantly greater FA when compared to controls (Fig. 2, Supplemental Fig. 2). The most robust differences in the *Pten* model were reflected by significantly reduced RD values in the external capsule, frontal lobe, and corpus callosum (Fig. 1).

3.2. Biological overlap in genetic models of autism spectrum disorder

An initial analysis of our TBSS results comparing each genetic model of ASD to control animals uncovers significant transformations of the diffusion tensor that are attributable to each genetic variant. When

these changes are superimposed on each other, the TBSS maps from the three genetic variants demonstrate a similar pattern of change to the diffusion tensor both in the direction and spatial distribution of changes, particularly in the corpus callosum and external capsule differing only in the overall magnitude of these changes in the diffusion tensor in each genetic variant. For example, while *Nrxn1* and *Pten* both show significantly increased FA and decreased RD in both the corpus callosum and external capsule relative to controls, the extent of observed change is greater in the *Pten* model. In addition to regions of common and converging change, there are equally interesting divergent areas of change in the diffusion tensor, which may reflect region-specific genetic influences in white matter structural integrity. These include confluent bilateral increases in FA in the external capsule in the *Pten* model, which are less apparent in the *Nrxn1* model and are entirely absent in the *Fmr1* model (Fig. 2). FA comparisons between groups also reveal unique confluent areas of change in FA in left frontal lobe of the *Nrxn1* model that are absent in the other experimental models (Fig. 2). And while all genetic variants demonstrate areas of significantly decreased MD, the spatial distribution of these changes differs; right temporal lobe changes in MD cover a greater volume in the *Pten* group compared to the other experimental models and focal changes in MD appear in the *Nrxn1* model in the mesial left frontal lobe that are not present in the other experimental groups (Supplemental Fig. 3).

Region of interest (ROI) analysis between control and experimental groups (*control:Fmr1*; *control:Nrxn1*; *control:Pten*) was additionally performed to determine whether monogenetic perturbations lead to differences in diffusion signal in the hippocampus, thalamus, frontal lobe, corpus callosum, and internal and external capsule (Fig. 3). There were no statistical differences after Bonferroni correction in diffusion scalar measures in controls relative to *Fmr1*. Comparing diffusion measures in the assessed regions reveals significant decreases in AD in the hippocampus (*p* = 0.0014) and external capsule (*p* = 0.0003) in the *Nrxn1* group compared to control. AD in the corpus callosum of *Nrxn1* was also significantly decreased compared to control (*p* = 0.0079). When comparing control to *Pten*, there were significant differences after correcting for multiple comparisons for all diffusion scalar measures in several regions. Relative to control, *Pten* showed increased FA in the hippocampus (*p* = 0.0032) and frontal lobe (*p* = 0.0019) and decreased AD in the hippocampus (*p* = 0.0035). Significant decreases in MD in *Pten* relative to control were observed in the hippocampus (*p* = 0.0018), external capsule (*p* = 0.0065), thalamus (*p* = 0.0024), and frontal lobe (*p* = 0.0067). Similarly, there were significant decreases in both RD in *Pten* relative to control in the hippocampus (*p* = 0.0016), external capsule (*p* = 0.0041), frontal lobe (*p* = 0.0003), and thalamus (*p* = 0.0036).

3.3. Convergent white matter microstructural change in genetic models of autism spectrum disorder

In an extension of our analysis, we sought to uncover regions of shared comorbidity in ASD by directly comparing the brains of each of our three genetic variants of ASD to each other. To these ends, whole-brain voxel-wise TBSS was performed comparing each genetic knockout model cohort to each other. Surprisingly, in each of the comparisons (*Fmr1:Nrxn1*; *Fmr1:Pten*; *Nrxn1:Pten*), no voxels of significant change

