

# Brain networks modulated by subthalamic nucleus deep brain stimulation

Ettore A. Accolla<sup>1,2</sup>, Maria Herrojo Ruiz<sup>1,3</sup>, Andreas Horn<sup>1</sup>, Gerd-Helde Schneider<sup>4</sup>, Tanja Schmitz-Hübsch<sup>1</sup>, \*Bogdan Draganski<sup>5,6</sup>, \*Andrea A. Kühn<sup>1,7,8,9</sup>

<sup>1</sup>Department of Neurology, Charité University Medicine Berlin, Campus Virchow, 13353 Berlin, Germany.

<sup>2</sup>Neurology Unit, Medicine Department, HFR Cantonal Hospital and Faculty of Sciences, University of Fribourg, Fribourg, Switzerland.

<sup>3</sup>Department of Psychology, Goldsmiths, University of London, London, United Kingdom

<sup>4</sup>Department of Neurosurgery, Charité University Medicine Berlin, Campus Virchow, 13353 Berlin, Germany.

<sup>5</sup>LREN - Département des neurosciences cliniques, CHUV, Université de Lausanne, 1011 Lausanne, Switzerland.

<sup>6</sup>Max Planck Institute for Human Cognitive and Brain Science, 04103 Leipzig, Germany.

<sup>7</sup>Berlin School of Mind and Brain, Humboldt University, 10117 Berlin

<sup>8</sup>NeuroCure Clinical Research Center, Charité - Universitätsmedizin Berlin, 10117 Berlin, Germany

<sup>8</sup>DZNE, Berlin, Germany

\*Equal contribution.

## **Corresponding Author:**

Dr. Ettore Accolla

Laboratory for Cognitive and Neurological Sciences (LCNS)

Neurology Unit, Department of Medicine

University of Fribourg

Chemin du Musée 5

1700 Fribourg, Switzerland.

e-mail: [ettoreaccolla@gmail.com](mailto:ettoreaccolla@gmail.com)

Tel: +41 26 426 81 30

Fax: +41 26 426 81 35

**Running title:** Deep brain stimulation electrodes connectivity: a diffusion tensor imaging study.

## Abstract

Deep brain stimulation of the subthalamic nucleus is an established treatment for the motor symptoms of Parkinson's disease. Given the frequent occurrence of stimulation-induced affective and cognitive adverse effects we need a better understanding of the subthalamic nucleus role in non-motor functions. The main goal of this study is to characterise anatomical circuits modulated by subthalamic deep brain stimulation, and infer about the inner organisation of the nucleus in terms of motor and non-motor areas. Given its small size and anatomical inter-subject variability, STN functional organisation is difficult to investigate *in vivo* with current methods. Here, we used local field potential recordings obtained from 10 Parkinson's disease patients to identify an STN area with an analogous electrophysiological signature, namely a predominant beta oscillatory activity. The spatial accuracy was improved by identifying a single contact per each macroelectrode for its vicinity to the electrophysiological source of the beta oscillation. We then conducted whole brain probabilistic tractography seeding from the previously identified contacts, and further described connectivity modifications along the macroelectrode main axis. The designated STN "beta" area projected predominantly to motor and premotor cortical regions additional to connections to limbic and associative areas. More ventral subthalamic areas showed predominant connectivity to medial temporal regions including amygdala and hippocampus. We interpret our findings as evidence for the convergence of different functional circuits within STN portions deemed to be appropriate as deep brain stimulation target to treat motor symptoms in Parkinson's disease. Potential clinical implications of our study are illustrated by an index case where DBS of estimated predominant non-motor STN induced hypomanic behaviour.

## **Keywords**

Deep brain stimulation; Parkinson's disease; Parkinson's disease: imaging; subthalamic nucleus; beta oscillations.

## **Abbreviations**

LFP= Local Field Potentials

DBS = Deep Brain Stimulation

phr= phase reversal

PSD= power spectral density

STN = subthalamic nucleus

## Introduction

Deep Brain Stimulation of the subthalamic nucleus in Parkinson's disease leads to effective reduction of motor symptoms and improvement of quality of life (Krack *et al.*, 2003; Schuepbach *et al.*, 2013). Despite its efficacy in ameliorating motor symptoms, DBS of the STN is also associated with affective, behavioural and cognitive adverse effects (Castrियोto *et al.*, 2014; Voon *et al.*, 2006; Welter *et al.*, 2014). The most frequently observed symptoms include emotional instability (Krack *et al.*, 2001; Odekerken *et al.*, 2012) additional to induction of (hypo)manic episodes (Chopra *et al.*, 2012; Kulisevsky *et al.*, 2002; Mallet *et al.*, 2007; Ulla *et al.*, 2011; Welter *et al.*, 2014) and impulsivity changes (Cavanagh *et al.*, 2011; Frank *et al.*, 2007), alongside depression and apathy most probably due to medication reduction (Okun *et al.*, 2009; Thobois *et al.*, 2010; Witt *et al.*, 2012). Given that one of the main determinants of clinical outcome is the precise location of the macro-electrode (Castrियोto *et al.*, 2014), a detailed knowledge of STN anatomy is particularly relevant for optimal target choice and DBS efficiency.

Although recently disputed (Alkemade and Forstmann, 2014; Lambert *et al.*, 2015), mounting evidence from anatomical, neurophysiological and clinical studies confirms the notion of a tripartite functional organisation of the human STN (Hamani *et al.*, 2004; Karachi *et al.*, 2009; Krack *et al.*, 2001; Mallet *et al.*, 2007; York *et al.*, 2009). Despite the assumption of functional specialisation, the putative segregated sensorimotor, associative and limbic territories show substantial areas of overlap (Haynes and Haber, 2013). The STN functional sub-regions can be distinguished with a certain degree of precision using neurophysiological markers – procedure that is widely used in the clinical routine for electrode implantation (Abosch *et al.*, 2002; Kinfe and Vesper, 2013; Marceglia *et al.*, 2010; Rodriguez-Oroz *et al.*,

2001). In Parkinson's disease patients, LFP recordings from the STN demonstrated enhanced oscillations in the beta band (13-30Hz), which is substantially and consistently reduced after the intake of levodopa along with symptom improvement (Hammond *et al.*, 2007; Kühn *et al.*, 2006). Interestingly, neurons with predominant firing at frequencies within the beta range or those that are locked to oscillatory beta band activity are significantly more abundant in the dorso-lateral portion of the STN (Trottenberg *et al.*, 2007; Weinberger *et al.*, 2006; Zaidel *et al.*, 2010) - a region that is part of the cortico-basal ganglia motor loop (Haynes and Haber, 2013). Beta activity could be therefore considered as the electrophysiological signature of the sensori-motor function within the dorso-lateral STN (Chen *et al.*, 2006; Trottenberg *et al.*, 2007; Zaidel *et al.*, 2010).

An inherent limitation when studying *in vivo* the anatomical and functional organisation of the STN is due to the high level of inter-individual variability (Richter *et al.*, 2004). Addressing this limitation, we combine neurophysiological recordings with brain imaging data from Parkinson's disease patients undergoing DBS of the STN. The main goal of the study is to obtain fine-grained topographical information about the STN functional subregions through characterisation of its anatomical and functional connectivity patterns. To this aim, we use LFP recordings from DBS macroelectrodes within the STN in parallel with investigation of the anatomical connectivity of the very same DBS contacts based on probabilistic diffusion tractography. Finally, we analyse how connectivity values vary along the macro-electrode main axis. Based on the clinical observation of reduction of DBS-induced psychiatric symptoms when shifting the stimulation site dorsally (Welter *et al.*, 2014), we hypothesize that different patterns of connectivity to limbic cortical structures differentiate neighbouring contacts in the electrodes implanted in the STN of Parkinson's disease patients.

