

# DENSE AND STRUCTURED REPRESENTATIONS OF U-SHAPE FIBER CONNECTIVITY IN THE CENTRAL SULCUS

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## ABSTRACT

U-shape fibers are superficial white matter fibers connecting adjacent gyri. In this paper, we present a method to characterize the connectivity of U-shape fibers coursing around the central sulcus. Pre- and post-central gyral crests are semi-automatically drawn and used to build a connectivity space that is identical between subjects. This group space provides a dense representation of the short-range connectivity between the two gyri, as well as a structured representation after clustering.

*Index Terms*— central sulcus, connectivity

## 1. INTRODUCTION

Although main fiber bundles of the brain have been intensively studied during the last ten years, less is known about superficial white matter and more precisely about short associations fibers. Recent technical progress in diffusion MRI, the modality commonly used to probe white matter, have made feasible to access the structure of these fibers. Few studies have investigated such fibers and most of them concentrate on the central sulcus area, a sulcus with little variability across subjects and a well-known functional organization [1], [2]. Such studies have tried to characterize the U-shape fibers connecting the pre- and post-central gyri around the central sulcus, either at the entire sulcus level, or locally based on predefined regions of interests (ROIs). In [3], tracks were selected from a whole-brain deterministic tractogram using nine ROIs in the pre-and post-central gyri. A similar approach was used in [4] with six ROIs. The connectivity between ROIs was assessed through fiber count, normalized by the white matter volume within each ROI. In [5], associations fibers are clustered into four categories at the whole brain level. Connectivity profile of these fibers was assessed with respect to drawn sulcus fundi and gyral crest and the connectivity of sharp U-shape fibers was assessed globally between gyri as the number of fibers connecting pairs of gyri. Recently, a clustering technique dedicated to short association fibers was introduced in [6] and used to build a specific atlas from seventy subjects.

In this paper, we introduce a method to characterize the structure of U-shape fibers around the central sulcus in a local and continuous manner, providing a dense description of the U-shape fiber distribution, independent of any ROI-based seed. This distribution is characterized at the group level after extracting U-shape bundles and representing each tract as a point in a local connectivity space based on its extremities. This group-level connectivity space is defined from a parameterization of the pre- and post-central gyral crest lines.

This new representation not only provides a dense description of the short association fibers connecting both gyri but can also be clustered into bundles in order to provide a more structured description. The method was applied on the left central sulcus of ten subjects from the Human Connectome Project dataset.

## 2. MATERIAL AND METHODS

### 2.1. Dataset

Ten subjects from the publicly available Human Connectome Project dataset were used in this study. All individual were right-handed males aged of 25-30 years. Scans were acquired using a modified version of Siemens Skyra 3T scanner (Siemens, Erlangen, Germany) with a maximum gradient strength of 100mT/m, slew rate of 200T/m/s and a 32-channel head coil.

T1-weighted scans were acquired using 3D MPRAGE sequence (TR/TE=2400/2.14ms, flip angle=8°, FOV=224x224 mm<sup>2</sup>, resolution=0.7 mm isotropic). Diffusion-weighted images were acquired using a spin-echo EPI sequence consisting of 3 shells (b=1000, 2000 and 3000 s/mm<sup>2</sup>) of 90 diffusion weighted volumes each and 6 interleaved non-weighted b0 volumes (TR/TE = 5520/89.5ms, resolution=1,25mm isotropic, FOV= 210x180mm<sup>2</sup>, 111 axial slices, multiband factor=3, partial Fourier = 6/8, echo spacing=0.78ms). Each direction was acquired twice with reversed-phase encoding.

### 2.2. Preprocessing

T1-images were segmented using Freesurfer<sup>1</sup> and imported into Brainvisa<sup>2</sup> to obtain grey/white matter interface meshes. Diffusion-weighted scans were preprocessed using the

