_	
1	Short Communication
2	
3	Optimizing the Accuracy of Cortical Volumetric Analysis in Traumatic Brain Injury
4	
5	Bram R. Diamond, ^{1,2} Christine L. Mac Donald, ³ Samuel B. Snider, ¹
6	Bruce Fischl, ² Kristen Dams-O'Connor, ^{4,5} * Brian L. Edlow ^{1,2} *
7	
8	* co-senior authors
9	
10	¹ Center for Neurotechnology and Neurorecovery, Department of Neurology, Massachusetts General Hospital and
11	Harvard Medical School, Boston, MA.
12	² Athinoula A. Martinos Center for Biomedical Imaging, Department of Radiology, Massachusetts General Hospital
13	and Harvard Medical School, Charlestown, MA.
14	³ Department of Neurological Surgery, University of Washington, Seattle, WA.
15	⁴ Department of Rehabilitation Medicine, Icahn School of Medicine at Mount Sinai, New York, NY.
16	⁵ Department of Neurology, Icahn School of Medicine at Mount Sinai, New York, NY.
17	
18 19	Correspondence to: Kristen Dams-O'Connor, Ph.D.
20	Email: kristen.dams-o'connor@mountsinai.org
20	Eman. Kristen.dams-o connor@mountsmai.org
22	Word Count: 2,039
23	Figures: 2
24	Supplementary Material: Supplementary Methods, 2 Supplementary Figures, 4 Supplementary Tables, 3 Videos
25	
26	Keywords : traumatic brain injury, contusion, MRI, FreeSurfer, neurodegeneration
27	
28	

29 Author Contact Information

30

Bram R. Diamond: <u>brdiamond@mgh.harvard.edu</u>, Phone (617) 726-4050, Fax: (617) 726-7422, address:

- 32 Athinoula A. Martinos Center for Biomedical Imaging, 149 Thirteenth Street, Charlestown, MA 02129.
- 33
- Christine L. Mac Donald: <u>cmacd@uw.edu</u>, Phone: (206) 897-4047, Fax: (206) 744-9942, address:
- University of Washington School of Medicine, Department of Neurological Surgery, 325 9th Ave, Box
 359924, Seattle, WA 98104.
- 38 Samuel B. Snider: ssnider@partners.org, Phone: (617) 724-6352, Fax: (617) 643-3939, address:
- 39 Massachusetts General Hospital, 175 Cambridge St Suite 300, Boston, MA 02114.
- 40

37

- 41 Bruce Fischl: <u>fischl@nmr.mgh.harvard.edu</u>, Phone: (617) 726-3197, Fax: (617) 726 -7422, address:
- 42 Athinoula A. Martinos Center for Biomedical Imaging, 149 13th Street, Charlestown, MA 02129.
- 43
- 44 Kristen Dams-O'Connor: kristen.dams-o'connor@mountsinai.org, Phone: (212) 241-7587, Fax: (212)
- 45 241-0137, address: Brain Injury Research Center, Department of Rehabilitation Medicine, Department of
- 46 Neurology, Box 1163, One Gustave L. Levy Place, New York, NY 10029.
- 47
- 48 Brian L. Edlow: <u>bedlow@mgh.harvard.edu</u>, Phone: (617) 724-6352, Fax: (617) 643-3939, address:
- 49 Massachusetts General Hospital, 175 Cambridge St Suite 300, Boston, MA 02114.

