

# Diffusion tensor MRI as a biomarker in axonal and myelin damage

Diffusion tensor imaging has been used extensively as a research tool to understand the structural changes associated with white matter pathology. Using water diffusion as the basis to construct anatomic details, diffusion tensor imaging offers the potential to identify structural and functional adaptations before gross anatomical changes, such as lesions and tumors, become apparent on conventional MRI. Over the past 10 years, further parameters, such as axial and radial diffusivity, have been developed to characterize white matter changes specific to axons and myelin. In this paper, the potential application and outstanding issues on the use of diffusion tensor imaging directional diffusivity as a biomarker in axonal and myelin damage in neurological disorders will be reviewed.

KEYWORDS: acute and chronic CNS disorders acute disseminated encephalomyelitis Alzheimer's disease axial diffusivity axonal injury diffusion tensor imaging leukodystrophy MRI multiple sclerosis myelin damage radial diffusivity

# Principles of diffusion tensor imaging

Diffusion tensor imaging (DTI) is a noninvasive, quantitative MRI technique that measures the rate and direction of movement of water molecules within tissues. In the CNS, axonal tracts and myelin present physical barriers that impose directionality or anisotropy on water diffusion (FIGURE 1) [1,2]. Applying magnetic field gradients allows the measurement of the rate and direction of the movement of water molecules in the direction of the magnetic field. Using the basis of diffusion, we can construct a 3D directional architecture of axon fibers and myelin in the CNS (FIGURE 2).

Diffusion is limited along certain directions in each image voxel. Diffusion in a voxel can be modeled as a 3D ellipsoid with a  $3 \times 3$  matrix or the diffusion tensor (D), which can also be characterized by three eigenvectors ( $\Sigma_1$ ,  $\Sigma_2$  and  $\Sigma_3$ ).

Multiple summary parameters can be obtained from the diffusion tensor represented by an ellipsoid. The ellipsoid volume describes the mean diffusivity, which is a measure of the overall mean displacement of water molecules. The ellipsoid eccentricity describes fractional anisotropy (FA), which characterizes the fraction of molecular displacements that can be attributed to the orientation of the axon fiber (anisotropy). FA values vary between 0 for isotropic diffusion (diffusion in a sphere where molecular movement is equally restricted in all directions) and 1 (diffusion with infinite anisotropy) [3]. Another important parameter is the apparent diffusion coefficient (ADC), which takes into account the fact that restriction barriers, such as myelin and other cellular structures, may interfere with diffusion and, therefore, diffusion rates are only apparent [1,3,4].

These parameters can be used to deduce the general organization of fiber tracts. Often, disorganization of axon fiber architecture leads to unrestricted or isotropic diffusion and, as a result, reduced FA values. A low ADC value often indicates a well-organized structure while a high ADC indicates disorganization in structure. These anisotropy parameters can highlight interruption of diffusion along the axon fiber even before structural changes are obvious on other imaging modalities, making DTI a potentially useful tool for clinical application.

However, summary parameters allow for a simplified expression of water diffusion and are not specific to axon and myelin pathology [5,6]. A reduced anisotropy and high ADC do not allow us to discriminate between axonal and myelin damage. However, the directional architecture of axons and myelin in the CNS provides additional parameters that characterize water diffusion to the axonal tracts and underlying tissue structures. Through matrix diagonalization (a mathematical operation that allows orthogonal directions to coincide with the main diffusion directions; i.e., along which diffusion is the fastest), three eigenvalues ( $\lambda_1$ ,  $\lambda_2$  and  $\lambda_3$ ), each associated with an eigenvector, are obtained for each voxel [7,8]. Eigenvalues can be used to characterize directional diffusivity describing Wint Yan Aung<sup>1</sup>, Soe Mar<sup>2</sup> & Tammie LS Benzinger<sup>\*1,3</sup> <sup>1</sup>Department of Radiology, Washingtor University, School of Medicine, 510 South Kingshighway Boulevard, St Louis, MO 63110, USA <sup>2</sup>Department of Pediatric & Developmental Neurology, Washington University School of Medicine, St Louis, MO, USA <sup>3</sup>Department of Neurological Surgery, Washington University School of Medicine, St Louis, MO, USA \*Author for correspondence:



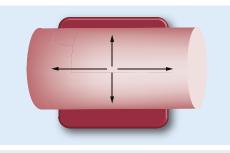


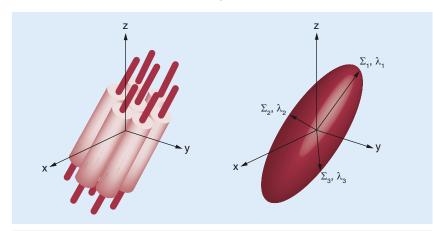
Figure 1. In tissues, physical barriers restrict diffusion and impose directionality or anisotropy. Anisotropic diffusion forms the basis of diffusion tensor imaging.

water movement parallel to (axial diffusivity), and perpendicular to (radial diffusivity), axonal tracts.

Axial diffusivity =  $\lambda$ -axial ( $\lambda_{11}$ ) =  $\lambda_1$ 

Radial diffusivity =  $\lambda$ -radial ( $\lambda_{\perp}$ ) = ( $\lambda_2 + \lambda_3$ )/2

 $\lambda_{\rm II}$  is the largest eigenvalue and is thought to characterize diffusion along the long axis of the axonal tract. Diffusion is greater in the direction parallel to the length of the fiber.  $\lambda_{\perp}$ is the average of the shorter two eigenvalues  $(\lambda_2 + \lambda_3)$  and is thought to characterize diffusion perpendicular to the long axis of fiber tract where diffusion is limited. Unlike summary parameters, such as ADC and FA, directional diffusivity takes anatomic details into account. Hence, it provides specific structural details regarding the anatomical status of axons and myelin.



