

Comparing Region of Interest versus Voxel-Wise Diffusion Tensor Imaging Analytic Methods in Mild and Moderate Traumatic Brain Injury: A Systematic Review and Meta-Analysis

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Abstract

Diffusion tensor imaging is a magnetic resonance imaging technique that is uniquely capable of detecting microstructural tissue damage in mild and moderate traumatic brain injuries (TBIs). To date, it remains unknown if two common analytic techniques, region of interest (ROI) versus voxel-wise (VW) analyses, detect injury in similar locations. The purpose of this systematic review and meta-analysis was to directly compare the regions of abnormality elucidated by each method. Twenty-seven ROI and 11 VW studies met our inclusion criteria. Our ROI meta-analysis identified 11 regions, including the splenium of the corpus callosum, where fractional anisotropy (FA) was significantly decreased in TBI patients, compared with controls. Likewise, we identified higher mean diffusivity/apparent diffusivity constant in the genu, body, and splenium of the corpus callosum. Alternatively, our VW analysis identified one region of high FA in the right superior longitudinal fasciculus and seven regions of low FA, with the two largest located in the corpus callosum. High mean diffusivity and high radial diffusivity, both in the right inferior longitudinal fasciculus, also was revealed by our VW analysis. Moreover, we have shown that the magnitude of damage in the corpus callosum revealed by ROI analysis ($z = -3.15$) is greater than that demonstrated by VW analysis ($z = -1.41$). Overall, this study indicates that both ROI and VW analytic methods are sensitive to low FA in the corpus callosum; however, the ROI method has more power to detect the full extent of tissue abnormality in the corpus callosum. More research utilizing standardized methods and reporting is essential to fully characterize the extent to which ROI and VW analyses can concordantly detect other locations of pathology in mild and moderate TBI patients.

Keywords: diffusion tensor imaging; meta-analysis; systematic review; traumatic brain injury

Introduction

TRAUMATIC BRAIN INJURIES (TBIs) are a major cause of death and disability worldwide, the majority of which are mild or moderate in nature.¹ Traumatic axonal injury (TAI), the pathological substrate of mild TBIs is not detectable by conventional computed tomography or magnetic resonance imaging (MRI) modalities. Instead, diffusion tensor imaging (DTI) has emerged as an MRI method able to detect evidence of microscopic pathology not visible on standard anatomical images.² Despite the growing popularity of DTI over the past two decades, the relative strength of different DTI analytic approaches has not been quantified in a coherent analysis.

DTI analytic approaches that aim to identify regional damage in TBI patients typically employ either a region of interest (ROI) or

voxel-wise (VW) method to compare patients with a control group. Detailed descriptions of the two methods, as well as their pros and cons, have been published elsewhere.³ In brief, in ROI analyses, researchers select specific portions of the brain for examination based on *a priori* hypotheses of injury location. The historic ROI method of the manually tracing region(s) is laborious and rater dependent. While the more modern tractography technique, which utilizes algorithms to segment white matter tracts of interest, overcomes these limitations, it likewise accounts for the spatial heterogeneity of TAI.^{4,5}

Alternatively, in whole-brain VW analyses, every white matter voxel is compared between groups without region specific assumptions. Unlike ROI analyses, this method is not biased towards only detecting pathology in the regions pre-determined by the researchers. VW analyses, however, are limited by the fact that there

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is comparatively less statistical power when necessary corrections for multiple comparisons are employed. Moreover, the more recent VW method, Tract-Based Spatial Statistics (TBSS), which restricts the analysis to a white matter skeleton to minimize registration errors,⁶ is limited both by the propensity for type II errors when applying strict thresholds for significance and the fact that areas outside the skeleton cannot be detected.

Few meta-analyses have addressed DTI abnormalities in mild TBI,^{7,8} namely a report by Aoki and colleagues⁷ on 13 pooled ROI studies and another report by Aoki and colleagues⁸ on 17 pooled VW studies. Further, both Aoki studies were restricted to a mild TBI population and did not examine moderate TBI patients who typically demonstrate more extensive TAL.⁹ To date, no structured meta-analysis using papers published within the same time frame and appraised using the same inclusion/exclusion criteria has examined whether ROI and VW methods identify similar regions of microstructural tissue damage in mild and moderate TBI. Accordingly, the purpose of this systematic review and meta-analysis is to compare the regions of DTI abnormalities in mild and moderate TBI elucidated utilizing a ROI versus a VW analysis to determine if these methods detect the similar locations of injury.

