Contents lists available at ScienceDirect





NeuroImage: Clinical

journal homepage: www.elsevier.com/locate/ynicl

Imaging of repeated episodes of demyelination and remyelination in multiple sclerosis



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ARTICLE INFO

ABSTRACT

Article history: Received 26 March 2014 Received in revised form 11 June 2014 Accepted 30 June 2014 Available online 15 August 2014

Keywords: Magnetic resonance imaging Multiple sclerosis Magnetization transfer ratio Remyelination Multiple sclerosis (MS) is characterized by the formation of demyelinating lesions in the white matter (WM). However, the timecourse of the evolution of healthy white matter into fully demyelinated lesions in MS is not well understood. We use a recently proposed technique to examine magnetization transfer ratio (MTR) timecourses in lesions segmented from MTR images in patients with relapsing-remitting MS (RRMS) and secondary progressive MS (SPMS). In both groups we found MTR lesions forming both in previously normal appearing WM (de novo lesions) as well as in previously lesional tissue that appears to be experiencing a second round of inflammatory demyelination (repeat lesions). Both de novo and repeat lesions exhibited significant, but incomplete MTR recovery, suggesting partial remyelination; post-lesion MTR values in de novo lesions were similar to pre-lesion values in releast lesions. Both de novo and repeat lesions appeared relatively more common in the secondary progressive phase. These observations support the hypothesis that entirely demyelinated lesions, and may have implications for MS treatment development efforts aimed at neuroprotection and enhancing remyelination.

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1. Introduction

Multiple sclerosis (MS) is an inflammatory demyelinating disease of the central nervous system. The most prominent feature of MS is the formation of demyelinated lesions in the white matter (WM), which are associated with a breakdown in the blood–brain barrier (BBB) and invasion of peripheral immune cells into brain tissue, causing inflammatory demyelination. Although very effective remyelination routinely occurs following demyelination associated with traumatic injury (Lasiene et al., 2008), in many experimental models of MS, and even in many MS lesions (Fancy et al., 2010; Patrikios et al., 2006; Salgado-Ceballos et al., 1998), histopathological studies show that remyelination does frequently fail (Patrikios et al., 2006). Lesions with no evidence of remyelination are typical at autopsy (Miller et al., 1996). Discovering the reasons for this failure is particularly important as drug discovery efforts have expanded to include neuroprotective and remyelination promoting strategies (Franklin et al., 2002).

Histopathological studies can examine in great detail various aspects of the inflammatory, demyelinating and remyelinating processes

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occurring in MS, but can only indirectly examine the dynamic process of lesion formation and repair. Additionally, tissue available for histopathological investigation is dominated by samples from patients who have died of either long-standing or particularly aggressive MS. Because of this, the detailed timecourse of the evolution of healthy white matter into fully demyelinated lesions in MS is not well understood. Histopathological studies have provided apparently divergent results (Patrikios et al., 2006), and some authors have concluded that remyelination is only transient, with newly remyelinated tissue quickly demyelinating again (Frohman et al., 2006) or that it fails more frequently in chronic forms of the disease (Goldschmidt et al., 2009).

One longstanding hypothesis proposes that MS lesions routinely remyelinate, although not completely, and the fully demyelinated chronic lesions seen at autopsy are the result of repeated episodes of demyelination in the same tissue (Ludwin, 1980). Histopathological observations of what appear to be demyelinated lesions partially overlapping shadow plaques (Prineas et al., 1993) provide indirect evidence for this hypothesis. Several studies have induced repeated demyelination in predictable locations using animals fed Cuprizone (Johnson and Ludwin, 1981; Mason et al., 2001) or injection of demyelinationinducing compounds directly into the brain or spinal cord (Penderis et al., 2003) with results ranging from no sign of impaired remyelination after repeated demyelination (Penderis et al., 2003) to slower, less complete remyelination (Johnson and Ludwin, 1981).