50 Abstract

Cortical volumetric analysis is widely used to study the anatomic basis of neurological deficits in 51 patients with traumatic brain injury (TBI). However, patients with TBI-related lesions are often 52 53 excluded from analysis, because cortical lesions may compromise the accuracy of reconstructed 54 surfaces upon which volumetric measurements are based. Here, we propose a novel FreeSurfer-55 based lesion correction method and illustrate its impact on cortical volume measures in patients 56 with chronic moderate-to-severe TBI. We performed MRI in 87 patients at mean+/-SD 10.9+/-9.1 years post-injury using a T1-weighted multi-echo MPRAGE sequence at 1 mm resolution. 57 58 Following surface reconstruction, we parcellated the cerebral cortex into seven functional 59 networks using FreeSurfer's standard pipeline. Next, we manually labeled vertices on the cortical 60 surface where lesions caused inaccuracies and removed them from network-based cortical volumetric measures. After performing this lesion correction procedure, we measured the surface 61 area of lesion overlap with each network and the percent volume of each network affected by 62 lesions. We identified 120 lesions that caused inaccuracies in the cortical surface in 46 patients. 63 64 In these 46 patients, the most commonly lesioned networks were the limbic and default mode 65 networks (95.7% each), followed by the executive control (78.3%), and salience (71.7%) networks. The limbic network had the largest average surface area of lesion overlap (4.4+/-3.7%) 66 67 and the largest percent volume affected by lesions (12.7+/-9.7%). The lesion correction method has the potential to improve the accuracy of cortical volumetric measurements and permit 68 inclusion of patients with lesioned brains in quantitative analyses, providing new opportunities to 69 70 elucidate network-based mechanisms of neurological deficits in patients with TBI.

71 Introduction

Cortical volumetric analysis with FreeSurfer^{1, 2} is widely used to study the neuroanatomic 72 basis of cognitive, behavioral, and motor deficits in patients with traumatic brain injury (TBI).³⁻⁶ 73 74 However, cortical lesions caused by TBI pose major challenges to FreeSurfer's standard automated magnetic resonance imaging (MRI) processing pipeline. Lesions often compromise 75 76 the accuracy of the cortical surfaces that are reconstructed and used by FreeSurfer to generate volumetric measurements.^{4, 6, 7} As a result, TBI imaging studies have historically excluded 77 patients with large focal lesions.^{5, 8} Development of a tool that accounts for lesions in cortical 78 volumetric analysis is needed to prevent the systematic exclusion of patients with large cortical 79 80 lesions and to ensure that TBI imaging studies are generalizable across the full spectrum of cortical pathology. Moreover, integration of such a tool into the FreeSurfer software platform 81 would create new opportunities to study network-based mechanisms of disease^{9, 10} using 82 canonical atlases.¹¹ 83

Here, we propose a novel FreeSurfer-based lesion correction method and illustrate its 84 85 impact on cortical volumetric measures in patients with chronic TBI. The lesion correction method differs in several ways from the standard FreeSurfer approach to editing reconstructed 86 cortical surfaces. Standard cortical segmentation using FreeSurfer relies on the assumption that 87 88 the brain has normal anatomy and that any surface inaccuracies are related to the FreeSurfer processing pipeline. However, in patients with cortical lesions caused by TBI, FreeSurfer's 89 90 reconstruction of the cortical surface can be grossly inaccurate due to focal encephalomalacia 91 and distorted anatomy. This methodological limitation of the standard FreeSurfer editing approach is the main motivation for the lesion correction method proposed here. The new 92

93 method makes no assumptions about lesioned cortical surface anatomy, and it minimizes bias by 94 requiring the manual rater simply to identify inaccuracies without changing the surfaces. In this 95 study, we use the lesion correction method to assess the topology of lesion overlap with 96 functional brain networks and to characterize inter-network differences in lesion burden. We 97 also distribute the lesion correction method to the academic community to facilitate future 98 studies of network-based mechanisms of neurological deficits in patients with TBI.

99

100 Methods

101 *Patients*

Between May, 2014 and January, 2019, we prospectively enrolled 141 patients with a history of TBI at two academic medical centers as part of the Late Effects of TBI (LETBI) study.¹² Patients were included if they had sustained a moderate-to-severe TBI at least one year prior to enrollment. We characterized TBI severity based on the United States Department of Defense classification system,¹³ as detailed in the Supplementary Material. Of the 141 enrolled participants, 98 completed an MRI scan (see CONSORT diagram in Supplementary Fig. S1).