Methods

Literature search strategy

A research librarian identified potential studies by searching the PubMed, EMBASE, PsycINFO, CENTRAL, and Web of Science electronic databases for any entries from inception until June 2017. Search results were limited to English language studies. The full search strategies are available in Appendix A. A combination of Medical Subject Heading (MeSH) terms (or equivalent) and free text were utilized including: brain injuries [MesH], Craniocerebral Trauma [MesH], Head Injuries, Closed, brain trauma, closed head injur*, concuss*, Mild TBI, mild traumatic brain injur*, mtbi AND diffusion tensor imaging [MesH], Diffusion Magnetic Resonance Imaging, diffusion magnetic resonance, diffusion mri, diffusion tensor imag*, diffusion tensor magnetic resonance imaging, diffusion tensor MRI, diffusion tensor tractography, diffusion weighted imag*, DTI, DTT, diffusion tensor, magnetic resonance diffusion tensor imaging. All studies were imported into DistillerSR software (Evidence Partners Incorporated, Ottawa, Ontario) for duplicate removal, screening and data extraction.

Selection criteria

Two independent reviewers (M.S., A.G.) conducted an initial title and abstract screening. Studies were included at this stage if both reviewers agreed that the study: 1) was conducted in humans; 2) used DTI; 3) compared a mild and/or moderate TBI population with a control group; 4) did not study children <18 years old; and 5) was an original research paper (e.g., not a case study or review article). The full text of the studies that passed the abstract screening were then reviewed by two independent reviewers (M.S., J.S.) using the aforementioned criteria in addition to the following requirements for inclusion: 1) fractional anisotropy (FA), axial diffusivity (AD), radial diffusivity (RD), mean diffusivity (MD), or the apparent diffusion coefficient (ADC) in white matter was measured in both the TBI and control group; 2) An ROI (including tractography) or VW analysis (including TBSS) was employed; 3) the TBI population did not have a clinically diagnosed psychiatric comorbidity; and 4) the study was published in a peer reviewed journal (e.g., not a meeting abstract). Disagreements in full text screening were resolved by a third reviewer (L.H.). All reviewers were supervised by a board-certified neuroradiologist (M.L.L.)

Data extraction

For each study, the following variables were extracted by two reviewers (N.W., L.H.) and discrepancies were resolved via a collaborative review of the manuscript: number of male and female TBI and control subjects, age of TBI and control subjects, severity of injury, type of TBI population, time since injury, magnet field strength, number of diffusion directions, b value (other than 0), threshold used to test for significance, method of correction for multiple comparisons, and the DTI parameters explored. For ROI papers, we extracted data necessary to calculate a pooled effect size (mean and standard deviation [SD], or *p* value and sample size or *t*-statistic and sample size) in each region of interest.¹⁰ For VW analysis, we extracted the X, Y, and Z coordinates (in any standard space) and significance level (*p* or *t* values) of positive and negative peaks reported in each study. In the event of missing data, the authors were contacted at least twice, to request necessary data.

Statistical analysis

ROI. All analyses were performed using the Comprehensive Meta Analyses Program v.3. We calculated the standardized mean difference (Hedges' *g*) in DTI parameters between TBI patients and controls in regions of interest reported in ≥ 2 studies. Given the methodological heterogeneity in DTI studies of TBI,³ we implemented a random effects models when < 20 studies were available. The I^2 statistic was calculated to determine whether to employ a fixed or random effects model where data from ≥ 20 studies were available.¹¹ Data from left and right hemispheres were considered as independent regions in order to directly compare ROI with VW analysis. Publication bias was assessed via visual inspection of funnel plots, if ≥ 10 studies were included in the primary analyses¹² and by using the Egger's test. Forest plots were generated using Meta Data Viewer.¹³

VW. Anisotropic Effect-Size Signed Differential Mapping (AES-SDM)^{14,15} was used to conduct a meta-analysis across VW studies. We utilized the following pre-processing parameters for all analyses: modality, DTI-FA; randomizations, 1; correlation template, FA; anisotropy, 1; isotropic full width at half maximum, 20; and mask, white matter. We applied the default thresholds: peak $z > 1$, voxel $p = 0.005$ and cluster size ≥ 10 voxels.¹⁴ To maximize our power, we conducted our AES-SDM analysis combining peak coordinates data from papers that used whole-brain or TBSS voxel-wise methods.^{8,16} For sensitivity analyses, we considered locations within 10 voxels of the X, Y and Z as consistent with the primary results. Publication bias was assessed using the Egger's test.