## Materials and Methods

We acquired data from 10 idiopathic Parkinson's disease patients recruited at the Charité Movement Disorders clinic and scheduled for DBS based on clinical decision. Inclusion criteria were an established clinical diagnosis of idiopathic Parkinson's disease, a proven response to levodopa and the absence of other neurological or psychiatric diagnosis not related to Parkinson's disease. STN targeting and stereotactic surgery were performed according to a standard protocol as detailed previously (Kühn *et al.*, 2009).

All subjects gave informed written consent to the study, which was approved by the local Ethics committee. Demographic and available clinical information is summarized in Table 1. Levodopa equivalent daily dosage (LEDD) was calculated according to a recent systematic review (Tomlinson *et al.*, 2010).

### *Pre-surgery MRI*

Before surgery, all patients underwent quantitative multi-parameter brain imaging and diffusion-weighted imaging on a 3T whole-body MRI system (Magnetom TIM Trio, Siemens Healthcare, Erlangen, Germany) using a 32-channel radio-frequency (RF) head receive coil and RF body transmit coil. The quantitative MR protocol consisted of 3D multi-echo FLASH datasets with predominantly proton density weighting (PDw; repetition time TR = 23.7 ms, flip angle  $\alpha = 6^\circ$ ), T1 weighting (T1w; TR/ $\alpha = 18.7$  ms/ $20^\circ$ ), and magnetization transfer weighting (MTw; TR/ $\alpha = 23.7$  ms/ $6^\circ$ ) contrast according to the previously published protocol (Draganski *et al.*, 2011; Weiskopf *et al.*, 2013).

The diffusion-weighted imaging protocol was performed with the following parameters: TE = 80 ms, TR 8300ms, acquisition matrix 128 x 128 voxels, 74 axial slices, yielding voxel size of 1.7 x 1.7 x 1.7mm, BW = 2003 Hz/pixel, diffusion weighting at a high b = 1000 s mm<sup>-2</sup> along 60 directions and 6 reference volumes at zero b-value acquired one every 10th high b-value acquisition.

### *Post-surgery LFP recordings*

Patients were studied 2–6 days after DBS implantation with externalised DBS electrodes and prior to their connection to the stimulator device (Macroelectrode 3389, Medtronic, Minneapolis, USA).

Bipolar LFP activity was recorded from adjacent contact pairs (01, 12, 23) in each DBS electrode, where 0 is the most ventral and 3 is the most dorsal contact (R=right, L=left). Signals were amplified 50000-fold and filtered at 0.5–250 Hz on a Digitimer D360 (Digitimer Ltd., Welwyn Garden City, Hertfordshire, UK) and recorded through a 1401 A-D converter (Cambridge Electronic Design [CED], Cambridge, UK) onto a computer using Spike2 software (CED, Cambridge, UK). Signals were sampled at 1 kHz (except in Patient 4, where signals were sampled at 826 Hz) and monitored on-line.

In all patients LFP recordings of 3-5 minutes duration were performed at rest (i) after overnight withdrawal of dopaminergic mediation (OFF-drug) and (ii) 1 h after intake of 200 mg of levodopa or 1.5 times the patient-specific morning levodopa dose (ON-drug). For the analysis of the LFP signals a segment of 180 s without muscle or ocular artefacts was selected for each patient from the OFF-drug and ON-drug LFP recordings.

## *Post-surgery MRI*

Within 5 days after surgery, patients underwent brain MRI as part of the clinical protocol to confirm the planned localisation of the electrodes. Dedicated T2-weighted fast-spin echo sequences were acquired in a 1.5 Tesla MRI machine (NT Intera; Philips Medical Systems, Best, the Netherlands), with the following parameters: TR/TE, 3500/138 ms; echo-train length, 8; excitations, 3; flip angle, 90°; section thickness, 2 mm; FOV, 260 mm (in-plane resolution 0.51 x 0.51 mm); matrix size, 384 interpolated to 512; total acquisition time, 10 minutes 41 seconds; Philips software Version 11.1 level 4.

## *Data analysis*

LFP and neuroimaging data were processed and analysed in Matlab 7 (Mathworks, Sherborn, MA, USA). Image processing was performed with the freely available Statistical Parametric Mapping software (SPM8; Wellcome Trust Centre for Neuroimaging, London, UK, <http://www.fil.ion.ucl.ac.uk/spm/software/>), running under Matlab 7. Probabilistic diffusion tractography was performed with the FDT diffusion toolbox in the framework of FSL (Behrens *et al.*, 2007).

## *Analysis of LFP activity*

The continuous LFP recordings of 180s-length were used for the LFP analyses described in this section.

The *power spectral density* (PSD, in  $\mu\text{V}^2/\text{Hz}$ ) of the raw data was computed with the standard fast Fourier Transform (Welch method, Hanning window of 1 s, 75% overlap) for each

patient and medication condition separately. The PSD (measured power:  $P$ ) was then normalized into decibels (dB) with the average PSD (reference power:  $P_0$ ) within 105-195 Hz (excluding the 145-155 Hz range to avoid possible harmonics of the 50Hz power line noise) to account for between-subjects variability:

$$PSD(dB) = 10 \log_{10} \left( \frac{P}{P_0} \right)$$

In order to confirm that the OFF state was associated with a larger beta-band (13-30Hz) LFP activity (Kühn *et al.*, 2006; Priori *et al.*, 2004), we first tested for spectral power differences between the OFF and ON states within the 1-100 Hz range. In this analysis, we averaged for each patient the normalized PSD across all contact pairs (R01, R12, R23, L01, L12, L23).

Next, to confine the local generator of the beta-band activity based on our bipolar LFP recordings, we used the analysis of phase reversal of oscillatory activity (Rodriguez-Oroz *et al.*, 2011) (**Fig. 1**), which provides a more consistent spatial localisation than the evaluation of the peak of activity in the spectral power. The occurrence of significant phase reversal between two pairs of bipolar recordings (i.e. between 12 and 23) indicates that the source of the activity, although spatially distributed, lies closer to the contact shared by both bipolar recordings (e.g. contact 1 in the previous example. As each electrode has only 4 contacts, this analysis was limited to 3 pairs per side. See **Fig. 1 panels A-C**).

Phase reversal was analysed for neighbouring contact pairs in each STN, in OFF medication condition. Prior to the phase reversal analysis, the LFP signals were band-pass filtered (finite impulse response filter) between 13-30Hz to obtain the signal content in the beta frequency range. Then, we applied the Hilbert transform to extract the phase values  $\varphi_i(t, f)$  for

each band-passed filtered bipolar recording  $i$ , at time point  $t$  and within the frequency band  $f$ . Our criterion of phase reversal was based on the computation of the cosine of the phase of the resultant vector:

$$\mathbf{v} = \frac{1}{N} \sum_{k=1}^N \exp(i(\varphi_{jk} - \varphi_{ik}))$$

where  $N$  is the signal length ( $N = 180000$  sampling points) and

$$\Delta\varphi_{ji,k} = \varphi_{jk} - \varphi_{ik}$$

is the phase difference between neighbouring signals  $i$  and  $j$  from bipolar recordings at sampling (time) point  $k$ . A phase reversal occurs when the resultant phase difference is within the range  $(\pi/2, 3\pi/2)$  radians and is thus associated with a negative cosine value (**Fig. 1 panel C**). When a phase difference lies within the range  $(-\pi/2, \pi/2)$  radians, no phase reversal occurs and, correspondingly, a positive cosine value is obtained (**Fig. 1 panel B**). The statistical evaluation of the phase reversal was performed following Rodriguez-Oroz et al. (Rodriguez-Oroz *et al.*, 2011), with the Rayleigh test of uniformity of angle by obtaining the significance value according to the expression:

$$\exp(-Nv^2)$$

where

$$v = \|\mathbf{v}\|$$

is the norm of the resultant vector  $\mathbf{v}$ .