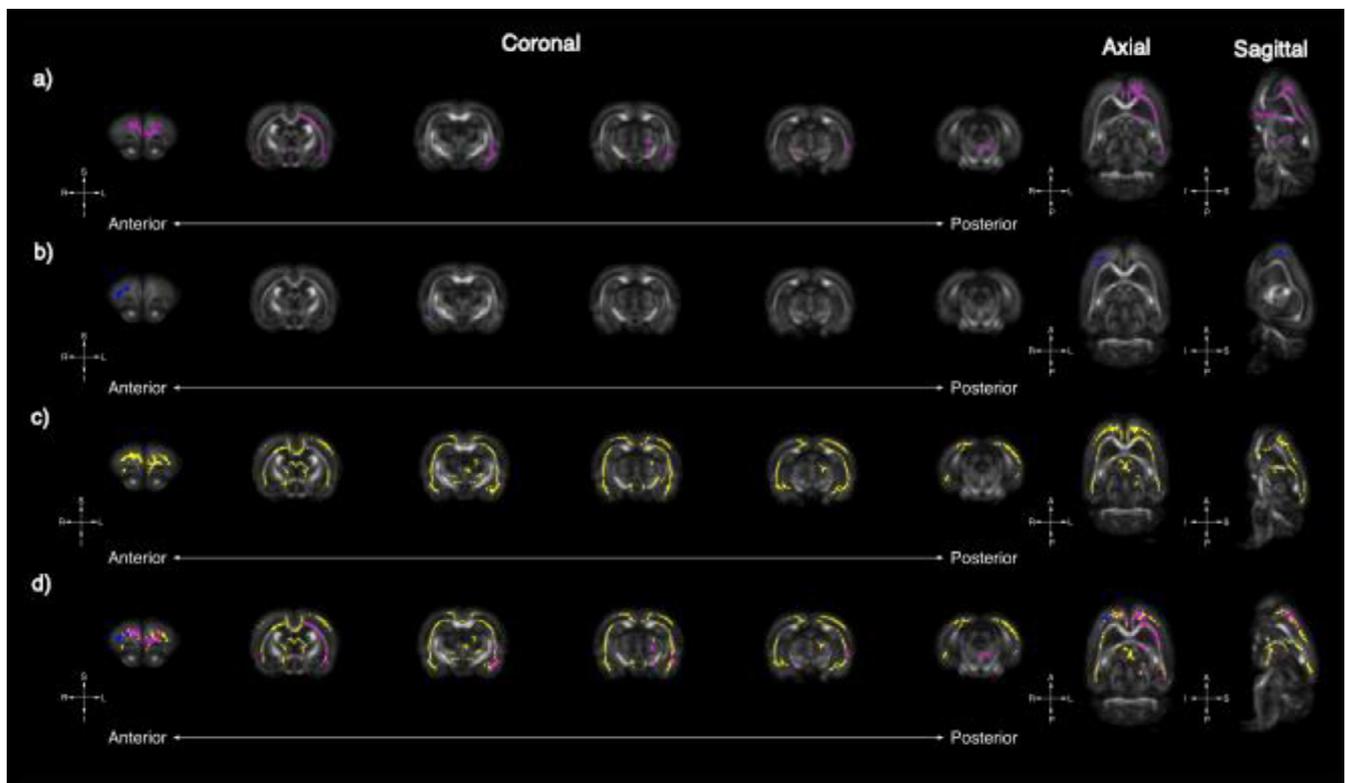


Fig. 1. Tract-based spatial statistics uncovers global changes in RD in *Fmr1*, *Nrnx1*, and *Pten* models of ASD. Whole-brain voxel-wise tract-based spatial statistics reveal significant areas of decreased RD in *Fmr1* (A, pink), *Nrnx1* (B, blue), and *Pten* (C, yellow) models of ASD. Six representative coronal sections (left [anterior] to right [posterior]) reveal significant overlapping regions of decreased in RD for all three models in the frontal lobe (D); however, unique gene-specific areas of RD change are noted caudally. Uniquely observed in the *Fmr1* model are decreases in RD in the left external capsule whereas unique changes in the *Pten* model are observed in the frontal lobe, genu of the corpus callosum, and fimbria. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

