SCIENTIFIC REPORTS

natureresearch

OPEN

Infant Corpus Callosum Size After Surgery and Critical Care for Long-Gap Esophageal Atresia: Qualitative and Quantitative MRI

Chandler R. L. Mongerson¹, Camilo Jaimes^{2,3}, David Zurakowski^{1,3}, Russell W. Jennings^{3,4,5} & Dusica Bajic^{1,3*}

Previous studies in preterm infants report white matter abnormalities of the corpus callosum (CC) as an important predictor of neurodevelopmental outcomes. Our cross-sectional study aimed to describe qualitative and quantitative CC size in critically ill infants *following* surgical and critical care for longgap esophageal atresia (LGEA) – in comparison to healthy infants – using MRI. Non-sedated brain MRI was acquired for full-term (n = 13) and premature (n = 13) patients following treatment for LGEA, and controls (n = 20) <1 year corrected age. A neuroradiologist performed qualitative evaluation of T1weighted images. ITK-SNAP was used for linear, 2-D and 3-D manual CC measures and segmentations as part of CC size quantification. Qualitative MRI analysis indicated underdeveloped CC in both patient groups in comparison to controls. We show no group differences in mid-sagittal CC length. Although 2-D results were inconclusive, volumetric analysis showed smaller absolute (F(2,42) = 20.40, p < 0.001) and normalized (F(2,42) = 16.61, p < 0.001) CC volumes following complex perioperative treatment for LGEA in both full-term and premature patients, suggesting delayed or diminished CC growth in comparison to controls, with no difference between patient groups. Future research should look into etiology of described differences, neurodevelopmental outcomes, and role of the CC as an early marker of neurodevelopment in this unique infant population.

Long-gap esophageal atresia (LGEA) is a rare birth defect characterized by a long gap of the esophagus (gap wider than 3 vertebral bodies) that can not be repaired by direct approximation. If left untreated, infants are unable to swallow food and secretions, leading to inadequate growth and infections, respectively. Although the Foker process^{1,2} is considered standard of care for treatment of LGEA, there is a major gap in our understanding of the impact of such complex perioperative critical care on brain development. Evidence suggests that critical illness and prolonged mechanical ventilation in infancy are important risk factors associated with altered brain development^{3,4}. Emerging reports also suggest that infants born with noncardiac congenital anomalies undergoing surgery and complex critical care in infancy are at increased risk of brain injury^{5,6} and poor long-term outcomes^{7,8}. Similarly, infections in infancy were linked to altered brain development and higher risk of long-term neurological sequelae⁹.

We previously reported that critically ill full-term and premature infants following LGEA repair had previously unrecognized clinically significant MRI findings, as well as quantitative increase of cerebrospinal fluid and globally decreased brain size^{6,10}. In the same pilot cohort of full-term and premature patients, we also illustrated qualitative MRI findings implicating abnormal thinning of the corpus callosum (CC)⁶ following completion of complex perioperative critical care for LGEA that included Foker process^{1,2} and prolonged postoperative sedation (\geq 5 days)¹¹. The CC forms the major commissural white matter tract important for integrating and transferring interhemispheric signals spanning sensory, motor, and higher-order cognitive domains¹², and is formed as early

¹Department of Anesthesiology, Critical Care and Pain Medicine, Boston Children's Hospital, 300 Longwood Ave., Boston, MA, 02115, USA. ²Department of Radiology, Division of Neuroradiology, Boston Children's Hospital, 300 Longwood Ave., Boston, MA, 02115, USA. ³Harvard Medical School, Harvard University, 25 Shattuck St., Boston, MA, 02115, USA. ⁴Department of Surgery, Boston Children's Hospital, 300 Longwood Ave., Boston, MA, 02115, USA. ⁵Esophageal and Airway Treatment Center, Boston Children's Hospital, 300 Longwood Ave., Boston, MA, 02115, USA. *email: dusica.bajic@childrens.harvard.edu as 18–20 weeks gestational age (GA)¹³. Indeed, impaired callosal thickness has been associated with degree of prematurity¹⁴. Smaller CC size in former premature infants in comparison to full-term-born infants has been reported at term-equivalent age^{15,16}, early childhood¹⁷, and adolescence^{18,19}. However, the impact of Foker process and perioperative critical care on CC size in full-term patients is unknown.

Our aim in present descriptive pilot study was to evaluate both qualitative and quantitative MRI measures of CC size in aforementioned pilot cohort of infants with LGEA^{6,10}. We hypothesized that critically ill full-term and premature patients <1 year-old following thoracic surgical and critical care for LGEA – in comparison to healthy full-term infants – have (1) higher incidence of qualitative CC abnormalities (shape, size, and degree of myelination), and (2) smaller absolute and normalized CC size using linear, 2-D, and 3-D measures. Due to the nature of the disease and critical care they undergo, infants born with LGEA also receive prolonged parenteral nutrition. Our secondary outcome measure was total body weight (kg) at the time of MRI scan, since feeding regime with total parenteral nutrition does not offer the same nutritional advantages as breast milk^{20,21}.

Methods

Study design and participants. This work builds on our previous work^{6,10} approved by Boston Children's Hospital Institutional Review Board as a 'no more than minimal risk' study. Informed written parental consent was obtained prior to subject participation, in accordance with the Declaration of Helsinki and Good Clinical Practice guidelines. Considering that data presented is from the same infant study subjects, previously described methodological approach for (1) recruitment criteria and (2) MRI scanning process⁶ apply here. We analyzed 3 groups: full-term patients, preterm patients, and full-term healthy controls. Recruitment was previously described in detail⁶. A parent or legal-guardian of each subject attested to informed consent for study participation. Patients' eligibility criteria were: full-term (37 to 42 weeks GA at birth) and moderate-to-late preterm (28 to 36 weeks GA at birth) patients <1 year gestation-corrected age that underwent surgery for Foker process for LGEA repair^{1,22}. We selected infants that required prolonged postoperative sedation (\geq 5 days) associated with development of pharmacological dependence to drugs of sedation^{11,23-25}. Representative timeline illustrating sequence of perioperative critical care was presented previously^{6,26}. Exclusion criteria were: (1) extreme prematurity (<28 weeks GA); (2) ECMO exposure; (3) cranial ultrasound findings (e.g. ventricular enlargement with or without gray matter and/or ventricular hemorrhage); (4) neurological disease (e.g. seizures); (5) chromosomal abnormalities (e.g. Down syndrome); (6) prenatal drug exposure; and/or (7) MRI incompatible implants.