Following this procedure, we selected in each STN the contact where the phase reversal occurred (e.g. 1) and, in addition, the next one in the dorsal (e.g. 2) and ventral direction (e.g.

0) along the macroelectrode axis (if available; note that whenever the phase reversal was estimated to occur beyond contact 3, there was no dorsal contact available; and whenever the phase reversal was estimated to occur beyond contact 0, no ventral contact was available. These estimations were based on a tendency of the cosine towards more negative values, either in the  $0 \rightarrow 1 \rightarrow 2 \rightarrow 3$  direction or in the opposite direction. However, these effects did not represent a true phase reversal). Beta-band phase reversal occurred within the STN for the majority of the nuclei ( $N = 16/20$ ). A detailed list of the contacts at the phase reversal of beta LFP activity is provided in Table 1.

We then analysed the normalised spectral power with respect to the localization of the contact pairs (in relation to the beta-band phase reversal). The selection of contact pairs for this analysis was based on the occurrence of a significant phase reversal: for phase reversal at contact 1 or 2 (L or R STN), we selected contact pair 12 and 23, respectively, as the closest one to the phase reversal (phr). The remaining contact pairs were defined as *ventral* to phr contact pair for the one caudal to the phr contact pair, and *dorsal* contact pair for the one rostral to the phr contact pair (if available, see above). Note that the contact pairs choice in relation to phase reversal proximity (found for only one contact) is arbitrary, but this criterion was kept for consistency.

### *MRI data processing*

The multi-parameter maps were only used for the purpose of non-linear registration to standardised space.

MT maps were first linearly registered to the diffusion space (using as a destination volume the first B0 diffusion acquisition) and then segmented according to the standard unified

segmentation approach in the framework of SPM (Ashburner and Friston, 2005). Deformation fields from the previous step allowed for the inverse deformation of labelled probabilistic cortical atlases from MNI into individual native diffusion space, as well as for the transformation of tractography results into the common space for further analysis (see below). For delineation and labelling of cortical areas we used a combination of freely available probabilistic atlases: the Juelich atlas for medial temporal areas (Eickhoff *et al.*, 2005, including amygdala and hippocampus) and the Harvard-Oxford cortical atlas (Desikan *et al.*, 2006) for the remaining areas.

Each group of 10 DWI  $b=1000$  s/mm<sup>2</sup> volumes was affine registered to the respective reference B0 volume, and then with the first  $b=0$  (b0) volume of the block acquisition. Diffusion vector directions were corrected accordingly with in-house Matlab code. Post-operative T2 images were subsequently linearly co-registered with the average reference b0 volume, allowing for superposition of electrode artefacts on the diffusion native space. The accuracy of the procedure was visually inspected, and coordinates of the central voxel of contact artefact manually identified. From these coordinates, cube-shaped seed masks for tractography were built by expanding to all neighbouring voxels (total seed volume=27 voxels). We used the recently implemented LEAD-DBS toolbox (Horn and Kühn, 2015) to estimate contacts coordinates in the MNI space, and their spatial localisation with respect to the STN Morel atlas (Krauth *et al.*, 2010). With the settings used, the toolbox allowed for subject-specific non-linear registration after segmentation of structural images (**Supplementary Fig. 3**).

Whole-brain unconstrained probabilistic tractography was performed in subject specific native space using the default settings in FSL bedpostx with the following parameters: 10000

originating tracts per voxel, curvature 0.2, step length 0.5. Distributions of diffusion parameters were estimated at each voxel in order to model the directions of up to two tensors per voxel (Behrens *et al.*, 2007). Through the option “classification targets” we computed for each contact-surrounding seed the average number of tracts reaching each cortical target.

In order to maintain consistency across subjects, tractography was conducted seeding from contacts closest to the beta source (further called contacts ‘B’), from the adjacent dorsal contact (contacts ‘D’) and the adjacent ventral contact (contacts ‘V’). In the case of contact ‘B’ being assigned to the most dorsal contact (due to a trend towards a phase reversal beyond contact 3: 2/20 cases, see Table 1), the adjacent connectivity profile was excluded from analysis (contact ‘D’). The STNs showing no phase reversal were excluded from this analysis (4/20 cases).

In order to reduce well-known biases affecting the probabilistic tractography method (Morris *et al.*, 2008), we excluded targets in close proximity to the implanted electrodes – i.e the basal ganglia. Moreover, the cingulate cortex was also excluded, after demonstration of an important proximity bias: connectivity values were strongly affected by the vicinity of corpus callosum, so that it was not possible to reliably distinguish tracts directed to cingulate cortex from inter-hemispherical projections.

For each side, seed-to-target connectivity matrices were thresholded at 50 tracts, and the values were transformed using the natural logarithm. Values were normalized in each subject by dividing them by the maximum connectivity value. Cortical targets were considered for further analysis only if connected to at least 50% of contacts B or D or V.

### *Statistical analysis*

Spectral power differences between the OFF and ON states within the 1-100 Hz range were tested by means of a non-parametric pair-wise permutation test (*Permutation, Parametric and Bootstrap Tests of Hypotheses*, 2005) across N subjects, with a total of 5000 random permutations. The difference in sample means was the test statistic. The *p*-values were computed as the frequencies that the replications of the test statistic had absolute values greater than or equal to the experimental difference. Statistical tests of the changes in spectral power were assessed at each frequency within 1-100 Hz.

The statistical assessment of a general effect of localisation (ventral, beta-band phase reversal, dorsal) on the spectral power was performed by means of the non-parametric Kruskal–Wallis one-way analysis of variance test. This test was assessed at each frequency bin between 13 and 30 Hz, to determine whether the effect of pair localisation on the beta-band spectral power occurred in a specific sub-band or in the full beta band.

Differences in connectivity among contacts B, D and V were first tested with the non-parametric Kruskal–Wallis test. Post-hoc analyses between D and B or between V and B contacts were performed by means of pairwise permutation tests.

In all statistical analyses, differences were considered significant if  $p < 0.05$ . Correction of the significance level due to multiple comparisons was performed by controlling the false discovery rate (FDR) at level  $q = 0.05$  by means of an adaptive two-stage linear step-up procedure (Benjamini and Yekutieli, 2001). The corrected threshold *p*-value obtained from this procedure, *p*<sub>th</sub>, was used to reject all null hypotheses fulfilling the condition: *p*-value < *p*<sub>th</sub>. Throughout the paper, *p*<sub>th</sub> is given when multiple comparisons are performed (spectral power or connectivity analysis).

## Results

### *Clinical Data*

All patients showed a good clinical response both to levodopa (mean improvement in UPDRS III score =  $52 \pm 7\%$ ) and to DBS (mean improvement with DBS OFF vs ON, medication OFF, available for 7/10 patients =  $61 \pm 5\%$ ). Demographical and clinical information is summarized in Table 1. Two patients presented with mood disturbances after surgery (case 5, 6). Subject 5 (male, 55 years old) developed hypomanic behaviour with uncontrolled money spending and high irritability (see below) 4 months after surgery. Subject 6 (male, 53 years old) also presented with transient hypomanic behaviour immediately after surgery. However, a retrospective diagnosis of a pre-existing bipolar disorder could be established on the basis of new anamnestic information. Symptoms stabilised under withdrawal of SSRI and treatment with valproic acid over a time period of a few weeks, and no clear relation with STN stimulation could be identified.

