# Measuring and Mapping Cardiac Fiber and Laminar Architecture Using Diffusion Tensor MR Imaging

PATRICK HELM,  $^a$  MIRZA FAISAL BEG,  $^b$  MICHAEL I. MILLER,  $^b$  AND RAIMOND L. WINSLOW  $^a$ 

<sup>a</sup> The Center for Cardiovascular Bioinformatics & Modeling, The Johns Hopkins University School of Medicine and Whiting School of Engineering, Baltimore, Maryland 21218, USA

<sup>b</sup> The Center for Imaging Sciences, The Johns Hopkins University School of Medicine and Whiting School of Engineering, Baltimore, Maryland 21218, USA

ABSTRACT: The ventricular myocardium is known to exhibit a complex spatial organization, with fiber orientation varying as a function of transmural location. It is now well established that diffusion tensor magnetic resonance imaging (DTMRI) may be used to measure this fiber orientation at high spatial resolution. Cardiac fibers are also known to be organized in sheets with surface orientation varying throughout the ventricles. This article reviews results on use of DTMRI for measuring ventricular fiber orientation, as well as presents new results providing strong evidence that the tertiary eigenvector of the diffusion tensor is aligned locally with the cardiac sheet surface normal. Considered together, these data indicate that DTMRI may be used to reconstruct both ventricular fiber and sheet organization. This article also presents the large deformation diffeomorphic metric mapping (LDDMM) algorithm and shows that this algorithm may be used to bring ensembles of imaged and reconstructed hearts into correspondence (e.g., registration) so that variability of ventricular geometry, fiber, and sheet orientation may be quantified. Ventricular geometry and fiber structure is known to be remodeled in a range of disease processes; however, descriptions of this remodeling have remained subjective and qualitative. We anticipate that use of DTMRI for reconstruction of ventricular anatomy coupled with application of the LDDMM method for image volume registration will enable the detection and quantification of changes in cardiac anatomy that are characteristic of specific disease processes in the heart. Finally, we show that epicardial electrical mapping and DTMRI imaging may be performed in the same hearts. The anatomic data may then be used to simulate electrical conduction in a computational model of the very same heart that was mapped electrically. This facilitates direct comparison and testing of model versus experimental results and opens the door to quantitative measurement, modeling, and analysis of the ways in which remodeling of ventricular microanatomy influences electrical conduction in the heart.

KEYWORDS: computational modeling; fiber orientation; MRI; sheet orientation; ventricular anatomy

Address for correspondence: Prof. Raimond L. Winslow, Ph.D., Center for Cardiovascular Bioinformatics & Modeling, Johns Hopkins University School of Medicine, Baltimore, MD 21218, USA. Voice: 410-516-5417; fax: 410-516-5294.

rwinslow@bme.jhu.edu

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# INTRODUCTION

The fiber structure of the cardiac ventricles plays a critical role in determining properties of electrical conduction in the heart. Conduction is anisotropic, with current spread being most rapid in the direction of the fiber long axis. <sup>1,2</sup> Conduction is also influenced by properties of tissue geometry such as expansion and contraction, <sup>3–5</sup> as well as by the spatial rate of change of fiber orientation. <sup>6</sup> Remodeling of ventricular geometry and fiber organization is a prominent feature of several cardiac pathologies. These alterations may figure importantly in arrhythmogenesis. <sup>7</sup> A detailed knowledge of ventricular fiber structure, how it may be remodeled in cardiac pathology, and the effects of this remodeling on ventricular conduction is, therefore, of fundamental importance to the understanding of cardiac electromechanics in health and disease.

Ventricular fiber orientation was first studied by means of fiber dissections<sup>8–10</sup> and histologic measurements in transmural plugs of ventricular tissue.<sup>11–15</sup> The principle conclusions of this work were that cardiac fibers are arranged as counterwound helices encircling the ventricular cavities and that fiber orientation is a function of transmural location, with fiber direction being oriented predominantly in the base–apex direction on the epicardial and endocardial surfaces and rotating to a circumferential direction in the midwall. These initial fiber dissection studies were restricted to a small number of myocardial measurement sites. Nielsen *et al.*<sup>16</sup> overcame this limitation by using a custom-built histologic apparatus to measure inclination angle at up to ~14,000 points throughout the myocardium, with a resolution of ~500, 2,500, and 5,000 μm in the radial, longitudinal, and circumferential directions, respectively. This work led to the first complete reconstruction of ventricular geometry and fiber orientation—an achievement that has had significant impact on the cardiac mechanics and electrophysiology communities.