109 MRI data acquisition

110 Patients at Mount Sinai were scanned using a Siemens Skyra (Siemens Medical Solutions,

111 Erlangen, Germany) 3 Tesla (T) MRI scanner with a 32-channel head coil for signal reception,

and patients at University of Washington were scanned using a Philips Achieva 3T MRI scanner

113 with a 32-channel head coil.¹ Patients underwent standardized MRI using a T1-weighted multi-

echo MPRAGE (MEMPRAGE)¹⁴ sequence with 1mm isotropic voxels. All LETBI sequences
 5

- 115 were designed to maximize consistency with the National Institutes of Health Common Data
- 116 Elements for TBI Neuroimaging.¹⁵
- 117
- 118 MRI processing
- 119 We first processed all MEMPRAGE data using the standard FreeSurfer pipeline (version 6.0) for
- 120 cortical surface reconstruction and cortical volume estimation.¹ We used the "big ventricles"
- 121 function to optimize automatic segmentation for a patient population with enlarged ventricles. In
- accordance with FreeSurfer recommended best practices
- 123 (<u>https://surfer.nmr.mgh.harvard.edu/fswiki/FsTutorial/TroubleshootingDataV6.0</u>), we visually
- inspected output files, made manual edits to the white matter segmentation, and added control
- points. To ensure that the lesion correction method would be tested in an unbiased manner, we
- did not manually edit regions bordering cortical lesions. We then resampled the Yeo 7-Network
- resting-state functional connectivity atlas¹¹ onto each patient's reconstructed cortical surface
- 128 using FreeSurfer's surface-based registration tool
- 129 (https://surfer.nmr.mgh.harvard.edu/fswiki/mri_surf2surf).¹⁶
- 130
- 131 *Quality Assessments*
- 132 We performed visual quality assessment for all 98 scans based upon delineation of grey-white
- 133 matter boundaries and the accuracy of the FreeSurfer-generated surfaces. We defined scan
- quality using an integer scale: 0 = scan excluded because FreeSurfer failed to complete the
- processing pipeline; 1 = scan excluded because surface inaccuracies would have required major
- manual edits; 2 = scan included because only minor manual edits required; 3 = scan included 6

137	without requiring manual edits. For any scan that received a score of 1 by the primary rater
138	(B.R.D.), a second rater (B.L.E.) reviewed the scan to achieve consensus. Our primary method
139	for determining scan inclusion was qualitative visual assessment because inaccurate FreeSurfer-
140	based segmentations can confound quantitative measurements. Nevertheless, we performed
141	quantitative assessments of signal-to-noise ratio (SNR) and contrast-to-noise ratio (CNR) and
142	tested for correlations with visual assessments of scan quality, as detailed in the Supplementary
143	Materials.
144	
145	Lesion identification and classification
146	We next assessed each MRI scan for focal lesions causing encephalomalacia of the cerebral
147	cortex (Fig. 1, top row). ¹⁵ All such lesions were considered for subsequent lesion correction
148	analysis and classified according to the cortical network(s) with which they overlapped. To
149	ensure robust and reproducible methods for lesion identification, we performed an inter-rater
150	reliability analysis among three investigators who identified lesions in a randomly selected group
151	of 20 MRI scans and calculated lesion volumes using the standard ABC/2 method. ¹⁷ Two
152	investigators were board-certified neurologists with fellowship training in Neurocritical Care
153	(B.L.E. and S.B.S.) and one was a research technician (B.R.D.).

154

155 Implementation of the lesion correction procedure

156 A detailed description of the methodological principles of the lesion correction procedure is

157 provided in the Supplementary Material. To implement the procedure, we visually identified

sites where FreeSurfer's modeled surface mesh erroneously passed through subcortical tissue7

159	(Fig. 1, top row). Next, we manually labeled these surface-points to produce lesion-induced
160	inaccuracy labels (Fig. 1, middle row). Finally, we applied these labels as exclusion masks to
161	remove affected surface regions and calculate corrected cortical volumes (Fig. 1, bottom row).
162	After performing this lesion correction procedure, we used standard FreeSurfer tools to
163	measure the average surface area overlap of lesion-induced inaccuracies with each network of
164	the Yeo 7-Network atlas ¹¹ and the average percent volume change of each network caused by the
165	lesion correction procedure (Fig. 2). There was no need to correct cortical volume measurements
166	by total intracranial volume in this study because all network-based measures (i.e. % change in
167	volume) were calculated at the single-subject level.
168	An overview of the lesion correction procedure is shown in Video 1, and additional
169	methodological details are provided in the Supplementary Material. We also release all code used
170	in the lesion correction procedure on <u>https://github.com/ComaRecoveryLab/Lesion_Correction</u> .
171	
172	Statistical analysis
173	We used the intraclass correlation coefficient to test interrater reliability for lesion volume
174	measurements. We report descriptive statistics for the average percent cortical surface area and
175	the average percent cortical volume affected by lesions for each network.
176	
177	Results
178	Patient demographics and clinical characteristics
179	Due to the presence of severe anatomic distortions, two of the 98 patients' scans did not complete
180	FreeSurfer's standard processing pipeline (visual assessment scores=0). Of the remaining 96