**Figure 2. Water diffusion in the CNS is restricted by physical structures.** On the left is a schematic representation of myelinated axons with the MRI scanner x-, y-, and z-axis superimposed. On the right, water movement within the axon bundle can be modeled as an ellipsoid. The ellipsoid orientation can be described by three eigenvectors ( $\Sigma_1$ ,  $\Sigma_2$  and  $\Sigma_3$ ) and through matrix diagonalization; three eigenvalues ( $\lambda_1$ ,  $\lambda_2$  and  $\lambda_3$ ) associated with the eigenvectors are obtained for each voxel to characterize the shape of the ellipsoid. In a healthy myelinated axon, diffusion is limited to the directions perpendicular to the length of the axon ( $\lambda_2$  and  $\lambda_3$ ) and is characterized by radial diffusivity ( $\lambda_1$ ). Diffusion is greater in the direction parallel to the length of the fiber ( $\lambda_1$ ) and is characterized by axial diffusivity ( $\lambda_{II}$ ). Reproduced with permission from [3].

# DTI versus MRI in demyelinating diseases

While MRI can help to identify demyelinating lesions, it is not capable of discriminating between demyelination and axonal injury. Demyelinating lesions are typically hyperintense on conventional T2-weighted images and fluidattenuation inversion recovery images. To some degree, we can discriminate between active and inactive lesions based on contrast enhancement. However, conventional MRI cannot predict whether T2 hyperintense lesions involve pure demyelination or a mixture of demyelination and axonal injury (FIGURE 3) [4]. Hence, while MRI has been an important diagnostic tool, it has been less satisfactory in terms of prognostic evaluation. In particular, with demyelinating diseases, such as multiple sclerosis (MS) and leukodystrophies, MRI provides important information for diagnoses but shows a weak correlation between burden of lesions, clinical manifestations and disability [9,10]. If acute axonal damage can be identified during a window of opportunity before clinical manifestations present, it could provide an opportunity for better management and have a positive impact on clinical outcome.

DTI directional diffusivity has the potential to distinguish whether T2 hyperintense lesions involve pure demyelination, axonal damage or a mixture of both. In doing so, DTI directional diffusivity may provide valuable information on structural changes underlying demyelination, axonal damage and recovery. In addition, evaluating changes in DTI directional diffusivity and disability over time for prognostic and therapeutic decision-making purposes are promising potential applications of DTI.

#### Animal model & experiments

The use of  $\lambda_{11}$  and  $\lambda_{\perp}$  to model axonal and myelin injury has been established through numerous experiments in mice over the last decade. Using mouse optic nerve after retinal ischemia, Song *et al.* demonstrated that DTI diffusivity measures could differentiate between axonal and myelin damage [11]. In a mouse model of retinal ischemia, a timecourse assessment of DTI measurements demonstrated a decrease in  $\lambda_{11}$  at day 3 corresponding to axonal degeneration, which was confirmed by histology. An increase in  $\lambda_{\perp}$  was observed beginning at day 5 and was correlated with myelin degradation, again confirmed by histology [11]. A distinct timecourse for axonal and myelin injury was noted (FIGURE 4) [4].

Decreased  $\lambda_{II}$  has been attributed to fragmentation of axons, which creates barriers to

the longitudinal movement of water. Accumulation of cellular debris, disordering of microtubule arrangement and filament aggregation leading to impaired axonal transport have been proposed as mechanisms that hinder water diffusion and, thereby, decrease  $\lambda_{11}$  [12-14]. Elevated  $\lambda_{\perp}$  is thought to be a consequence of myelin degradation, allowing increased water diffusion perpendicular to axons.

Using cuprizone treatment of C57BL/6 mice as a model of CNS acute demyelination, remyelination and axonal damage, a series of experiments have been conducted to further evaluate  $\lambda_{\mu}$  and  $\lambda_{\perp}$ , *in vivo* and *ex vivo*, with correlation to histological analysis [15-17]. Demyelination was quantified using Luxol fast blue staining, immunohistochemical examinations and electron microscopy, and was found to be consistent with increased  $\lambda_{\perp}$ . Axonal damage was evaluated by various immunochemical staining techniques for detecting nonphosphorylated neurofilaments and quantifying amyloid precursor protein-positive accumulations. Axonal damage, however, did not always correspond with  $\lambda_{11}$  throughout the pathologic process.

In these series of studies, mice were fed a diet of 0.2% cuprizone for 12 weeks followed by 12 weeks of recovery. Biweekly *in vivo* DTI results showed reduced  $\lambda_{\mu}$ , indicative of axonal damage early on at 4 weeks into the diet. Axonal damage was confirmed by histology demonstrating axonal swellings, neurofilament dephosphorylation and reduced diameters. Increased  $\lambda_{\perp}$  corresponded to demyelination in the corpus callosum (CC) 6–12 weeks into the 0.2% cuprizone diet. This was followed by normalization of  $\lambda_{\perp}$  during remyelination in the recovery stage.

Some of the studies report that changes in axons and myelin indicated by histology did not always coincide with DTI diffusivity changes, despite the careful control of timing and pathologic process in the animal models. Often, histology revealed that demyelination begins early on at week 4, but this was not revealed by DTI. In another study looking at in vivo and ex vivo imaging of cuprizone-induced demyelination in the mouse CC, *in vivo*  $\lambda_{\mu}$  was found to detect axonal pathology early on and *ex vivo*  $\lambda_{\perp}$  was found to be more specific in conveying myelin damage that was consistent with histological evidence [18]. The authors have proposed that the sensitivity of  $\lambda_{\perp}$ in vivo may be masked by mechanisms of axonal injury, such as increased cell infiltration, which may restrict water diffusion, and cellular swelling [12,19], which could potentially reduce extracellular fluid and contribute to overall reduced

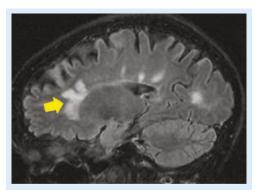


Figure 3. Sagittal fluid-attenuation inversion recovery image obtained at conventional MRI for a patient with multiple sclerosis demonstrates hyperintense lesions (arrow) but cannot distinguish between axonal injury and demyelination.