Healthy full-term infants <1 year old with no prior exposure to surgery, anesthesia or sedation served as a reference baseline for typical CC size and were not age or gender matched. In our original report, we used n = 17 controls for *qualitative* analyses of **T1-weighted** and *quantitative* analyses of **T2-weighted** MRI data⁶. The following changes account for this report: (i) addition of three new control subjects, and (ii) replacement follow-up scans for 2 previously analyzed infants to improve quality of T1-weighted images (now 3.2 months-old control subject and 5.4 months-old full-term patient). Summary of recruitment details and final group characteristics are shown in Table 1. Our secondary outcome measure of individual absolute body weights of subjects at the time of MRI scan is shown in Fig. 1A.

MRI acquisition. Our MRI scanning protocol was previously described in detail^{6,10}. All infants underwent a non-sedated research scan after completion of all perioperative treatment for Foker process using a 'feed and wrap' approach²⁷⁻³⁰. Patients were scanned in late evenings or at night using a 3 T TrioTim MRI system equipped with 32-channel receive-only head coil and body-transmission (Siemens Healthcare Inc., USA). Structural **T1-weighted** images were acquired using a MPRAGE sequence (repetition time = 2.52 s; echo time = 1.74 ms; flip angle = 7°; field of view = 192 × 192 mm2; voxel size = 1 × 1 × 1 mm3; 144 sagittal slices). T1 images were collected for all scanned full-term and preterm patients (n = 13/group), and 20/22 (91%) full-term controls (Table 1). Of those 20 controls, only one infant had partial brain coverage that precluded analysis of total brain volume (n = 19 controls) but allowed for quantification of CC metrics. We noted minor ringing artifact due to motion only in 1/20 controls and 1/13 premature patients that did not obscure CC delineation and segmentation.

Oualitative brain MRI evaluation. The neuroradiologist blinded to treatment groups reviewed T1-weighted scans to identify abnormalities in the CC involving: (i) shape, (ii) size, and (iii) status of myelination for age (Fig. 1B–D). Subjects were divided into three categories based on likelihood of CC finding with respect to each analysis (shape, size, myelination): (1) *normal*, (2) *possibly* abnormal, or (3) *very likely* abnormal CC (e.g. abnormal shape, global or regional thinning, and/or hypomyelination or incomplete myelination for the respective age). Category designations were determined as per the clinical neuroradiologist's expertise. Myelination scoring was adapted from a study by Plecko *et al.*³¹.

Quantitative brain MRI analyses. A single blinded rater with neuroanatomical expertise performed data analysis. **T1-weighted** image preprocessing included alignment along the anterior commissure - posterior commissure line using Freeview (v.2.0) to correct for any head tilt during MRI acquisition as illustrated in our previous report (see Fig. 2 in⁶). ITK-SNAP software (v.3.6.0; www.itksnap.org)³² was used to measure A-P length (cm) of the CC and to manually segment both CC 2-D surface area (cm²) and 3-D volumetric masks (cm³). We used a neuroanatomical atlas³³ and a fiber tract-based atlas of human white matter³⁴ as anatomical references for CC measures and segmentation.

Linear CC measure. A linear segment running from the most anterior tip of the genu to the most posterior point of the splenium in the mid-sagittal view was used to create an anterior – posterior (A-P) line that represents CC length (Fig. 2A).

n	Controls	Full-Term Patients	Premature Patients
Recruitment Process			
Considered/(Chart) Reviewed	62	173	108
Eligible (%Reviewed)	59 (95%)	63 (36%)	49 (45%)
Approached (%Eligible)	56 (95%)	40 (63%)	23 (47%)
Consented (%Approached)	22 (39%)	19 (48%)	18 (78%)
Scanned (%Consented)	22 (100%)	13 (68%)	13 (72%)
Included/Analyzed (%Scanned)	20 (91%)	13 (100%)	13 (100%)
Group Characteristics	· ·		·
Sex (male), n (%)	17 (85%)	7 (54%)	8 (62%)
GA at birth (weeks), Mean \pm SD	39.3±1.15	38.5 ± 1.1	32.2±2.9
CA at scan (months), Median [range]	4.5 [0.5-12.3]	5.4 [0.7-13.0]	3.8 [1.4-7.5]
Twin births, n (%)	1 (5%)	1 (8%)	2 (15%)
Primary diagnoses			
Isolated LGEA, n (%)	0	3 (23%)	3 (23%)
LGEA with TEF, n (%)	0	5 (38%)	9 (69%)
Other, n (%)	0	5 (38%)	1 (8%)

Table 1. Recruitment and Group Characteristics. Table summarizes study recruitment process for the 3 groups(full-term controls, and full-term and preterm patients), as well as demographic and clinical characteristicsof all subjects included in analysis of **T1-weighted** images. Numbers for recruitment process are updatedsince our previous publication⁶ (see Methods). Primary diagnoses included: (1) isolated long-gap esophagealatresia (LGEA), (2) LGEA with tracheo-esophageal fistula (TEF), or (3) other that included LGEA as part ofVACTERL association (without cardiac component). Infants diagnosed with VACTERL typically exhibit \geq 3of the characteristic features (viz. Vertebral defects; Anal atresia; Cardiac defects; Tracheo-Esophageal fistula;**R**enal anomalies; Limb abnormalities). None of the infants included in analysis were exposed to extracorporealmembrane oxygenation or had any previously known neurological injury or disease. For other exclusioncriteria, see Methods. *Abbreviations*: **GA**, gestational age; **CA**, corrected age.

Surface area (2-D) segmentation. A single mid-sagittal section (Figs. 2, 3A and 4) was used to manually trace the surface area of both the CC and intracranial space (Fig. 4). Mid-sagittal surface area of total brain tissue was not evaluated due to variable amounts of extra-axial interhemispheric fluid, particularly in that of patients (Fig. 2A, asterisk). The mid-sagittal section allowed for the best visualization of CC boundaries and was identified by the presence of anterior and posterior commissures, cerebral aqueduct, septum pellucidum, and distinctness of the thalamus. Callosal fibers sharply contrast with neighboring gray matter and cerebrospinal fluid^{15,35} allowing for straightforward manual segmentation of the CC.

Volumetric (3-D) segmentation. We manually segmented 3-D CC and performed whole brain extraction, as described below.