Both. If data from TBI subjects were divided into separate groups, we calculated a pooled mean and standard deviation. For longitudinal studies, we utilized the more chronic time-point for analysis. Additionally, we conducted jackknife sensitivity and subgroup analyses (mild TBI patients only, < 3 months and ≥ 3 months since injury) when more than two studies were available.

All procedures for this systematic review and meta-analysis were conducted in accordance with the Preferred Reporting Items for Systematic Review and Meta-Analyses (PRISMA) guidelines.¹⁷ Quality assessment of individual studies was not quantified because suitable metrics are not available for observational DTI studies.

Results

Studies and participants

Eligible studies. The PRISMA flow diagram (Fig. 1) describes the study selection process for eligibility. We screened 1890 studies of which 24 ROI and six VW studies provided sufficient

data for analysis. Three authors^{18–20} provided the mean (SD) of DTI parameters of all regions explored in their study. Four^{21–24} authors provided the location of peak coordinates and *p* values for VW analysis. One author¹⁸ provided the original corrected t-Map. This yielded a total of 27 ROI^{18–20,25–48} and 11 VW^{18,21–24,49–54} studies suitable for our meta-analysis.

Participants and imaging characteristics. Demographic and imaging information on included studies are described in Supplementary Table 1 (see online supplementary material at <http://www.liebertpub.com>). A total of 1010 TBI/791 controls were included in meta-analysis of ROI studies and 311 TBI/282 controls were included in VW meta-analysis. The majority of studies (22/27 ROI; 10/11 VW) examined only mild TBI patients. Less than half (12/28 ROI; 5/11 VW) of the studies conducted the DTI scan at an acute or subacute time-point (< 3 months since injury) and the remainder of scans were conducted at a chronic stage (\geq 3 months since injury). Most studies scans were conducted on a 3T scanner (17/27 ROI; 7/11 VW) and used b value of 1000 (18/27 ROI; 8/11 VW). Thirteen of the ROI the studies used manual tracing to delineate regions and the remainder used tractography (8/27), an atlas based (4/27), or an automated segmentation procedure (2/27). Six VW studies used TBSS and five used a non-TBSS whole-brain white matter analytic approach. Eleven ROI studies were corrected

for multiple comparison and more than half (6/11) of VW studies applied a correction for multiple comparisons. FA was examined in all ROI and VW studies included in this meta-analysis. MD/ ADC was the next most commonly explored DTI parameter (16 ROI; three VW studies) followed by RD (nine ROI; two VW), and AD (eight ROI; zero VW).

Primary meta-analysis

ROI. We identified 11 regions where FA was lower in TBI subjects compared with controls in the following areas, listed in decreasing magnitude: the posterior internal capsule (right), the posterior internal capsule (bilateral), the centrum semiovale (bilateral), the posterior internal capsule (left), the splenium of the corpus callosum (bilateral), the anterior internal capsule (right), the posterior corona radiata (left), the posterior corona radiata (right), the posterior thalamic radiations (left), the anterior corona radiata (bilateral), and the posterior corona radiata (bilateral). We identified three clusters of high MD/ADC in TBI subjects compared with controls in the splenium, genu, and body of the corpus callosum (Table 1). Effect sizes in all regions are shown in Supplementary Figure 1 and Supplementary Figure 2 (see online supplementary material at <http://www.liebertpub.com>).