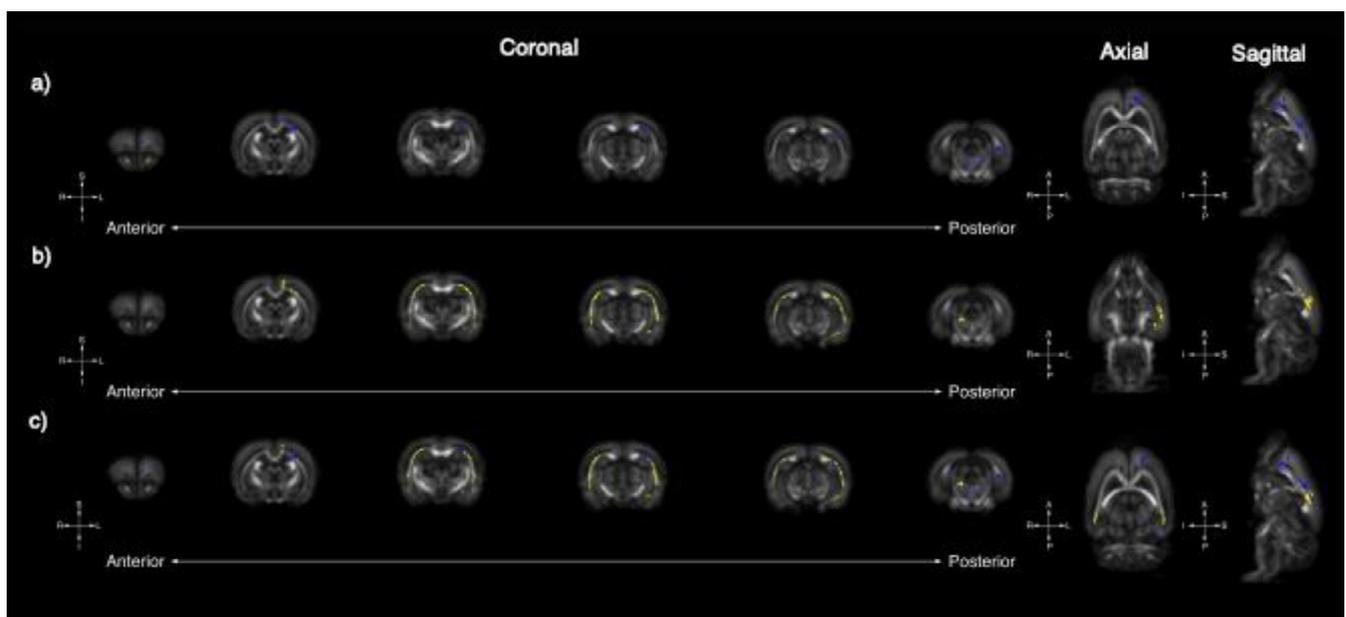


Fig. 2. Tract-based spatial statistics reveals global changes in FA in *Nrnx1* and *Pten* models of ASD: Whole-brain voxel-wise tract-based spatial statistics reveal significant areas of increased FA in *Nrnx1* (A, blue) and *Pten* (B, yellow) models of ASD. Six representative coronal sections (left [anterior] to right [posterior]) reveals unique FA changes in the *Nrnx1* model, which are observable medially in anterior regions encompassing the frontal lobe as well as the medial structures of the brain stem. In contrast, increases in FA in the *Pten* model are most concentrated bilaterally along medial margins of the external capsule. There are also overlapping small areas of increased FA medially in the external capsule and frontal lobe in both the *Nrnx1* and *Pten* models (C). (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