<u>3-D CC Segmentation</u>. Anatomical landmarks important for 3-D demarcation of CC boundaries are summarized in Fig. 3. This is in line with previously described protocol for CC segmentation in newborns by Yu *et al.*³⁶. Great care was taken to exclude encircling cerebral vasculature and neighboring subcallosal area inferiorly (Fig. 3A). Challenging structural distinctions included the cingulum and fornix (columns, body, and crux) due to their close proximity to CC contour throughout its length (Fig. 3B–F). We also extended previously described protocol³⁶ by defining lateral boundaries of CC segmentation. Specifically, lateral outermost edges of the CC were bounded by the anterior and posterior corona radiata³⁴. Effectively, this was traced as an arching line from tip of lateral ventricles to the in-folding of the cingulate gyrus (Fig. 3B–F; white dashed lines).

<u>3-D Total Brain Segmentation</u>. We also performed semi-automated total brain tissue segmentation of T1-weighted images that was necessary for normalized CC volume calculation. It included: (i) <u>Skull-stripping</u> of T1 images by manually tracing whole brain outline (includes ventricular system); and (ii) <u>Partial volume seg-mentation</u> of cerebrospinal fluid (CSF) using FMRIB's Automated Segmentation Tool (FAST)³⁷. We found that FAST served well in distinguishing between CSF and brain tissue, even beyond the neonatal period. Using tools in FMRIB Software Library (FSL; v.5.0), CSF partial volume estimate was (a) thresholded at 99% (eliminating voxels with <99% of their volume comprising CSF), (b) converted to a binary CSF mask, which was then (c) subtracted from the mask of a whole brain outline in order to generate mask of total brain that excludes ventricular system. Brain volume masks underwent additional (d) minor manual editing to draw-in any missing brain tissue.

Structural quantification. Absolute values of 2-D segmentations (intracranial and CC surface area in cm²; Fig. 4A,B, respectively) and 3-D segmentations (brain and CC volume in cm³; Fig. 5A,B, respectively) were obtained using the ITK-SNAP volume estimation tool. In addition, we calculated normalized values for CC surface area (% intracranial surface area; Fig. 4C) and CC volume (% brain volume; Fig. 5C). Normalization using total brain tissue is appropriate for understanding how CC size changes with respect to the brain as a whole³⁸.



Figure 1. Body Weight (**A**) and Qualitative Analyses of Corpus Callosum (**B**–**D**). Graph A shows individual absolute body weight at scan (kg) for the 3 groups analyzed: (1) full-term controls (n = 20; open circles), (2) full-term patients (n = 13; gray circles), and (3) premature patients (n = 13; black circles). Despite noted trend for group differences, we report no significant differences in body weight at scan between the groups (F(2,42) = 3.01, p = 0.06). **Graphs B–D** summarize results of qualitative MRI analysis of the corpus callosum (CC). Abnormal CC shape (**Graph B**) was either *possible* or *very likely* in 4/13 (31%) full-term patients and 6/13 (46%) preterm patients. In contrast, only 1/20 (5%) controls exhibited possible abnormal CC shape. Incidence of abnormal CC size for age (**Graph C**) was high in both patient groups, with smaller size either *possible* or *very likely* in 9/13 (69%) full-term and 12/13 (92%) preterm patients. Incidence of abnormal CC myelination for age (**Graph D**) was either *possible* or *very likely* in only 2/13 (15%) full-term patients and 6/13 (46%) preterm patients. In contrast, controls showed no evidence of CC abnormalities in age-appropriate size (**C**) or myelination (**D**).



Figure 2. Linear Metrics of Infant Corpus Callosum. Panel A illustrates representative realigned **T1-weighted** brain MRI at mid-sagittal section of a *full-term* patient scanned after perioperative care for long-gap esophageal atresia treatment at 5 months corrected age. It also illustrates linear measurement of total corpus callosum anterior-posterior (A-P) length. Corresponding graph (**B**) shows individual absolute total A-P length (cm) for the 3 groups: (1) full-term controls (n = 20; open circles), (2) full-term patients (n = 13; gray circles), and (3) preterm patients (n = 13; black circles). There were no significant differences in total A-P length between groups (F(2,42) = 0.97, p = 0.39) despite noted increase with age (F(1,42) = 64.86, p < 0.001). Increased presence of extra-axial, interhemispheric fluid in patients (asterisk) necessitated segmentation of intracranial surface area (see Fig. 4A) rather than brain surface area for normalization of corpus callosum (CC) size at this mid-sagittal brain section.

Statistical analysis. As this was a pilot study and no prior information was available regarding brain volumes in the selected cohort of infants with LGEA, a convenience sample size of 13 patients/group was chosen, based on the anticipated number of eligible infants at our institution and an estimated 50% enrollment rate. Statistical analyses were performed using the Statistical Package for the Social Sciences (SPSS, v.23.0; IBM Corporation, Armonk, NY). Normal distribution of all continuous variables was confirmed using the Shapiro-Wilk test. Comparison of volumes between the three groups was assessed using a general linear model (GLM) univariate analysis with corrected age at scan as a covariate and Bonferroni adjusted p values. The interaction (viz. test of parallelism) was reported when significant. Statistical significance was assessed at the $\alpha < 0.05$.

Results

T1-weighted images allowed for qualitative and quantitative comparisons of CC size between full-term and premature patients (n = 13/group), and full-term controls (n = 20; Table 1). Total body weight of all subjects in the analysis is illustrated in Fig. 1A. Despite noted trend for group differences, we report increased absolute body weight with advancing age at scan (F(1,42) = 174.65, p < 0.001) with no differences between groups (F(2,42) = 3.01, p = 0.06).

Oualitative corpus callosum evaluation. The neuroradiologist performed qualitative evaluation of CC, which demonstrated a consistent pattern of either *possible* or *very likely* abnormal shape (Fig. 1B), overall smaller CC size for age (Fig. 1C), and either hypomyelination or incomplete CC myelination for age (Fig. 1D) in both full-term and premature patients with no previously known neurological concerns. Such striking qualitative findings of smaller CC size for age (Fig. 1C) in majority of patients with LGEA fueled quantitative analyses presented below.