<sup>1</sup> <https://surfer.nmr.mgh.harvard.edu/fswiki/>

<sup>2</sup> <http://brainvisa.info>

Diffuse toolbox<sup>3</sup>, an in-house Brainvisa toolbox [7] wrapping FSL<sup>4</sup> and Dipy [8] functions. Scans were corrected for subject motion and susceptibility artefacts. Corrected diffusion images and T1-images were non-linearly registered, then the white matter meshes could be brought into the diffusion space. Local Multi Shell Multi Tissue (MSMT) model parameters were estimated in Mrtrix<sup>5</sup>. MSMT impulsional response was first estimated for each subject using dhollander method [9] with default parameters. Whole brain deterministic tractography based on the MSTM model was performed using the Mrtrix SD\_Stream algorithm [10] with the following parameters: 50 million seeds, random placement in grey and white matter volume, Runge-Kutta 4<sup>th</sup> order integration, 45° angle, constrained by anatomical tissues and cropping at grey-white matter interface [11]. Resulting tractograms were filtered with the SIFT algorithm [12].

### 2.3. Pre- and post-central gyrus crest lines delineation

The left pre-central and post-central gyral crest were drawn semi automatically onto each subject's left white matter mesh using the SurfPaint module [13] in BrainVisa after manually choosing their end points (see Fig. 2). Each of the two lines was isometrically parametrized from the ventral to the dorsal extremity, such as to obtain a reference 1-D coordinate system [0-100], as described in [14].

### 2.4. Hand-knob alignment reparameterization

In order to provide a better correspondence of the pre- and post-central gyri across subjects than the simple [0-100] parameterization, we reparameterized both crest lines to enforce the matching of a specific structure, the hand-knob, following the same procedure as in [14]. The hand-knob is a part of the central sulcus with a characteristic inverted omega shape, known to locate the primary hand motor area reliably across subjects [2].

The location of the most posterior extension of the hand-knob was located manually on the white matter mesh of each individual. The plane orthogonal to the inertia plane of the central sulcus and passing through the hand-knob extension was computed. The pre-central and post-central hand-knob landmarks were then chosen as the closest vertex to this plane on each of the two crest lines.

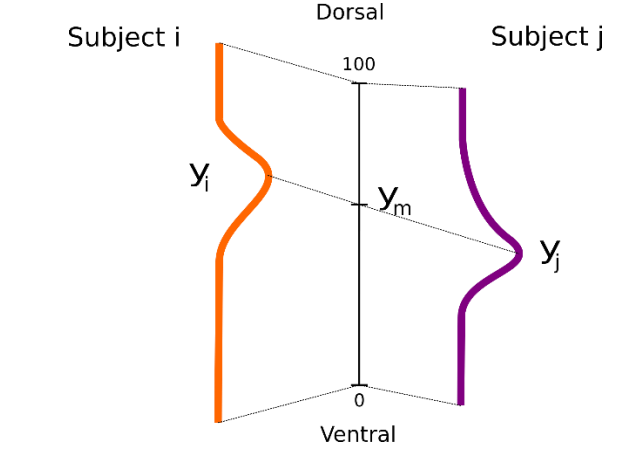
These two landmarks were then forced the same coordinate across subjects following the procedure in [1]. Specifically, each crest line was reparameterized using the following affine transformation:

$$\text{if } 0 \leq y \leq y_i \quad y_{new} = \frac{y_m}{y_i} \cdot y$$

$$\text{if } y_i < y \leq 100 \quad y_{new} = \frac{100 - y_m}{100 - y_i} \cdot y + 100 \cdot \frac{y_m - y_i}{100 - y_i}$$

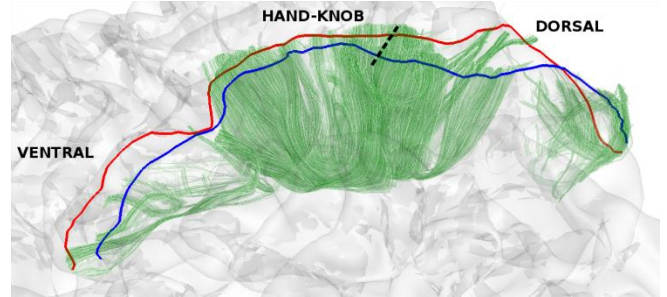
<sup>3</sup> <https://github.com/MecaLab/Brainvisa-Diffuse>

<sup>4</sup> <https://fsl.fmrib.ox.ac.uk/fsl/fslwiki>



**Fig. 1. Schematic 2D representation of affine transform on a gyral crest line: subjects hand-knob coordinates  $y_i$  and  $y_j$  are transported to group mean hand-knob coordinate  $y_m$ .**

where  $y_i$  is the hand-knob coordinate for subject  $i$  and  $y_m$  is the corresponding mean coordinate across subjects. After reparameterization, the hand-knob landmark has coordinate  $y_m$  across all subjects (Fig. 1). Both pre-central and post-central crest lines are processed independently.