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diffusion. On the other hand, sensitivity of *ex vivo*  $\lambda_{\perp}$  may be less affected owing to an increase in permeability of the axon membrane as a result of fixation, reducing the barrier to water diffusion perpendicular to the axons [1]. Again, while the timing of the pathologic process can be well controlled in animal models and may potentially resolve discrepancies between histology and DTI diffusivity changes, the challenge lies in translating the findings of mice studies to human diseases given the complexities and lack of control of timing in humans.

Nevertheless, the normalization of  $\lambda_{\perp}$  to baseline levels during periods of remyelination indicates that  $\lambda_{\perp}$  is an overall good measure of myelin damage. Changes in  $\lambda_{\perp}$  are not limited to demyelination; dysmyelination has also been found to correlate with increased  $\lambda_{\perp}$  [20,21].

In the series of experiments described above,  $\lambda_{\mu}$  values consistently declined in the acute injury stage, but did not correlate with axonal atrophy during the chronic injury stage. An increase in *in vivo* measures of  $\lambda_{II}$  was found during chronic injury and the recovery stage. However, histochemical examinations consistently confirmed axonal regeneration and gain of normal morphology only during the stage of recovery following injury. While an increase in  $\lambda_{\mu}$  may reflect some degree of axonal recovery, even during the chronic demyelination stage, it is important to further investigate the precise mechanisms that entail axonal damage and repair. Cellular responses to CNS injury, such as gliosis, cellular infiltration and resolution of axonal swellings, during periods of chronic demyelination have been proposed as possible factors affecting  $\lambda_{_{||}}$  and  $\lambda_{\perp}.$  Further studies involving different

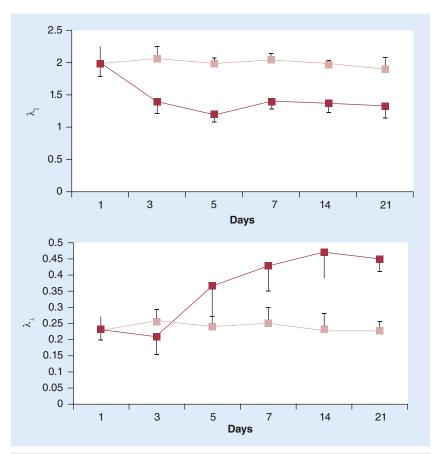


Figure 4. Timecourse of axial and radial diffusivity in mice following retinal ischemia. A distinct timecourse for axonal and myelin injury was noted; axial diffusivity, marking axonal degeneration, begins at day 3. Subsequently, myelin degradation is identified by increased radial diffusivity.  $\lambda_{\mu}$ : Axial diffusivity;  $\lambda_{\perp}$ : Radial diffusivity. Reproduced with permission from [3,11].

axonal injury models and careful timecourse histological quantification using fluorescence microscopy and immunostaining may be useful to understand the cellular mechanisms reflected by an increase in  $\lambda_{11}$ . Possible mechanisms, such as myelin-associated glycoprotein activity, resolution of axonal swellings, astrogliosis and hypertrophy [22,23], associated with axonal recovery should be further investigated to understand potential implications of  $\lambda_{11}$  and  $\lambda_{\perp}$  measures.

In summary, the results of animal model studies suggest that  $\lambda_{\perp}$  is a good indicator of myelin damage. However,  $\lambda_{\parallel}$  does not always correlate with axonal pathology. Currently, there is no animal model that describes demyelination and axonal damage independently, making it difficult to precisely discern the contributions with respect to pathology. We speculate that mechanisms associated with different stages of axonopathy may be attributed to the  $\lambda_{\parallel}$  measure. Decreased  $\lambda_{\parallel}$  has been associated with various mechanisms of axonal damage, such as axonal swelling [16,24], Wallerian degeneration [5,25,26] and diffuse axonal injury [12,27,28]. In animal experiments,  $\lambda_{\parallel}$  was able to characterize axonal degeneration in the acute stage but could not demonstrate axonal damage in the chronic state. Based on the results of the animal models, it is conceivable that  $\lambda_{II}$  is a time-dependent measure reflective of different stages of axonal injury, which may be characterized by unique cellular mechanisms. The findings from animal models suggest that, in the context of demyelinating diseases, acute injury involving axonal swellings with minimal axonal damage may be able to indicate axonal involvement through  $\lambda_{\mu}$ , while chronic diseases characterized by long-term axonal atrophy and degeneration may fail to do so. However, with all human studies, the challenge of lack of control of timing and the pathologic process is difficult to resolve and may not always demonstrate a clear-cut uniform answer. With this in mind, we will discuss the potential application of directional diffusivity in the context of acute demyelination disorders, such as acute disseminated encephalomyelitis (ADEM), chronic demyelinating diseases such as MS and leukodystrophies (Pelizaeus-Merzbacher disease [PMD]) and other neurodegenerative diseases such as Alzheimer's disease (AD). Based on current DTI studies, we will also assess  $\lambda_{\perp}$  during the course of myelin damage and  $\lambda_{\mu}$  during the course of axonal injury in acute and chronic white matter diseases.