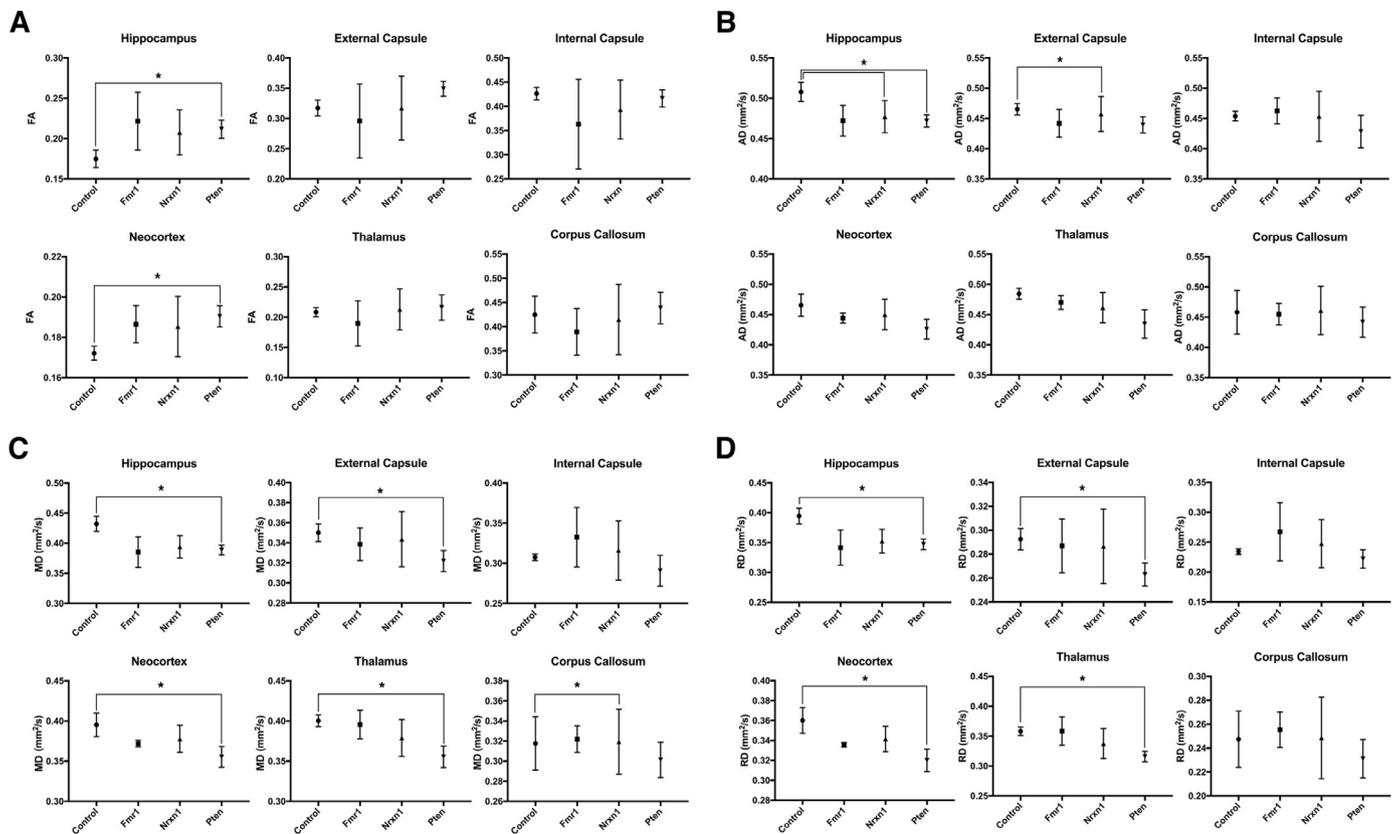


Fig. 3. Representative plots of FA (A), AD (B), MD (C), and RD (D) displaying the mean \pm S.D. values for 6 regions of interest for control, *Fmr1*, *Nrnx1*, and *Pten*. Statistical differences, after Bonferroni correction, were identified between control and both *Nrnx1* and *Pten* genetic variants in several regions of interest across all diffusion measures (indicated by starred (*) brackets). After correcting for multiple comparisons, intragroup comparisons between each genetic model within each region of interest showed no statistically significant difference in any of the four diffusion tensor metrics calculated. N.B. Units of measure for MD, AD, and RD are $[10^{-3} \text{ mm}^2/\text{s}]$.