### *Source localisation of beta-band LFP oscillations and spectral power analysis.*

The average normalised spectral power OFF medication, as compared to ON medication, exhibited significantly larger values in the lower beta range (13-20 Hz,  $p < p_{th} = 0.031$ , **Supplementary Fig. 1**). This outcome confirmed that there was a higher level of beta-band activity OFF medication, which was further assessed using the phase reversal analysis. We

found a significant phase reversal of the beta-band STN oscillatory activity OFF medication for the majority of the patients, and typically in both STNs (16 nuclei out of 20 in 10 patients,  $p < 10^{-6}$ , see **Fig. 1 A-C**, and **Table I**). In four STNs stemming from four different patients, no significant phase reversal could be found. For two of these nuclei, postoperative imaging showed a slight medial positioning of the macro-electrode (patient 3 and 6). For all other patients post-operative imaging confirmed the optimal electrode placement with at least one contact of the macro-electrode within STN.

The contacts closer to the beta source (contacts **B**), after transformation of coordinates onto the standard MNI space, were localised in the dorso-lateral (sensorimotor) STN (average MNI coordinates in mm  $\pm$  SEM: right:  $x= 11.25 \pm 0.41$ ;  $y= -12.62 \pm 0.90$ ;  $z= -6.62 \pm 0.41$ ; left:  $x= -11.00 \pm 0.59$ ;  $y= -13.12 \pm 0.51$ ;  $z= -6.87 \pm 0.61$ , **Fig. 2**). Neighbouring contacts located above (dorsal, contacts **D**) the contact exhibiting the beta-band phase reversal were placed mainly outside the STN, while contacts below (ventral, contacts **V**) were still within the nucleus borders (**Fig. 2**).

The assessment of a general effect of contact pair localisation (beta-band phase reversal, dorsal and ventral) on the normalised spectral power OFF medication, revealed a significant effect in the upper beta band within 26-30 Hz (Kruskal–Wallis test,  $p < p_{th} = 0.0208$ ; **Fig. 1D**). This was due to consistently larger beta-band power values at the phase reversal contact pairs, relative to the ventral and dorsal contact pairs. Accordingly, the analysis of the normalised spectral power based on the phase reversal classification of contact pairs demonstrated a frequency-specific effect. By contrast, power analysis in the case of classification of contact pairs based on the peak of beta-band oscillatory activity revealed

largely non-frequency specific (and non-significant) power modulations (**Supplementary Fig. 2**).

#### *DBS contacts: anatomical connectivity*

Probabilistic tractography seeding from contacts B revealed a high connectivity to motor and premotor areas, and to a lesser extent to medial temporal and post-central structures (descriptive results in **Fig. 3**). In contrast, connectivity to amygdala, hippocampus and post-central gyrus were maximal from contacts V, and progressively reducing in the dorsal direction (**Fig. 3, 3<sup>rd</sup> row**). Connectivity to superior, middle and inferior frontal gyri, and supplementary motor cortex (SMC) were highest in contacts D, intermediate in contacts B, and lowest in contacts V (**Fig. 3, 2<sup>nd</sup> row**).

The cortical areas that fulfilled both our criteria of (i) > 50 tract thresholding and (ii) > connectivity to at least 50% of either contacts B, D, and V included the frontal pole, superior, middle and inferior frontal gyrus, precentral gyrus, SMC, amygdala, hippocampus, superior parietal lobule, precuneus, and lateral occipital cortex. The non-parametric Kruskal–Wallis test revealed a main effect of contact localisation (3 levels: D, B, V) on the normalized connectivity to the amygdala, hippocampus, superior, middle and inferior frontal gyri, post-central gyrus, SMC ( $p < p_{th} = 0.01$ , after control of FDR at level  $q = 0.05$ ; **Fig. 3 and 4**). Post-hoc analysis by means of permutation tests showed that contacts B had a significantly higher connectivity to the amygdala and smaller connectivity to the superior frontal gyrus than contacts D ( $p < p_{th} = 0.01$ ). Compared to contacts V, contacts B had significantly smaller connectivity to the amygdala, whereas they had larger connectivity to the SMC, and the superior, middle and inferior frontal gyri ( $p < p_{th} = 0.016$ ). Hence, in a dorso-ventral

direction we described an increasing connectivity gradient to the amygdala, and a decreasing gradient of connectivity to SMC and the superior, middle and inferior frontal gyri.

### *Index Case – clinical and imaging findings*

Subject 5 (male, 54 years old at surgery) developed stimulation-induced hypomanic episodes. The patient underwent STN stimulation with no peri-operative complications and good motor response after activation of contacts 1R and 1L (2nd contact proceeding ventro-dorsally, right and left respectively). For the same contacts, we observed the appearance of hemi-corporal sensory symptoms at 2,4 V amplitude bilaterally. Over the next few months, the positive effect on the motor symptoms waned progressively, prompting successive adaptations including shifting to the contacts above (2R and 2L). The pharmacological treatment was also optimised and included levodopa/carbidopa/entacapone and pramipexole. The total amount was 40% less than before surgery.

Six days after the last stimulation voltage increase to 2,5 V (right STN) and 2,7 V (left STN), 60 µsec, 130 Hz, the patient complained of restlessness and irritability. His son reported irascible behaviour and episodes of uncontrolled, unnecessary money spending (mounting up to a car purchase). The psychiatric symptoms were almost completely resolved by reducing the intensity of the stimulation to 2,0V and 2,1V while the patient did not tolerate further reduction of the oral treatment. The lasting emotional irritability during in-patient care evolved further in a hypomanic state. The restlessness and logorrhoea could be prompted by increasing the stimulation voltage at contacts 2 bilaterally to rapidly disappear when the DBS was turned OFF. The psychiatric assessment was consistent with DBS-induced manic episodes given that the patient had no similar symptoms prior to surgery. After stimulation

was shifted to most dorsal contacts (3R and 3L), there was a prompt optimal motor response associated with a subjective appeasing sensation. In the long-term observation there was a complete resolution of the psychiatric symptoms despite further increases in voltage up to 2,9V in the right and 2,7V in left STN.

The stereotactic localisation according to the Morel STN atlas showed that the contacts eliciting hypomanic manifestations were positioned slightly anterior and ventral to the putative motor area, particularly in the left STN (**Fig. 5 panel A**). The connectivity results in this patient confirmed the trend observed in the rest of the population (**Fig. 5 panel B**). The tracts originating from the contacts 2 bilaterally were subtracted from those originating from contacts 3. Ventral contacts, eliciting manic manifestations (contacts 2R and 2L) had higher connectivity to medial temporal cortex, and lower to primary motor cortex as compared to dorsal contacts (contacts 3R and 3L). There was a certain asymmetry, with the left STN showing globally lower connectivity to prefrontal cortex. Clinical testing was not conducted separately for each side, so it was not possible to ascertain whether psychiatric side effects were caused predominantly by one of the two macro-electrodes.

## **Discussion**

In our study we combine neurophysiological recordings with magnetic resonance imaging to investigate *in vivo* subthalamic nucleus' functional organisation. In the effort of overcoming the limitations of both methods, we gather evidence on the existence of overlapping functional sub-regions within the nucleus. Our results support a neurobiological interpretation of the manifold clinical effects of DBS to further provide valuable information guiding clinical decision making after occurrence of STN DBS adverse effects. These findings

expand the current knowledge suggesting a rather complex and possibly subject-specific interplay between anatomical connectivity and neural activity patterns that does not support the notion of clear-cut segregated STN sub-regions.

### *Sensory-motor STN*

We found that the target for DBS - the dorso-lateral STN - is characterized by beta oscillations and anatomical connections to motor cortical areas, suggesting a link between electrophysiological activity, connectivity, and function. Our neurophysiological findings confirm previous reports based on single unit recordings and LFP spectral analysis (Kühn *et al.*, 2005; Trottenberg *et al.*, 2007; Weinberger *et al.*, 2006; Zaidel *et al.*, 2010). The depicted anatomical network of the STN beta oscillatory region is compatible with the sensorimotor function previously attributed to the beta rhythm (Engel and Fries, 2010; Little and Brown, 2014). The most highly connected targets include sensorimotor areas - pre-central, post-central gyrus, SMC. This finding is consistent with the 'hyper-direct' pathway connecting primary motor areas with the dorso-lateral STN (Haynes and Haber, 2013; Nambu *et al.*, 1996; Whitmer *et al.*, 2012), and with the beta-coherence observed between STN and M1 (Fogelson *et al.*, 2006; Litvak *et al.*, 2011; Marsden *et al.*, 2001).

