

The Effect of Beading and Permeable Axons on Water Diffusion Properties: A Monte Carlo Simulation of Axonal Degeneration and Its Effect on DTI and Q-space Contrasts

J. A. Farrell^{1,2}, B. A. Landman^{3,4}, J. Zhang¹, S. A. Smith^{5,6}, D. S. Reich^{1,7}, P. A. Calabresi⁸, and P. C. van Zijl^{1,2}

¹Dept. of Radiology, Johns Hopkins University School of Medicine, Baltimore, MD, United States, ²Kennedy Krieger Institute, F.M. Kirby Research Center for Functional Brain Imaging, Baltimore, MD, United States, ³Biomedical Engineering, Johns Hopkins University School of Medicine, Baltimore, MD, United States, ⁴Electrical Engineering, Vanderbilt University, Nashville, TN, United States, ⁵Dept. of Radiology, Vanderbilt University, Nashville, TN, United States, ⁶Institute of Imaging Science, Vanderbilt University, Nashville, TN, United States, ⁷Neuroimmunology Branch (NINDS), National Institutes of Health, Bethesda, MD, United States, ⁸Dept. of Neurology, Johns Hopkins University School of Medicine, Baltimore, MD, United States

Introduction: Diffusion tensor imaging (DTI) studies in animal models of axonal degeneration have reported that diffusion is increased perpendicular (\perp), and decreased parallel (\parallel), to damaged white matter (WM) fibers [1-2]. Q-space imaging (QSI) has also shown that \perp diffusion is near Gaussian whereas \parallel diffusion is non-Gaussian in damaged WM [3]. We hypothesized that two mechanisms that may account for these observations are the beading and increased permeability of the axon membrane. Axonal “beading” is characterized by multiple constrictions and enlargements of the axonal membrane and has been reported after axon stretching [4] and transection [5], and in multiple sclerosis [6] and Alzheimer’s disease [7]. Additionally, injury can increase the permeability of the axon membrane [8]. Understanding the relationship between axon morphology, permeability, and the diffusion weighted imaging signal is therefore a vital step in the validation of DTI and QSI and in its application to neurodegenerative disease. Previously, Monte Carlo (MC) studies have modeled WM damage by varying the radius, permeability, and packing of cylinders [9-11]; and recent MC simulations of axonal beading have only considered intra-cellular (IC) diffusion [12]. Here we investigate the effects of axonal beading and membrane permeability in a tissue model with intra (IC) and extra-cellular (EC) compartments, and compare the effects on DTI and QSI contrasts currently used to study WM damage.

Methods: The Brownian motion of 100,000 spins was studied via MC simulation, using the *RandomWalkSimulator* [13], on an infinite lattice (6x6x20 μ m cell) containing healthy axons (cylinders of radius R_{cyl}) or degenerating axons (the union of cylinders of radius R_{cyl} with spheres of radius R_{sph}). Based on indications from histology that axoplasm is shifted from constricting to enlarging portions of axons [4], beading axons were modeled by decreasing R_{cyl} (7 steps from 1.91 to 1.62 μ m) while increasing R_{sph} (from 0 to 2.97 μ m) accordingly to maintain a constant axon volume (IC/EC fractions = 0.64/0.36). The bead separation was 20 μ m, consistent with histology [4-7]. Spins were assigned random initial positions, and simulations were performed with a diffusion time of 20ms, time step $\Delta t = 0.2\mu$ s, and diffusion constant $D = 2\mu$ m²/ms (step length $l = \sqrt{6D\Delta t} = 0.05\mu$ m). The DWI signal was simulated by computing the phase dispersion over all spins (PGSE, T2=100ms). Experiments were performed with membrane permeability of $P_m = 0, 0.1, 1, \text{ and } 10 \times 10^{-2}$ cm/s, which corresponded to empirical residence times of $\tau_c = \infty, 95, 9.5$ and 0.95 ms within a cylinder ($R_{cyl} = 1.91\mu$ m). This agreed with analytical predictions ($\tau_c = R_{cyl}/2P_m$). Diffusion was assessed \perp and \parallel to the axon. **DTI:** Perpendicular (D_{\perp}) and parallel (D_{\parallel}) diffusivity, and fractional anisotropy (FA) were computed at $b = 1000$ s/mm². **QSI:** The probability density function (PDF) was generated from the histogram of spin displacements, and the probability of zero displacement (PZERO), root mean square displacement (RMSD), and kurtosis excess (KE) were computed [14].