were identified across all of the four major diffusion tensor values. In an extension (and to secondarily confirm) these surprising TBSS results, all subject scans were then masked and segmented into the 28 major regions of interest (ROI) present in the UNC Rat Brain Atlas (Rumple et al., 2013) and the four major diffusion tensor values were subsequently calculated for each ROI. After correcting for multiple comparisons, no significant intra-ROI differences were identified between the genetic variants for FA, MD, RD, or AD (Fig. 3). To further verify that the results of our tract-based spatial statistics and ROI analysis were not driven by single sample variations skewing intragroup tensor values, an intragroup sample quality assurance analysis was performed. As before, after scans were masked and segmented, six major ROIs present in the UNC Rat Brain Atlas (Rumple et al., 2013) (hippocampal formation, external capsule, internal capsule, frontal lobe, thalamus, corpus callosum) were selected and the mean and standard deviation of all tensor values in each ROI were then calculated (Table 2). Overall, our analysis reveals low intragroup variability across each ROI. Exemplars of the low variance seen in our imaging samples include measures of RD in the frontal lobe across all genetic variants in the present study: *Fmr1* frontal lobe mean RD = $0.34 \pm 0.002 \cdot 10^{-3} \text{ mm}^2/\text{s}$; *Nrnx1* frontal lobe mean RD = $0.34 \pm 0.01 \cdot 10^{-3} \text{ mm}^2/\text{s}$; *Pten* frontal lobe mean RD = $0.32 \pm 0.01 \cdot 10^{-3} \text{ mm}^2/\text{s}$.

4. Discussion

ASD is a genetically and phenotypically heterogeneous neurodevelopmental disorder characterized by communication deficits, restricted interests, and repetitive behaviors. While there exists ample evidence linking many genetic variants to the clinical phenotypes seen in the ASD patient population, the precise manner through which individual

genetic variants contribute to the overall disease phenotype remains largely opaque (Christensen et al., 2016). Recent advances in neuroimaging techniques such as DTI have begun to unpack the complex relationship between these susceptibility genes and their related neuroimaging phenotypes within the clinical ASD population. Progress toward identifying salient biomarkers for ASD, however, has stalled, which has largely been attributed to the inherent heterogeneity of the ASD patient population and is further underscored by the conspicuous absence of a true neuroimaging biomarker in ASD. As an illustrative example of the challenges encountered in clinical populations, several studies have investigated the impact of *Fmr1* on global measures of white matter structural integrity. While some studies have reported an increase in FA in tracts such as the uncinate fasciculus and inferior longitudinal fasciculus (Green et al., 2015; Hall et al., 2016), others have reported alterations in the white matter of the genu and splenium of the corpus callosum and the middle cerebellar peduncle (Filley et al., 2015) without recapitulating the findings in the uncinate fasciculus and inferior longitudinal fasciculus. The heterogeneity of studies such as these highlights the challenge of interpreting human imaging studies, even those with pre-identified genetically homogenous patient populations. Furthermore, it emphasizes the importance of considering the potential influence of epistatic and environmental factors in determining the overall clinical and neuroimaging disease phenotype.

Recent advances in genome editing technology have allowed for the novel generation of monogenetic rat models of ASD. The models of ASD used herein (*Pten*^{-/+}, *Fmr1*^{-/-}, and *Nrnx1*^{-/-}) were generated with ZFNs (zinc finger nucleases), which are dual-function artificial restriction enzymes containing both a zinc-finger binding domain as well as a DNA-cleavage domain that enable precise manipulation of complex genomes previously inaccessible to genetic manipulation. The