The current knowledge about the generator of beta oscillations recorded from the STN is sparse, however strong evidence indicates that cortical activity drives beta oscillations in the STN (Fogelson *et al.*, 2006; Hirschmann *et al.*, 2013; Lalo *et al.*, 2008; Litvak *et al.*, 2011). Although not statistically significant, we found that contacts closest to the beta source had highest connectivity to the prefrontal gyrus. This could represent the anatomical basis of the

observed beta coherence among STN and precentral gyrus activity as recorded from subdural electrodes (Whitmer *et al.*, 2012).

Besides confirming the known topography of the sensorimotor STN, we restrain from oversimplifying STNs functional organisation. The demonstrated pattern of connectivity strongly suggests that STN areas involved in the origin of beta activity in PARKINSON'S DISEASE project not only to sensorimotor areas, but also to regions involved in cognitive and emotional/behavioural functions: contacts B were also highly connected to prefrontal regions, including superior, middle and inferior frontal gyri; higher order sensory areas in the post-central gyrus, precuneus, superior parietal lobule additional to medial frontal and temporal regions also showed high connectivity with 'beta' contacts. These results have to be interpreted with caution given major limitations in spatial resolution of MRI that we tried to overcome. However, we estimate that our combination of beta source localisation, high resolution DWI sequence (1.7 mm isotropic), and probabilistic tractography reached a sufficient reliability for inferring the STN's functional organisation. The notion of a tripartite STN – constituted by motor, associative and limbic functional subregions – is supported by consistent evidence (Hamani *et al.*, 2004; Karachi *et al.*, 2009; Krack *et al.*, 2001; Mallet *et al.*, 2007; York *et al.*, 2009). However, STN anatomo-functional subdivisions are not clear-cut as demonstrated by anatomical and neurophysiological evidence. Distribution of prefrontal projections to STN in the non-human primate (Haynes and Haber, 2013) and in humans as captured by recent imaging studies (Accolla *et al.*, 2014; Brunenberg *et al.*, 2012; Lambert *et al.*, 2012; Mallet *et al.*, 2007) show convergence and multiple areas of overlap. STN subareas are also not clearly segregated from a neurophysiological point of view, as firing pattern modifications secondary to sensory-motor tasks have been observed in regions with no prominent beta activity (Zaidel *et al.*, 2010). Given these premises, our data further

support that i) beta oscillations are not restricted to a ‘motor’ STN area; and that ii) the ‘motor’ STN is not connected exclusively with motor cortical areas. We here show that where the electrophysiological source of beta activity is found, motor connectivity is predominant, but not exclusive. We conclude that beta oscillations have a main but not exclusive motor significance, and that STN might be organised following a topographical specialisation by which predominant function at each location is constantly informed by other circuits’ activity.

#### *STN connectivity to limbic cortical areas*

Comparison of neighbouring contacts revealed a significantly higher connectivity of ventral STN to limbic targets – medial temporal structures including hippocampus and amygdala. This principle of organisation was also observed at the single subject level in a patient with DBS induced hypomanic manifestations. The involvement of amygdala and hippocampus in manic states - mostly investigated in the context of bipolar disorder - is well documented, with reported volume differences among patients and healthy subjects (Schneider *et al.*, 2012), and increased BOLD fMRI signal in response to affective faces during mania (Altshuler *et al.*, 2005; Malhi *et al.*, 2007; Strakowski *et al.*, 2012). Our findings provide a plausible anatomical substrate for the occurrence of (hypo)manic states following STN DBS, and a rationale for improvement observed when shifting stimulation dorsally.

#### *Methodological considerations*

Our approach to differentiate STN contact pairs based on the proximity to the beta-band phase reversal aimed at increasing spatial resolution, and strengthens the validity of our conclusions. The alternative approach, based solely on maximum spectral power, was not frequency-specific (**Supplementary Fig. 2**). Rather, this approach revealed that the contact

pair with maximum power in the beta range also exhibited maximum power in neighbouring frequency ranges, therefore suggesting a generally larger signal-to-noise ratio in these contacts but not a specific contact localisation in the proximity of the generator of beta oscillations. With this respect, the phase reversal analysis provides a higher accuracy for spatial localisation of oscillatory activity in a specific frequency range (Rodriguez-Oroz *et al.*, 2011).

One limitation of the beta source localisation lies in the few available contact pairs per STN: four contacts amounting to 3 contact pairs. A larger number of contact pairs per STN could lead to a more accurate spatial localisation of the beta oscillations, although it should also be noted that the beta-band activity pattern is not expected to be localised to a single focal point within the STN but may rather be spatially distributed across the dorso-lateral STN. An additional limitation that affects exclusively the power analysis is that it was necessary to set a criterion upon which to select the contact *pair* closest to the phase reversal. That is, if a phase reversal was found between contact pairs 01 and 12, there was no ambiguity with regard to which *contact* was closest to the phase reversal (here contact 1), but it was indeed necessary to decide which contact *pair* from the two containing the phase-reversal contact (1) should be selected for power analysis. Importantly, however, the connectivity analysis was not affected by this ambiguity.

In conclusion, our study expands the knowledge of STN anatomy and describes anatomical networks potentially modulated by DBS. We failed to address more specific clinical questions due to the retrospective nature of clinical data. We nevertheless here demonstrate the advantages of merging clinical, neurophysiological and neuroimaging data in investigating specific neuro-scientific questions relevant for medical purposes. We propose

that future strategies for improving DBS outcome should focus beyond the schematic tripartite principle of organisation, to target individually the optimal STN stimulation site.

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**Table 1.**

<b>Subjects</b>	<b>1</b>	<b>2</b>	<b>3</b>	<b>4</b>	<b>5</b>	<b>6</b>	<b>7</b>	<b>8</b>	<b>9</b>	<b>10</b>
<b>Age</b>	51	63	62	51	55	53	52	57	66	71
<b>Gender 1=f</b>	m	m	m	f	m	m	m	f	f	m
<b>Disease duration (years)</b>	6	11	8	14	8	10	15	13	12	11
<b>Stimulating Contacts (R L)</b>	1 / 1	1 / 1	1 / 1	2(-)3(+) / 2	3 / 3	3 / 3	1 / 1	3 / 3	3 / 3	1 / 1
<b>Beta phase reversal OFF (R L)</b>	2 / 2	(-) / 1	1 / (-)	1 / 2	1 / 2	(-) / 1	3 / 2	2 / (-)	2 / 2	3 / 1
<b>UPDRS preop. OFF</b>	29	34	21	(n.a.)	34	42	50	36	24	30
<b>UPDRS preop. ON</b>	3	14	12	8(n.a.)	20	13	38	15	16.5	22
<b>UPDRS medOFF/ StimOFF</b>	30	47	22	45	32	39	50	n.a.	n.a.	n.a.
<b>UPDRS medOFF/ stimON</b>	8	12	14	8	16	14	28	n.a	n.a	n.a.
<b>UPDRS DBS improvement %</b>	73.33	74.47	36.36	82.22	50.00	64.10	44.00	n.a	n.a	n.a
<b>LEDD preop</b>	402	1382	1580	675	1689	1552	875	1380	832	3395
<b>LEDD reduction postop %</b>	35.32	16.42	50.31	88.88	67.49	70	71.42	n.a.	18.02	77.94

## Captions

**Table 1.** Demographic and clinical information. Macroelectrode contacts are indicated as follows: R=Right, L=Left; contacts from most ventral to most dorsal 0-1-2-3; (-) indicates that a phase reversal could not be identified in the recordings. UPDRS: Unified Parkinson's Disease Rating Score, part III (range 0-108).n.a.=not available.

