Supplementary information: Optimal Stimulation Sites and Networks for Deep Brain Stimulation of the Fornix in Alzheimer's Disease

Ana Sofía Ríos¹, Simón Oxenford¹, Clemens Neudorfer¹, Konstantin Butenko¹, Ningfei Li¹, Nanditha Rajamani¹, Alexandre Boutet^{2,3,4}, Gavin J.B. Elias^{2,3}, Jurgen Germann^{2,3}, Aaron Loh^{2,3}, Wissam Deeb^{5,6}, Fuyixue Wang^{7,8}, Kawin Setsompop^{7,8,9}, Bryan Salvato¹⁰, Leonardo Almeida¹¹, Kelly D. Foote¹¹, Robert Amaral¹², Paul B. Rosenberg¹³, David F. Tang-Wai^{14,3}, David A. Wolk¹⁵, Anna D. Burke¹⁶, Stephen Salloway^{17,18}, Marwan N. Sabbagh¹⁶, M. Mallar Chakravarty^{12,19,20}, Gwenn S. Smith¹³, Constantine G. Lyketsos¹³, Michael S. Okun¹¹, William S. Anderson²¹, Zoltan Mari^{21,22}, Francisco A. Ponce¹⁶, Andres M. Lozano^{2,3}, Andreas Horn*1,23,24

Affiliations

- 1. Movement Disorder and Neuromodulation Unit, Department of Neurology, Charité – Universitätsmedizin Berlin, corporate member of Freie Universität Berlin and Humboldt-Universität zu Berlin, Berlin, Germany.
- 2. Division of Neurosurgery, Department of Surgery, University Health Network and University of Toronto, Toronto, M5T2S8, Canada
- 3. Krembil Research Institute, University of Toronto, Toronto, M5T2S8, Canada
- 4. Joint Department of Medical Imaging, University of Toronto, Toronto, M5T1W7, Canada
- 5. UMass Chan Medical School, Department of Neurology, Worcester, MA 01655
- 6. UMass Memorial Health, Department of Neurology, Worcester, MA 01655
- 7. Athinoula A. Martinos Center for Biomedical Imaging, Department of Radiology, Harvard Medical School, Massachusetts General Hospital, Charlestown, MA, USA
- 8. Harvard-MIT Health Sciences and Technology, MIT, Cambridge, MA, USA
- 9. Department of Radiology, Stanford University, CA, USA
- 10. University of Florida Health Jacksonville, Jacksonville, FL, USA
- 11. Norman Fixel Institute for Neurological Diseases, Departments of Neurology and Neurosurgery, University of Florida, Gainesville, FL
- 12. Cerebral Imaging Centre, Douglas Research Centre, Montreal QC, Canada
- 13. Department of Psychiatry and Behavioral Sciences and Richman Family Precision Medicine Center of Excellence, School of Medicine, Johns Hopkins University, Baltimore, MD, USA
- 14. Department of Medicine, Division of Neurology, University Health Network and University of Toronto, Toronto, M5T2S8, Canada
- 15. Department of Neurology, University of Pennsylvania, Philadelphia, PA, USA
- 16. Barrow Neurological Institute, Phoenix, AZ
- 17. Department of Psychiatry and Human Behavior and Neurology, Alpert Medical School of Brown University, Providence, RI, USA
- 18. Memory & Aging Program, Butler Hospital, Providence, USA
- 19. Department of Psychiatry, McGill University, Montreal, QC, Canada
- 20. Biological and Biomedical Engineering, McGill University, Montreal, QC, Canada
- 21. Johns Hopkins School of Medicine, Baltimore, MD, USA
- 22. Cleveland Clinic Lou Ruvo Center for Brain Health, Las Vegas, NV, USA
- 23. Center for Brain Circuit Therapeutics, Department of Neurology, Brigham and Women's Hospital, MA, USA
- 24. Departments of Neurology and Neurosurgery, Massachusetts General Hospital, MA, USA

*** Corresponding Author**

Andreas Horn, MD, PhD

Associate Professor of Neurology, Center for Brain Circuit Therapeutics, Department of Neurology, Brigham and Women's Hospital, MA, USA. E-mail: ahorn1@bhw.harvard.edu

Keywords

Alzheimer's disease (AD), Deep Brain Stimulation (DBS), Fornix, Connectome, Structural Connectivity, Network mapping

Supplementary Table 1. Inclusion/exclusion criteria of Toronto-based pilot clinical trial (NCT00658125).