Table 2
Group mean diffusion measures in six regions of interest demonstrate low intragroup sample variability

| | FA | | AD | | RD | | EC | | Neo. | | CC | | MD | | EC | | Neo. | | CC | |
|--------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|--------------|--------------|-------------|-------------|
| | Hip. | EC | Hip. | EC | Hip. | EC |
| <i>Fmr1</i> | 0.22 ± 0.03 | 0.30 ± 0.06 | 0.47 ± 0.02 | 0.44 ± 0.02 | 0.34 ± 0.03 | 0.29 ± 0.02 | 0.34 ± 0.03 | 0.29 ± 0.02 | 0.44 ± 0.01 | 0.44 ± 0.01 | 0.34 ± 0.03 | 0.26 ± 0.01 | 0.39 ± 0.03 | 0.34 ± 0.02 | 0.39 ± 0.03 | 0.34 ± 0.02 | 0.37 ± 0.004 | 0.37 ± 0.004 | 0.32 ± 0.01 | 0.32 ± 0.01 |
| <i>Nrxn1</i> | 0.29 ± 0.04 | 0.28 ± 0.05 | 0.51 ± 0.02 | 0.49 ± 0.04 | 0.33 ± 0.03 | 0.33 ± 0.02 | 0.33 ± 0.03 | 0.33 ± 0.02 | 0.46 ± 0.02 | 0.46 ± 0.02 | 0.34 ± 0.01 | 0.31 ± 0.03 | 0.39 ± 0.01 | 0.35 ± 0.02 | 0.39 ± 0.01 | 0.35 ± 0.02 | 0.38 ± 0.02 | 0.38 ± 0.02 | 0.33 ± 0.04 | 0.33 ± 0.04 |
| <i>Pten</i> | 0.25 ± 0.03 | 0.27 ± 0.03 | 0.46 ± 0.01 | 0.44 ± 0.01 | 0.32 ± 0.02 | 0.30 ± 0.02 | 0.32 ± 0.01 | 0.30 ± 0.02 | 0.43 ± 0.02 | 0.43 ± 0.02 | 0.32 ± 0.01 | 0.26 ± 0.02 | 0.36 ± 0.01 | 0.34 ± 0.02 | 0.36 ± 0.01 | 0.34 ± 0.02 | 0.35 ± 0.01 | 0.35 ± 0.01 | 0.33 ± 0.02 | 0.33 ± 0.02 |

* Values are mean ± SD. Each column corresponds to each diffusion measure in a region of interest derived from the P72 UNC Atlas.
 ** FA = fractional anisotropy; AD = axial diffusivity; RD = radial diffusivity; MD = mean diffusivity; Hip = hippocampus; EC = external capsule; Neo = neocortex; CC = corpus callosum.

advantages of these monogenetic rat models of ASD over analogous murine models lies in the closer physiological similarity to and more analogous behavioral characteristics found in rats (Gibbs et al., 2004; Smith and Alloway, 2013) relative to humans. Therefore, the rat would be anticipated to provide a more translatable imaging appraisal of gene-specific changes in ASD when compared to previously reported murine neuroimaging studies. Our study represents one of the first reports of rat diffusion tensor imaging analysis of three salient genetic rat models of ASD and contributes to our understanding of single-gene contributions to white matter structural integrity free of potentially confounding environmental and epistatic effects encountered in clinical studies and populations. The three models described herein (*Fmr1*^{-/-} [decreased production of FMRP, a critical protein in synaptic development], *Nrxn1*^{-/-} [cell surface receptor binding neuroligins to form Ca²⁺-dependent neurexin/neuroligin complexes at synapses], and *Pten*^{+/-} (PI3K-Akt-mTOR pathway disruption)) were selected as each model demonstrates disparate molecular mechanisms that contribute to the overall ASD phenotype. That we find a similar degree of microstructural change in all of our models further extends prior work examining volumetric and morphometric differences between different murine models of ASD (Ellegood et al., 2015) to quantitative diffusion MRI and further buttresses our emerging understanding of the neurostructural similarities between genetic models of ASD.

Individuals with mutations in *Pten*, a well-established ASD neural susceptibility gene in the *mTOR* signaling pathway (Eng, 2003), have been associated with nonspecific multifocal white matter hyperintensities, enlarged perivascular spaces, and macrocephaly (Vanderver et al., 2014). However, to the best of our knowledge, no studies have yet examined the impact of *Pten* on measures of white matter microstructure with diffusion tensor imaging. To examine the influence of *Pten* mutations on white matter microstructure in the rat, we conducted whole-brain voxel-wise TBSS analysis, which reveals confluent areas of increased FA and decreased MD, AD, and RD values in the *Pten* model compared to controls. These include areas of decreased RD and concomitantly increased FA throughout most of the frontal lobe and in major white matter tracts such as the corpus callosum and the external capsule as well as the cerebellum (Figs. 1 and 2) that are consistent with recent studies showing MR findings in these same regions (Balci et al., 2018; Frazier et al., 2015).