Results: **A)** shows geometries for $[R_{cyl}, R_{sph}] = [1.91, 0]$ and $[1.62, 2.97]$ μ m. **B)** as the 3D RMSD for free diffusion is large (15 μ m over 20ms) compared to the confining geometry, the PDF for \perp diffusion within impermeable cylinders agrees with the autocorrelation function (ACF) for cylindrical geometry. The EC component is low and broad, but is distinct from free diffusion due to tortuosity. Thus the PDF for \perp diffusion of all spins (IC&EC) is tall with a broad base. For \parallel diffusion, the PDFs for IC, EC and IC&EC agree with free diffusion (not shown). Subsequent results are for IC&EC diffusion. **C)** shows that increasing P_m produces PDFs for \perp diffusion that are lower and broader than PDFs with $P_m = 0$. In the case of $R_{sph} = 0$, P_m has no effect on \parallel diffusion. Axonal beading results in increased \perp diffusion (lower, broader PDF) and decreased \parallel diffusion (tall and narrow PDFs) relative to the PDF observed with $R_{sph} = 0$ and equal P_m . Notably, increased P_m dampens the effect of beading on \parallel diffusion. **D)** presents the relationship between morphological parameters (R_{sph} , P_m) and diffusion contrasts. $RMSD_{\perp}$ and D_{\perp} increase as a function of R_{sph} , however larger shifts in \perp diffusion are produced by increased P_m . The downward trend of $RMSD_{\parallel}$ and D_{\parallel} as a function of R_{sph} is enhanced by low P_m . FA showed a strong dependence on both P_m and R_{sph} (due to its summary of the difference between \parallel and \perp diffusion). KE_{\perp} did not change substantially over the range of R_{sph} tested in this model; however, non-Gaussian \perp diffusion ($KE \neq 0$) was preserved over a wide range of membrane permeability. Notably, non-Gaussian \parallel diffusion was only evident at large R_{sph} and low P_m .

Conclusion: The effects of axon beading and increased membrane permeability on diffusion properties were simulated. Axonal beading and increased membrane permeability can act in concert to produce increased perpendicular diffusion. On the contrary, the decreased, non-Gaussian, parallel diffusion caused by beading is mitigated by increased permeability. Future simulations of diffusion in biologically relevant geometries may aid the development and interpretation of DTI and QSI studies of WM damage.

References: [1] Song SK, NeuroImage 2003, 20:p1714. [2] Zhang J, J. Neurosci. 2009, 29(10):3160. [3] Farrell JAD, ISMRM 2009 program # 836. [4] Ochs S, Prog. Neurobio. 1997, 52:391. [5] George R, Griffin JW, J. Neurocyt. 1994, 23:657. [6] Trapp BD, NEJM 1998, 338:278. [7] Stokin GB, Science 2005, 307:1282. [8] Kilinc D, Exp. Neuro. 2009 219:553. [9] Hall MG, Alexander DC, IEEE Trans. Med. Imag. 2009 28(9):1354. [10] Ford JC, JMRI 1998, 8:775. [11] Balls GT, MRM 2009 62:771. [12] Farrell JA, ISMRM 2009 #1357. [13] Landman BA, NMR Biomed. 2009 DOI 10.1002/nbm.1437. [14] Latt J, MRI 2008, 26:77. **Funding:** NIH/NICRR-P41RR15241; NMSS-TR3760A3; NIH-AG20012, NS052309, and NS059529.

