# Network Mapping of Connectivity Alterations in Disorder of Consciousness: Towards Targeted Neuromodulation

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#### Methods

#### Figure

Supplementary Figure S1

#### **Realistic Biophysical Head Model**

The realistic head model used in this study was built from a structural T1-weighted MRI of the Colin27 single-subject template (http://brainweb.bic.mni.mcgill.ca/brainweb) (Figure S1- a1). The 1 mm × 1mm × 1 mm resolution image was segmented into the main head tissues classes (Figure S1a2) by using free software: the white-matter (WM) and grey-matter (GM) segmentations were obtained with FreeSurfer (https://surfer.nmr.mgh.harvard.edu), whereas cerebrospinal fluid (CSF), air filled sinuses, skull and scalp masks were obtained with MARS (Huang et al., 2013). The binary masks were combined into one 3D volume (Figure S1-a4) using custom Matlab scripts (r2018a, with Image Processing Toolbox and Iso2Mesh (Fang & Boas, 2009), which ensured that each tissue was surrounded by at least a 1 mm layer of another tissue and generated surfaces of all the tissues (Figure S1-a3). Sixty-four cylinders (1 cm radius 3 mm thickness) representing gelled PISTIM Ag/AgCl electrodes were placed in the scalp positions defined by the 10/10 EEG system, upon manual identification of the four fiducials (nasion, inion, left/right preauricular point) on the T1 image. The finite element volume mesh of the full head with electrodes (Figure S1-a5) was created using Iso2Mesh (Fang & Boas, 2009). The mesh comprised about 4.3 million tetrahedra. The mesh was then imported into Comsol (v5.3a) (http://www.comsol.com), where the tissues were assigned appropriate isotropic conductivities for the DC-low frequency range: 0.33, 0.008, 1.79, 0.40, 0.15 and 10<sup>-5</sup> S/m respectively for the scalp, skull, CSF, GM, WM and air (Miranda, Mekonnen, Salvador, & Ruffini, 2013). The electrodes were represented as isotropic homogeneous conductive media with conductivity of 4.0 S/m. Laplace's equation was solved for the electrostatic potential (V) using Lagrange second order finite elements. As boundary condition, floating potential was imposed at the surface of the electrodes, to ensure a constant current injection.

The electric field (E-field) was obtained by taking the negative gradient of the potential. The E-field normal to the GM surface (E<sub>n</sub>) was calculated for all the bipolar

montages having Cz as a common cathode (-1 mA) and each of the other electrodes as the anode (+1 mA). These results were used as the input to the optimization algorithm (Ruffini, Fox, Ripolles, Miranda, & Pascual-Leone, 2014), since the distribution of  $E_n$  for any montage involving these electrodes can be calculated as a linear combination of the bipolar unit-current  $E_n$  distributions multiplied by the electrode's current.

### Montage Optimization

Montage optimizations (Figure S1-c) were performed using the Stimweaver algorithm, as described in Ruffini et al. (2014). Under the assumption of the lambda-E-model (Ruffini et al., 2013) for the interaction of the E-field with the neurons, the algorithm optimizes for the E<sub>n</sub> component of the E-field. Positive/negative E<sub>n</sub> values, directed towards/out-of the cortical surface, depolarize/hyperpolarize dendrites, soma and the axon terminal of pyramidal cells, thus modulating excitation.

The best montage is found by minimizing the least squares difference between the weighted target  $E_n$ -map (as defined in the next section) and the weighted  $E_n$ -field distribution induced by the montage, which defines the objective function. Minimization is constrained by safety limits for the currents (maximum current per electrode of 2mA, and maximum total injected current of 4mA), and by the maximum number of stimulation electrodes in the device (N = 8 here). The last condition is imposed by using a genetic algorithm that searches in electrode space for the constrained solution that better approximates the optimization objective function, as described in Ruffini et al. (2014).

#### **Functional Connectivity Target Map**

Functional connectivity volume images were converted into target networks for the optimization algorithm following a procedure already (Fischer et al., 2017) applied to the motor cortex network. These steps are briefly outlined here for completeness.

The FC correlation coefficient values *r* in the image (Figure S1-b1) are mapped onto the cortical surface of the reference brain (http://brainweb.bic.mni.mcgill.ca/brainweb), after registration to a common space (Figure S1-b2) (MNI).

Since we aim at promoting the activation (excitation) of the positively correlated areas and the inhibition of negatively correlated ones, regions with positive *r* were assigned positive target electric field  $E_n^{Target} = 0.25$  V/m (excitatory), while regions with negative *r* were assigned to negative  $E_n^{Target} = -0.25$  V/m (inhibitory).

The weighted target network for the optimization (Figure S1-b3) is created by applying different thresholds to ignore low and emphasize high correlation, and by linearly rescaling the *r*-values into absolute weights *w* (from 0 to 10). Note that, in order to reflect the correlation strength, the positive and negative *r*-values are saturated to different absolute maximum and minimum weights ( $|w_{max}|$ ,  $|w_{min}|$ ), with the higher between the two assigned to the regions with higher maximum absolute correlation |r|.



Figure 1. Biophysical head model, target map and multichannel tES optimized montages for stimulation of the motor cortex.

**Biophysical Fem Model (a1–a5):** the structural T1-weighted MRI (a1) of the template head (http://brainweb.bic.mni.mcgill.ca/brainweb) was segmented (a2) into the main tissue classes (scalp, skull, CSF and ventricles, grey matter, white matter); 3D surfaces of the tissues (a3) were created from the segmented volumes images and assembled into one head volume, where 64 1 cm-radius PISTIM

electrodes were placed on the scalp according the 10-10 EEG system (a4). The tissues were assigned conductivity in the DC regime (scalp = 0.33 S/m, skull = 0.008 S/m, CSF and ventricles = 1.79 S/m, GM = 0.4 S/M, WM = 0.13 S/m), and head model was meshed (a5) to calculate with finite elements the electric field induced on the cortex.

**Target Map (b1–b3):** the 3D image of the functional connectivity correlation (b1–in this example, the motor cortex network from Fisher et al., 2017) was remapped onto the cortical surface of the template brain (b2), and converted into a weighted target network (b3) by linearly rescale and saturation of the values (the values in the scale are multiplied by the sign of  $E_n^{Target}$  to display excitatory/positive and inhibitory/negative areas).

**Montage Optimization (c1):** normal electric field (V/m) induced on the cortex of the reference head model by the best multielectrode solution targeting the map in (b3), as determined by the optimization algorithm (Ruffini et al., 2014). For this example, the solution involves 7 electrodes, delivering a total maximum current 4mA. Anodes are shown in red, cathodes in blue; arrows represent current density.

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