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MS lesions can also be visualized using magnetic resonance imaging (MRI) and serial MRI studies can provide information about the dynamic nature of MS lesion formation. While conventional MRI is not myelinspecific, several MRI techniques have emerged that may provide a more direct means of investigating demyelination, remyelination and lesion development over time. Myelin water fraction (MWF), derived from multicomponent T2 mapping (Mackay et al., 1994); restricted proton pool size, derived from quantitative magnetization transfer (qMT) imaging (Sled and Pike, 2001); and magnetization transfer ratio (MTR) (Wolff and Balaban, 1989) provide change measures that are sensitive and reasonably specific to changes in myelin content in MS white matter. MTR, in particular, is easy to compute from conventional images acquired with and without a magnetization transfer prepulse, is available as a stock sequence option on most recent scanners, and is therefore suitable for use in clinical trials. MTR has been histopathologically validated as a marker of myelin content in both humans and animals, and has a specificity similar to Luxol fast blue (Barkhof et al., 2003; Chen et al., 2007; Deloire-Grassin et al., 2000; Dousset et al., 1992; Pike et al., 2000; Schmierer et al., 2004).

Several studies to date have used these imaging techniques to look for overall abnormalities in the WM (Filippi et al., 2000; Levesque et al., 2010; Rocca et al., 1999; van Buchem et al., 1999), or within conventional MRI lesion types (Chen et al., 2007, 2008; Richer et al., 2001). Recently we have demonstrated a technique, based on MTR imaging, for identifying " Δ MTR lesions": focal areas of significant MTR change (Brown et al., 2012) that are more specific to changes in myelin than in lesions on T1-weighted (T1), T2-weighted (T2) or gadolinium contrast-enhanced (Gd) images and can also identify recurrent demyelination. Analysis of the longitudinal changes in MTR within Δ MTR lesions is a statistically powerful method for determining differences in MTR recovery (Brown et al., 2012).

In this study we examined MTR timecourses in Δ MTR lesions that appeared either in NAWM or in previously T2 hyperintense tissue. T2 hyperintensity (i.e. a T2 lesion) is generally used as a marker of a previous focal inflammatory demyelinating episode in MS. Therefore, while Δ MTR lesions arising in NAWM (de novo lesions) might be examples of initial foci of demyelination, those found in already T2 hyperintense tissue (repeat lesions) may be subsequent demyelination in tissue that has already experienced a cycle of demyelination followed by remyelination. Thus, we investigated the hypothesis that white matter experiences repeated episodes of focal demyelination and remyelination.

2. Methods

2.1. Data and processing

Two datasets were used (demographic values are mean \pm standard deviation): (1) a group of 18 relapsing–remitting MS (RRMS) patients (11 females, age 39 \pm 8 years, disease duration 7 \pm 9 years) and (2) a group of 88 subjects with secondary progressive MS (SPMS). Detailed demographic information was not available for the SPMS group. However, these were a subset of the group described in Freedman et al. (2011) (64% females; mean age 50, range 23–72 years; disease duration 9 years); all subjects from imaging sites that had at least one scan of a normal control, required for MTR normalization, were used.

Subjects in the RRMS group were treated with teriflunomide and imaged approximately monthly for 2 years. The SPMS group was scanned at baseline and at three, six, twelve and eighteen months and treated with MBP8298. For both groups, image contrasts acquired at each timepoint included T1, T2 and proton density weighted (PD) scans, plus images with and without a magnetization transfer preparation pulse (MT_{on} and MT_{off}). Imaging for the RRMS group was performed on a 1.5 T Phillips ACS II and the MT imaging consisted of a T1-FFE sequence (T_R = 35 ms; T_E = 10 ms; 40° flip angle) with and without an MT pre-pulse (on-resonance, binomial 1-2'-1 pulse; length 1200 µs). The SPMS group was a subset of a multicenter trial; subjects scanned at sites that had MTR data from a normal control, required for normalization, were used. The subjects used were scanned at 14 sites using stock MTR sequences on each 1.5 T scanner. These were GE: 3D SPGR, TR/TE 33–35/8–10 ms, 15° flip + 8 ms Fermi pulse, 1200 Hz off- resonance; Siemens: 3D FLASH, TR/TE 30/11 ms, 15° flip + Gaussian 7.68 ms 250 Hz bandwidth, 1500 Hz offset, 500° effective flip; Phillips: 3D T1-FFE, TR/TE 40/8 ms, 15° flip + Gaussian 1200 Hz off-resonance. Images for both groups had $1 \times 1 \times 3$ mm voxels and whole brain (60 slices) coverage.