#### Acute CNS demyelination ■ MR markers for acute monophasic demyelinating disorders

DTI directional diffusivity may prove to be useful as a biomarker in differentiating between acute monophasic disorders and progressive disorders. The most common demyelinating disease in childhood represents ADEM, an acute monophasic disease associated with low rates of conversion to MS, a progressive disorder. ADEM is found to have an excellent recovery rate in the long-term follow-up [29]. MS is a progressive disorder and immunomodulatory treatments are used to reduce relapses and prevent permanent disability. It is difficult to differentiate between MS and ADEM early in the clinical process. MR markers involving CC long-axis perpendicular lesions and the presence of well-defined lesions are found to be specific, but not very sensitive for predicting conversion to MS after the first episode [30,31]. Recent studies have confirmed T2 lesions in periventricular white matter and the presence of T1 hypointense lesions are better predictors of MS diagnosis in children with

acute demyelinating syndromes [32,33]. However, the MRI criteria have not yet been established that are predictive of disability in the long term. Similarly, spinal cord lesions have only shown a weak correlation with physical disability [34,35].

The distinction between MS and ADEM can be difficult, as no specific clinical feature exists for differentiating the two pathologies. Conventional MRI scans are not able to discriminate between the two diagnoses at the time of initial presentation. In addition, laboratory testing and physical examinations are not definitive. A final diagnosis is only made after months of follow-up, with the rate and number of relapses determining the final diagnosis - in that, if relapses occur that are disseminated with respect to space and time, MS is diagnosed [36]. At the same time, conversion to MS is uncertain from the initial diagnosis. Current MRI predictive criteria are not satisfactory in terms of distinguishing a first attack of MS from ADEM. Owing to the difficulty in identifying children at highest risk of developing MS after the first acute attack, disease-modifying treatments are typically not given. A lack of definitive diagnosis, however, can result in significant treatment delay for patients who will later be diagnosed with MS after many follow-ups. Predictive biomarkers to identify children at risk of conversion to MS may allow early treatment during a window of opportunity in which conversion to MS and progressive disability may be prevented.

#### DTI diffusivity as a potential biomarker

MS and ADEM are characterized by lesions with demyelination, inflammation and axonal injury. There are no exclusive clinical features within lesions that are specific for the pathologies. On the other hand, abnormalities in normalappearing white matter (NAWM) may point to distinct pathologic profiles for these disorders. In MS, axonal loss often occurs early in the course of the disease [37–39]. Many studies have also highlighted that axonal loss may be the primary determinant of irreversible neurological disability in MS patients [39–41].

In a recent retrospective DTI study looking at nonlesional white matter changes within central fibers of the CC genu and internal capsule in pediatric MS and monophasic demyelination disorders, Tillema *et al.* found lower FA values, increased  $\lambda_{\perp}$  and decreased  $\lambda_{\parallel}$  compared with controls for the MS group early in the disease course, in less than 1 year (median duration from symptoms onset to DTI was 20 months) [42]. In the monophasic demyelination group, reduced FA values, increased  $\lambda_{\perp}$ and no difference in  $\lambda_{II}$  was observed (ADEM: median duration from symptoms onset to DTI was <1 week). Overall, DTI directional diffusivity appears to be consistent with pathologic profiles of axonal damage and demyelination for the disorders. Decreased  $\lambda_{\mu}$  in the MS group corresponds with the pathologic profile of MS characterized by early axonal loss. In the ADEM group, no change in  $\lambda_{\parallel}$  was observed, consistent with limited axonal injury during the course of the disorder. The preliminary study suggests a unique  $\lambda_{11}$  pattern in pediatric MS, which may serve as a biomarker for predicting progression to MS after the first initial demyelinating event [4]. Further longitudinal studies are needed to confirm the application of DTI changes in these difficult clinical cases.

#### **CNS demyelination: MS**

DTI studies conducted in MS patients can help us understand the changes in white matter taking place in the context of chronic demyelination and axonal loss. In MS patients with low lesion loads and mean disease duration of 4 years [43], DTI–MRI of the brain revealed increased  $\lambda_{\perp}$  in both lesions and NAWM compared with healthy controls.  $\lambda_{\mu}$  was either increased or remained the same. In other DTI studies involving longer term relapse-remitting MS patients (disease duration of 3–9 years), increased  $\lambda_{\!\perp}$  has been observed in the CC and pyramidal tracts, both within lesions and NAWM [44-46], and correlated with progressive disability. Moreover,  $\lambda_{\perp}$ was shown to be a strong predictor of myelin status in postmortem human brain prior to, and after, fixation [47,48]. However, increased  $\lambda_{\mu}$  was found in these studies involving patients with longer disease duration.

Axonal atrophy is a pathologic feature of MS that is expected to occur early in the course of the disease. MRI studies have confirmed that CC atrophy is a common finding in MS [49-51], and histopathologic studies indicate early axonal injury, transection of axons passing through the CC and Wallerian degeneration over time [41,52]. As with mouse experiments during the chronic demyelinating state, current DTI studies in progressive MS patients with longer disease duration (over 3 years) did not demonstrate decreased  $\lambda_{\mu}$ . Spinal cord CNS atrophy is another feature of MS expected to occur early in the disease process [53-55]. In a recent ex vivo imaging study of the spinal cord in subjects with long-standing secondary-progressive MS [48], higher  $\lambda_{\parallel}$  and

 $\lambda_{\perp}$  in MS lesions were found compared with age-matched controls. Histopathologic examination demonstrated a degree of demyelination that corresponded to high  $\lambda_{\perp}$ . The extent of axonal loss, however, was not found to correlate with observed  $\lambda_{\mu}$ .

The consistent findings of elevated  $\lambda_{\perp}$  in these studies suggest that  $\lambda_{\perp}$  has the ability to detect myelin damage. While  $\lambda_{\mu}$  appears to correlate with axonal involvement early during the course of MS (as demonstrated by studies during the pediatric population early in the disease course), it appears to lack the resolution needed to discern complex mechanisms involved in axonal damage and repair at the chronic stage. The complications of inflammation, cellular infiltration and gliosis may affect  $\lambda_{\parallel}$ , making it difficult to interpret whether increased  $\lambda_{II}$ truly demonstrates axonal recovery versus loss masked by effects on diffusivity attributed to confounding cellular responses. It is conceivable that  $\lambda_{\mu}$  is influenced by long-term changes and cellular responses in axons over the course of chronic, progressive demyelination; however, the effects of such cellular processes remain unclear.