Recently, diffusion tensor magnetic resonance imaging (DTMRI), a technique for measuring the self-diffusion of protons in fibrous tissue, has emerged as a powerful new tool for the rapid measurement of cardiac geometry and fiber structure at high spatial resolution. In this article, we will summarize the current state of DTMRI for use in reconstruction of ventricular anatomy. We first review results regarding the application of DTMRI to measure fiber orientation in the cardiac ventricles. These results demonstrate that the primary eigenvector of the diffusion tensor measured at each image voxel is aligned with the direction of the cardiac fiber long axis and that both ventricular geometry and fiber orientation may be measured rapidly and at high spatial resolution using DTMRI. Second, we present new data providing strong support for the hypothesis that the tertiary eigenvector of the diffusion tensor measured at each image voxel is aligned with the surface normal to the cardiac sheets.<sup>17</sup> Third, we describe a quantitative mathematical approach known as large deformation diffeomorphic metric mapping (LDDMM), by which ensembles of imaged and reconstructed hearts may be registered so that statistical analysis of variation of ventricular geometry and shape may be performed. Finally, we demonstrate how DTMRI data may be used in modeling of electrical conduction in the cardiac ventricles.

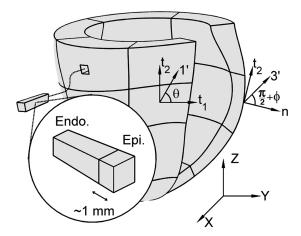
# **METHODS**

# **DTMRI** Imaging Methods

DTMRI methods have been described previously. <sup>18</sup> Anesthesia was induced with sodium thiopental and maintained after intubation with isofurane. A midline thoracotomy was performed, animals were heparinized and cardiac arrest was induced with a bolus of potassium chloride. Following explantation, a Langendorff preparation was used to perfuse the heart with saline solution until coronary vessels were clear. Vinyl polysiloxane was injected into each of the four chambers via the tricuspid and mitral valves in order to maintain diastolic conformation during imaging. The hearts were then perfused with and stored in a 7% by volume isotonic solution of formaldehyde. Care was taken to fix hearts in the same cardiac phase so that their fiber orientations would be similar. Small variations in cardiac phase during fixation are not problematic since fiber angles do not change significantly between diastole and systole. 11 Each heart was placed in an acrylic container filled with the perfluoropolyether Fomblin (the low dielectric effect and minimal MR signal of Fomblin increases contrast and eliminates unwanted susceptibility artifacts near the boundaries of the heart). The long axis of each heart was aligned with the z axis of the scanner, and images were acquired with a 4-element phased array coil on a 1.5 T GE CV/I MRI Scanner (GE Medical Systems, Wausheka, WI). The system had a 40 mT/m maximum gradient amplitude and a 150 T/m/s slew rate. Hearts were placed in the center of the coil and a 3-D fast spin-echo sequence was used to acquire diffusion images. 18 Total scan time was approximately 60 h per heart.

