Structural and functional asymmetry of the neonatal cerebral cortex

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Features of brain asymmetry have been implicated in a broad range of cognitive processes; however, their origins are still poorly understood. Using a new left-right symmetric, spatiotemporal cortical surface atlas, we investigated cortical asymmetries in 442 healthy newborn infants soon after birth, using structural and functional magnetic resonance images from the Developing Human Connectome Project. We identified previously unrecognised structural and functional asymmetries in auditory, visual and sensorimotor cortices, which closely resemble known asymmetries in adults. These findings show that cortical asymmetries are largely determined prenatally and suggest that they may constrain the development of lateralised functions in later life. In adults, deviations in brain asymmetry have been implicated in a broad range of developmental and psychiatric disorders, some of which have been associated with abnormal perinatal neurodevelopment. To test the hypothesis that normal cortical asymmetry is disrupted in the perinatal period by severe environmental stress, we compared cortical asymmetries between the same group of term neonates and 103 preterm neonates imaged at term-equivalent age. No significant differences were seen between these two cohorts, showing that the development of cortical asymmetries proceeds largely unaffected by preterm birth.

developing human connectome project | cortical surface | asymmetry | resting-state networks | preterm birth

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Introduction

Asymmetry is an important feature of human brain organisation (1), implicated in a number of cognitive processes including language (2, 3) and face processing (4). Moreover, changes to typical brain asymmetry have been associated with neurodevelopmental and psychiatric disorders including autism spectrum disorder (5, 6), schizophrenia (7, 8), obsessive-compulsive disorder (9), attention-deficit hyperactivity disorder (10), and dyslexia (11). However, the origins of these asymmetries (12) and the factors affecting their development (13) remain poorly understood.

Using magnetic resonance imaging (MRI) to characterise

cortical asymmetries in the neonatal period can help clarify their ontogenesis (14). Previous work has investigated structural (15–22) and functional (23–25) asymmetries in the perinatal period and early infancy. As is seen in adults (20), term and preterm neonatal brains exhibit leftward volume (left greater than right) and sulcal depth (left deeper than right) asymmetry (19, 20, 22) in regions important for processing language. Functional asymmetries, measured using task-based functional MRI (fMRI), are also present at birth and during infancy, and include lateralised responses to speech (25, 26) and music (23).

Although these studies have greatly advanced our understanding of brain asymmetry in early life, they have important limitations. Volumetric-based analyses (15, 22–25) fail to capture the structural and functional heterogeneity of the cortex, due to residual misalignment between cortical folds during registration (27, 28). In the case of fMRI, this leads to leakage of blood-oxygen-level-dependent signal across adjacent cortical folds (29). Additionally, previous surface-based approaches register individual subject cortical surfaces to a single group template directly from their native space (19, 20). This is undesirable as the deformations required for registration increase as the age difference between the subject and the template increases, to properly account for the marked changes in cortical morphology that characterise perinatal brain development (30–32).

The Developing Human Connectome Project (dHCP) is an open-science project, which has advanced image acquisition and processing to produce a large cross-sectional set of multimodal MRI data in neonates between 24–45 weeks' postmenstrual age (PMA). Here we present a new left-right symmetric, surface-based spatiotemporal atlas that models population average changes in cortical morphology between 28–44 weeks' PMA. After surface-based registration to this new template, we investigated structural asymmetry in 442 healthy term-born neonates at a vertex-wise level using permutation testing. As there are only a limited number of studies directly testing for functional asymmetry in the neonatal

tal period (33), we also investigated asymmetries of intrinsic cortical activity using resting-state fMRI (rs-fMRI) mapped to the cortical surface.

Finally, it is well known that neurodevelopment in preterm neonates (born < 37 weeks' gestational age (GA)) is characterised by dysmaturation (34, 35), and that those born preterm have poorer long-term developmental and behavioural outcomes compared to their term-born counterparts (36–39). By comparing cortical asymmetries between the same 442 term-born neonates and 103 preterm neonates at term-equivalent age (TEA), we directly tested the impact of early life environmental perturbations on the development of structural and functional asymmetry in the newborn brain.

Results

Structural Asymmetries in the Healthy Term Neonatal Brain. Significant regions of sulcal depth, surface area and cortical thickness asymmetry are shown in Figure 1a, with corresponding *t*-statistic maps in Figure S1a.