**Fig. 2. Dorso-ventral view of one subject: pre- (red), post- (blue) central gyri crests and resulting U-shape streamlines (green) behind the left white matter mesh. Hand-knob position is marked with the dotted line.**

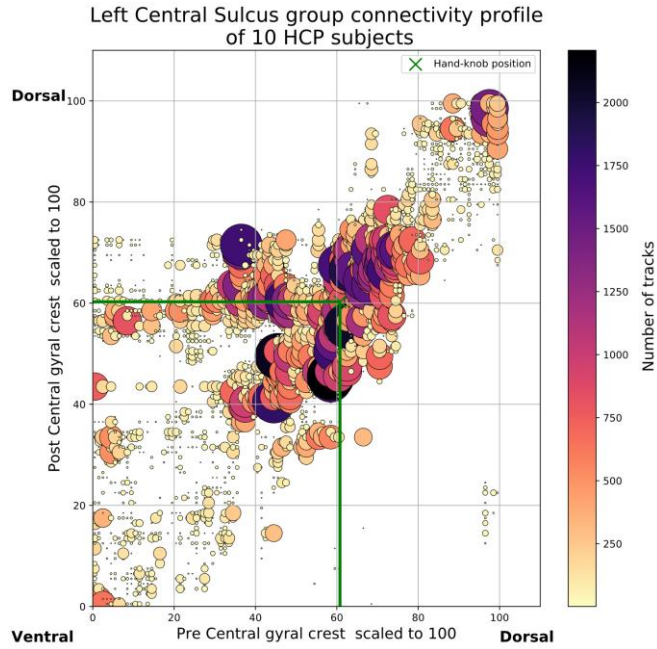
### 2.5. Short U-shape fibers selection

U-shape fibers are connecting the pre- and post-central gyri, passing below the sulcus fundus. U-shape streamlines were selected from the whole tractogram as follows. If  $s$  and  $e$  are respectively the starting and ending vertices of a streamline in the tractogram, and  $d_{s_{pre}}$ ,  $d_{s_{post}}$ ,  $d_{e_{pre}}$ ,  $d_{e_{post}}$  the Euclidian distances between  $s$  ( $e$ ) and the pre (post-) central gyral crestlines, then the selection conditions is expressed as:

<sup>5</sup> [www.mrtrix.org](http://www.mrtrix.org)

$$U_{shape\ fibers} = \{ f \in F / (d_{s_{pre}} < d_{s_{post}}) \cdot (d_{e_{pre}} > d_{e_{post}}) + (d_{s_{post}} \leq d_{s_{pre}}) \cdot (d_{e_{pre}} \leq d_{e_{post}}) \}$$

where  $F$  stands for whole-brain tractogram, + and  $\cdot$  stands for the OR and AND boolean operators. This first criterion insures that tracts are indeed going from one gyrus to another. In addition, tracks extremities (s and e) were associated with their respective closest mesh vertices. A geodesic distance map from the two gyral crest was then computed on the mesh. To insure only short U-shape streamlines connecting adjacent gyri are kept, a threshold of  $t=16$  mm was set on the geodesic distance map. Streamlines whose closest vertices were further than  $t$  from the gyral crests were discarded, insuring that remaining streamlines go up in the gyri close enough to their crest line. This threshold was empirically found to include most fibers connecting the two gyri while removing spurious streamlines in the tractogram (Fig. 2.).