**Figure 1. Local Field Potential recordings (LFPs) from STN-implanted macroelectrodes.** **A.** Representative time course of beta-band oscillatory activity in the right STN obtained from bipolar recordings in patient #1. Note the phase reversal occurring between R12 and R23 (phase reversal at contact R2). For the power analysis, contact pair R12 was selected by convention (see main text) as the closest one to the source of beta activity (phase reversal). **B.** Histogram depicting the difference phase values between signals recorded from contact pairs R01 and R12 in patient #1. The maximum of the histogram is located at 0 radians ( $0^\circ$ ), indicating no phase reversal between both pairs. **C.** Same for the difference phase values between signals recorded from contact pairs R12 and R23. In this case, the histogram attains its maximum value at  $\pi$  radians ( $180^\circ$ ), indicating the occurrence of phase reversal at contact R2. **D.** Grand-average of the normalized spectral power OFF medication for the contact pair closest to the phase reversal of beta-band activity (potential source; phr, in black), and for the dorsal (d, orange line) and ventral (v, green line) contact pairs. A significant effect of localisation on the spectral power was obtained within 26-30 Hz (Kruskall-Wallis test,  $p < p_{th} = 0.0208$ , after control of FDR). The inset shows the mean value and corresponding

standard error of the mean (SEM) for the spectral power (d, phr, v) averaged within the range 26-30Hz, in which the significant effect was found.

**Figure 2. Localisation of contacts in relation to the STN.** Contacts coordinates were non-linearly registered to the MNI standard space, and superimposed to a STN 3D representation of the Morel stereotactic atlas (Krauth *et al.*, 2010). **A.** 3D rendering of all leads post-operative position from a dorsal (left panel) and posterior (right) view. **B.** Distribution model (coordinates average and covariance) of contacts in relation to the source of the beta oscillation. Contacts most close (Contacts B, middle panel) lie in the dorso-lateral STN while neighbouring dorsal contacts (contacts D, left panel) are more frequently outside the nucleus. Contacts lying immediately beneath contacts B are closer to its inferior border (contacts V, right panel).

**Figure 3. Probabilistic diffusion tractography from STN macroelectrode contacts.** **First row.** Connectivity profile of contacts closest to source of beta oscillations (contacts B). Regions with highest connectivity (yellow) include precentral gyrus and superior frontal gyrus. Lower connectivity values were found for prefrontal cortex and medial temporal regions. **Second row.** Normalised difference of connectivity values: contacts dorsal to beta minus contacts closest to beta source (D (-) B). **Third row.** Contacts ventral to beta minus contacts closest to beta source (V (-) B). More dorsal contacts show higher connectivity to prefrontal associative regions, while most ventral contacts have higher connectivity to medial temporal and orbitofrontal regions.

**Figure 4. Kruskal–Wallis test showing a significant (\*) effect of localisation for connectivity to cortical targets surviving threshold** (see Methods section). Columns represent normalised difference of connectivity values between (a) contacts dorsal to beta (D, orange) and contacts closest to beta source: D-source; and (b) contacts ventral (V, green) to beta and contacts closest to beta source: V- source. Connectivity to amygdala and hippocampus increases towards more ventral contacts, whereas more dorsal contacts show increased connectivity to prefrontal cortex (superior, middle and inferior frontal gyrus) and supplementary motor cortex (SMC), and decreased connectivity to postcentral gyrus. Significance is set at  $p < p_{th} = 0.01$ , after control of FDR at level  $q = 0.05$ . On the background, connectivity of beta contacts is represented by the shaded grey area (right y axis).

**Figure 5. Imaging data relative to the case patient (#5).** This subject had a significant motor improvement after stimulation from contacts 2 (right and left), but developed manic behaviour and restlessness. After shifting more dorsally (contacts 3 bilaterally) motor benefit was maintained, and psychiatric manifestations relieved. **A.** MNI localisation of stimulating contacts, superimposed to the STN atlas (in purple, from Morel et al.). First row: axial view, with z coordinates specifying the section level (vertical axis). Second row: sagittal view, with x coordinates (right to left axis). Contacts eliciting hypomanic manifestations (2L and 2R) are located in a more anterior and ventral position within the nucleus. **B.** Voxelwise, whole brain connectivity difference between contacts 2 and 3 (both sides computed separately) are shown (coronal view). In blue/light-blue voxels with higher connectivity to ventral contacts (contacts 2 vs contacts 3). In orange/red voxels with higher connectivity to dorsal contacts (contacts 3). Values represent the difference of number of tracts passing from

each voxel. **C.** Transversal sections at different z coordinates. Ventral contacts have higher connectivity to medial temporal structures, including amygdala, while more dorsal contacts have higher connectivity values to primary motor areas (particularly on the right side). Clinical effects were not tested separately for each side.

**Table 1.**

<b>Subjects</b>	<b>1</b>	<b>2</b>	<b>3</b>	<b>4</b>	<b>5</b>	<b>6</b>	<b>7</b>	<b>8</b>	<b>9</b>	<b>10</b>
<b>Age</b>	51	63	62	51	55	53	52	57	66	71
<b>Gender 1=f</b>	m	m	m	f	m	m	m	f	f	m
<b>Disease duration (years)</b>	6	11	8	14	8	10	15	13	12	11
<b>Stimulating Contacts (R L)</b>	1 / 1	1 / 1	1 / 1	2(-)3(+) /2	3 / 3	3 / 3	1 / 1	3 / 3	3 / 3	1 / 1
<b>Beta phase reversal OFF (R L)</b>	2 / 2	(-) / 1	1 / (-)	1 / 2	1 / 2	(-) / 1	3 / 2	2 / (-)	2 / 2	3 / 1
<b>UPDRS preop. OFF</b>	29	34	21	(n.a.)	34	42	50	36	24	30
<b>UPDRS preop. ON</b>	3	14	12	8(n.a.)	20	13	38	15	16.5	22
<b>UPDRS medOFF/ StimOFF</b>	30	47	22	45	32	39	50	n.a.	n.a.	n.a.
<b>UPDRS medOFF/ stimON</b>	8	12	14	8	16	14	28	n.a	n.a	n.a.
<b>UPDRS DBS improvement %</b>	73.33	74.47	36.36	82.22	50.00	64.10	44.00	n.a	n.a	n.a
<b>LEDD preop</b>	402	1382	1580	675	1689	1552	875	1380	832	3395
<b>LEDD reduction postop %</b>	35.32	16.42	50.31	88.88	67.49	70	71.42	n.a.	18.02	77.94