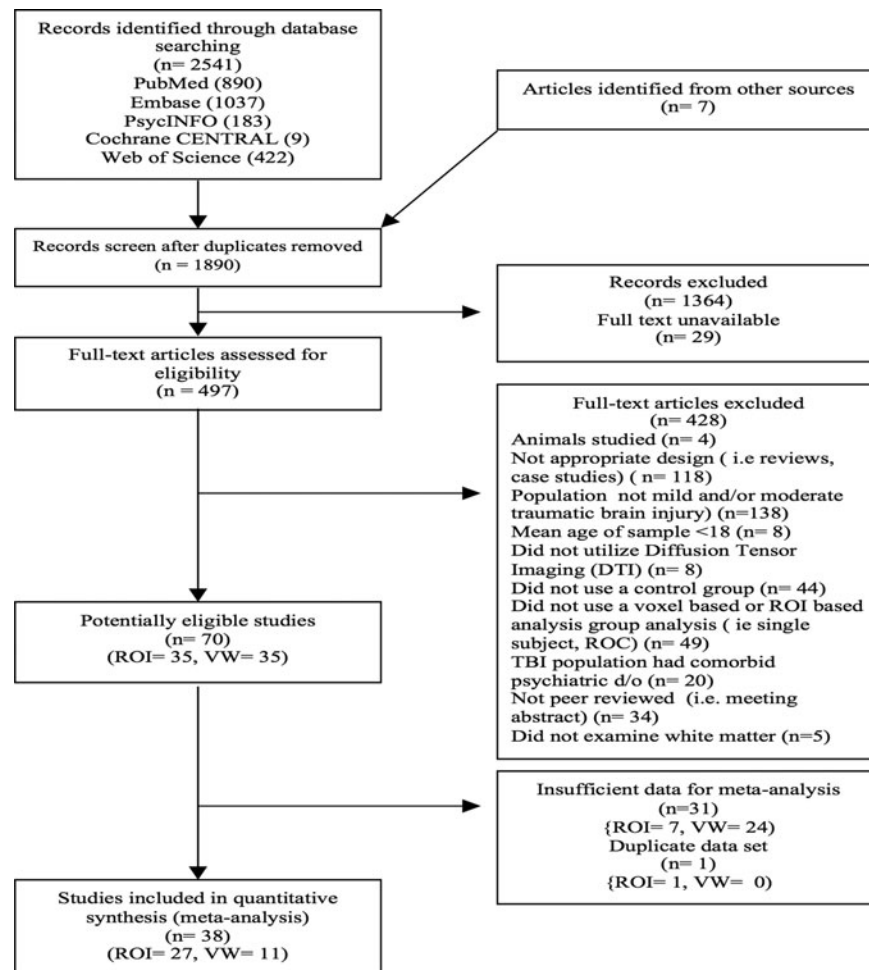


FIG. 1. Preferred Reporting Items for Systematic Review and Meta-Analyses flow chart of included studies. ROI, region of interest; VW, voxel-wise.

TABLE 1. REGIONS OF SIGNIFICANT DIFFERENCE BETWEEN TBI SUBJECTS AND CONTROLS IDENTIFIED POOLING ROI STUDIES

Description	Z value	p value	n studies	Subgroups analysis		
				Mild only	< 3 months since injury only	≥ 3 months since injury only
FA: TBI < control						
Posterior internal capsule, right	-3.69	< 0.01	5	X	X	X
Posterior internal capsule, bilateral	-3.41	< 0.01	3	X		X
Centrum semiovale, bilateral	-3.36	< 0.01	2			
Posterior internal capsule, Left	-3.17	< 0.01	5	X		X
Splenium of corpus callosum, bilateral	-3.15	< 0.01	13			X
Anterior internal capsule, right	-2.68	< 0.01	5	X		X
Posterior corona radiata, left	-2.44	0.01	2			
Posterior corona radiata, right	-2.42	0.02	2			
Posterior thalamic radiations, left	-2.37	0.02	3	X		
Anterior corona radiata, bilateral	-2.35	0.02	2			
Posterior corona radiata, bilateral	-2.26	0.03	2			
Posterior thalamic radiations, right	-2.00	0.045	2			
MD/ADC: TBI > control						
Splenium of CC, bilateral	3.35	< 0.01	7	X	X	X
Genu of CC, bilateral	2.63	0.01	7		X	
Body of CC, bilateral	2.35	0.02	4		X	

An "X" indicates that the results remained significant when only this subgroup was analyzed. A shaded black box indicates that analysis was not done because <2 studies in subgroup. TBI, traumatic brain injury; ROI, region of interest; FA, fractional anisotropy; MD, mean diffusivity; ADC, apparent diffusion coefficient; CC, corpus callosum.

VW. AES-SDM identified one cluster of high FA in TBI subjects, located in the right superior longitudinal fasciculus. There were seven clusters of low FA in TBI subjects, the largest two located in the corpus callosum. Other smaller clusters of low FA included the right superior longitudinal fasciculus, the right inferior fronto-occipital fasciculus, and the right insula (Table 2; Fig. 2A). We found one significant cluster of high MD and one cluster of high RD in TBI subjects, both located in the right inferior longitudinal fasciculus (Table 2; Fig. 2B, 2C).