# Reconstruction of Ventricular Geometry and Fiber Organization

After imaging, the three principle eigenvalues and eigenvectors were computed for each voxel from the diffusion tensors. <sup>17,19</sup> Voxels in the 3-D DTMRI images representing compact myocardium were identified using a parametric active contouring method implemented as part of *HeartWorks*. <sup>20</sup> Ventricular geometry and fiber orientation were modeled using 3-D finite elements as described by Nielsen et al. 16 using a graphical user interface implemented in Matlab (Mathworks, Natick, MA). Diffusion tensor eigenvectors corresponding to voxels within the finite element boundaries were used to study the fiber structure of the ventricles. These eigenvectors were transformed into local material coordinates of the model as described by LeGrice et  $al.^{21}$  Fiber inclination angle  $\theta$  (the angle formed by the circumferential epicardial tangent vector t<sub>1</sub> and the projection of the primary eigenvector onto the surface tangent plane defined by vectors t<sub>1</sub> and the axial tangent vector t<sub>2</sub>) was used as a measure of fiber orientation and was computed as shown in Figure 1. The circumferential tangent vector  $t_1$  was constrained to the xy plane. Intersection angle  $\phi$  was used as a measure of cardiac sheet orientation and was defined relative to the tertiary eigenvector where  $\frac{\pi}{2} + \phi$  was the angle formed by the surface normal and the projection of the tertiary eigenvector onto the plane defined by the surface normal n and t<sub>2</sub>. A total of 11 normal and 7 tachycardia pacing-induced failing canine hearts were reconstructed using these methods. Data was loaded into the Cardiac Anatomic Database System (CADS)<sup>22</sup> for visualization and analysis.



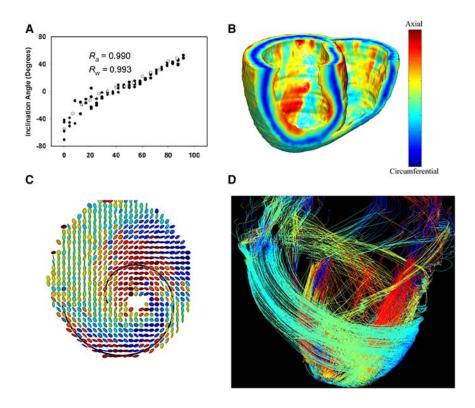
**FIGURE 1.** The coordinate system used to define the inclination angle,  $\theta$ , and the intersection angle,  $\phi$ .

# Anatomical Registration and Structural Analysis of Imaged Hearts

We have recently developed a mathematical method known as the LDDMM algorithm for accurate registration of ensembles of imaged and reconstructed heart anatomies. 18 In this method, an anatomy is defined as collection of landmarks, curves, surfaces, subvolumes and tensors. A "template" anatomy is selected from a database of imaged hearts, and large deformation mappings are generated and used to deform this template onto "target" anatomies (e.g., other imaged hearts in the database). The transformations are constrained to be 1:1 and differentiable with differentiable inverse so that every point in the template has a corresponding point in the target, connected sets of template image points remain connected in the target, surfaces are mapped as surfaces, and volumes are mapped as volumes, thereby maintaining the global relationships between these structures. Regional anatomic variability is then studied as a property of the local variability of these transformations. The advantages of the LDDMM method over small-deformation mapping schemes are that the computed transformations are invertible and, therefore, the choice of an anatomic template is arbitrary and LDDMM computes a geodesic that is a shortestlength path in the space of transformations matching the given imagery, thereby quantifying deformation via a scalar metric distance.

### RESULTS

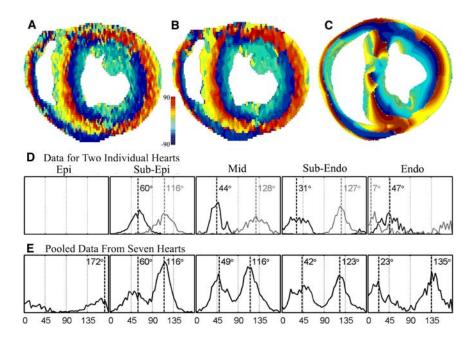
Substantial data now confirms the hypothesis that the primary eigenvector of the diffusion tensor is aligned locally with the long axis of cardiac fibers. <sup>17,20,23,24</sup> As an example, FIGURE 2A shows fiber inclination angle (ordinate) as a function of transmural depth (abscissa). Open symbols show histological measurements from transmural tissue plugs, and filled circles show DTMRI estimates obtained at the same locations of these transmural tissue plugs. Histological and DTMRI-based measurements are in close agreement. We have also shown that DTMRI can be used to image and reconstruct fiber orientation throughout the cardiac ventricles. <sup>18,20</sup> FIGURE 2B [in color in Annals Online] shows an example of reconstruction of both ven-



**FIGURE 2.** (A) Comparison of histological and diffusion tensor magnetic resonance imaging (DTMRI)-based estimates of fiber inclination angle at corresponding transmural location. (B) Reconstruction of fiber inclination angle throughout the canine cardiac ventricles. (C) Map of fiber inclination angle at the apex of a canine heart. (D) Fiber tracing performed in a canine heart using DTMRI data [in color in Annals Online].