Asymmetries were observed in several sulci on the lateral and medial hemispheric surface. On the lateral surface, leftward asymmetry (left deeper than right) was observed for the anterior and posterior lateral fissure. There was also rightward asymmetry (right deeper than left) of the middle portion of the superior temporal sulcus. On the medial hemispheric surface, there was leftward asymmetry of the calcarine sulcus and rightward asymmetry of the parieto-occipital sulcus.

Regarding surface area, on the lateral hemispheric surface there were leftward asymmetries (left > right) located in the anterior lateral fissure, supramarginal, postcentral, and inferior temporal gyri, and occipital pole. There were rightward asymmetries (right > left) located in the superior and middle temporal, rostral middle frontal, and inferior frontal gyri, and insula. On the medial hemispheric surface, there were leftward asymmetries in the isthmus of the cingulate gyrus and rostral anterior cingulate gyrus. There were also rightward asymmetries in the parieto-occipital sulcus, lingual and caudal anterior cingulate gyri.

For cortical thickness, on the lateral hemispheric surface there were leftward asymmetries (left > right) located in the insula, posterior lateral fissure, supramarginal and angular gyri, lateral aspect of the central sulcus, pre- and postcentral gyri, and occipital pole. There were also rightward asymmetries (right > left) located in the superior and middle temporal gyri. On the medial surface, there were rightward asymmetries located in the calcarine and parieto-occipital sulci, precuneus and caudal aspect of the superior frontal gyrus.

Functional Asymmetry in the Healthy Term Neonatal Brain. Group independent component analysis (ICA) on the cortical surface generated 11 resting-state networks (RSNs), which are shown in Figure S2. Significant asymmetries were found in seven of these RSNs (Figure 1b), with corresponding *t*-statistic maps in Figure S1b.

In the medial motor RSN, a leftward asymmetric region was located in the dorsolateral aspect of the central sulcus, and a rightward asymmetric region in the dorsomedial aspect of the

central sulcus. The lateral motor RSN had a leftward asymmetric region located in the midportion of the central sulcus and a rightward asymmetric region located in the inferolateral aspect of the central sulcus. For the somatosensory RSN, the leftward asymmetric region was located in the midportion of the postcentral gyrus, and the rightward asymmetric region in the inferolateral aspect of the postcentral gyrus. A single rightward asymmetric region was located in the dorsomedial aspect of the precentral gyrus in the motor association RSN. Asymmetry in the auditory RSN comprised a leftward asymmetric region located along the anterior end of the superior temporal gyrus and a rightward asymmetric region at the posterior end of the superior temporal gyrus and lateral fissure. The visual RSN consisted of a single rightward asymmetric region located on the medial aspect of the occipital lobe. Rightward asymmetry in the parietal RSN was localised to the subparietal sulcus and dorsal aspect of the precuneus. To test if residual differences in individual sulcal depth asymmetry affected functional asymmetry, we performed an additional experiment where single subject sulcal depth asymmetry maps were included as a per-vertex explanatory variable (see Methods: Statistical Analysis). Residual sulcal depth asymmetries had minimal impact on the spatial extent and significance of regions of functional asymmetry (Figures S3 and S4).

Effect of Preterm Birth. There were no significant differences in structural or functional asymmetries between preterm- and term-born neonates at TEA. Corresponding *p*-value and *t*-statistic spatial maps are shown in Figures S5 and S6, respectively.

Discussion

This paper details the largest investigation into the development of cortical asymmetries in the newborn brain to date; the first to simultaneously investigate asymmetries in cortical morphology and intrinsic cortical activity (as assessed with rs-fMRI); and the first to directly measure the impact of preterm birth on their development. The assessment of cortical asymmetries was contingent on accurate correspondence of features between hemispheres and across individuals, which was achieved through: 1) development of a novel left-right symmetric, spatiotemporal cortical surface atlas (based on work described in (32) and (40)), and 2) biomechanically-constrained surface registration to this template using Multimodal Surface Matching (MSM) (41, 42) and template-to-template registration (30).