Sensitivity analyses

ROI. Jackknife (JK) sensitivity analysis of ROI studies demonstrated that findings were retained when all studies were iteratively removed one at a time in all regions except the posterior limb of the internal capsule (bilateral) which was sensitive in two of three of JK analyses. Likewise, High MD/ADC in the genu and splenium of the corpus callosum remained significant when all studies were iteratively removed and was sensitive in two of three JK analyses for the body of the corpus callosum (Supplementary Table 2; see online supplementary material at <http://www.liebertpub.com>).

VW. Our AES-SDM findings were also highly robust. High FA in the right superior longitudinal fasciculus was sensitive in eight of nine JK analyses and all clusters of low FA remained significant when ≥ 8 studies were removed. High MD in the right inferior longitudinal fasciculus remained significant in two of three JK analyses (Supplementary Table 3; see online supplementary material at <http://www.liebertpub.com>).

Subgroup analysis

ROI. All FA ROI findings, except for low FA in the splenium of the corpus callosum (bilateral), remained significant when only mild TBI cases (e.g., excluding moderate TBI) were included in the analysis. Our low FA findings remained consistent in the ≥ 3 months

since injury subgroup in all regions. High MD/ADC in the splenium of the corpus callosum remained significant in all subgroup analyses; however, findings in the genu and body of the corpus callosum only persisted in the < 3 months since injury subgroup (Table 1).

VW. VW findings remained in similar regions when only mild TBI cases were included. Although our threshold of 10 voxels in the X, Y and Z direction was not met in the four largest clusters, AES-SDM located these clusters in similar regions as the primary analysis (Table 2 and Supplementary Table 4; see online supplementary material at <http://www.liebertpub.com>). Our findings of low FA in largest corpus callosum cluster and in the right superior longitudinal fasciculus remained in < 3 months since injury subgroup whereas low FA in the second and third largest corpus callosum clusters and in the right inferior fronto-occipital fasciculus only persisted in ≥ 3 months since injury subgroup. The one cluster of high FA identified in VW analyses was only significant in the ≥ 3 months since injury subgroup. High MD in the right inferior longitudinal fasciculus persisted in both the mild and ≥ 3 months since injury subgroups (Table 2; Supplementary Tables 5 and 6; see online supplementary material at <http://www.liebertpub.com>).

Publication bias

ROI. The Egger's tests identified no evidence of publication bias in any region (Supplementary Table 7; see online supplementary material at <http://www.liebertpub.com>).

VW. Visual inspection of the funnel plot of low FA in the splenium of the corpus callosum did not reveal publication bias (Supplementary Fig. 3; see online supplementary material at <http://www.liebertpub.com>). Likewise, the Egger's tests identified no evidence of publication bias in any region (Supplementary Table 8; see online supplementary material at <http://www.liebertpub.com>).

TABLE 2. REGIONS OF SIGNIFICANT DIFFERENCE BETWEEN TBI SUBJECTS AND CONTROLS IDENTIFIED POOLING VW STUDIES

Primary analysis						Subgroup analysis		
	Z value	p value	Cluster size	MNI coordinates	n studies	Mild only	< 3 months since injury only	≥ 3 months since injury only
FA: TBI > control								
Superior longitudinal fasciculus III, right	1.16	0.000006	315	48, -10, 24	10			X
FA: TBI < control								
Corpus callosum	-1.77	0.000196	1164	-8, 4, 20	10		X	
Corpus callosum	-1.48	0.000796	148	20, -34, 12	10			X
Superior longitudinal fasciculus III, right	-1.52	0.000672	56	32, -2, 18	10		X	
Corpus callosum	-1.41	0.001213	40	-16, 44, 28	10			X
Corpus callosum	-1.35	0.002243	30	20, -14, 44	10	X		
Inferior fronto-occipital fasciculus, right	-1.34	0.002250	21	34, -60, 6	10	X		X
Insula, right	-1.44	0.001219	11	42, 2, 6	10	X		
MD: TBI > control								
Inferior longitudinal fasciculus, right	1.39	0.000007	435	30, -58, 2	3	X		X
RD: TBI > control								
Inferior longitudinal fasciculus, right	1.57	0.000033	832	28, -66, 2	2			

Results thresholded at $p < 0.005$ and cluster size > 10 voxels.

An "X" indicates that the results are within 10 voxels in the X, Y, and Z direction of primary findings. Shaded black box indicates that analysis was not done because < 2 studies in subgroup.