In addition to presenting the DTI findings of a *Pten*^{+/-} model of ASD, we also explored changes in white matter in the *Nrxn1*^{-/-} model of ASD. Closely related human functional MRI analyses with genetic variants in contactin-associated protein-like 2 (*CNTNAP2*, a neurexin superfamily member) provide the closest analogous imaging study, which demonstrate altered frontal connectivity in individuals with neurodevelopmental disorders such as ASD (Scott-Van Zeeland et al., 2010). In line with these results, our TBSS analyses also reveal marked increases in FA predominantly in the frontal lobe of the *Nrxn1* knockout model. Additionally, we observed significant reductions in global MD and RD throughout the frontal lobe as well as in the corpus callosum as well as in the external capsule. The widespread, confluent changes in measures of the diffusion tensor throughout the brain likely reflect the cytoarchitectural consequences of *neurexin-1* deletion given the critical role neurexins play in establishing and mediating GABAergic and glutamatergic synaptic function through postsynaptic neuroligins (Südhof, 2008). It is interesting to note that the observed increase of FA in both our *Nrxn1* and *Pten* models is a somewhat surprising finding and stands in contrast to findings typically observed in idiopathic ASD in clinical populations. However, numerous studies have also highlighted how these changes are reversed in young children (Bashat et al., 2007; Bode et al., 2011; Weinstein et al., 2011). While the underlying mechanism for these changes are not well understood, this observation is critical given the age of the animals used in our study (P45) frames the same developmental time period as the young children in the aforementioned studies, and further highlights an important translational neuroimaging parallel between our preclinical results and currently

available clinical studies. That each of these three genetic models yields similar results similarly suggests that while the genetic susceptibilities are somewhat disparate, each gene may be contributing and impacting neural microstructure via common neurodevelopmental pathways.

Prior preclinical murine DTI studies involving a *Fmr1*^{-/-} mouse model of autism report reduced structural integrity in the splenium of the corpus callosum and forceps minor of the corpus callosum (Haberl et al., 2015). Whole-brain voxel-wise TBSS and tractography analysis performed in our study revealed no significant differences in FA between *Fmr1*^{-/-} and control animals; however, we did see significant changes in other DTI metrics (AD, RD, MD) in the TBSS analysis. These findings suggest important biological transformations to the diffusion tensor exist that ultimately are balanced to a degree such that no changes in FA were observed. These differences in AD, RD, and MD were observed in the frontal lobe, forebrain, external capsule, and fimbria, which correlate with prior areas of FA change in the mouse and human ASD population (Ingalhalikar et al., 2011; Kumar et al., 2012; Lai et al., 2016). While unexpected, the absence of significant FA change in the *Fmr1* analysis highlights the limitations of modeling these complex neuropsychiatric disorders in a rodent model and likely reflects important biological differences in physiology, environmental conditions, and development between small animal models (mouse to rat) and from rodents to humans. The lack of significant changes in FA in the whole-brain TBSS analysis also highlights the importance of drawing conclusions from multiple measures of diffusion results rather than relying on FA as a faithful representative summary measure of the diffusion tensor (Alexander et al., 2000).