*See McKhann G, Drachman D, Folstein M, et al. Clinical diagnosis of Alzheimer's disease: report of the NINCDS-ADRDA Work Group under the auspices of Department of Health and Human Services Task Force on Alzheimer's Disease. Neurology 1983;34: 939–944.

Supplementary Table 2. Inclusion/exclusion criteria of ADvance multi-centre trial (NCT0160806).

Supplementary Table 3. Demographic and clinical data of the patients included. Clinical outcomes measured by Alzheimer's Disease Assessment Scale 11 – cognitive subscale (ADAS-cog 11). Absolute change calculated subtracting 12-month ADAS-cog 11 value from Baseline ADAS-cog 11. Relative change calculated by dividing absolute changes by pre-operatory score and multiplying by 100.

Normative Connectomes: Underlying Data

Supplementary Table 4. Specification of normative connectome data. Abbreviations: TR = Repetition time, TE = Echo time, FOV = Field of view, BOLD = Blood oxygenation level-dependent, EPI = Gradient-echo echo-planar imaging, FA = Flip angle

Final model parameters of DBS fiber filtering

During the training phase of model optimization in the DBS fiber filtering analysis, a variety of parameters were tested with the aim to create a tract-set that was i) robustly predictive during cross-validation within the training set (leave-one-out and several k-fold strategies were interactively tested) and ii) was *not robust* to permutations of improvement data (also see fig. 4). The following set of parameters were finally selected and used to cross-predict outcomes in the test-cohort.

Supplementary Table 5. Model parameters available in the DBS fiber filtering tool implemented in Lead-DBS, their units, range, and selected value, as well as a brief explanation of what the parameter means.

Sweetspot Coordinates

Supplementary Table 6. Probabilistic Stimulation Mapping peak and center coordinates in non-mirrored and mirrored data.

46 patients with ADAS-cog 11 scores and MRI imaging included for analysis

Supplementary Figure 1. Flowchart summarizing patient inclusion for this work.

Supplementary Figure 2. Electrode localizations. a) Sagittal and b) coronal view showing solid electrodes of the 46 patients included in this study, classified by outcome group (blue-poor responders, yellow-middle responders, pink-top-responders), active contacts highlighted with red superimposed on slices of a brain cytoarchitecture atlas in MNI 152 space*4*. Fornix informed by the CoBrALab Atlas 5.

Supplementary Figure 3. In-fold analysis from fiber filtering analysis on Training cohort (N = 28) showing absolute predicted error, root mean square deviation (RMS) and median absolute error (MAE) for each of the validation approaches. The boxplot displays the interquartile range in the box with the median percentual absolute predicted error as a vertical line, whiskers extend to 1.5 times the interquartile range, outlier points outside of this range are plotted. LOO: Leave one out.

Supplementary Figure 4. Fiber tracts associated with optimal clinical response superimposed on slices of a 100-µm, 7T brain scan in MNI 152 space. From a set of 5 million fiber tracts sampled from a high-resolution connectome, the ones preferably modulated by top-responding (and not by poor-responding) patients were selected using the DBS fiber filtering method and visualized. The process was repeated on the training-cohort $(N = 28)$ (a), the test-cohort $(N = 18)$ (b), and both cohorts combined $(N = 46)$ (c). Fiber tracts are color-coded by the resulting Spearman's rank correlation coefficients (R-values) which shows how strongly modulating each bundle correlated with clinical response across patients. d) Results from panel c superimposed on atlas structures forming part of the circuit of Papez, also visualized by dotted arrows. e) Lateral and top views of fibertract superimposed with structures of interest, white arrow indicates intersection of streamlines of the fornix and the anterior commissure that could give the illusion of a loop on lateral projection views. 1. Hipp: Hippocampus, 2. Fx: Fornix, 3. MB: mamillary bodies, 4. MMT: mamillothalamic tract, 5. Thal: thalamus, 6. Cg: Cingulate gyrus, 7. Cingulum and 8. Parahipp: Parahippocampal gyrus, BNST: bed nucleus of the stria terminalis. The backdrop features an ultra-high resolution (100 μ m) template of the human brain⁶. Structures: Fornix (blue-green), Hippocampus (pink), Thalamus(blue) informed by the CoBrALab Atlas⁵, Bed nucleus of the stria terminalis (light brown) informed by the Atlas of the Human Hypothalamus⁷.