Linear and 2-D MRI quantification. Mid-sagittal length of the CC as measured by linear anterior-posterior (A-P) distance along its longest dimension (Fig. 2A) increased with advancing age (F(1,42) = 64.86, p < 0.001)



Figure 3. Manual Segmentation of Corpus Callosum. Illustrative tracings of the corpus callosum (CC; cyan) overlaid on T1-weighted sections (gray-scale) of a full-term control scanned at 7.6 months of age. Segmentation of CC included all four main subdivisions: [1] rostrum, [2] genu, [3] body, and [4] splenium. As outlined in Panel (A) (mid-sagittal section that was used for 2-D surface area analysis), great care was taken to exclude subcallosal area (SCA; arrowhead) and encircling cerebral vasculature including: [a.] anterior cerebral arteries, [b.] pericallosal arteries, [c.] inferior sagittal sinus and pericallosal veins, and [d.] great cerebral vein of Galen. Anatomical landmarks important for 3-D volumetric CC segmentation are illustrated in axial (Panels B,C) and coronal sections (Panels D-F). Specifically, lateral outermost edges of the CC were traced as an arching line (white dashed lines) from tip of lateral ventricles (LV) to the in-folding of the cingulate gyrus (cg). Extra attention was given to ensure exclusion of the fornix (fx) columns and crura (B) and body (C), as shown in two axial sections moving inferior to superior, respectively. Panels (D-F) show the CC in three coronal sections, moving anterior to posterior: Panel (D), transition from genu [2] to rostral body of CC [3]; Panel (E), crosssection through mid-body of CC [3]; and Panel (F), transition from body [3] to splenium [4]. Anatomical abbreviations were guided by previous literature⁶⁶. *Abbreviations*: *, septum pellucidum; A, anterior; Aq, cerebral aqueduct; BCd, body of caudate; cg, cingulum; fx, fornix; HCd, head of caudate; L, left; LV, lateral ventricles; P, posterior; R, right; SCA, subcallosal area; sof, superior occipitofrontal (subcallosal) fasiculus; Th, thalamus.

and showed no significant differences between groups (F(2,42) = 0.97, p = 0.39; Fig. 2B). All 2-D measures significantly increased with advancing age irrespective of group status (Fig. 4): *absolute* intracranial surface area (cm²; F(1,42) = 133.41, p < 0.001), *absolute* CC surface area (cm²; F(1,42) = 94.15, p < 0.001), and *normalized* CC (% intracranial surface area; F(1,42) = 38.08, p < 0.001). Absolute intracranial surface area did not differ between groups (F(2,42) = 0.15, p = 0.86; Fig. 4A), suggesting head size at scan followed a similar trajectory over time for all. In contrast, group status independently predicted CC size at scan. Specifically, *absolute* CC surface area showed significant group differences (F(2,42) = 4.74, p = 0.01; Fig. 4B) only between full-term patients and controls (p = 0.005), but not preterm patients and controls (p = 0.05) or between patient groups (p = 0.37) which could be attributed to higher variability of data in premature patients and lack of data points for premature infants older than 8 months. Likewise, *normalized* CC surface areas (% intracranial surface area) showed significant group differences (F(2,42) = 5.07, p = 0.01; Fig. 4C) between full-term patients and controls (p = 0.28).

3-D MRI quantification. All 3-D measures significantly increased with advancing age irrespective of group status (Fig. 5): *absolute* total brain (cm³; F(1,41) = 224.02, p < 0.001) and CC volumes (cm³; F(1,42) = 130.29, p < 0.001), and *normalized* CC volume (% total brain volume; F(1,41) = 49.80, p < 0.001). Absolute total brain volume was significantly smaller (F(2,41) = 12.15, p < 0.001; Fig. 5A) in both full-term and premature patients in comparison to controls (both p < 0.001), with no difference between patient groups (p = 0.81). Likewise, *absolute* CC volume was significantly smaller (F(2,42) = 20.40, p < 0.001; Fig. 5B) in both full-term and premature patients in comparison to controls (both p < 0.001), with no difference between patient groups (p = 0.70).



Figure 4. Corpus Callosum Surface Area Analysis. Representative photomicrographs of a T1-weighted midsagittal brain section illustrate 2-D surface area segmentations of intracranial space (**A**, red), corpus callosum (CC; **B**, cyan) or both (**C**). Corresponding graphs show quantitative 2-D analysis for the 3 groups: (1) full-term controls (n = 20; open circles), (2) full-term patients (n = 13; gray circles), and (3) premature patients (n = 13; black circles). *Absolute* mid-sagittal intracranial surface area (cm²; **graph A**) was not different between groups. In contrast, *absolute* CC surface area (cm²; **graph B**) differed among the groups, with significantly smaller CC surface area only between full-term patients and controls (p = 0.005). Likewise, *normalized* CC surface areas (% intracranial space surface area; **graph C**) differed among the groups with significantly smaller normative CC surface area found only between full-term patients and controls (p = 0.004).

Furthermore, significant interaction between age at scan and group status for *absolute* CC volume (F(2,40) = 4.34, p = 0.02; Fig. 5B) suggests possible altered growth trajectories between groups with advancing age. *Normalized* CC volumetric analysis (% total brain volume) showed disproportionately smaller CC size (F(2,41) = 16.61, p < 0.001; Fig. 5C) in both full-term and preterm patients in comparison to controls (both p < 0.001), with no difference between patient groups (p = 0.63).

Discussion

Building on our previous report of incidental CC findings (see Fig. 5 in⁶), our current descriptive pilot study shows qualitatively and quantitatively smaller absolute CC volume in both full-term and premature infants following complex LGEA treatment. Disproportionately smaller normalized CC volume (relative to total brain tissue) in both patient groups, points to CC as a potential early marker of neurodevelopment. These findings could



Figure 5. Corpus Callosum Volumetric Analysis. Representative 3-D renderings illustrate segmentations of total brain (**A**, orange), corpus callosum (CC; **B**, cyan) or both (**C**) based on T1-weighted MRI analysis. Corresponding graphs show quantitative 3-D analysis for the 3 groups: (1) full-term controls (n = 20; open circles), (2) full-term patients (n = 13; gray circles), and (3) premature patients (n = 13; black circles). We report differences between groups for all 3 measures: *absolute* brain volume, *absolute* CC volume, and *normalized* CC volume. Specifically, *absolute* brain volume (cm³; **graph A**) was smaller in both full-term and premature patients in comparison to controls (p < 0.001), with no difference between patient groups (p = 0.81). Likewise, *absolute* CC volume (cm³; **graph B**) was significantly smaller in patients compared to controls (p < 0.001), with no difference between patient groups (p = 0.63). Please note that brain volume used for normalization was not available for 1/20 controls (infant scanned at 11.7 months-old) due to incomplete brain coverage, which accounts for discrepancy in a single data point between the graphs.

possibly implicate subtle cortical neuronal and/or astrocytic vulnerability in the setting of LGEA treatment, not previously seen by analysis of gross forebrain structure as a whole¹⁰.