In an extension of previous morphometric studies comparing murine genetic variants of ASD (most notably by Ellegood et al.), our study also found no significant differences in white matter microstructure between our three genetic models of ASD following both TBSS and ROI analysis. With a growing appreciation for the biological overlap among numerous neuropsychiatric diseases including ASD, schizophrenia, and bipolar disorder (Carroll and Owen, 2009; Forstner et al., 2017), our study's findings reinforce a growing understanding that a comprehensive understanding of disease comorbidity and shared biology may be helpful, especially within newly developed frameworks such as the National Institute of Mental Health (NIMH) Research Domain Criteria (RDoC) (Gold et al., 2016). Especially in the context of ASD, which involves a wide and profoundly diverse spectrum of genetic contributions to the disease phenotype, new evidence has demonstrated how diverse genetic perturbations can lead to phenotypic convergence at multiple biological levels in a complex neuropsychiatric disorder (Parikshak et al., 2016). Mirroring these molecular findings, our TBSS analysis, in addition to our ROI analysis, confirms and recapitulates these molecular insights along global measures of white matter structural integrity. While each genetic variant independently demonstrates areas of significant change when compared to control animals, when compared to each other, these three common genetic variants of ASD show remarkable similarity to each other with no areas of statistically significant difference. These data highlight that while there exists the potential for gene-specific neuroimaging biomarkers in ASD, the relative degree of change between each variant is small and mirrors other examples of phenotypic convergence that have also been seen in studies comparing brain morphometry across multiple childhood psychiatric disorders (Gold et al., 2016) and in other morphological studies of ASD (Ellegood et al., 2015).

There are some features of our study that limit the interpretation of our data. As this is a pilot study, one concern would be the relatively small number of replicates used in each of our imaging group analyses. Although we do present secondary analyses to demonstrate that there exists a low degree of variance in our data (Table 2) with no single sample skewing our results, the variance is not zero. Thus, the small sample size emphasizes the pilot nature of our work but provides a springboard for future experiments with larger sample sizes to validate our findings as well as other experimental work with similar

hypotheses. The absence of a female animals in our pilot work also precludes an examination of whether our results would be generalizable to females and future work with female animals will help determine if structural convergence is a phenomenon that is seen in both sexes. Lastly, recent work describing *in situ* gene expression levels mapped to neural microstructural changes in the 16p11.2 hemideletion seen in ASD and ADHD have shown that sex-specific differential gene expression that demonstrates high correlation to underlying deficits in white matter microstructure (Kumar et al., 2018). Such a granular detailed gene-expression map is currently not available for the rat (or for these models) but future work investigating concomitant changes in gene expression with voxel-wise changes in neural microstructure would be informative and provide a greater understanding of the association between gene expression and imaging findings not only in these models of ASD but in other genetic models of neuropsychiatric illness.

In sum, high-resolution diffusion tensor imaging of transgenic models of ASD can provide insight into the relationship between genetic variants and aberrant white matter microstructure in ASD and ultimately highlights the structural convergence in genetic models of a complex neuropsychiatric disorder. Future work with other genetic variants of ASD will continue to shed light on the impact of genotype on global measures of neural microstructure and will help refine our understanding of the shared neuroimaging features in ASD.

Acknowledgments

The authors would like to thank Beth Rauch for outstanding imaging support through the Small Animal Imaging Facility at the University of Wisconsin Carbone Cancer Center and University of Wisconsin Carbone Cancer Center Support Grant P30 CA014520.

Funding

J-P.J.Y was supported by UW-Madison School of Medicine and Public Health and Department of Radiology, the Brain and Behavior Research Foundation (NARSAD) Young Investigator Grant and the University of Wisconsin Institute for Clinical and Translational Research KL2 Scholars Program (NCATS UL1TR000427); DTI analysis tools and pipelines were developed with partial support from NIH U54 HD090256 IDRC Core Grant to the Waisman Center; J.G.G is supported by the National Science Foundation Graduate Research Fellowship under Grant No. DGE-1256259.

Contributors

J-P.J.Y and P.A.R designed the experiments; P.A.R and J.G.G performed the experiments; J-P.J.Y, P.A.R, J.G.G., A.L.A interpreted the results; J-P.J.Y, P.A.R, J.G.G., A.L.A wrote the manuscript.

Conflicts of interest

None.

Supplementary materials

Supplementary material associated with this article can be found, in the online version, at [doi:10.1016/j.psychres.2018.12.007](https://doi.org/10.1016/j.psychres.2018.12.007).

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