tricular geometry and fiber orientation in a normal canine heart. Fiber inclination angle varies from the circumferential direction to the base–apex direction. Imaging resolution is ~300  $\mu$ m in plane and ~800  $\mu$ m out of plane. Imaging at this resolution enables measurement of fiber orientation at roughly two orders of magnitude more points than is possible with histological reconstruction methods. <sup>16</sup> Figure 2C shows that fiber orientation may be reconstructed accurately even in regions of the ventricles where fiber curvature is large (e.g., the apex of the heart). Finally, Figure 2D shows that fiber-tracing methods may be used to map fiber trajectories within the heart in a matter reminiscent of the original fiber dissections of MacCallum, <sup>8</sup> Mall, <sup>9</sup> and Fox and Hutchins. <sup>10</sup>

Cardiac fibers are known to be organized in sheets approximately four cells in thickness that radiate outward from the endocardial to the epicardial surface. Local surface orientation of these sheets varies spatially. In previous work, we compared the intersection angle obtained by projection of the tertiary eigenvector of the diffusion tensor onto a plane defined by the epicardial and axial tangent vectors (see



**FIGURE 3.** (A) Intersection angle measured using diffusion tensor magnetic resonance imaging in a short-axis section of the rabbit ventricle, (B) smoothed using a median filter. (C) Intersection angle measured by LeGrice *et al.*<sup>21</sup> in a short-axis section of the canine heart. (D) Histograms of intersection angle measured in the indicated regions of canine myocardium for two different hearts (gray vs. black lines). (E) Pooled data, as in D, from seven normal canine hearts [in color in Annals Online].

FIG. 1) with the intersection angle generated by projection of surface normal to the cardiac sheets measured histologically by Nielsen *et al.*<sup>16</sup> These data are shown in FIGURE 3A–C. FIGURE 3A shows DTMRI-based estimates of this inclination angle in a single short-axis section of the rabbit heart, and FIGURE 3B shows the data of FIGURE 3A smoothed using a median filter.<sup>17</sup> FIGURE 3C shows interpolated intersection angles of the surface normal to the ventricular sheets determined by LeGrice *et al.* in canine heart.<sup>21,25</sup> The short-axis section of FIGURE 3C was selected to be positioned at roughly the same percentage distance from base to apex as was the section of FIGURE 3A and B. The qualitative correlation between intersection angles of the tertiary eigenvector and the sheet normals is striking, despite being not only from different hearts, but also from different species.

More recent theoretical analyses coupled with histological reconstructions have predicted and verified the existence of two populations of sheets differing in orientation by approximately 90° in the canine<sup>26</sup> and ovine<sup>27</sup> ventricles. We, therefore, sought to determine if DTMRI may be used to reconstruct these two differing populations of sheet angles (Helm PA., H.J. Tseng, L. Younes, E. McVeigh, R. Winslow, unpublished data). To do this, we measured intersection angles for the tertiary eigenvector of the diffusion tensor at ventricular locations similar to those where previous

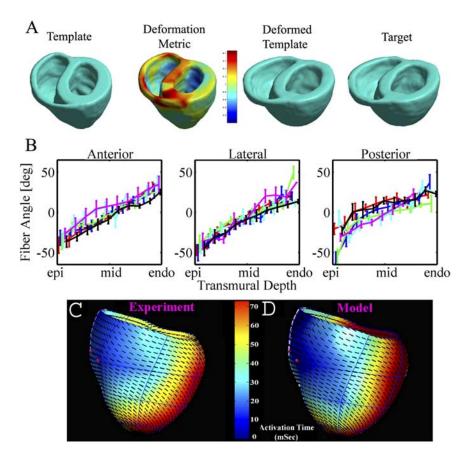
histological measurements of dual sheet structure have been reported. <sup>26,27</sup> In these prior experimental studies, left ventricular transmural blocks of tissue were isolated and sectioned in ~1-mm increments parallel to the epicardial tangent plane, and measurements of intersection angles were averaged within these regions. Using a similar approach, we isolated 24 transmural regions by selecting 4 transmural regions each from within the anterior base, lateral base, posterior base, anterior apex, lateral apex, and posterior apex of the left ventricle. These 24 regions were divided into ~1-mm cube subregions each containing, on average, 291 tensor measurements. Based on normalized transmural depth, we assigned each cube as being in the epicardium (0% to 20%), subepicardium (20% to 40%), midwall (40% to 60%), subendocardium (60% to 80%), or endocardium (80% to 100%).