This study demonstrates qualitatively smaller CC size and increased incidence of possible abnormal shape and hypomyelination or incomplete myelination in both full-term and premature patients (Fig. 1). These results implicate (1) pre-existing (in-utero) brain abnormalities and/or (2) risk of atypical CC development for full-term and premature infants in the setting of complex perioperative critical care for LGEA (postnatal and/or peri-surgery). It has been well established that premature birth is associated with altered white matter development³⁹ including

that of the CC⁴⁰. Interestingly, a recent study by Stolwijk *et al.*⁵ reported a preponderance of punctate white matter lesions in both full-term and preterm patients following neonatal surgery for major noncardiac congenital anomalies. Authors reported that, in addition to prematurity, the type of congenital anomaly (e.g. including those with esophageal atresia) predicted presence of white matter lesions. Such findings might not be unique to infants with esophageal atresia, since it is known that neonates born with congenital heart defects are at risk of altered CC size pre-surgery, with such disparities intensifying following cardiac surgery and critical care⁴¹. Additionally, altered cerebral brain perfusion has been implicated in abnormal white matter findings in patients following surgery for congenital diaphragmatic hernia⁴². Whether intrinsic qualitative CC findings are present at birth in our population of infants with LGEA (pre-Foker) remains to be determined.

To our knowledge, this is the first study to use quantitative brain MRI to assess CC size in critically ill full-term and premature infants after complex perioperative care for LGEA repair. In accordance with our previous linear and volumetric findings of intracranial volume (as a correlate of head circumference)⁶, we report larger absolute mid-sagittal intracranial surface area with advancing age without significant group differences, suggesting similar head growth between groups with age (Fig. 4A). Interestingly, length of CC in our pilot cohort does not show group differences (Fig. 2B). Although both absolute and normalized CC surface area (Fig. 4B,C) increased with age for all groups, 2-D measures of CC size were significantly smaller in only full-term patients compared to controls. Literature of premature infants at term-equivalent age¹⁵ and in adolescence^{35,43} showed negative correlations between absolute surface area of the CC and gestational age. Contrary to our hypothesis, trend towards smaller absolute or normalized CC surface areas in preterm patients compared to controls did not reach significance. Although previous structural MRI studies in infants established feasibility of manual cross-sectional CC surface area analysis^{15,44-47}, it is possible 2-D surface area analysis (proxy of CC thickness) requires higher statistical power that is not met in our cohort.

Regarding the 3-D analysis, in accordance with our previous study (using T2-weighted volumetric analysis)⁶, current T1-weighted volumetric analysis also demonstrated smaller total brain size in both full-term and premature patients in comparison to controls (Fig. 5A). Although some patients had VACTERL association (Table 1), none had concomitant hydrocephalus (viz. VACTERL-H)^{48,49}, known to be of autosomal recessive or X-linked recessive inheritance⁴⁹⁻⁵². Similarly, none of the subjects included in analysis had cardiac involvement (less severe cases). Following exclusion of extremely premature infants (born <28 weeks GA), we report smaller absolute CC volumes in both full-term and premature patients following LGEA repair in comparison to controls (Fig. 5B,C). Since this is an observational pilot study, etiology associated with presented 3D findings is not known. Whether disparities in 3-D CC measures between patients and controls reflect pre-existing (prenatal) and/or delayed (postnatal; peri-surgery) CC maturation remains unclear and awaits future studies that should evaluate growth in contrast to size as described in this study. Our most recent preliminary data published as a small case report series⁵³ are in support of possible double-hit etiology of brain injury (pre-Foker and peri-Foker process) in both premature and full-term infants with LGEA. Both the degree of prematurity⁵⁴ and extremely low birth weight⁵⁵ have predicted smaller absolute CC volumes at term-equivalent age. Furthermore, CC volume at term-equivalent age⁵⁴ was predictive of CC size at 7-years of age⁴⁴, suggesting early altered CC growth patterns may persist into childhood. We also report decreased normalized CC volumes in both full-term and premature patients scanned after complex perioperative LGEA treatment. This interesting finding is in contrast to our recent T2-weighted MRI study report¹⁰, which showed global decrease of gross brain, forebrain, and deep gray matter (viz. thalamus and basal ganglia) volumes. It still remains to be investigated if decreased normalized CC size is paralleled with subtle cortical gray/white matter changes. Follow-up multimodal MRI studies in this clinical population are warranted to assess sub-regional patterns of CC size and growth and its homotopical⁵⁶ sub-regional properties of the cortex. Given its pivotal role in facilitating cross-talk between cerebral hemispheres, aberrant CC development or injury may translate to altered motor and cognitive functional circuitry later in life⁵⁷⁻⁶⁰. Notably, former very premature neonates with white matter injury in the CC were shown to exhibit altered intrinsic functional connectivity between thalamic and sensorimotor networks⁶¹. Future studies of the CC should include complementary diffusion tensor imaging (DTI) analyses such as regional white matter measurements of fractional anisotropy and mean diffusivity as indicators of white matter microstructural integrity in the setting of perioperative critical care in infancy.

To date, investigations into CC size as an early marker of later neurodevelopmental outcomes are limited, largely confined to premature infants, and inconclusive in terms of contradictory findings. In one study of very preterm infants, there was no association between CC size and neurodevelopmental function at 2-year follow-up⁵⁴. In contrast, several recent studies in premature infants reported CC size at term-equivalent age as an important predictor of cognitive outcomes in early childhood^{44,62,63}. Other studies showed that reduced CC growth predicts motor performance at 2 years of age⁶⁴ and late childhood⁶⁵. Qualitative thinning of the CC and hypomyelination in very preterm infants at term-equivalent age was associated with IQ and language formation at 4 to 6 years of age⁶³. In contrast, a recent study by Thompson *et al.*⁴⁴ reported that smaller total CC surface area in former very preterm children at 7 years of age was associated with higher intelligence and reading skills, but not language and visual function. Given the limited number of studies investigating neurodevelopmental implications of CC growth and varying cohort characteristics and age ranges therein, more research is needed to understand the long-term functional significance of altered CC size of infants with LGEA.