TBI, traumatic brain injury; VW, voxel-wise; MNI, Montreal Neurological Institute; FA, fractional anisotropy; MD, mean diffusivity; RD, radial diffusivity.

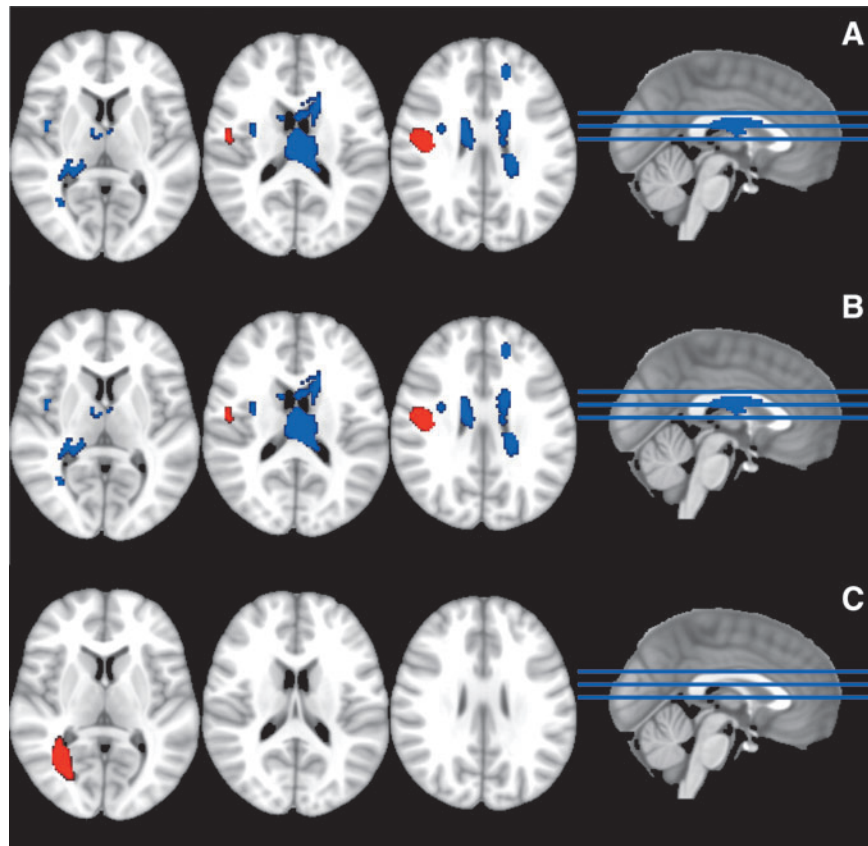


FIG. 2. Results of voxel-wise meta-analysis. (A) Fractional anisotropy (FA): traumatic brain injury (TBI) subjects demonstrated one cluster of high FA (red) in the right superior longitudinal fasciculus and seven clusters of low FA (blue), the largest two located in the corpus callosum. (B) Mean diffusivity (MD): TBI subjects demonstrated one cluster of high MD (red) in the right inferior longitudinal fasciculus. (C) Radial diffusivity (RD): TBI subjects demonstrated one cluster of high RD (red) located in the right inferior longitudinal fasciculus. Color image is available online.

Discussion

This systematic review and meta-analysis compared DTI findings in mild and moderate TBI patients identified utilizing ROI versus VW analytic approaches. Our findings show that both ROI and VW methods detect low FA in the corpus callosum but the ROI method detects a greater amount of abnormality in this region. Our results were highly robust when applying a jackknife sensitivity analysis and findings remain similar locations when only mild TBI cases were examined.

To date, few studies have meta-analyzed DTI findings in mild TBI. Aoki and colleagues published two studies, which separately assessed ROI and VW studies culled from different timeframes. Their 2012⁷ meta-analysis of ROI studies identified low FA in the splenium and their 2016⁸ meta-analysis, which synthesized FA findings across VW studies, similarly showed the largest cluster of low FA in the splenium. Our meta-analysis, however, more specifically addressed whether ROI and VW revealed similar regions of abnormality across the whole brain by directly comparing studies published within the same time-period and screened using identical criteria. Moreover, we included moderate TBI patients and examined additional DTI parameters to provide a more comprehensive review of the utility of DTI in detecting TAI.