Supplementary Figure 5. Random permutation results. Example results when repeating the DBS fiber filtering method after randomly permuting clinical improvement values across patients ($N = 46$). This process was performed to demonstrate that tract results do not merely reflect average connectivity of the group of DBS electrodes but are highly informed by improvement values. For instance, the result on the top left highlights a connection to the brainstem, the one in the top middle the stria terminalis and the one on the bottom middle and right panels the anterior commissure. The backdrop features an ultra-high resolution (100 μ m) template of the human brain6

Supplementary Figure 6. Close up view of positive sweetspot cluster center coordinate at the junction between fornix and bed nucleus of stria terminalis (BNST). Fx: Fornix, AC: Anterior Commissure. The backdrop features an ultra-high resolution (100 μ m) template of the human brain⁶

Supplementary Figure 7. In-fold analysis from summary showing absolute predicted error, root mean square deviation (RMS) and median absolute error (MAE) for each of the validation approaches followed on fiber filtering (a), sweetspot (b) and network mapping (c) methods in the entire cohort $(N = 46)$. The boxplot displays the interquartile range in the box with the median percentual absolute predicted error as a vertical line, whiskers extend to 1.5 times the interquartile range, outlier points outside of this range are plotted. LOO: Leave one out.

Supplementary Figure 8. Results summary including sweetspot, tract- and network-level models calculated with absolute ADAS-cog 11 outcomes. Three levels of analysis led to mostly significant predictions of clinical outcomes across leave-one-patient-out (LOO) and multiple k-fold designs, plots show the fitting of a linear model representing the degree to which, stimulating voxels (left), functional regions (top-right) and tracts (bottom-right) explains variance in clinical outcomes across the 46 patients using Spearman correlation, gray shaded areas represent 95% confidence intervals. Three level analysis results were superimposed on slices of a brain cytoarchitecture atlas in MNI 152 space*4*. RMS: Root mean square deviation, MAE: Median absolute error.

Supplementary Figure 9. Results summary including sweetspot, tract- and network-level models calculated with ADAS-cog 13 outcomes (available for ADvance trial patients, $N = 40$). Three levels of analysis led to mostly significant predictions of clinical outcomes across leave-one-patient-out (LOO) and multiple k-fold designs, plots show the fitting of a linear model representing the degree to which stimulating voxels (left), functional regions (top-right) and tracts (bottom-right) explains variance in clinical outcomes across the 40 patients using Spearman correlation, gray shaded areas represent 95% confidence intervals. Three level analysis results were superimposed on slices of a brain cytoarchitecture atlas in MNI 152 space*4*. RMS: Root mean square deviation, MAE: Median absolute error.

Supplementary Figure 10. Effects of Age. a) Axial, coronal, and sagittal overlay of maps created from stimulation volumes of subjects older than 65 years (left), younger than 65 years (middle) and whole cohort (right), color bar representing amount of overlapping stimulation volumes. b) Fiberscores obtained through DBS fiber filtering analysis explained in Methods and Results sections, by the stimulation volumes of younger than 65-year-old patients (top, $N = 15$), and patients 65-year-old or older (bottom, $N = 31$), $p(T-test) = 0.790$. The model used to estimate these scores was calculated in a leave-one-patient out design across the entire cohort. The boxplot displays the interquartile range in the box with the mean fiberscore as a vertical line, whiskers extend to 1.5 times the interquartile range, outlier points outside of this range are plotted. The backdrop features an ultra-high resolution (100 μ m) template of the human brain⁶

Supplementary Methods

Narrative section of methods / predictive models:

In all three models, each patient contributed their relative improvement of ADAS-cog-11 scores (before surgery, one year after surgery).

Beyond that, each model (i) tracts, ii) sweetspots and iii) functional networks) was run independently from one another.