Several limitations should be considered when interpreting results of presented observational pilot study. (1) **Pre-Existing Findings:** None of the recruited infants had any previously known brain abnormalities or neurologic disease. However, since no pre-treatment MRI scans were available, we could not rule out the possibility of inherently altered CC structure. Our preliminary findings implicate possible pre-existing (pre-Foker) CC findings⁵³, similar to those previously reported for infants undergoing cardiac surgery and congenital diaphragmatic hernia⁴¹. (2) **Study Groups:** We lack a true control group since (1) there is no alternate treatment for LGEA that does not involve surgery, (2) there are a limited number of infants with prolonged sedation (without surgery)¹¹,

or (3) otherwise healthy preterm infants that did not require medical care. Therefore, premature infants with LGEA served as a positive control, while otherwise healthy full-term controls served as negative control in this pilot study. (3) Study Size: We had a limited number of subjects scanned at older time points (>8 months of age), particularly in that of the preterm patient group (see Table 1). Age-related changes in CC size were accounted for during statistical analysis by using a general linear model with gestation-corrected age at scan as a covariate. (4) Timing of the Brain MRI: Subjects in our one-time cross-sectional study were scanned at a wide range of corrected ages, introducing a potential bias. Future analyses should include uniform age range distribution and additional time points for brain MRI scans (e.g. pre- and post-Foker treatment). (5) Sex Differences: Unlike the balanced sex distributions in patient groups, the control group consisted of mostly males (17/20 (85%)). It remains unclear whether sex is a determinant of CC size. One study in a large cohort of neonates reported no sex differences in total cross-sectional area of the CC or its sub-regions⁴⁷. A more recent study of CC size from birth to young adulthood also found no sex differences in *absolute* total CC size, but demonstrated significant female > male trend once normalized to whole brain tissue⁴⁵. Given the limited reports on CC size in infancy, and varying age ranges of cohorts therein, future investigations are needed to establish whether sex-dependent growth patterns exist and to elucidate the precise mechanisms underlying possible postnatal sex differences of CC size.

Conclusions

This study provides evidence that both full-term and premature infants following LGEA repair are at risk of smaller *absolute* CC size. Equally important, disproportionately smaller *normalized* CC volume (relative to total brain) in both patient groups points to potential heightened vulnerability of this brain structure. In the light of the descriptive and hypothesis-generating nature of this study, future research should look into exact causative factors/mechanisms underlying observed differences including possible pre-existing (prenatal and/or pre-Foker) brain abnormalities, as well as neurodevelopmental outcomes of infants with LGEA and role of the CC as an early marker of neurodevelopment.

Received: 9 September 2019; Accepted: 26 March 2020; Published online: 14 April 2020

References

- Kunisaki, S. M. & Foker, J. E. Surgical advances in the fetus and neonate: esophageal atresia. *Clin. Perinatol.* 39, 349–361, https://doi. org/10.1016/j.clp.2012.04.007 (2012).
- Foker, J. E., Kendall Krosch, T. C., Catton, K., Munro, F. & Khan, K. M. Long-gap esophageal atresia treated by growth induction: the biological potential and early follow-up results. *Semin. Pediatr. Surg.* 18, 23–29, https://doi.org/10.1053/j.sempedsurg.2008.10.005 (2009).
- 3. Bonifacio, S. L. *et al.* Extreme premature birth is not associated with impaired development of brain microstructure. *J. Pediatr.* 157, 726–732 e721, https://doi.org/10.1016/j.jpeds.2010.05.026 (2010).
- 4. Shim, S. Y. *et al.* Altered microstructure of white matter except the corpus callosum is independent of prematurity. *Neonatology* **102**, 309–315, https://doi.org/10.1159/000341867 (2012).
- Stolwijk, L. J. et al. Neonatal Surgery for Noncardiac Congenital Anomalies: Neonates at Risk of Brain Injury. J. Pediatr. 182, 335–341 e331, https://doi.org/10.1016/j.jpeds.2016.11.080 (2017).
- 6. Mongerson, C. R. L. *et al.* Infant brain structural MRI analysis in the context of thoracic noncardiac surgery and critical care. *Front. Pediatr.* 7, 315, https://doi.org/10.3389/fped.2019.00315 (2019).
- Laing, S., Walker, K., Ungerer, J., Badawi, N. & Spence, K. Early development of children with major birth defects requiring newborn surgery. J. Paediatr. Child. Health 47, 140–147, https://doi.org/10.1111/j.1440-1754.2010.01902.x (2011).
- Stolwijk, L. J. et al. Neurodevelopmental Outcomes After Neonatal Surgery for Major Noncardiac Anomalies. Pediatrics 137, e20151728, https://doi.org/10.1542/peds.2015-1728 (2016).
- Chau, V. et al. Postnatal infection is associated with widespread abnormalities of brain development in premature newborns. Pediatr. Res. 71, 274–279, https://doi.org/10.1038/pr.2011.40 (2012).
- Mongerson, C. R. L., Jennings, R. W., Zurakowski, D. & Bajic, D. Quantitative MRI study of infant regional brain size following surgery for long-gap esophageal atresia requiring prolonged critical care. *Int. J. Dev. Neurosci.* 79, 11–20, https://doi.org/10.1016/j. ijdevneu.2019.09.005 (2019).
- Solodiuk, J. C., Jennings, R. W. & Bajic, D. Evaluation of Postnatal Sedation in Full-Term Infants. Brain Sci 9, https://doi.org/10.3390/ brainsci9050114 (2019).
- Fabri, M. & Polonara, G. Functional topography of human corpus callosum: an FMRI mapping study. Neural Plast. 2013, 251308, https://doi.org/10.1155/2013/251308 (2013).
- Malinger, G. & Zakut, H. The corpus callosum: normal fetal development as shown by transvaginal sonography. AJR Am. J. Roentgenol. 161, 1041–1043, https://doi.org/10.2214/ajr.161.5.8273605 (1993).
- 14. Iwata, S. *et al.* Region-specific growth restriction of brain following preterm birth. *Sci. Rep.* **6**, 33995, https://doi.org/10.1038/ srep33995 (2016).
- 15. Thompson, D. K. *et al.* Characterization of the corpus callosum in very preterm and full-term infants utilizing MRI. *Neuroimage* 55, 479–490, https://doi.org/10.1016/j.neuroimage.2010.12.025 (2011).
- Thompson, D. K. *et al.* Characterisation of brain volume and microstructure at term-equivalent age in infants born across the gestational age spectrum. *Neuroimage Clin.* 21, 101630, https://doi.org/10.1016/j.nicl.2018.101630 (2019).
- Peterson, B. S. *et al.* Regional brain volume abnormalities and long-term cognitive outcome in preterm infants. JAMA 284, 1939–1947, https://doi.org/10.1001/jama.284.15.1939 (2000).
- Nosarti, C. *et al.* Corpus callosum size and very preterm birth: relationship to neuropsychological outcome. *Brain* 127, 2080–2089, https://doi.org/10.1093/brain/awh230 (2004).
- Caldu, X. et al. Corpus callosum size and neuropsychologic impairment in adolescents who were born preterm. J. Child. Neurol. 21, 406–410, https://doi.org/10.1177/08830738060210050801 (2006).
- Vohr, B. R. *et al.* Beneficial effects of breast milk in the neonatal intensive care unit on the developmental outcome of extremely low birth weight infants at 18 months of age. *Pediatrics* 118, e115–123, https://doi.org/10.1542/peds.2005-2382 (2006).
- Lucas, A., Morley, R., Cole, T. J. & Gore, S. M. A randomised multicentre study of human milk versus formula and later development in preterm infants. Arch. Dis. Child. Fetal Neonatal Ed. 70, F141–146, https://doi.org/10.1136/fn.70.2.f141 (1994).
- Bairdain, S. et al. Foker process for the correction of long gap esophageal atresia: Primary treatment versus secondary treatment after prior esophageal surgery. J. Pediatr. Surg. 50, 933–937, https://doi.org/10.1016/j.jpedsurg.2015.03.010 (2015).