Since the subjects in each group were scanned on different machines, enrolled in different studies and treated with different agents, the two groups are not directly comparable. However, we examined both separately, using the same methods, for evidence of repeated demyelination in both RRMS and SPMS.

 $\mbox{MT}_{\mbox{on}}$ and $\mbox{MT}_{\mbox{off}}$ scans were coregistered and used to calculate an MTR image using previously published techniques (Brown et al., 2012). The MT_{off} and other scans from each timepoint were also coregistered to the T1w scan, and each T1w scan coregistered to the T1w scan from the subject's first timepoint. The resulting set of transforms allowed all images from each subject to be transformed into a common space for analysis. All coregistration used a six degree of freedom (translation and rotation) linear transform (minctracc, McConnell Brain Imaging Centre, Montreal) (Collins et al., 1994). MTR data from different scanners were normalized and Δ MTR lesions were segmented using the procedures in Brown et al. (2012). MTR normalization not only allowed the pooling of data from different scanners, but also placed the MTR measurements on a calibrated scale (Brown et al., 2011a, b). On this scale, normal white matter has a value of 1.0 and normal gray matter 0.0. Thus, the difference between normal gray and white matter is one unit.

Lesions were divided into de novo and repeat lesions. We assumed that Δ MTR lesions appearing in previously NAWM represented a first round of demyelination, while those occurring in previously T2 hyperintense tissue were a subsequent, repeat round of demyelination. Individual lesions that consisted of both a de novo and a repeat portion were split into separate de novo and repeat lesions. This is consistent with the histopathological observation that new demyelinating lesions sometimes overlap shadow plaques (Prineas et al., 1993).

MTR timecourses for each lesion were constructed. Each timecourse consisted of at least one MTR measurement at a minimum of 1 month prior to lesion appearance (baseline), one measurement at the time the lesion first became evident (acute), and a number of follow-up measurements at least 3 months after lesion appearance (follow-up).

Data were collected with the written informed consent of the subjects involved and the approval of the institutional ethics review boards of the collecting sites.

2.2. Analysis

MTR timecourses in lesions were modeled with a general linear mixed model, according to the R formula:

MTR ~ acuteLesion + postLesion + lesionType + acuteLesion : lesionType + postLesion : lesionType + (1|subject/timepoint/lesion)

where acuteLesion and postLesion are binary variables indicating whether the measurement was from the acute or post-lesion phase (both of these equal to zero indicates the baseline state) and lesionType is a categorical variable equal to either "denovo" or "repeat". A ":" indicates an interaction between two variables. The last term, in brackets, is a random effect of lesion nested within timepoint, within subject. This term allows a lesion-specific random intercept and allows for correlation among measurements in lesions in the same subject and at the same timepoint. This model was fit to each of the RRMS and SPMS datasets individually. During fitting, observations were weighted by the volume of the lesion. Since the measured MTR values are averages over the voxels in each lesion, measurements from larger lesions are expected to have lower variance.

The overall fit of each model was evaluated by comparing the loglikelihoods of the model and a null model using a χ^2 test. If this was significant, *f*-tests were performed on the individual effects. Denominator degrees of freedom for the *f*-tests were estimated using a Satterthwaite approximation. R^2 values were produced according to Nakagawa and Schielzeth (2012), where the marginal R^2 is the variance explained by the fixed effects alone, and the conditional R^2 includes the contribution of the random effects.

Image processing and statistical analysis were performed using custom software written in Python (Python Software Foundation, <u>http://python.org</u>) using the MINC tools (MINC tools, McConnell Brain Imaging Centre, Montreal), the Scientific Python package (SciPy, <u>http://www.scipy.org</u>), the RPy2 module (RPy2, <u>http://rpy.sourceforge.net</u>) the R statistical package (R Team, 2010) and the Ime4 (Bates et al., 2011) and MixMod (Kuznetsova and Brockhoff, 2012) R modules. Error bars and values are 95% confidence intervals.