In our direct comparison, we confirmed that both ROI and VW methods are sensitive to low FA in the corpus callosum in mild and moderate TBI. However, other regions of low FA are not concor-

dantly identified across methods. High MD was found in both ROI and VW analyses, but in dissimilar regions. A major caveat in interpreting these findings, however, is the fact that no regions other than the corpus callosum utilized data from more than five studies. This is due to bias imposed by the researcher(s) *a priori* hypotheses as well as data actually available from the studies for meta-analysis. To sufficiently compare data across regions it is necessary for papers to examine similar ROIs and for authors to report data from all regions explored, regardless of statistical significance.

Only the VW meta-analysis identified a region where FA was higher in TBI patients than in controls. VW meta-analysis by Aoki and colleagues⁸ did not reveal any regions of high FA; however, our divergent findings may be attributable to the fact that we utilized the raw statistical t-map from the study by Ling and colleagues,¹⁸ which primarily reported high FA in their population. This underscores the importance for researchers to make available raw statistical maps so that future meta-analyses can more comprehensively characterize diffusion abnormalities and associated biological changes in mild and moderate TBI.

We have found that the magnitude of the effect size of low FA revealed by our ROI meta-analysis was approximately two times larger than that revealed by our VW meta-analysis. This finding is not unexpected, given that the conservative thresholds and necessary registration procedures applied in VW analyses lead to small cluster sizes that may conceal the full anatomic extent of damage. Additionally, efforts such as clustering, used to minimize the risk of

type 1 error in VW analyses, necessarily limit sensitivity. On the other hand, ROI analyses average DTI parameters over the entire prescribed region/tract and hence are inherently more sensitive to detect a greater degree of abnormality.

There are several limitations to this meta-analysis that should be noted. ROI analyses are only reliable insofar as regions are reproducibly localized across subjects and across studies, which is, in turn, conditional upon reliable manual placement of ROIs or robust registration procedures. Moreover, although we aggregated regions based on the naming provided in publications, we cannot exclude the possibility that the white matter in the distinct regions we examined does not completely overlap. For instance, we cannot know whether the internal capsule was delineated as a unique structure or included as part of the larger corticospinal tract. Moreover, despite our diligent efforts, we were only able to retrieve sufficient data for our AES-SDM analysis in 31% of eligible studies. This may have limited our power to detect full extent of pathology revealed by VW methods and highlights the necessity for researchers to make available the coordinates and the precise p values of the abnormalities detected in their studies. Furthermore, AES-SDM results are most reliable, and less prone to Type 1 errors, when statistical parametric maps are included.¹⁴ In the present analysis, we were only able to retrieve one original t-map; however, this is more data than has been included in any prior image-based meta-analyses of mild TBI. Finally, unmeasured sources of heterogeneity such as divergent imaging parameters (e.g., field strength; b values), differences in image processing methods and software, and TBI populations (e.g., military vs. civilian) also exist across studies. We did not have sufficient power to conduct subgroup analyses on these or other possible sources of heterogeneity and we, therefore, employed random effects models to account for these potential sources of variance.

Overall, in this systematic review and meta-analysis, we have shown that low FA in the corpus callosum is consistently detected by both ROI and VW methods; however, the effect size of damage revealed by pooling ROI studies was twice as large. These results suggest that VW analyses, which are automated and not subject to rater bias, can be implemented clinically to identify injury in the corpus callosum. On the other hand, ROI analyses, which are bias prone and onerous, may henceforth be exclusively utilized when the magnitude of microstructural tissue damage is an important clinical consideration.

Evidence of tissue damage in regions outside the corpus callosum was incongruently identified across methods; however, this discordance may simply reflect the small number of papers that examined similar regions and the limited data available for our VW meta-analysis. To more accurately synthesize findings across studies and robustly assess the power of ROI versus VW methods for detection of pathology in smaller white matter regions, it is essential for future studies to follow standardized data reporting methods such as those proposed by the National Institute of Neurological Disorders and Stroke's Common Data Elements Project.⁵⁵

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Author Disclosure Statement

No competing financial interests exist.