- Anand, K. J. et al. Analgesia and sedation in preterm neonates who require ventilatory support: results from the NOPAIN trial. Neonatal Outcome and Prolonged Analgesia in Neonates. Arch. Pediatr. Adolesc. Med. 153, 331–338 (1999).
- Dewey, W. L. Various factors which affect the rate of development of tolerance and physical dependence to abused drugs. NIDA Res. Monogr. 54, 39–49 (1984).
- Vet, N. J., Kleiber, N., Ista, E., de Hoog, M. & de Wildt, S. N. Sedation in Critically Ill Children with Respiratory Failure. Front. Pediatr. 4, 89, https://doi.org/10.3389/fped.2016.00089 (2016).
- Hodkinson, D. J., Mongerson, C. R. L., Jennings, R. W. & Bajic, D. Neonatal functional brain maturation in the context of perioperative critical care and pain management: A case report. *Heliyon* 5, e02350 (2019).
- Almli, C. R., Rivkin, M. J. & McKinstry, R. C. & Brain Development Cooperative, G. The NIH MRI study of normal brain development (Objective-2): newborns, infants, toddlers, and preschoolers. *Neuroimage* 35, 308–325, https://doi.org/10.1016/j. neuroimage.2006.08.058 (2007).
- Raschle, N. et al. Pediatric neuroimaging in early childhood and infancy: challenges and practical guidelines. Ann. N. Y. Acad. Sci. 1252, 43–50, https://doi.org/10.1111/j.1749-6632.2012.06457.x (2012).
- Tocchio, S., Kline-Fath, B., Kanal, E., Schmithorst, V. J. & Panigrahy, A. MRI evaluation and safety in the developing brain. Semin. Perinatol. 39, 73–104, https://doi.org/10.1053/j.semperi.2015.01.002 (2015).
- Paterson, S. J., Badridze, N., Flax, J. F., Liu, W. C. & Benasich, A. A. A Protocol for Structural MRI Scanning of Non-Sedated Infants. Proc. J. Cogn. Neurosci. 15, F124 (2004).
- Plecko, B. et al. Degree of hypomyelination and magnetic resonance spectroscopy findings in patients with Pelizaeus Merzbacher phenotype. Neuropediatrics 34, 127–136, https://doi.org/10.1055/s-2003-41276 (2003).
- Yushkevich, P. A. et al. User-guided 3D active contour segmentation of anatomical structures: significantly improved efficiency and reliability. Neuroimage 31, 1116–1128, https://doi.org/10.1016/j.neuroimage.2006.01.015 (2006).
- 33. Mai, J. K., Assheuer, J. & Paxinos, G. Atlas of the Human Brain, 4th Edition. (Academic Press, 2015)
- Wakana, S., Jiang, H., Nagae-Poetscher, L. M., van Zijl, P. C. & Mori, S. Fiber tract-based atlas of human white matter anatomy. *Radiology* 230, 77–87, https://doi.org/10.1148/radiol.2301021640 (2004).
- Narberhaus, A. *et al.* Gestational age at preterm birth in relation to corpus callosum and general cognitive outcome in adolescents. J. Child. Neurol. 22, 761–765, https://doi.org/10.1177/0883073807304006 (2007).
- Yu, X. et al. Comprehensive brain MRI segmentation in high risk preterm newborns. PLoS One 5, e13874, https://doi.org/10.1371/ journal.pone.0013874 (2010).
- Zhang, Y., Brady, M. & Smith, S. Segmentation of brain MR images through a hidden Markov random field model and the expectation-maximization algorithm. *IEEE Trans. Med. Imaging* 20, 45–57, https://doi.org/10.1109/42.906424 (2001).
- Matthews, L. G. et al. Brain growth in the NICU: critical periods of tissue-specific expansion. Pediatr. Res. 83, 976–981, https://doi. org/10.1038/pr.2018.4 (2018).
- Volpe, J. J. The encephalopathy of prematurity-brain injury and impaired brain development inextricably intertwined. Semin. Pediatr. Neurol. 16, 167–178, https://doi.org/10.1016/j.spen.2009.09.005 (2009).
- 40. Dubois, J. et al. The early development of brain white matter: a review of imaging studies in fetuses, newborns and infants. *Neuroscience* 276, 48–71, https://doi.org/10.1016/j.neuroscience.2013.12.044 (2014).
- Hagmann, C., Singer, J., Latal, B., Knirsch, W. & Makki, M. Regional Microstructural and Volumetric Magnetic Resonance Imaging (MRI) Abnormalities in the Corpus Callosum of Neonates With Congenital Heart Defect Undergoing Cardiac Surgery. J. Child. Neurol. 31, 300–308, https://doi.org/10.1177/0883073815591214 (2016).
- Nagaraj, U. D. et al. Impaired Global and Regional Cerebral Perfusion in Newborns with Complex Congenital Heart Disease. J. Pediatr. 167, 1018–1024, https://doi.org/10.1016/j.jpeds.2015.08.004 (2015).
- Biffen, S. C. et al. Reductions in Corpus Callosum Volume Partially Mediate Effects of Prenatal Alcohol Exposure on IQ. Front. Neuroanat. 11, 132, https://doi.org/10.3389/fnana.2017.00132 (2017).
- Thompson, D. K. et al. Accelerated corpus callosum development in prematurity predicts improved outcome. Hum. Brain Mapp. 36, 3733–3748, https://doi.org/10.1002/hbm.22874 (2015).
- Tanaka-Arakawa, M. M. *et al.* Developmental changes in the corpus callosum from infancy to early adulthood: a structural magnetic resonance imaging study. *PLoS One* 10, e0118760, https://doi.org/10.1371/journal.pone.0118760 (2015).
- Mulkey, S. B. et al. Quantitative cranial magnetic resonance imaging in neonatal hypoxic-ischemic encephalopathy. Pediatr. Neurol. 47, 101–108, https://doi.org/10.1016/j.pediatrneurol.2012.05.009 (2012).
- 47. Hwang, S. J. et al. Gender differences in the corpus callosum of neonates. Neuroreport 15, 1029-1032 (2004).
- Aslanabadi, S. et al. Associated congenital anomalies between neonates with short-gap and long-gap esophageal atresia: a comparative study. Int. J. Gen. Med. 4, 487–491, https://doi.org/10.2147/IJGM.S19301 (2011).
- Corsello, G. & Giuffre, L. VACTERL with hydrocephalus: a further case with probable autosomal recessive inheritance. Am. J. Med. Genet. 49, 137–138, https://doi.org/10.1002/ajmg.1320490133 (1994).
- Iafolla, A. K., McConkie-Rosell, A. & Chen, Y. T. VATER and hydrocephalus: distinct syndrome? Am. J. Med. Genet. 38, 46–51, https://doi.org/10.1002/ajmg.1320380112 (1991).
- Genuardi, M., Chiurazzi, P., Capelli, A. & Neri, G. X-linked VACTERL with hydrocephalus: the VACTERL-H syndrome. Birth Defects Orig. Artic. Ser. 29, 235–241 (1993).
- Chung, B. et al. From VACTERL-H to heterotaxy: variable expressivity of ZIC3-related disorders. Am. J. Med. Genet. A 155A, 1123–1128, https://doi.org/10.1002/ajmg.a.33859 (2011).
- Rudisill, S. S. et al. Neurologic injury and brain growth in the setting of long-gap esophageal atresia perioperative critical care: A pilot study. Brain Sci, https://doi.org/10.3390/brainsci9120383 (2019).
- Thompson, D. K. et al. Corpus callosum alterations in very preterm infants: perinatal correlates and 2 year neurodevelopmental outcomes. Neuroimage 59, 3571–3581, https://doi.org/10.1016/j.neuroimage.2011.11.057 (2012).
- Parikh, N. A., Kennedy, K. A., Lasky, R. E., McDavid, G. E. & Tyson, J. E. Pilot randomized trial of hydrocortisone in ventilatordependent extremely preterm infants: effects on regional brain volumes. J. Pediatr. 162, 685–690 e681, https://doi.org/10.1016/j. jpeds.2012.09.054 (2013).
- Zhou, J. et al. Axon position within the corpus callosum determines contralateral cortical projection. Proc. Natl Acad. Sci. USA 110, E2714–2723, https://doi.org/10.1073/pnas.1310233110 (2013).
- Fields, R. D. White matter in learning, cognition and psychiatric disorders. *Trends Neurosci.* 31, 361–370, https://doi.org/10.1016/j. tins.2008.04.001 (2008).
- Michalski, J. P. & Kothary, R. Oligodendrocytes in a Nutshell. Front. Cell Neurosci. 9, 340, https://doi.org/10.3389/fncel.2015.00340 (2015).
- 59. Paus, T. et al. Structural maturation of neural pathways in children and adolescents: in vivo study. Science 283, 1908–1911 (1999).
- Casey, B. J., Giedd, J. N. & Thomas, K. M. Structural and functional brain development and its relation to cognitive development. *Biol. Psychol.* 54, 241–257 (2000).
- Duerden, E. G. et al. White matter injury predicts disrupted functional connectivity and microstructure in very preterm born neonates. *Neuroimage Clin.* 21, 101596, https://doi.org/10.1016/j.nicl.2018.11.006 (2019).
- Malavolti, A. M. et al. Association between corpus callosum development on magnetic resonance imaging and diffusion tensor imaging, and neurodevelopmental outcome in neonates born very preterm. Dev. Med. Child. Neurol. 59, 433–440, https://doi. org/10.1111/dmcn.13364 (2017).