#### Application of DTI in therapeutic & prognostic evaluations

DTI directional diffusivity may offer the potential to monitor therapeutic options and further our understanding of the disease process. In a DTI study looking at longitudinal changes in brain tissues in a group of patients with MS (mean disease duration: 11.9 years) starting natalizumab therapy, the authors found increased FA, decreased  $\lambda_{\perp}$  and no change in  $\lambda_{\mu}$  in gadolinium-enhancing lesions over the course of the year [56]. The reduction in  $\lambda_{\perp}$  may be indicative of remyelination. Natalizumab is an anti-inflammatory drug that prevents leukocyte adhesion to the capillary endothelial cells and, as a result, reduces leukocytes entering the CNS [57]. Natalizumab therapy has been shown to reduce conversion of gadolinium-enhancing lesions into T1 black holes, which are indicative of severe tissue damage comprising axonal loss, axonal swelling and demyelination [58]. It is thought that the anti-inflammatory effects of natalizumab would allow for more repair. In the study, higher  $\lambda_{\perp}$  at baseline predicted conversion to T1 black holes at 12 months. Similar predictions were demonstrated in another study that followed a cohort of 22 individuals (disease duration of 2–23 years) over 15 months [59]. On the other hand, in normal-appearing brain

tissue, FA and  $\lambda_{ll}$  demonstrated further decline over time, while no significant change in  $\lambda_{\perp}$  was observed. Hence, the decline in  $\lambda_{ll}$  may suggest involvement of axonal loss and degeneration in normal-appearing brain tissue at the early stage before active lesions develop, possibly attributing to the progressive disability often observed in MS patients despite treatment.

Treatment with natalizumab demonstrates increased FA and reduced  $\lambda_{\perp}$  in gadoliniumenhancing lesions. This may be indicative of remyelination consistent with results from mouse studies. Identification of axonal damage in normal-appearing brain tissue illustrated by DTI, highlights its potential for evaluating treatment outcomes and drug efficacy. DTI directional diffusivity offers the potential for use as biomarker for prognostic purposes and monitoring treatment response.

Often, throughout the course of MS, progressive disability is observed despite the fact that no new lesions are detected on MRI. Conventional MRI cannot provide information on the degree of tissue injury at the cellular level. Progressive disability in MS, despite no new lesions, may suggest ongoing cellular processes around existing lesions or in NAWM that may be comprised of tissue damage involving myelin, axonal damage, or both. Imaging studies with histopathologic examinations have demonstrated axonal loss and microglial activation in areas of NAWM [60]. Diffusely abnormal white matter has been associated with axonal loss, decreased myelin and chronic fibrillary gliosis exemplified by astrocytic, microglial and oligodendrocytic hypertrophy [61,62]. These proposed mechanisms may lead to irreversible axonal loss involved in the disease progression and neurologic disability in MS patients. Early identification of these pathologic processes by DTI can aid clinicians in evaluating drug efficacy and making important decisions on therapeutic interventions.

In summary,  $\lambda_{\perp}$  is consistently found to be higher than baseline over the course of MS, while  $\lambda_{\parallel}$  appears to change with chronicity of the disease. In the early stages of MS (disease duration less than 3 years),  $\lambda_{\parallel}$  demonstrates a trend toward decreased values, but in patients with longer disease duration, increased  $\lambda_{\parallel}$  is observed. The results are concordant with the findings from mouse experiments and the current working model (FIGURE 5).

#### Future directions

DTI directional diffusivity data could provide useful information on the pathology of MS at the cellular level and elucidate mechanisms involving damage, repair and functional plasticity. Since directional diffusivity can identify white matter changes with respect to myelin and axonal damage, it offers the potential for monitoring disease progression and predicting clinical outcome. Recently, lower  $\lambda_{\perp}$  at baseline has been found to be predictive of recovery after spinal cord relapse in patients with MS [63].

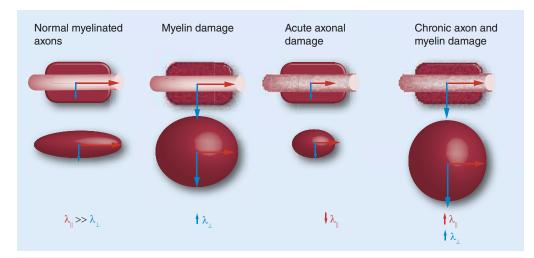
Studies have also highlighted that axonal loss may be the primary determinant of irreversible neurological disability in MS patients [39-41]. In a clinical setting, the ability to differentiate between axonal damage and demyelination can offer a valuable opportunity in monitoring therapeutic and drug-target response. Exploration of drugs and therapies that can aid axonal repair and prevent axonal damage may be a promising area of research for treatment. While the use of MRI in clinical trials of MS is well established, imaging methods, such as DTI, have the potential to serve as biomarkers and outcome measures of neuroprotective and reparative strategies in clinical trials of primary- and secondary-progressive MS. To further confirm axonal damage as a key determinant of neurologic disability, future studies should investigate changes in DTI directional diffusivity and disability as time progresses to identify any relationship with clinical outcome in MS patients. Changes in  $\lambda_{\mu}$  may be an important parameter linking axonal damage, predictive clinical outcome in MS and drug response in patients with MS.