8

181	scans, nine received a visual assessment score of 1 by the two raters and were excluded, yielding
182	a final sample size of 87 patients. The 87-patient cohort was comprised of 60.9% men, with a
183	mean +/- SD age of 56.7 +/- 12.0 years. Injury severity was classified as mild (n=3), moderate
184	(n=42), and severe (n=32); in 10 participants duration of LOC was unknown and records were
185	not available. The duration from most recent TBI to MRI was 10.9 +/- 9.1 years. Additional
186	clinical and demographic data, as well as SNR and CNR data, are provided in Supplementary
187	Tables 1 and 2.
188	
189	Interrater Reliability
189 190	Interrater Reliability The intraclass coefficient between the two physician raters across 20 datasets was 0.99 [95%
190	The intraclass coefficient between the two physician raters across 20 datasets was 0.99 [95%
190 191	The intraclass coefficient between the two physician raters across 20 datasets was 0.99 [95% Confidence Interval 0.98, 0.99]. The intraclass coefficients between the physician raters and the
190 191 192	The intraclass coefficient between the two physician raters across 20 datasets was 0.99 [95% Confidence Interval 0.98, 0.99]. The intraclass coefficients between the physician raters and the technician rater for these same datasets were 0.95 [0.91, 0.97] and 0.96 [0.93, 0.98], respectively.
190 191 192 193	The intraclass coefficient between the two physician raters across 20 datasets was 0.99 [95% Confidence Interval 0.98, 0.99]. The intraclass coefficients between the physician raters and the technician rater for these same datasets were 0.95 [0.91, 0.97] and 0.96 [0.93, 0.98], respectively. Because sufficient inter-rater reliability was established in this test set (n=20; intraclass
190 191 192 193 194	The intraclass coefficient between the two physician raters across 20 datasets was 0.99 [95% Confidence Interval 0.98, 0.99]. The intraclass coefficients between the physician raters and the technician rater for these same datasets were 0.95 [0.91, 0.97] and 0.96 [0.93, 0.98], respectively. Because sufficient inter-rater reliability was established in this test set (n=20; intraclass correlation coefficient > 0.9), all subsequent lesion identification was performed by the

197 Lesion characteristics and anatomic distribution

198 Forty-six of the 87 patients had at least one lesion that affected the accuracy of the FreeSurfer-

199 modeled cortical surface. There were 120 total lesions, with a median of 2 lesions per patient

200 (range 1 to 10). On average, lesions overlapped with 4.6 +/- 1.6 of the 7 networks. A group-level

lesion topology map demonstrated an orbitofrontal and anterior temporal predominance of the

202 lesions (Fig. 2, Videos 2 and 3).9

203

204 *Network-based cortical surface area measures*

205	The limbic and default mode networks were lesioned in the largest proportion of patients (44/46
206	scans, 95.7% incidence for both networks), followed by the executive control (78.3%), and
207	salience (71.7%) networks. This large limbic lesion burden was observed despite the limbic
208	network having the smallest average surface area of the seven functional networks across all
209	patients (Supplementary Fig. S2). The largest mean percentage of lesion-network surface area
210	overlap occurred within the limbic network (4.4 +/- 3.7% of total network surface area;
211	Supplementary Table 3).
212	
213	Network-based cortical volume measures
214	When considering networks impacted by the lesion correction method in the 46 patients with
215	cortical lesions, we observed a median decrease in network-based cortical volume of 3.4%
216	(range <1.0% to 47.0%). The limbic network had the largest lesion-induced mean +/- SD
217	percentage decrease in cortical volume (12.7 +/- 9.7%; Supplementary Table 4).
218	

219 **Discussion**

220 We introduce a new FreeSurfer-based method for cortical volumetric analysis in patients with

lesions caused by TBI. We apply this method in a cohort of 87 patients with chronic moderate-to-

severe TBI and show that lesion-induced cortical inaccuracies are not equally distributed within

223 the brain's functional networks. Rather, inaccuracies preferentially affected the limbic network,

an observation consistent with prior pathology^{18, 19} and MRI²⁰ studies showing that traumatic
 10

contusions commonly affect the orbitofrontal and temporal nodes of the limbic network.