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APPENDIX A

Database	Search Strategy
All databases	Limit applied: English No limitations by date of publication, publication type, or document type
PubMed	((brain injuries) OR (Craniocerebral Trauma) OR (Head Injuries, Closed) OR (brain trauma[ti] OR (closed head injur*[tiab]) OR (concuss*[tiab]) OR (Mild TBI[tiab]) OR (mild traumatic brain injur*[tiab]) OR (mtbi[tiab]) OR (brain trauma) OR (closed head injur*) OR (concuss*) OR (Mild TBI) OR (mild traumatic brain injur*) OR (mtbi))) AND ((diffusion tensor imaging) OR (Diffusion Magnetic Resonance Imaging) OR (diffusion magnetic resonance[tiab]) OR (diffusion mri[tiab]) OR (diffusion tensor imag*[tiab]) OR (diffusion tensor magnetic resonance imaging[tiab]) OR (diffusion tensor MRI[tiab]) OR (diffusion tensor tractography[tiab]) OR (diffusion weighted imag*[tiab]) OR (DTI[tiab]) OR (DTT[tiab]) OR (diffusion[tiab] AND tensor[tiab]) OR (magnetic resonance diffusion tensor imaging[tiab]) OR (diffusion magnetic resonance) OR (diffusion mri) OR (diffusion tensor imag*) OR (diffusion tensor magnetic resonance imaging) OR (diffusion tensor MRI) OR (diffusion tensor tractography) OR (diffusion weighted imag*) OR (DTI) OR (DTT) OR (diffusion AND tensor) OR (magnetic resonance diffusion tensor imaging))
Embase	'traumatic brain injury'/exp OR 'traumatic brain injury' OR 'brain concussion'/exp OR 'brain concussion' OR ('traumatic brain':ab,ti AND injur*:ab,ti) OR 'tbi':ab,ti OR 'mtbi':ab,ti OR concuss*:ab,ti OR 'brain trauma':ab,ti OR ('closed head':ab,ti AND injur*:ab,ti) AND 'diffusion tensor imaging'/exp OR 'diffusion magnetic resonance':ab,ti OR 'diffusion mri':ab,ti OR 'diffusion tensor':ab,ti OR 'diffusion weighted':ab,ti OR 'dti':ab,ti OR 'dti':ab,ti
Cochrane	1. exp Diffusion Magnetic Resonance Imaging/ 2. dti.mp. [mp=title, original title, abstract, mesh headings, heading words, keyword] 3. diffusion tensor imaging.mp. [mp=title, original title, abstract, mesh headings, heading words, keyword] 4. 1 or 2 or 3 5. exp Brain Injuries/ 6. tbi.mp. [mp=title, original title, abstract, mesh headings, heading words, keyword] 7. mtbi.mp. [mp=title, original title, abstract, mesh headings, heading words, keyword] 8. traumatic brain injur\$.mp. [mp=title, original title, abstract, mesh headings, heading words, keyword] 9. 5 or 6 or 7 or 8 10. 4 and 9
PscyINFO	ti=diffusion NEAR/3 tensor OR ab=diffusion NEAR/3 tensor OR kw=diffusion NEAR/3 tensor OR ti=dti OR ab=dti OR kw=dti OR ti=diffusion NEAR/3 mri OR ab=diffusion NEAR/3 mri OR kw=diffusion NEAR/3 mri OR ti=diffusion NEAR/3 "magnetic resonance" OR ab=diffusion NEAR/3 "magnetic resonance" OR kw=diffusion NEAR/3 "magnetic resonance" OR it="magnetic resonance imaging" AND it="traumatic brain injury" OR ti=TBI OR ab=TBI OR kw=TBI OR ti=mtbi OR ab=mtbi OR kw=mtbi OR ti="mild" NEAR/3 "traumatic" NEAR/3 "Brain" NEAR/3 Injur* OR ab="mild" NEAR/3 "traumatic" NEAR/3 "Brain" NEAR/3 Injur* OR kw="mild" NEAR/3 "traumatic" NEAR/3 "Brain" NEAR/3 Injur* OR ti="moderate" NEAR/3 "traumatic" NEAR/3 "Brain" NEAR/3 Injur* OR ti="moderate" NEAR/3 "traumatic" NEAR/3 "Brain" NEAR/3 Injur* OR kw="moderate" NEAR/3 "traumatic" NEAR/3 "Brain" NEAR/3 Injur* OR it="brain concussion" OR ti=concuss* OR ab=concuss* OR kw=concuss*
Web of Science	1: TS=(diffusion tensor) OR TS=(dti) OR TS=(diffusion magnetic resonance) 2: TS=(brain n/3 injur*) OR TS=(tbi) OR TS=(mtbi) OR TS=(concuss*) 3: #2 AND #1