# Leukodystrophies: DTI directional diffusivity as a MR biomarker of axonal injury

Leukodystrophies describe a set of inherited demyelinating disorders affecting myelin, leading to progressive deterioration in neurological status, disability and death [64]. A varying degree of axonal injury is observed and may correlate with progressive deterioration and neurologic signs (FIGURES 6 & 7) [65].

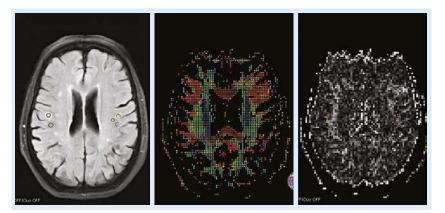
#### Animal studies of PMD

Several DTI studies involving mouse models of various forms of leukodystrophy have been performed to characterize pathological changes in white matter. Among the many forms of leukodystrophies, PMD is the most widely studied as it is well exemplified in mouse models. Using transgenic mice with the duplicated PIP1 gene as a model of PMD, Ruest and coworkers compared ex vivo DTI findings with histology in three brain regions involving the anterior commissure, CC and hippocampal fimbria [66]. PMD is an X-linked recessive disorder caused by mutations associated with PLP1 that encodes two proteolipid proteins in oligodendrocytes, PLP and DM20. PLP is required for the production and stabilization of myelin while DM20 may be involved in oligodendrocyte differentiation and survival. Among the mutations associated with PMD, gene duplication has been found to be the most common cause. Mutations present a broad range of clinical severity



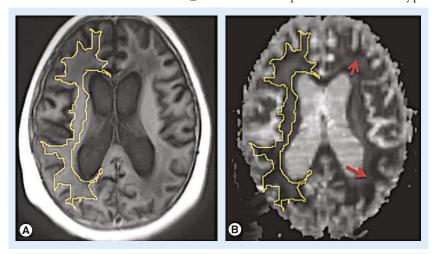
**Figure 5. Working model summarizing current findings of axial and radial diffusivity changes at different stages of axonal and myelin damage.** When myelin is damaged, water diffusion along the perpendicular direction increases, leading to increased radial diffusivity. Changes in intracellular water due to impaired axonal transport leads to reduced axial diffusivity. Cellular infiltration, gliosis and changes in extracellular water caused by inflammation have been hypothesized to increase axial diffusivity in the chronic injury state.

 $\lambda_{\!\scriptscriptstyle |\!|} :$  Axial diffusivity;  $\lambda_{\!\scriptscriptstyle \perp} :$  Radial diffisivity.



**Figure 6. Directional diffusivity in the evaluation of a family with leukodystrophy.** From left, fluid-attenuation inversion recovery, rotational atherectomy map with ellipsoid and color tensor encoding, and the corresponding radial diffusivity parameter maps. This subject is a gene carrier in a family with Pelizaeus–Merzbacher's disease. Unlike chronic microangiopathy of the elderly, which presents with small periventricular T2 hyperintense lesions on fluid-attenuation inversion recovery and T2-weighted images, which are characterized by elevations in both axial and radial diffusivity, this subject has more peripheral lesions (circled on the fluid-attenuation inversion recovery image and corresponding radial diffusivity map), which have elevated radial diffusivity and preserved axial diffusivity. These findings are expected in a carrier of a leukodystropy gene defect. Reproduced with permission from [3].

> and white matter pathology, primarily involving myelin loss, dysmyelination and a variable degree of axonal damage [67,68]. In the experiment, both t-value maps and tract-based spatial statistics voxel-based analyses demonstrated loss of anisotropy and increased water diffusion along, and perpendicular to, white matter tracts – that is, decreased FA, increased  $\lambda_{II}$  and  $\lambda_{\perp}$  diffusivities compared with the wild-type.



**Figure 7. Conventional and diffusion tensor imaging of leukodystrophy.** (A) Axial T1 (magnetization-prepared rapid acquisition with gradient echo) in a patient with severe adrenoleukodystrophy. There is central atrophy, with enlargement of the lateral ventricles, and diffusely abnormal white matter. (B) Coregistered  $\lambda_{\mu}$  map demonstrates a hypointense rim (arrows) within the area of normal-appearing white matter, suggestive of severe axonal injury. The patient died a few days after this scan was obtained.

Increased  $\lambda_{\perp}$  was correlated with demyelination in all of the three brain regions and was confirmed by antimyelin basic protein staining and electron microscopy. Subsequently, further immunohistology analyses confirmed axonal damage (antiamyloid precursor protein-positive accumulations) and increased astrocytosis (anti-GFAP or GFAP accumulations). Increased  $\lambda_{II}$ may be reflective of the finding that amyloid precursor protein accumulations were not as extensive due to the time-dependent manner of axonal degeneration [69].

Based on the work of Harsan and coworkers, it is conceivable that increased  $\lambda_{\mu}$  detected in PMD mouse models may be attributed to astrogliosis and hypertrophy [23]. In their jimpy PLP-mutant mouse model, Harsan et al. demonstrated irreversible dysmyelination with increased astrocytic activity in mouse brains. In comparing DTI-MRI parameters of jimpy mouse brain with dysmyelinated brain of oligo-TTK transgenic mice with little astrocyte hypertropy, dramatic increases in  $\lambda_{\perp}$  and  $\lambda_{\mu}$  were observed in the jimpy mouse brain. Astrocytes are major regulators of water content in the brain via AQP4 [70], and its cytoplasmic domains can extend along the axonal tracts. Hence, it is possible that astrocyte hypertrophy attributed to gliosis may contribute to increased water diffusion and, thereby, lead to changes in  $\lambda_{\mu}$ , and even  $\lambda_{\perp}$ , parameters to some degree.