3. Results

Both de novo and repeat lesions were successfully segmented, with some examples shown in Fig. 1. Characteristic MTR timecourses were obtained for both lesion types, from both groups (Fig. 2).

Table 1 contains descriptive statistics on the observed numbers and volumes of de novo and repeat lesions, as well as the ratio between them. De novo lesions were more common in the RRMS group, with a median volume ratio of 3:1, but repeat lesions were slightly more



Fig. 1. Examples of segmented de novo and repeat lesions. (A) shows large de novo (blue) lesions and (B), a lower slice from the same subject, shows de novo and repeat (red) lesions in close proximity (arrow). (C) shows periventricular repeat lesions with no de novo activity (arrow) and (D) shows a large repeat lesion.



Fig. 2. MTR timecourses in de novo (green) and repeat (blue) Δ MTR lesions from subjects with RRMS (A) and SPMS (B). All lesions showed characteristic timecourses with MTR decreasing at the time of lesion formation (time 0), then recovering partially afterward. Prelesion MTR values in repeat lesions were similar, though lower, to post-recovery values in de novo lesions. Heavy lines are predictions from the model while light lines are individual lesion timecourses. Shaded areas indicate 95% confidence intervals.

common in the SPMS group, with the de novo to repeat volume ratio at 0.75:1.

Results of modeling the MTR timecourses are in Table 2, with the timecourses themselves shown in Fig. 2. MTR decreased as lesions formed (p < 0.0001) and increased on follow-up (p < 0.0001). The intercepts of 0.45 in RRMS and 0.51 in SPMS suggest that MTR values were low even in the NAWM preceding the formation of de novo lesions (normal WM has a median value of 1.0). Follow-up MTR in de novo lesions in both groups was lower than that at baseline, though higher than that at the acute timepoint, indicating partial recovery after the severe drop at the time of lesion formation. The timecourses in repeat lesions were very similar to those in de novo lesions, but with initial, prelesion MTR values that were much lower than those in de novo lesions (p < 0.0001). Average recovery of repeat lesions was poorer than that of de novo lesions, relative to their pre-lesion values, but this difference was only significant in the SPMS group (SPMS: p = 0.017; RRMS: p = 0.068).

Note that the interactions listed in Table 2 indicate effects over and above the main effects. For example, the non-significant repeat lesions:follow-up effect in the RRMS group does not mean that repeat lesions in the RRMS group did not experience significant MTR recovery. Rather, these lesions did not experience a significantly different amount of recovery than did de novo lesions in the RRMS group.

Table 1

Descriptive statistics for lesions. STD is standard deviation and IQR is the inter-quartile ratio. De novo lesions were more common than repeat lesions in the RRMS group. The SPMS group had fewer lesions and a more even ratio between de novo and repeat.

	Lesion type	Mean (STD)	Median (IQR)	Mean (STD)/year	Median (IQR)/year
RRMS					
Volume	T2	7374 (8729)	2315 (10,125)		
(mm ³)	de novo	181 (249)	42 (298)	2426 (3718)	710 (2838)
	repeat	43 (72)	7.9 (50)	818 (1246)	252 (878)
Volume	de novo	3.5 (5.7)	1.4 (3.8)	36 (56)	18 (34)
(% of T2)	repeat	0.64 (1.0)	0.19 (0.94)	11 (16)	0.19 (0.94)
Count	de novo	5.4 (6.6)	2.0 (9.0)	76 (114)	26 (88)
	repeat	2.5 (3.8)	1.0 (3.0)	47 (72)	19 (42)
Volume ratio	de novo : repeat	11 (22)	3.2 (9.3)		
Count ratio		3.5 (5.7)	1.0 (4.0)		
SPMS					
Volume	T2	10,867 (10,292)	8201 (11,083)		
(mm ³)	de novo	79.8 (152)	26 (86)	411 (670)	189 (305)
	repeat	95 (126)	49 (137)	544 (713)	251 (438)
Volume	de novo	0.91 (2.1)	0.28 (0.77)	4.4 (8.8)	1.6 (3.9)
(% of T2)	repeat	0.83 (1.1)	0.43 (1.1)	3.9 (6.3)	2.5 (3.5)
Count	de novo	2.1 (2.6)	1.0 (3.0)	11 (12)	7.0 (8.6)
	repeat	3.4 (4.0)	2.0 (5.0)	16 (17)	10 (17)
Volume ratio	de novo : repeat	2.3 (4.9)	0.75 (1.6)		
Count ratio		0.97 (1.9)	0.0 (1.0)		