Implementation of the proposed lesion correction method will prevent the systematic exclusion

of patients with cortical lesions from MRI volumetric studies and improve the generalizability of

228 MRI studies across the full spectrum of cortical pathology.

These findings demonstrate the potential utility of the new lesion correction method for 229 studying network-based mechanisms of cognitive, behavioral, and motor deficits in patients with 230 231 TBI. For example, lesion-induced cortical volume changes within the limbic, default mode, and frontoparietal networks (the three most frequently lesioned networks) can be tested for 232 233 correlations with symptoms that are putatively attributable to their dysfunction, such as 234 behavioral dysregulation, altered self-awareness, and executive dysfunction, respectively. From a phenomenological standpoint, the application of the new lesion correction tool to large clinical-235 radiological-pathological databases being acquired by the LETBI,¹² Transforming Research and 236 Clinical Knowledge in TBI (TRACK-TBI),²¹ Collaborative European NeuroTrauma 237 Effectiveness Research in Traumatic Brain Injury (CENTER-TBI),²² and other studies, has 238 potential to elucidate pathological signatures of TBI phenotypic classification, with implications 239 for clinical trial selection²³ and prognostication.¹⁰ 240

Several limitations should be considered when interpreting the results of this study. The lesion correction method relies upon an assumption whose validity is difficult to test: we assume that at sites of tissue distortion and encephalomalacia, the cortex is non-functional and therefore should be masked, or removed, from subsequent cortical volume measurements. This assumption is made with the recognition that definitive determination of the functional status of lesioned cortex is not possible solely with T1-weighted MEMPRAGE data. Nevertheless, the assumption

that lesioned cortex is non-functional in the population studied here is strongly supported by 247 visual inspection of the data, which reveals complete or near complete absence of cerebral 248 249 cortex, as shown in Figure 1. In future multimodal experiments, the lesion correction method can 250 be refined by analyzing the functional properties of lesioned cortex (e.g. with functional MRI or 251 EEG). In future work, it may also be possible to integrate the lesion correction method with software programs that offer automated lesion detection, such as the ABC module extension of 252 3D Slicer.²⁴ Moreover, the method can be used to measure point-wise and region-wise estimates 253 254 of cortical thickness in unlesioned cortex by masking inaccurate regions of cortex.

255

256 Conclusions

We demonstrate the impact of a new FreeSurfer-based lesion correction tool on cortical volumetric measures in 7 atlas-based functional networks, and we distribute this lesion correction tool to the academic community. We show that cortical lesions are not evenly distributed across networks, but rather preferentially affect the frontotemporal nodes of the limbic network. This lesion correction method can facilitate inclusive, unbiased investigation into the anatomic basis of neurological deficits in patients with TBI and other neuropsychiatric diseases associated with focal lesions.

264 Acknowledgments

- 265 We thank Cheuk Y. Tang, Ph.D. for assistance with acquisition of MRI data. The LETBI Project
- is supported by the National Institutes of Health/ National Institute for Neurological Disorders
- and Stroke and National Institute of Child Health and Development (U01 NS086625 and
- 268 RF1NS115268). This research was also supported by the NIH Director's Office
- 269 (DP2HD101400), National Center for Research Resources (U24RR021382), the National
- 270 Institute for Biomedical Imaging and Bioengineering (P41EB015896, R01EB006758,
- 271 R21EB018907, R01EB019956, R01EB023281), the National Institute on Aging (AG022381,
- 272 R01AG008122, R01AG016495, R01AG008122, U01AG006781, R21AG046657,
- 273 P41RR014075, P50AG005136), the National Center for Alternative Medicine (RC1 AT005728-
- 01), the National Institute for Neurological Disorders and Stroke (K23NS094538,
- 275 R21NS109627, R01NS052585, 1R21NS072652, 1R01NS070963, R01NS083534,
- 5U01NS086625), the Eunice Kennedy Shriver National Institute of Child Health and Human
- 277 Development (K01HD074651, R01HD071664), and the National Institute on Disability
- 278 Independent Living and Rehabilitation Research (H133B040033). This research also utilized
- resources provided by National Institutes of Health shared instrumentation grants S10RR023401,
- S10RR019307, and S10RR023043. Additional support for this project comes from the James S.
- 281 McDonnell Foundation, the Nancy and Buster Alvord Endowment, the Rappaport Foundation,
- the Tiny Blue Dot Foundation, institutional funds from the University of Washington School of
- 283 Medicine, and the Seton Brain Research Fund.
- 284
- 285
- 13