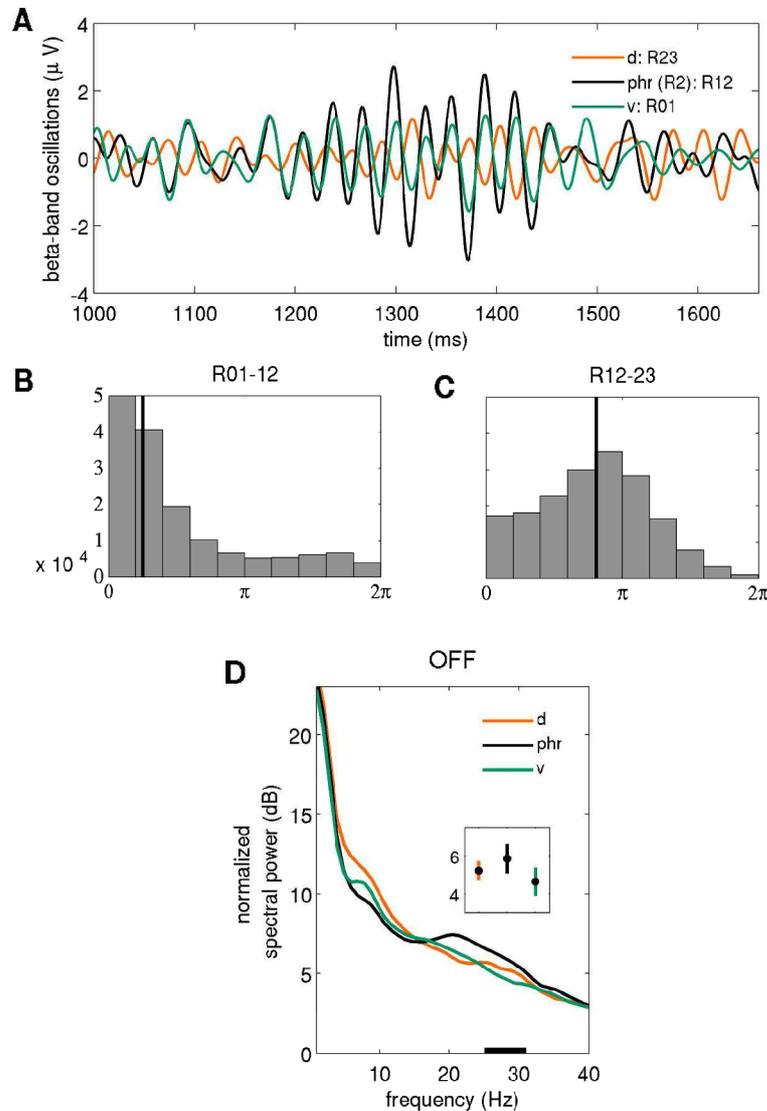


Figure 1. Local Field Potential recordings (LFPs) from STN-implanted macroelectrodes. A. Representative time course of beta-band oscillatory activity in the right STN obtained from bipolar recordings in patient #1.

Note the phase reversal occurring between R12 and R23 (phase reversal at contact R2). For the power analysis, contact pair R12 was selected by convention (see main text) as the closest one to the source of beta activity (phase reversal). B. Histogram depicting the difference phase values between signals recorded from contact pairs R01 and R12 in patient #1. The maximum of the histogram is located at 0 radians ( $0^\circ$ ), indicating no phase reversal between both pairs. C. Same for the difference phase values between signals recorded from contact pairs R12 and R23. In this case, the histogram attains its maximum value at  $\pi$  radians ( $180^\circ$ ), indicating the occurrence of phase reversal at contact R2. D. Grand-average of the normalized spectral power OFF medication for the contact pair closest to the phase reversal of beta-band activity (potential source; phr, in black), and for the dorsal (d, orange line) and ventral (v, green line) contact pairs. A significant effect of localisation on the spectral power was obtained within 26-30 Hz (Kruskall-Wallis test,  $p < p_{th} = 0.0208$ , after control of FDR). The inset shows the mean value and corresponding standard error of the mean (SEM) for the spectral power (d, phr, v) averaged within the range 26-30Hz, in which the significant effect was found.

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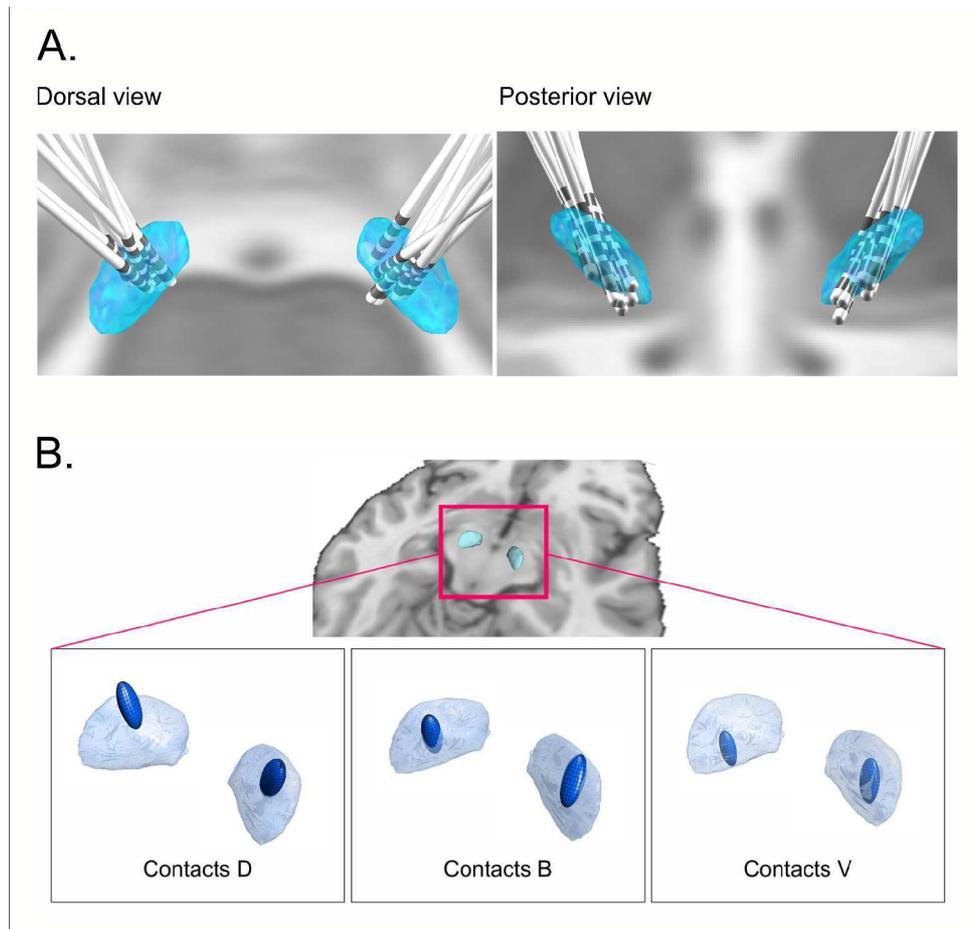


Figure 2. Localisation of contacts in relation to the STN. Contacts coordinates were non-linearly registered to the MNI standard space, and superimposed to a STN 3D representation of the Morel stereotactic atlas (Krauth et al., 2010). A. 3D rendering of all leads post-operative position from a dorsal (left panel) and posterior (right) view. B. Distribution model (coordinates average and covariance) of contacts in relation to the source of the beta oscillation. Contacts most close (Contacts B, middle panel) lie in the dorso-lateral STN while neighbouring dorsal contacts (contacts D, left panel) are more frequently outside the nucleus. Contacts lying immediately beneath contacts B are closer to its inferior border (contacts V, right panel).