4. Discussion

We observed abnormally low MTR values in normal appearing white matter before the formation of a de novo lesion, consistent with studies that have found evidence for diffuse damage in normal appearing tissue in MS (De Stefano et al., 2002) and focal MTR decrease up to 2 years before lesion formation (Filippi et al., 1998; Goodkin et al., 1998; Pike et al., 2000). We also measured significant MTR recovery in both lesion types in both groups, suggesting that remyelination is common in both forms of MS. This observation is consistent with histopathological studies that have found extensive remyelination (Patrikios et al., 2006). However, mean MTR did not recover to pre-lesion levels, indicating that remyelination was incomplete.

By examining novel Δ MTR lesions, we were able to identify MTR changes not only in previously normal appearing tissue, but also in existing T2 lesions. These repeat Δ MTR lesions were as common as de

novo lesions in SPMS, (Table 1), and exhibited MTR timecourses that were remarkably similar in shape to those in de novo lesions, but with baseline MTR values somewhat lower than follow-up values in de novo lesions. This latter observation suggests that the repeat lesions could be a subsequent round of demyelination in already damaged tissue. The difference between follow-up de novo lesion MTR and baseline repeat lesion MTR could be due to repeat lesions being a mixture of second, third or subsequent episodes, or a slow decline in MTR between major inflammatory events. To address this, we refit our models with an additional term measuring the slope of the baseline MTR timecourses. MTR in repeat lesions was not significantly decreasing prior to repeat lesion formation in either RRMS or SPMS; the mean baseline MTR rose slightly, though not significantly (RRMS: p = 0.81, SPMS: p = 0.14) in both groups.

Both de novo and repeat lesions experienced only partial MTR recovery. This may be due to a combination of three mechanisms:

Table 2

Fixed effect estimates for the general linear mixed model of MTR in Δ MTR lesions for subjects with RRMS. The model is significant with 9022 samples from 120 subject-timepoints in 18 subjects, $\chi^2 = 5925$ on 5 degrees of freedom, p < 0.0001. The ':' in an effect denotes an interaction. dDF is the estimated denominator degrees of freedom. Predictions are included to help interpretation but statistics apply to the effect estimates.

RRMS subjects, 120 timepoints, 1037 lesions, 9022 samples									
$\chi^2 = 5925; 5$	DF; p < 0.0001 ; <i>R</i> ² marginal		$= 0.45; R^2 \text{ conditional} = 0.67$						
Effect	Prediction (nMU)	Estimate (nMU)	Std Error	dDF	f	р			
Intercept (de novo lesions, baseline)	0.45	0.45	0.053						
Acute Post-recovery	-0.85 0.13	-1.29 -0.31	0.016 0.014	8072 7985	4087 146	<0.0001 <0.0001			
Repeat lesions Repeat lesions: acute	-0.29 -1.31	-0.74 0.28	0.025 0.037	5171 8119	865 20.6	<0.0001 <0.0001			
Repeat lesions: follow-up SPMS subjects, 221 timepoints, 1283	—0.49 lesions, 5548 samples	0.12	0.030	8789	3.34	0.068			
$\chi^2 = 4794; 5$	DF; p < 0.0001 ; <i>R</i> ² marginal		$= 0.47; R^2 \text{ conditional} = 0.78$						
Effect	Prediction (nMU)	Estimate (nMU)	Std Error	dDF	f	р			
Intercept (de novo lesions, baseline)	0.51	0.51	0.051						
Acute Post-recovery Repeat lesions Repeat lesions: acute	-0.99 -0.30 -0.74 -1.82	-1.51 -0.81 -1.25 0.42	0.025 0.030 0.029 0.033	4295 4410 5144 4323	4485 700 1612 20.4	>0.0001 >0.0001 >0.0001 >0.0001			
Repeat lesions: follow-up	-1.25	0.29	0.039	4655	5.70	0.017			

