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## 1 Full Length Articles

# Tractography atlas-based spatial statistics: Statistical analysis of diffusion tensor image along fiber pathways

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Introduction

## ABSTRACT

The quantitative analysis of diffusion tensor image (DTI) data has attracted increasing attention in recent decades 23 for studying white matter (WM) integrity and development. Among the current DTI analysis methods, tract-24 based spatial statistics (TBSS), as a pioneering approach for the voxelwise analysis of DTI data, has gained a lot 25 of popularity due to its user-friendly framework. However, in recent years, the reliability and interpretability 26 of TBSS have been challenged by several works, and several improvements over the original TBSS pipeline 27 have been suggested. In this paper, we propose a new DTI statistical analysis method, named tractography 28 atlas-based spatial statistics (TABSS). It doesn't rely on the accurate alignment of fractional anisotropy (FA) im-29 ages for population analysis and gets rid of the skeletonization procedures of TBSS, which have been indicated 30 as the major sources of error. Furthermore, TABSS improves the interpretability of results by directly reporting 31 the resulting statistics on WM tracts, waiving the need of a WM atlas in the interpretation of the results. The fea-32 sibility of TABSS was evaluated in an example study to show age-related FA alternation pattern of healthy human 33 brain. Through this preliminary study, it is validated that TABSS can provide detailed statistical results in a com-

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Diffusion tensor imaging (DTI), as a sensitive probe of cellular 42 structure by measuring the diffusion of water molecules, has become a 43 44 widely used tool for imaging the white matter (WM) of the brain. With its growing popularity, DTI has been applied in a variety of 45neuroscience studies, such as WM diseases study (Amlien and Fjell, 462014; Barnea-Goraly et al., 2010; Guo et al., 2001; Kubicki et al., 47 48 2005), human brain connectome modeling (Hagmann et al., 2007; Tymofiyeva et al., 2013), neurosurgical planning and navigation 49 (Abdullah et al., 2013; Nimsky et al., 2006; Wu et al., 2007) and so on. 5051To perform the quantitative analysis on DTI, several DTI-derived metrics can be calculated to quantify the properties of WM non-invasively. One 52of the most widely used metrics is fractional anisotropy (FA), which is a 5354useful quantity to measure WM integrity. The voxelwise FA map is usu-55ally compared across subjects to reveal diffusion property differences.

<sup>1</sup> The authors contributed equally to this work.

http://dx.doi.org/10.1016/j.neuroimage.2015.10.032 1053-8119/© 2015 Published by Elsevier Inc. There are three mainstream DTI analysis methods: region of interest 56 (ROI) analysis (Schneider et al., 2004; Shimony et al., 1999; Snook et al., 57 2005; Yoshiura et al., 2005), tract-specific analysis (Colby et al., 2012; 58 Yeatman et al., 2012) and voxel-based analysis (VBA) (Abe et al., 59 2010; Takao et al., 2010; Tapp et al., 2006). 60

In ROI-based approaches, ROIs are first specified in each subject 61 image. FA values are extracted and averaged within each ROI. Mean 62 FA values are compared across subjects on a regional basis. However, 63 as FA values are averaged within the ROI, the detailed spatial informa- 64 tion is lost through this operation, especially when regions with differ- 65 ent diffusion properties are combined. 66

In the previous tract-based DTI analysis studies, either a mean fiber 67 is used to represent the entire WM tract (Colby et al., 2012; Yeatman 68 et al., 2012), or ad hoc parameterization method is employed to model 69 the shape of the tract (O'Donnell et al., 2009; Verde et al., 2014; Zhang 70 et al., 2010a). This kind of method is limited to some specific WM tracts 71 that either contain fibers with similar diffusion properties so that the 72 diffusion indices of the mean fiber can represent the whole tract, or con-73 tain fibers with uniform shape for easy parameterization. 74

For VBA methods, FA images of different subjects are first registered 75 into a common space. The voxelwise statistical analysis is carried out to 76 study the between-group differences. VBA methods can achieve a more 77