FIGURE 3D-E shows analyses of the distribution of intersection angles computed from the tertiary eigenvector in the four transmural regions located in the apicalanterior left ventricular free wall for two hearts. We observed that within each region of each heart, distribution of intersection angle exhibited a single dominant peak (Fig. 3D). The dominant intersection angle differed at various anatomic locations. This finding is similar to observations made using histological reconstruction methods in which each report indicates the presence of a dominant muscle layer. 26,27 Dominant populations were located on average at approximately 45° and 117°. Histological measurements have indicated similar values for sheet angles. Specifically, Dokos et al. identified a dominant midwall muscle layer at ~45° and another at  $\sim 110^{\circ}$ , <sup>28</sup> and Ashikaga *et al.* observed angles at 36° and another at  $\sim 70^{\circ}$  to 90°. <sup>29</sup> Finally, when the distribution angles for all hearts were pooled, a bimodal distribution of angles per location emerged (Fig. 3E), with the two dominant angles being equally likely. This is similar to the results of Arts et al. in which pooled histological measurements were obtained from six canine hearts. Peaks of pooled intersection angles were observed at 45° and 135° per location with similar probabilities. 26 These data provide strong evidence that the tertiary eigenvector of the diffusion tensor corresponds to the surface normal of the laminar sheets.

The data presented above demonstrate how DTMRI may be used to reconstruct the detailed anatomic structure of the cardiac ventricles. Using this approach, we have imaged and reconstructed a population of 11 normal and 7 failing canine hearts (failure was induced using the tachycardia pacing procedure). Our goal is to first assess within-class variability of these anatomies (normal vs. normal, failing vs. failing) and then, using estimates of within-class variability, extend the analyses to identify between-class differences of both geometry, fiber, and sheet orientation between normal versus failing hearts.

FIGURE 4 shows results of applying the LDDMM algorithm to register a template to a target heart. The left panel of FIGURE 4A shows the structure of a normal canine heart selected as the template. The right panel shows a view of a failing canine heart selected as the "target." The panel labeled "deformation metric" is a representation of the displacements needed to bring every point in the template into 1:1 correspondence with a point in the target heart. The panel labeled "deformed template" shows the results of deforming the template onto the target heart. Comparison of the two right panels shows that the mapping computed using the LDDMM algorithm leads to accurate registration of target and template hearts.

Registration of template and target hearts enables comparison of anatomic structure at corresponding points in both hearts. As an example, FIGURE 4B shows fiber



**FIGURE 4.** (A) Results of computing and applying LDDMM, taking the template onto the target heart. (B) Plots of inclination angle (ordinate) as a function of percent transmural depth (abscissa) for the six normal target canine hearts following registration to the template. (C) Plot of experimentally measured activation time. (D) Plot of simulated activation time [in color in Annals Online].

inclination of 6 normal canine hearts taken at corresponding transmural locations of the left ventricle. Locations were selected by choosing a transmural set of voxels in the anterior, lateral, and posterior left ventricular walls of the normal template heart and then using the LDDMM mapping to locate corresponding sets of voxels in each of the six normal target hearts. The ordinate plots average fiber inclination angle at each transmural location (abscissa) for each of the target hearts. Error bars indicate the standard deviation of inclination angle calculated per heart at each transmural location. This variation reflects both anatomical variability as well as measurement noise. The mean standard deviation calculated over all transmural locations and hearts is 6.0, 5.9, and 5.7 degrees for anterior, lateral, and posterior left ventricular locations, respectively. The standard deviation of mean inclination angle calculated

over all target hearts and transmural locations is 3.3, 4.7, and 7.2 degrees for anterior, lateral, and posterior left ventricular locations, respectively. These data, therefore, offer an example of how the LDDMM algorithm may be used to register hearts in order to assess anatomic variability at corresponding locations. In particular, these data indicate that variations of fiber inclination angle at corresponding points over an ensemble of hearts is surprisingly small.