(1) microscopic inspection has shown that the myelin sheaths produced by remyelination are thinner (Bruck et al., 2003; Perier and Gregoire, 1965; Prineas and Connell, 1979; Rodriguez and Scheithauer, 1994); (2) apparently chronically demyelinated axons are commonly observed in lesions, suggesting that some axons may remain viable even without remyelination (Craner et al., 2003); and (3) acute axonal damage, including transection, is common in MS lesions (Kornek et al., 2000; Trapp et al., 1998) and quantitative histopathology reveals that 30% (Schmierer et al., 2004, 2007) to 60% (Mews et al., 1998) of axons may be lost in remyelinated lesions. MTR imaging is limited in that it cannot differentiate between these processes. While remyelination-promoting therapies in development are generally aimed at stimulating remyelination of axons that would otherwise remain bare, the results of Schmierer et al. (2004, 2007) and Mews et al. (1998) suggest that axonal loss is a major mechanism of incomplete lesion recovery. However, as remyelination protects axons against delayed axonal degeneration (Kornek et al., 2000), improved remyelination will also help preserve axons.

Ideally, repeated episodes of demyelination and remyelination would be studied by direct observation of these events in the same lesions. However, if remyelinated tissue is not much more likely to experience subsequent demyelination, as has been observed by our group and others, a second demyelinating episode in a given lesion may not occur for years. Therefore, direct observation of a statistically meaningful sample of repeated episodes of demyelination may require a longitudinal imaging study spanning many years. Our own data was limited to less than 2 years of scanning in both groups, requiring the assumption that a T2 lesion indicated a previous demyelinating episode.

Our results support the hypothesis that focal white matter lesions may undergo multiple demyelination and remyelination episodes. We observed MTR to recover to stable values, consistent with the findings of others (Brown et al., 2012; Chen et al., 2008; Richert et al., 2001), suggesting that remyelination is not a transient phenomenon. This suggests a model in which demyelination in lesions occurs mostly during acute inflammatory episodes, and is routinely followed by partial remyelination; the severe lesions containing little or no myelin seen at autopsy would be the end result of a series of inflammatory episodes with incremental net myelin loss resulting from each. This model of lesion development may have implications for treatment: with the availability of drugs that effectively control inflammation and reduce the formation of new lesions, there is growing interest in neuroprotective and remyelination promoting agents. Imaging of not only the first cycle of demyelination and remyelination but also subsequent episodes may help determine the mechanisms behind incomplete remyelination and identify possible treatment targets. Additionally, the relative abundance of repeat lesions in SPMS may mean that focal inflammatory activity in this phase of the disease has been underappreciated. In our SPMS group more than half of the Δ MTR lesions were repeat lesions, which would not be captured by measurements of new T2 lesions or T2 lesion volume.

We used a new technique involving analysis of MTR timecourses in Δ MTR lesions to examine demyelination and remyelination in MS. Standard T2 lesions have low specificity and, since T2 hyperintensity often persists, cannot reliably identify repeated episodes of demyelination in the same tissue. Δ MTR lesions are segmented from semi-quantitative MTR images so they are more specific to changes in myelin and can identify repeated demyelination. This allowed us to test the longstanding hypothesis that the completely demyelinated MS lesions seen at autopsy are not the result of a complete failure of remyelination, but rather are the end product of a series of demyelination events followed by robust, but incomplete, remyelination. Our results support this hypothesis and demonstrate that repeat demyelination is a common, and likely important, process in MS.

Dr. Arnold has an ownership interest and receives income from NeuroRx Research Inc., and has received, through McGill University, research funding from Bayer Healthcare. Drs. Narayanan and Brown have received financial compensation from NeuroRx Research for consulting services.

Acknowledgments

This work was supported by grants from the Multiple Sclerosis Society of Canada (MSSC) and the Canadian Institutes of Health Research (CIHR). R.A.B. has received personal support from the MSSC and the CIHR Neuroinflammation Training Program.

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