286 Author Disclosure Statement

- 287 None of the authors has a conflicting financial interest. Dr. Fischl has financial interest in
- 288 CorticoMetrics, a company whose medical pursuits focus on brain imaging and measurement
- technologies. His interests were reviewed and are managed by Massachusetts General Hospital
- and Partners HealthCare in accordance with their conflict of interest policies.

291

292

293 **References**

- 1. Fischl, B., van der Kouwe, A., Destrieux, C., Halgren, E., Segonne, F., Salat, D.H., Busa, E.,
- Seidman, L.J., Goldstein, J., Kennedy, D., Caviness, V., Makris, N., Rosen, B. and Dale, A.M.
- 296 (2004). Automatically parcellating the human cerebral cortex. Cereb Cortex 14, 11-22.
- 297 2. Fischl, B. and Dale, A.M. (2000). Measuring the thickness of the human cerebral cortex from
- 298 magnetic resonance images. Proc Natl Acad Sci U S A 97, 11050-11055.
- 3. Warner, M.A., Marquez de la Plata, C., Spence, J., Wang, J.Y., Harper, C., Moore, C., Devous,
- 300 M. and Diaz-Arrastia, R. (2010). Assessing spatial relationships between axonal integrity,
- 301 regional brain volumes, and neuropsychological outcomes after traumatic axonal injury. J
- 302 Neurotrauma 27, 2121-2130.
- 4. Santhanam, P., Wilson, S.H., Oakes, T.R. and Weaver, L.K. (2019). Accelerated age-related
- 304 cortical thinning in mild traumatic brain injury. Brain and behavior 9, e01161.
- 5. Warner, M.A., Youn, T.S., Davis, T., Chandra, A., Marquez de la Plata, C., Moore, C., Harper,
- 306 C., Madden, C.J., Spence, J., McColl, R., Devous, M., King, R.D. and Diaz-Arrastia, R. (2010).
- Regionally selective atrophy after traumatic axonal injury. Arch Neurol 67, 1336-1344.
- 6. Merkley, T.L., Bigler, E.D., Wilde, E.A., McCauley, S.R., Hunter, J.V. and Levin, H.S. (2008).
- 309 Diffuse changes in cortical thickness in pediatric moderate-to-severe traumatic brain injury. J
- 310 Neurotrauma 25, 1343-1345.
- 311 7. Strangman, G.E., O'Neil-Pirozzi, T.M., Supelana, C., Goldstein, R., Katz, D.I. and Glenn,
- 312 M.B. (2010). Regional brain morphometry predicts memory rehabilitation outcome after
- traumatic brain injury. Frontiers in human neuroscience 4, 182.