- i) For tracts, each patient contributed the peak E-field amplitude that each tract of the normative connectome was modulated by.
- ii) For sweetspots, each patient contributed the modeled electric field in MNI space (represented as a NIfTI volume).
- iii) For functional networks, each patient contributed a (normative) rs-fMRI map seeding from the individual patient ("connectivity fingerprints").

Then, the three models created a i) combination of tracts ii) optimal target (sweetspot), and iii) functional network profile associated with optimal clinical improvements.

- i) For tracts, this was achieved by rank correlating the modulation amplitude imposed on each tract with clinical improvements across the set of patients. This led to an R-value for each tract, denoting how well its modulation correlated with clinical improvements (the concept was introduced in Irmen et al. 2019 Annals of Neurology).
- ii) For sweetspots, this was achieved by rank correlating each voxel with clinical outcomes across the set of patients. This led to an R-map denoting how well modulations of specific voxels correlated with clinical outcomes (the concept was introduced in Horn et al. 2022 PNAS).
- iii) For functional networks, this was achieved by correlating the voxel values of connectivity fingerprints with clinical improvements across the set of patients. This led to an R-map denoting how well connectivity estimates between stimulation sites and each voxel in the brain correlated with clinical outcomes (the concept was introduced in Horn et al. 2017 Annals of Neurology).

Finally, data was cross-validated within the three models:

- i) For tracts, this was achieved by rank correlating the impacts of the E-Fields of an unseen patient on all tracts and their R-values This led to a fiberscore denoting how specifically an unseen E-Field modulated tracts associated with optimal outcomes (the concept was introduced in Horn et al. 2022 PNAS).
- ii) For sweetspots, this was achieved by spatially correlating the E-Fields of an unseen patient with the R-map model. This led to a sweetspot score denoting correlation coefficients of agreement between the actual stimulation field and an "optimal" stimulation field (represented by the R-map; the concept was introduced in Horn et al. 2022 PNAS).
- iii) For functional networks, this was achieved by spatially correlating the functional connectivity fingerprints with the R-map model. This led to a network score denoting correlation coefficients of agreement between the actual network profile and an optimal network profile (represented by the R-map; the concept was introduced in Horn et al. 2017 Annals of Neurology).

Data Availability

Anonymized derivatives of stimulation data used for the described analyses are openly available on OSF (https://osf.io/bckuf). The resulting tract atlas, sweet spot and fMRI network pattern are openly available within Lead-DBS software (www.lead-dbs.org).

Normative data:

Structural connectome: https://datadryad.org/stash/dataset/doi:10.5061/dryad.nzs7h44q2

Functional connectome:

https://dataverse.harvard.edu/dataset.xhtml?persistentId=doi:10.7910/DVN/25833

Neurosynth database: https://github.com/neurosynth/neurosynth-data

Code availability

All code used to analyze the dataset is openly available within Lead-DBS/-Connectome software (https://github.com/leaddbs/leaddbs). Code to reproduce main results and figures is openly available on OSF (https://osf.io/bckuf).

Supplementary References

- 1. Wang, F. *et al.* In vivo human whole-brain Connectom diffusion MRI dataset at 760 µm isotropic resolution. *Sci. Data* **8**, 122 (2021).
- 2. Bt, Y. *et al.* The organization of the human cerebral cortex estimated by intrinsic functional connectivity. *J. Neurophysiol.* **106**, (2011).
- 3. Holmes, A. J. *et al.* Brain Genomics Superstruct Project initial data release with structural, functional, and behavioral measures. *Sci. Data* **2**, 150031 (2015).
- 4. Amunts, K., Mohlberg, H., Bludau, S. & Zilles, K. Julich-Brain: A 3D probabilistic atlas of the human brain's cytoarchitecture. *Science* **369**, 988–992 (2020).
- 5. Amaral, R. S. C. *et al.* Manual segmentation of the fornix, fimbria, and alveus on highresolution 3T MRI: Application via fully-automated mapping of the human memory circuit white and grey matter in healthy and pathological aging. *Neuroimage* **170**, 132– 150 (2018).
- 6. Edlow, B. L. *et al.* 7 Tesla MRI of the ex vivo human brain at 100 micron resolution. *Sci. Data* **6**, 244 (2019).
- 7. Neudorfer, C. *et al.* A high-resolution in vivo magnetic resonance imaging atlas of the human hypothalamic region. *Sci. Data* **7**, 305 (2020).