#### Application & future research

DTI directional diffusivity measurements may prove to be useful biomarkers in monitoring axonal pathology in patients with leukodystrophies, regardless of the genetic etiology and, thus, provide important early diagnostic and prognostic information. Directional diffusivity as a MR biomarker also offers the potential to monitor and evaluate myelin therapies under development. In addition, changes in directional diffusivity may be used to differentiate between progressive white matter disorders, such as leukodystrophies, and static white matter disorders, such as periventricular leukomalacia.

#### Alzheimer's disease

AD is a neurodegenerative disorder classically characterized as a gray matter disease, with accumulation of misfolded proteins in the extracellular space forming amyloid plaques and within neurons forming neurofibrillary tangles. Volumetric reduction in gray matter regions of AD brains is significant in patients with AD [71,72], and recent studies have shown that this reduction may occur early in the disease process, as it has been found in adults with family history of AD [73,74].

Recently, DTI directional diffusivity studies have revealed white matter involvement in AD bringing a new perspective into the pathology of AD, which has previously been discussed primarily as a gray matter disease in the literature. Early degeneration of the temporal lobe structures has been commonly cited in the neurodegenerative process of AD [72,75]. Involvement of white matter in temporal, parietal and frontal regions, as well as in the CC, has been noted and, hence, are often associated with manifestations of impairment in attentive, executive, language and visuospatial functions in patients with AD [76-78]. In a DTI study of NAWM in patients with mild (early) AD, mild cognitive impairment and controls [79], increased  $\lambda_{\perp}$  and reduced  $\lambda_{\mu}$  were observed in higher cortical regions (temporal, parietal and frontal NAWM) compared with the healthy, age-matched controls. The changes reflected in these higher cortical regions correlated with declined cognitive function. In high-risk AD groups, increased  $\lambda_{\perp}$ and limited decreased  $\lambda_{II}$  have been observed, suggesting compromised structural integrity in white matter tracts, particularly in connections to the medial temporal lobes [80,81]. These findings suggest that decreases in axonal and myelin integrity are conceivably associated with degeneration of white matter tracts.

Findings in  $\lambda_{\perp}$  changes early in the disease process provide additional evidence for the hypothesis of myelin involvement at the onset of AD. In post-mortem studies, increased levels of β-amyloid peptides, which are cytotoxic to oligodendrocytes, have been detected, accompanied by reductions in white matter cholesterol, protein levels and myelin proteins [82,83]. Bartzokis and authors have put toward the myelin hypothesis of AD, which proposes that AD is initially a disease of demyelination in which  $\beta$ -amyloid and tau aggregates are the by-product of homeostatic repair [84,85]. Current DTI findings of reduced  $\lambda_{\perp}$  in AD patients support the hypothesis of white matter involvement and myelin damage.

In longer term studies involving AD patients with longer duration of disease, increased  $\lambda_{11}$ was often reported over time [86,87]. Increased  $\lambda_{\perp}$  with disease progression appears to be a rather consistent trend observed among AD subjects, regardless of the duration of AD disease. Increased  $\lambda_{11}$  may represent a later stage of white matter damage, marked by microglia activation and fluid shifts. Similar to previous studies described in this article, the mechanisms for increased  $\lambda_{11}$  observed with progression of white matter pathologies remain relatively unclear and several hypotheses have been proposed.

Astrogliosis is a known pathologic feature of AD that has been shown to be associated with  $\beta$ -amyloid deposition and oligodendrocyte death [88–90]. In animal studies, astrogliosis has been associated with increased  $\lambda_{11}$ . Reactive astrogliosis, accompanied by accumulation of cellular debris and cytoplasmic extensions in the pathogenesis of AD, appears to be a contributing factor to increased  $\lambda_{11}$ 3 over time, although further research is warranted.

#### Application & future research

Progressive increases in  $\lambda_{\perp}$  have been correlated with the severity of dementia [86,91]. On the contrary, axonal loss is commonly believed to be the primary determinant of irreversible disability. At present,  $\lambda_{II}$  does not appear to have the power to discern different underlying mechanisms involved in axonal damage and repair at the chronic stage. Since the detection of axonal damage by  $\lambda_{_{II}}$  remains flawed at chronic stages, we cannot exclusively rely on  $\lambda_{II}$  to assess axonal damage. Indeed, axonal damage including impaired axonal transport, swelling and accumulation of cellular debris have been confirmed even at early stages of AD in both mouse models and humans [92]. Further refinement of the meaning of  $\lambda_{ii}$  is warranted to apply it as a measure of axonal damage in the context of confounding factors of cellular infiltration and inflammation (Box 1) [93].

## Limitations of anatomic correlates of DTI

Since water tends to diffuse along axonal tracts, measurement of diffusion anisotropy within white matter can provide anatomical information on axonal architecture. However, there are some limitations to the current diffusion tensor model. The tensor model attempts to average diffusion data and assume that one long axis represents the fiber orientation within the diffusion ellipsoid. This seems possible when the ellipsoid consists of a fiber population that follows a similar directionality. In situations where fibers branch or crossover, the longest axis may no longer represent the orientation of any fibers depending on the angle and ratios of fiber branching (e.g., fanning of pyramidal projection fiber bundles, crossing of adjacent fiber bundles of cingulum and body of CC).

Box 1. A list of other neurologic diseases that may benefit from evaluation with diffusion tensor imaging.

- Infection: HIV and encephalopathy and progressive multifocal leukoencephalopathy
- Trauma: traumatic brain injury and minor head injury
- Neurodegeneration: dementia and Alzheimer's disease
- Inflammation: lupus erythematosus and autoimmune encephalitis, such as anti-N-methyl-D-aspartate receptor encephalitis
- Tumor: brain tumors such as glioblastoma multiforme, oligodendroglioma and primary CNS lymphomas

Diffusion may be hindered in all directions due to these heterogeneous fiber orientations within a voxel and may appear to be isotropic or low anisotropy. Consequently, areas of white matter where two or more heterogenous fiber populations pass within the same pixel may appear to be hypointense on DTI. It is important to note that these effects can impact upon the diffusion tensor and its parameters to some degree. In an attempt to resolve crossing fibers, higher order models and methods have been proposed [94,95]. However, these approaches require long acquisition times, which make them difficult to accomplish on clinical systems. The long scan time, acquisition methods and heavy computational load to acquire the data make them difficult to apply in clinical systems [94-96].