- 8. Ding, K., Marquez de la Plata, C., Wang, J.Y., Mumphrey, M., Moore, C., Harper, C., Madden,
- 315 C.J., McColl, R., Whittemore, A., Devous, M.D. and Diaz-Arrastia, R. (2008). Cerebral atrophy
- after traumatic white matter injury: correlation with acute neuroimaging and outcome. J
- 317 Neurotrauma 25, 1433-1440.
- 9. Fox, M.D. (2018). Mapping Symptoms to Brain Networks with the Human Connectome. N
- Engl J Med 379, 2237-2245.
- 10. Sharp, D.J., Scott, G. and Leech, R. (2014). Network dysfunction after traumatic brain injury.
- 321 Nature reviews. Neurology 10, 156-166.
- 11. Yeo, B.T., Krienen, F.M., Sepulcre, J., Sabuncu, M.R., Lashkari, D., Hollinshead, M.,
- Roffman, J.L., Smoller, J.W., Zollei, L., Polimeni, J.R., Fischl, B., Liu, H. and Buckner, R.L.
- 324 (2011). The organization of the human cerebral cortex estimated by intrinsic functional
- 325 connectivity. Journal of neurophysiology 106, 1125-1165.
- 12. Edlow, B.L., Keene, C.D., Perl, D.P., Iacono, D., Folkerth, R.D., Stewart, W., Mac Donald,
- 327 C.L., Augustinack, J., Diaz-Arrastia, R., Estrada, C., Flannery, E., Gordon, W.A.,
- 328 Grabowski, T.J., Hansen, K., Hoffman, J., Kroenke, C., Larson, E.B., Lee, P., Mareyam, A.,
- McNab, J.A., McPhee, J., Moreau, A.L., Renz, A., Richmire, K., Stevens, A., Tang, C.Y., Tirrell,
- L.S., Trittschuh, E.H., van der Kouwe, A., Varjabedian, A., Wald, L.L., Wu, O., Yendiki, A.,
- 331 Young, L., Zollei, L., Fischl, B., Crane, P.K. and Dams-O'Connor, K. (2018). Multimodal
- 332 Characterization of the Late Effects of Traumatic Brain Injury: A Methodological Overview of
- the Late Effects of Traumatic Brain Injury Project. J Neurotrauma 35, 1604-1619.
- 13. O'Neil, M.E., Carlson, K., Storzbach, D., Brenner, L., Freeman, M., Quinones, A.,

- 335 Motu'apuaka, M., Ensley, M. and Kansagara, D. (2013). In: *Complications of Mild Traumatic*
- Brain Injury in Veterans and Military Personnel: A Systematic Review: Washington (DC).
- 14. van der Kouwe, A.J.W., Benner, T., Salat, D.H. and Fischl, B. (2008). Brain morphometry
- with multiecho MPRAGE. Neuroimage 40, 559-569.
- 15. Haacke, E.M., Duhaime, A.C., Gean, A.D., Riedy, G., Wintermark, M., Mukherjee, P., Brody,
- 340 D.L., DeGraba, T., Duncan, T.D., Elovic, E., Hurley, R., Latour, L., Smirniotopoulos, J.G. and
- 341 Smith, D.H. (2010). Common data elements in radiologic imaging of traumatic brain injury. J
- 342 Magn Reson Imaging 32, 516-543.
- 16. Fischl, B., Sereno, M.I., Tootell, R.B. and Dale, A.M. (1999). High-resolution intersubject
- averaging and a coordinate system for the cortical surface. Hum Brain Mapp 8, 272-284.
- 17. Kothari, R.U., Brott, T., Broderick, J.P., Barsan, W.G., Sauerbeck, L.R., Zuccarello, M. and
- 346 Khoury, J. (1996). The ABCs of measuring intracerebral hemorrhage volumes. Stroke 27, 1304-
- 347 1305.
- 18. Adams, J.H., Doyle, D., Graham, D.I., Lawrence, A.E., McLellan, D.R., Gennarelli, T.A.,
- Pastuszko, M. and Sakamoto, T. (1985). The contusion index: a reappraisal in human and
- experimental non-missile head injury. Neuropathol Appl Neurobiol 11, 299-308.
- 19. Courville, C.B. (1942). COUP-CONTRECOUP MECHANISM OF CRANIOCEREBRAL
- 352 INJURIES: Some Observations. Arch Surg 45, 19-43.
- 20. Gentry, L.R., Godersky, J.C. and Thompson, B. (1988). MR imaging of head trauma: review
- of the distribution and radiopathologic features of traumatic lesions. AJR Am J Roentgenol 150,
 663-672.
- 21. Yue, J.K., Vassar, M.J., Lingsma, H.F., Cooper, S.R., Okonkwo, D.O., Valadka, A.B.,
 17