The DTMRI data provide important information that may be used to constrain computational models of electrical conduction in the cardiac ventricles. Electrical conduction may be modeled by solving the monodomain equation over the myocardial domain H,

$$\frac{\partial v(\underline{x},t)}{\partial t} = \frac{1}{C_m} \left[ -I_{ion}(\underline{x},t) - I_{app}(\underline{x},t) + \frac{1}{\beta} \left( \frac{\kappa}{\kappa+1} \right) \nabla \cdot (M_i(\underline{x}) \nabla v(\underline{x},t)) \right] \text{ on H,} \quad (1)$$

where  $I_{ion}(\underline{x},t)$  is membrane ionic current as defined in the canine myocyte model of Winslow *et al.*<sup>30</sup> The conductivity tensors at each myocardial point  $\underline{x}$  are then defined as

$$M_i(\underline{x}) = P(\underline{x})G_i(\underline{x})P^T(\underline{x}), \qquad (2)$$

where  $G_i(\underline{x})$  is a diagonal matrix with elements  $\sigma_{1,i}$ ,  $\sigma_{2,i}$  and  $\sigma_{3,i}$ ,  $(\sigma_{1,i})$  is longitudinal, and  $\sigma_{2,i}$  and  $\sigma_{3,i}$  are transverse intracellular conductivities), and  $P(\underline{x})$  is the transformation matrix from local to scanner coordinates at each point  $\underline{x}$ . When working from DTMRI data, the columns of  $P(\underline{x})$  are set equal to the eigenvectors of the diffusion tensor estimated at point  $\underline{x}$ . Coupling conductances are set as in previous models 33,34 and refined to yield measured epicardial conduction velocities. The reaction—diffusion monodomain equation (Eqs. 1 and 2) is then solved using methods described previously. 35

FIGURE 4 shows the results of applying these methods to the analysis of conduction in a normal canine heart. FIGURE 4C shows activation time measured experimentally using a 256-electrode sock array in response to a right ventricular stimulus pulse applied at the epicardial location marked as spheres. Following electrical mapping, the heart was excised and imaged using DTMRI, then a finite-element model was fit to the resulting geometry and fiber orientation data sets, and EQUATIONS 1 and 2 were solved—in response to the same stimulus as studied experimentally—on the myocardial domain. FIGURE 4D shows results of simulating conduction using a computational model of the very same heart that was mapped electrically in FIGURE 4C. Results are seen to be in qualitative agreement.

# **SUMMARY**

It is now clear that the primary eigenvector of the diffusion tensor is aligned locally with the cardiac fiber long axis, and, therefore, DTMRI may be used for rapid measurement of fiber orientation throughout the canine ventricles at high spatial resolution. In addition, the data of Figure 3 showing that intersection angles measured using DTMRI agree closely with those measured using histologic reconstruction provide strong evidence supporting the hypothesis that the tertiary eigenvector of the

diffusion tensor is aligned locally with the cardiac sheet surface normal. Considered together, these observations suggest that DTMRI may be used to reconstruct both ventricular fiber and sheet organization. We also show that the LDDMM algorithm may be used to register imaged and reconstructed hearts so that variability of ventricular geometry, fiber, and sheet orientation may be quantified over ensembles of imaged hearts. Ventricular geometry and fiber structure is known to be remodeled in a range of disease processes, <sup>36–38</sup> however, descriptions of this remodeling have remained subjective and qualitative. Future research will combine use of DTMRI with the LDDMM method to detect statistically significant changes of cardiac anatomy that are characteristic of specific disease processes in the heart. Finally, we show that epicardial electrical mapping and DTMRI imaging may be performed in the same hearts. The anatomic data may then be used to simulate electrical conduction in a computational model of the very same heart that was mapped electrically. This facilitates direct comparison and testing of model versus experimental results and opens the door to quantitative measurement, modeling, and analysis of the ways in which remodeling of ventricular microanatomy influences electrical conduction in the heart.

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