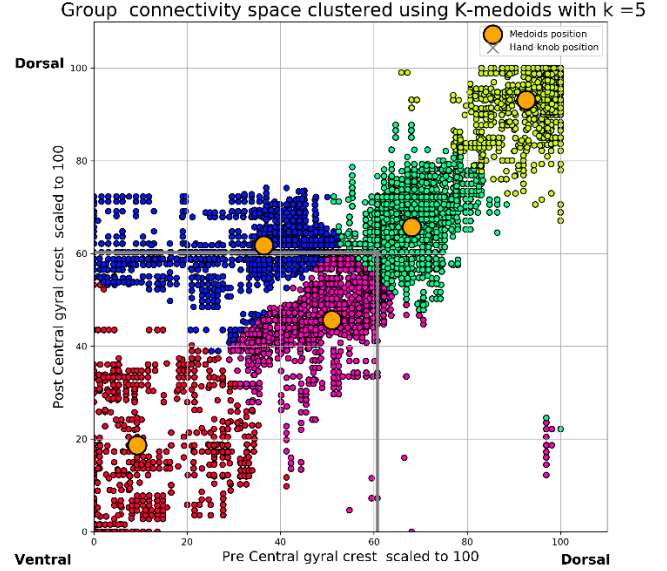


**Fig. 3. Group connectivity profile into the dense group connectivity space. Each marker aggregates the streamlines over unitary bins to ease visualization. Size of the marker is proportional to the number of streamlines. Group hand-knob position is plotted by green cross.**

### 2.6. Group connectivity space

Each U-shape fiber selected during the previous step is associated with the pre- and post-central coordinates corresponding to its extremities (closest vertices on the gyral crest lines). Therefore each streamline corresponds to a point in the  $[0;100] \times [0;100]$  space defined by the parameterization (section 2.2), and hereafter called ‘group connectivity space’. Because the parameterization is common to all subjects, so is the group connectivity space, and all U-shape streamlines of

all subjects can be plotted in this space, with a total of 361241 streamlines for the ten subjects.



**Fig. 4. Discrete and structured representation of group connectivity space achieved with k-medoids,  $k=5$ . Centroids are represented as orange dots, group hand-knob position is plotted by grey cross.**

### 2.7. Fiber clustering

The group connectivity space provides a multi-subject, continuous representation of U-shape fibers. However, in order to get a structured and simplified representation of this space we then cluster the group connectivity space using the k-medoids [15] algorithm with 1000 initializations and 300 iterations each, to ensure clusters stability. The number of clusters was empirically set to  $k=5$ . In this way, fibers that have similar starting and end points are clustered together in bundles defined by the cortical areas they connect.

## 3. RESULTS AND DISCUSSION

We presented a method to study connectivity profile of U-shape association fibers underneath the central sulcus. We introduced a continuous square domain common to all subjects by parameterization of the pre- and post-central gyral crests. In this continuous domain, a U-shape fiber connecting the two gyri is represented by a point. This group connectivity space is presented in Fig. 3. We observed a group connectivity variable density along the central sulcus from the ventral to the dorsal extremities. The denser and most numerous connections represented by larger disks are essentially located near to the hand-knob position, i.e. in the  $[60;80] \times [60;80]$  domain.

A dense but smaller connectivity is also observed in the dorsal area i.e. in the  $[90;100] \times [90;100]$  domain, while we observed sparse connectivity in the ventral area i.e.

[0;40]x[0;40] domain. These observations are similar to the functionally coherent (hand, foot and face area) tracts obtained and confirmed by dissection in [3]. In addition, we observe connections between the ventral pre-central gyri and the middle part of the post-central gyri. It may correspond to an extension of face superior U-tract described in [3] but also to previously undetected fibers or tractography artefacts. This connectivity organization is confirmed by the clustering shown in Fig.4. Obtained clusters, three around the hand-knob area, one in the extreme ventral region and one in the extreme dorsal region define bundles that are similar to those described in [3].

By using a continuous parametric domain based on adjacent gyral crest lines, we provide a continuous description of structural connectivity along central sulcus without introducing priors by choosing region of interest location along sulcus. This method, applied on high diffusion data quality, suggests a discrete organization of the connectivity along the central sulcus which is coherent with the literature. However, we found some additional short-range associations connections that need to be further investigated.

Further work will concentrate on several points: the use of a micro-structure informed filtering method such as COMMIT [16] in order to reduce the number of biologically erroneous tracts and improve the quality of the tractogram; a study on a much larger group of subjects, such as the entire HCP900 database; and finally a groupwise clustering technique based on individual connectivity space representations in order to take into account inter-subject variability. Finally, other sulci such as the temporal superior sulcus or the Calcarine sulcus.

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