- 357 Gordon, W.A., Maas, A.I., Mukherjee, P., Yuh, E.L., Puccio, A.M., Schnyer, D.M., Manley, G.T.
- and TRACK-TBI Investigators. (2013). Transforming research and clinical knowledge in
- traumatic brain injury pilot: multicenter implementation of the common data elements for
- traumatic brain injury. J Neurotrauma 30, 1831-1844.
- 22. Steyerberg, E.W., Wiegers, E., Sewalt, C., Buki, A., Citerio, G., De Keyser, V., Ercole, A.,
- Kunzmann, K., Lanyon, L., Lecky, F., Lingsma, H., Manley, G., Nelson, D., Peul, W., Stocchetti,
- N., von Steinbuchel, N., Vande Vyvere, T., Verheyden, J., Wilson, L., Maas, A.I.R., Menon, D.K.,
- Participants, C.-T. and Investigators (2019). Case-mix, care pathways, and outcomes in patients
- with traumatic brain injury in CENTER-TBI: a European prospective, multicentre, longitudinal,
- cohort study. Lancet Neurol 18, 923-934.
- 23. Smith, D.H., Hicks, R. and Povlishock, J.T. (2013). Therapy development for diffuse axonal
- 368 injury. J Neurotrauma 30, 307-323.
- 24. Irimia, A., Chambers, M.C., Alger, J.R., Filippou, M., Prastawa, M.W., Wang, B., Hovda,
- D.A., Gerig, G., Toga, A.W., Kikinis, R., Vespa, P.M. and Van Horn, J.D. (2011). Comparison of
- acute and chronic traumatic brain injury using semi-automatic multimodal segmentation of MR
- volumes. J Neurotrauma 28, 2287-2306.

Figure Legends

374 Figure 1. Overview of Lesion Correction Method

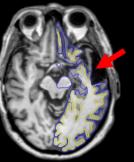
Row 1: Axial, coronal, and sagittal T1-weighted images of a representative patient with traumatic 375 376 brain injury. FreeSurfer reconstructions of the cortical surface (blue line) and grey-white surface (yellow line) are used to visually identify regions where a cortical lesion (red arrows) caused 377 surface inaccuracies. Row 2: We manually outlined lesions by labeling inaccurate vertices on the 378 379 cortical surface (left image). This surface inaccuracy (labeled in red) is shown in the coronal plane in the middle image and the right, zoomed image. The red label passes through lesioned, 380 381 encephalomalacic tissue. Row 3: To correct for the inaccuracy in the surface label at the site of 382 the lesion, we remove the volume of cortex within the lesion label and perform cortical 383 volumetric measures that exclude the lesioned tissue.

384

Figure 2. Lesion Topology and Network-based Lesion Effects on Cortical Volume

In the left panel, we show a heat map of cortical lesions for all 46 patients who had at least one 386 387 lesion. The anatomic regions most commonly affected by cortical lesions were the frontal and temporal lobes, particularly the frontal poles, temporal poles and orbitofrontal regions. In the top 388 right panel, we show the 7 functional networks from the Yeo atlas¹¹ that were used to investigate 389 390 network-specific lesion effects. In the bottom right panel, we show a violin plot demonstrating the changes in average cortical volume for each network after applying the lesion correction 391 392 method. Lesion effects on average cortical volume varied between networks, with the limbic 393 network showing the largest magnitude of decline in average cortical volume after application of the lesion correction method. 394 19

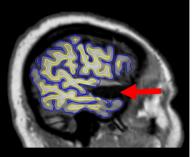
FreeSurfer Reconstruction



Axial

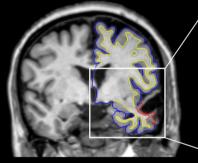


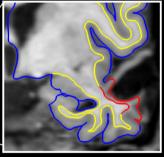
Coronal



Sagittal

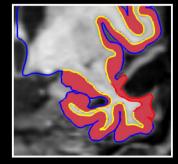
Lesion Labeling





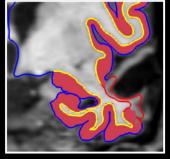
Lesion Label on 3D Surface

Cortical Volume Correction



Inaccurate Cortical Ribbon

Lesion Label on Surface in Coronal Plane



Corrected Cortical Ribbon



Cortical Volume