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detailed spatial statistics, but the results are highly sensitive to registra-78 79 tion accuracy and the choice of a smoothing kernel. One alternative to VBA is tract-based spatial statistics (TBSS) (Smith et al., 2006), which 80 81 was proposed to alleviate the influences of misalignment and the smoothing kernel. TBSS creates a mean FA skeleton image to represent 82 the centers of all fiber bundles, projects each subject's aligned FA 83 image onto the skeleton, and then carries out voxelwise statistical anal-84 85 ysis across subjects on the skeleton voxels. TBSS aims to reduce the sen-86 sitivity of registration accuracy by introducing the skeletonization and 87 projection steps. After its development and availability within FSL, TBSS has been widely adopted for many DTI analyses (Bodini et al., 88 2009; Burzynska et al., 2010; Giorgio et al., 2008; Hsu et al., 2008). Nev-89 ertheless, in recent years, some studies have emerged to point out the 90 limitations of TBSS. In summary, there are three major points of debate 91about TBSS: First, the skeleton projection step may break the topological 92 consistency of the transformed brain images (de Groot et al., 2013). Sec-93 ond, any misalignment resulting from the groupwise registration may 94 95 substantially influence the results. Although some works proposed to use a more advanced registration method to improve alignment accura-96 cy, e.g., ANTS (Schwarz et al., 2014), Elastix (de Groot et al., 2013), DTI-97 TK (Bach et al., 2014), registration errors inevitably exist to a certain ex-98 tent, and perfect anatomical alignment is hard to be achieved due to an-99 100 atomical variability between subjects. Third, as stated in Bach et al. (2014), special care should be taken in interpreting the results of 101 TBSS. TBSS overlays the significant results upon the skeleton voxels, 102which lack an explicit tract representation. For structures that are in 103 close proximity to each other, it is sometimes hard to differentiate be-104 105tween them. Moreover, it provides limited anatomical specificity with which to interpret the results. Although, these studies have raised 106 awareness of TBSS limitations and suggested improvements to the ap-107proach, a consensus has not yet been reached on how to modify the 108 original TBSS scheme. 109

110In order to address the above issues, we proposed an alternative DTI statistical analysis approach, entitled tractography atlas-based spatial 111statistics (TABSS). It is a whole-brain, fully automated, statistical analy-112 sis method. The statistical results are reported upon the WM tracts. In 113 order to validate the feasibility and accuracy of TABSS, we have conduct-114 ed experiments to compare the FA patterns between a young group and 115 an old group of subjects. The experiment was designed as a verification 116 of TABSS application to a between-group comparison. Age-related FA 117 reduction is widely documented in the literature (Burzynska et al., 118

2010; Hsu et al., 2008; Madden et al., 2008; Salat et al., 2005; Teipel 119 et al., 2010). We compared the TABSS results with those previously reported WM regions and found consistency between the findings. 121

### Method

Overview of TABSS

TABSS attempts to inherit the strengths of TBSS to perform automat-124ic whole brain DTI analysis. It does not rely on accurate non-rigid125groupwise registration to establish correspondence between subjects126for statistical analysis and gets rid of the projection process. This is127achieved by establishing a fiber-level correspondence with an existing128tractography atlas via feature matching. After correspondence estab-129lishment, diffusivity metrics can be sampled along the trajectory of fi-130bers and directly compared between corresponding fiber pairs across131subjects. The final statistics are reported in a multi-level way for a com-132prehensive understanding of any WM alternation patterns. The pipeline133of TABSS consists of four steps, as shown in Fig. 1 and summarized as134follows.135

- Creation of a tractography atlas: Perform fiber reconstruction on a 136 DTI template to construct the tractography atlas, which serves as 137 the reference space for population analysis.
   138
- 2. Extraction of WM tracts: Using an automated atlas-guided WM tracts 139 reconstruction method, extract the WM tracts in each subject space. 140
- 3. Establish the fiber correspondence: For each subject, and within each 141
  WM tract, find the fibers that match with the atlas fibers based on a 142
  defined fiber similarity measure. For each fiber with a counterpart in 143
  the tractography atlas, extract the diffusivity metrics along the fiber 144
  pathway for further analysis. 145
- 4. Statistical analysis. Carry out the statistical analysis on the diffusivity 146 metrics within the whole brain space. 147

## Tractography atlas

The tractography atlas was served as the reference tractography for 149 establishing correspondences among populations. In this study, we 150 used the publicly available DTI template – IIT Human Brain Atlas 151 (v.3.1), which contains both anatomical and DTI brain templates in 152 ICBM-152 space (Varentsova et al., 2014). It was constructed by the 153



Fig. 1. The pipeline of tractography atlas-based spatial statistics (TABSS) for DTI analysis.

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