In addition, Wheeler-Kingshott and authors suggest that when comparing patients with healthy controls, it may be necessary to analyze the direction of eigenvectors together with the assessment of eigenvalues (i.e., axial and radial diffusivity) and compare how eigenvectors are aligned with underlying tissue structures, making sure the eigenvalues represent the same physical information [93].

Finally, in areas of tissue partial volume where white and gray matter or white matter and cerebrospinal fluid (CSF) reside in the same pixel, additional diffusion bias is introduced, which may affect anisotropy of neighboring white matter [97-100]. For instance, the CC is often prone to partial volume effects from neighboring CSF. Hence, in a disease such as MS where CC thinning can occur, bias attributed by partial volume effects from neighboring CSF may lead to overestimation of structural loss if partial volume effects are not corrected for. Various methods of CSF suppression have been introduced including fluid-attenuated inversion recovery diffusion-weighted imaging–MRI [101], and a bitensor method used to correct free water contamination of standard DTI-acquisition schemes, possibly differentiating the contribution of the free water compartment from that of the tissue compartment (Box 2) [102].

## Potential barriers to implementation of DTI in clinical practice

DTI relies upon the performance of the diffusion gradients encoded on the MRI scanners. Performance in single-center studies, such as those discussed in this manuscript, has been robust. However, there have been relatively few multicenter studies published due to a lack of cross-vendor hardware standardization, protocol (software) standardization and a widely accepted diffusion phantom standard [95]. A further barrier is added when pediatric studies are concerned. As myelination of the white matter changes during childhood and adolescence, diffusion measurements in white matter also vary with age, thus, reference cohorts of normal participants are required [103].

#### **Conclusion & future perspective**

In summary, DTI plays an important role in identifying subtle white matter changes with respect to axon and myelin damage that are not distinguishable using conventional MRI. DTI directional diffusivity can offer the potential to identify pathologic changes in axons and myelin and, hence, convey the underlying pathology and structural and functional adaptations before gross anatomical changes become apparent on conventional MRI.

Particularly in the acute and early disease phase,  $\lambda_{II}$  and  $\lambda_{\perp}$  have the capacity to characterize axonal and myelin damage, providing a

#### Box 2. Outstanding translational questions.

- Radial diffusivity appears to characterize myelin pathology relatively well in animal imaging studies correlated with histology and in patient studies. Axial diffusivity appears to characterize axonal damage at the acute phase but, over time, it seems to be affected by response mechanisms to axonal damage. What are the effects of the underlying mechanisms at the chronic stage and how can we discern axonal recovery versus chronic axonal damage?
- The timing of pathologic processes can be controlled in animal models. Given the complexities of disease processes in humans, the challenge of lack of control of timing is difficult to resolve. How can we translate the findings of animal studies to unify and characterize the course of complex human diseases in a time-dependent manner?

Vascular: stroke and CNS vasculitis

landscape of white matter pathogenesis and degeneration. However,  $\lambda_{11}$  does not appear to have the resolution to discern underlying complex mechanisms involved in axonal damage and repair at the chronic stage. We expect that future advances will improve the resolution to overcome the current imaging limitations and will be able to distinguish axonal repair versus axonal damage in the chronic stages as we further understand the effects on diffusivity induced by complex processes of cellular infiltration and gliosis.

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#### **Executive summary**

#### Diffusion tensor imaging directional diffusivity as a measure of axonal & myelin damage

 Unlike summary parameters, such as apparent diffusion coefficient and fractional anisotropy, directional diffusivity takes anatomic details into account providing specific structural details regarding the anatomical status of axons and myelin.

#### Diffusion tensor imaging versus MRI in demyelinating diseases

- Conventional MRI cannot predict whether T2 hyperintense lesions involve demyelination or a mixture of demyelination and axonal injury.
- Increased radial diffusivity  $(\lambda_{\perp})$  is thought to characterize myelin damage (increased diffusion in the perpendicular direction). Decreased axial diffusivity  $(\lambda_{\perp})$  is thought to indicate axonal damage (decreased diffusion along the parallel axis of the axon).

#### Diffusion tensor imaging directional diffusivity imaging correlates

- In animal studies correlated with histology, radial diffusivity (λ<sub>1</sub>) appears to characterize myelin pathology relatively well.
- Axial diffusivity (λ<sub>||</sub>) was able to characterize axonal damage in the acute stage but could not demonstrate axonal damage in the chronic stage.
- Similar observations were made for studies involving human patient populations.

#### Potential application & future perspective

- Diffusion tensor imaging (DTI) has potential clinical applications in multiple CNS diseases:
- DTI may be useful in discrimination of monophasic demyelinating diseases (such as ADEM) from progressive disorders (such as MS).
  DTI may be useful in monitoring disease progression in MC and in louked stronging.
- DTI may be useful in monitoring disease progression in MS and in leukodystropies.
- DTI may be used in the future to guide therapeutic decisions or to predict clinical outcomes.
- DTI may be useful in future clinical trials for CNS diseases:
  - DTI may be useful for monitoring efficacy of drugs aimed at neuroprotection.
  - Clinical trial applications might include primary and secondary progressive MS therapeutic monitoring, traumatic brain injury treatment, and treatments for genetic diseases such as leukodystrophies.
- Current technical limitations which limit clinical applications might be overcome in the future:
- Better DTI strategies for resolving crossing axonal fibers might result in better correlations with underlying pathology.

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