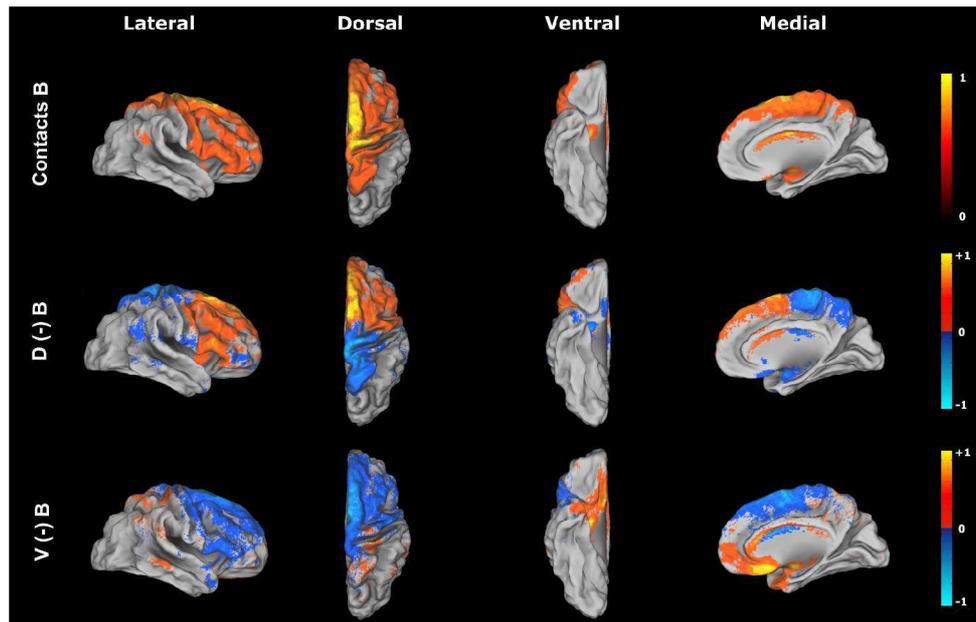


Figure 3. Probabilistic diffusion tractography from STN macroelectrode contacts. First row. Connectivity profile of contacts closest to source of beta oscillations (contacts B). Regions with highest connectivity (yellow) include precentral gyrus and superior frontal gyrus. Lower connectivity values were found for prefrontal cortex and medial temporal regions. Second row. Normalised difference of connectivity values: contacts dorsal to beta minus contacts closest to beta source (D (-) B). Third row. Contacts ventral to beta minus contacts closest to beta source (V (-) B). More dorsal contacts show higher connectivity to prefrontal associative regions, while most ventral contacts have higher connectivity to medial temporal and orbitofrontal regions

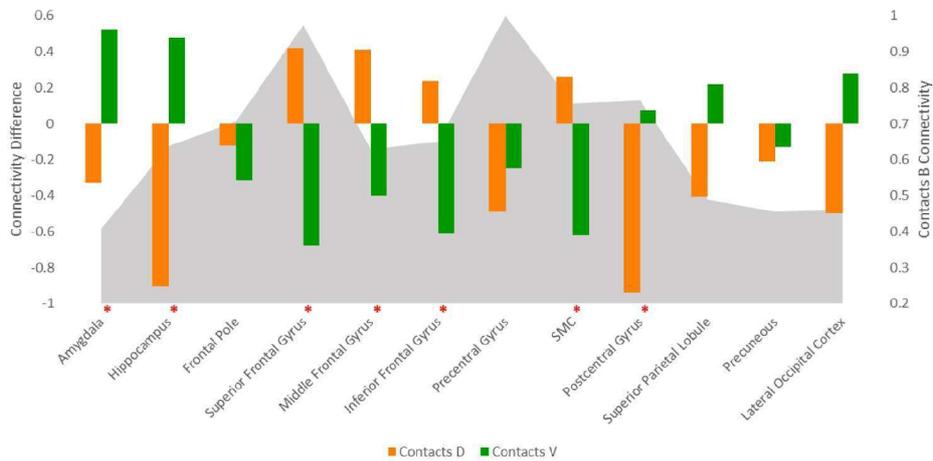


Figure 4. Kruskal–Wallis test showing a significant (\*) effect of localisation for connectivity to cortical targets surviving threshold (see Methods section). Columns represent normalised difference of connectivity values between (a) contacts dorsal to beta (D, orange) and contacts closest to beta source: D-source; and (b) contacts ventral (V, green) to beta and contacts closest to beta source: V- source. Connectivity to amygdala and hippocampus increases towards more ventral contacts, whereas more dorsal contacts show increased connectivity to prefrontal cortex (superior, middle and inferior frontal gyrus) and supplementary motor cortex (SMC), and decreased connectivity to postcentral gyrus. Significance is set at  $p < p_{th} = 0.01$ , after control of FDR at level  $q = 0.05$ . On the background, connectivity of beta contacts is represented by the shaded grey area (right y axis).

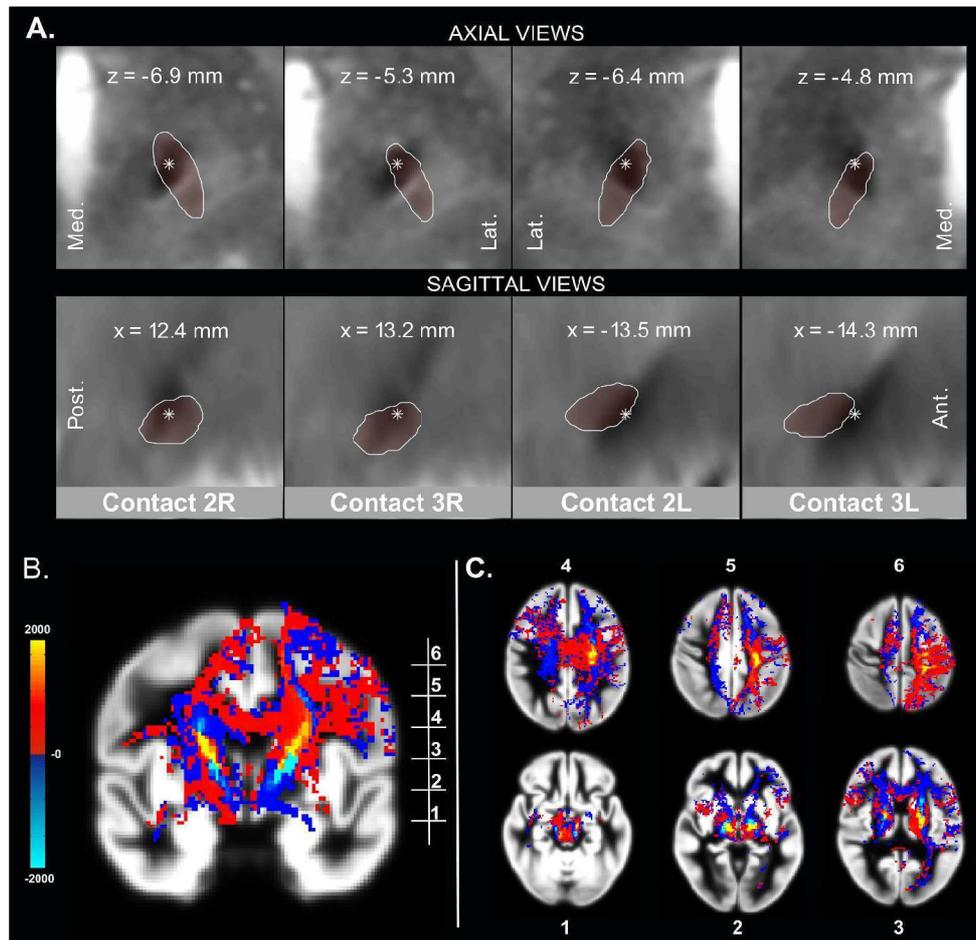


Figure 5. Imaging data relative to the case patient (#5). This subject had a significant motor improvement after stimulation from contacts 2 (right and left), but developed manic behaviour and restlessness. After shifting more dorsally (contacts 3 bilaterally) motor benefit was maintained, and psychiatric manifestations relieved. A. MNI localisation of stimulating contacts, superimposed to the STN atlas (in purple, from Morel et al.). First row: axial view, with z coordinates specifying the section level (vertical axis). Second row: sagittal view, with x coordinates (right to left axis). Contacts eliciting hypomanic manifestations (2L and 2R) are located in a more anterior and ventral position within the nucleus. B. Voxelwise, whole brain connectivity difference between contacts 2 and 3 (both sides computed separately) are shown (coronal view). In blue/light-blue voxels with higher connectivity to ventral contacts (contacts 2 vs contacts 3). In orange/red voxels with higher connectivity to dorsal contacts (contacts 3). Values represent the difference of number of tracts passing from each voxel. C. Transversal sections at different z coordinates. Ventral contacts have higher connectivity to medial temporal structures, including amygdala, while more dorsal contacts have higher connectivity values to primary motor areas (particularly on the right side). Clinical effects were not tested separately for each side.