- Woodward, L. J., Clark, C. A., Bora, S. & Inder, T. E. Neonatal white matter abnormalities an important predictor of neurocognitive outcome for very preterm children. *PLoS One* 7, e51879, https://doi.org/10.1371/journal.pone.0051879 (2012).
- Anderson, N. G., Laurent, I., Woodward, L. J. & Inder, T. E. Detection of impaired growth of the corpus callosum in premature infants. *Pediatrics* 118, 951–960, https://doi.org/10.1542/peds.2006-0553 (2006).
- Rademaker, K. J. et al. Larger corpus callosum size with better motor performance in prematurely born children. Semin. Perinatol. 28, 279–287 (2004).
- 66. Paxinos, G. & Watson, C. The rat brain in stereotaxic coordinates. 4th edn, (Academic Press, 1998).

Acknowledgements

This work was supported by the NIDA K08 DA035972-01 and *Trailblazer Award* from the Department of Anesthesiology, Critical Care and Pain Medicine, Boston Children's Hospital (DB). The authors express tremendous gratitude to infants and their parents for participation in our study. Authors would also like to thank: (i) Dorothy Gallagher, RN and Jean Solodiuk, RN, PhD for their help with recruitment; (ii) Kristina Pelkola, BS, RT and Dianne Biagotti, BS, RT for facilitating MRI scheduling in the evenings and week-ends; (iii) All MRI technologists for their invaluable help with scanning; (iv) Colleagues from the Computational Radiology Laboratory at Boston Children's Hospital for their technical support, and last but not least (v) Oliver Yan, BS for help with text editing. The content of this article is solely the responsibility of the authors and does not necessarily represent the official views of the National Institutes of Health.

Author contributions

Authorship credit was based on substantial contributions to (1) the conception and manuscript design (C.R.L.M. and D.B.); (2) acquisition (C.R.L.M., C.J., R.W.J. and D.B.), analysis (C.R.L.M., C.J., D.Z. and D.B.), or interpretation of data (all authors); (3) drafting the article (C.R.L.M. and D.B.) or critical revision for important intellectual content (all authors); (4) final approval of the version to be published (all authors); and (5) are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved (all authors).

Competing interests

The authors declare no competing interests.

Additional information

Correspondence and requests for materials should be addressed to D.B.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit http://creativecommons.org/licenses/by/4.0/.

© The Author(s) 2020