Our findings are consistent with previous volumetric-based studies in neonates and adults investigating structural and functional asymmetry. We replicated rightward asymmetry of the middle portion of the superior temporal sulcus, which has been demonstrated in fetuses (16, 17), preterm and term neonates (18–20, 43), infants (21), children (44) and adults (45). In addition, patterns of cortical surface area and thickness seen here closely resemble those seen in adults (46), as surface area asymmetries were consistent in the superior and middle temporal gyri, inferior and middle frontal gyri,

Fig. 1. Structural (a) and functional (b) asymmetries in the healthy term-born neonatal cortex at term-equivalent age. Leftward asymmetries are represented by the red-yellow colour scale and rightward asymmetries by the blue-light blue colour scale. Significantly asymmetric regions are visualised on a very inflated 40-week PMA left hemispheric surface, overlaid on a 40-week PMA sulcal depth template (grey scale colour scheme). Off-white lines surrounding the functional asymmetries represent the mask used to threshold single subject asymmetry maps (see [Methods: Generating Asymmetry Maps](#)). Data at <https://balsa.wustl.edu/wNlvv>.

inferior postcentral gyrus, supramarginal gyrus, caudal anterior and posterior cingulate gyri, medial occipital lobe, precuneus, and anterior insula; and cortical thickness asymmetries were consistent in the superior and middle temporal gyri, middle and superior frontal gyri, and precentral gyrus (46).

Although functional asymmetries have not previously been investigated using surface-based analyses, our findings are consistent with volumetric-based studies in neonates and adults. Studies investigating language using speech stimuli in task-based fMRI have shown leftward asymmetric activation in the primary auditory cortex of infants (25, 26), children (47) and adults (2, 3). On the other hand, studies in neonates have shown that music evoked predominantly right-hemispheric activation in primary and association auditory cortices (23). These findings are consistent with studies in adults demonstrating that the left auditory cortex is specialised for resolving temporal changes (for instance, discriminating between syllables), whilst the right auditory cortex is specialised for resolving changes in pitch (48–50). We also demonstrated, for the first time using rs-fMRI, rightward asymmetry of the visual network in the neonatal period. This is consistent with volumetric-based functional asymmetry studies in adults that show rightward asymmetry of primary and association visual networks (51, 52).

The marked similarity in structural and functional asymmetries between neonates and adults suggest that cortical asymmetries are broadly conserved. It is possible that such conservation is, at least in part, genetically determined. Recent work investigating the genomic loci underpinning brain asymmetries has implicated genes that are expressed during prenatal brain development (53), which are involved in molecular pathways responsible for left-right axis patterning in vertebrates (53), visual and auditory pathway development (54), neural activity during development of the so-

matosensory cortex (55), and regulation of axonal guidance and synaptogenesis (56). There is also evidence that gene expression during prenatal brain development is asymmetric (57).

Whilst genetic factors likely play a role in driving these asymmetries, they do not fully account for why these asymmetries, particularly functional asymmetries, are present at birth. One possibility relates to the idea that structural and functional connectivity precede and constrain the development of a functional region (as defined by task-based fMRI) (58). First demonstrated in the context of the visual word form area (58), there is now emerging evidence that structural and functional connectivity preceding task-based function may represent a general mechanism of cortical development (59, 60). Our results could represent an extension of this mechanism, whereby asymmetric functional connectivity precedes asymmetric task-based function in the auditory, visual and somatosensory networks.

Until now, studies demonstrated either leftward (25, 26) or rightward (23) functional asymmetry in the auditory cortex of neonates. To our knowledge, this is the first time that both leftward and rightward asymmetry in the auditory network have been demonstrated together. The marked rightward asymmetry observed in the primary auditory cortex may indicate that the ability to resolve changes in pitch, rather than temporal changes, is more important for language acquisition in the neonatal period. The leftward asymmetry of the auditory network seen in children (47) and adults (51) might then represent a developmental shift, where there is an increase in the importance of temporal information relative to pitch information for language development during childhood and adolescence. A recent finding that individuals diagnosed with autism spectrum disorder have reduced leftward asymmetry of the language network (61) suggests that disruption to this developmental shift in asymmetry may con-

tribute to language difficulties later on.

It is well established that there is a right-hemispheric preference for face processing (62). Using electroencephalography, rightward asymmetric responses to face-like stimuli have been observed in the occipitotemporal region in neonates (63) and infants (64). Using MRI, it has also been shown that resting-state functional connectivity underlying the cortical face processing is present at birth (60), and by 4-6 months, infants demonstrated face-selective responses in the fusiform-face area (65, 66). These findings suggest that the rightward asymmetry of the visual network in neonates may underlie the right hemispheric specialisation of face processing seen in infancy and later life.

Both lateral sensorimotor and somatosensory networks displayed similar functional asymmetry patterns, which might relate to the somatotopic organisation of the sensorimotor cortex in neonates (67–69). Specifically, the somatosensory and lateral motor networks showed leftward asymmetry in the upper limb region of the somatotopic map (67). It has been shown that leftward lateralisation of motor network connectivity was associated with better motor performance in children (70), and that motor circuit connectivity in children diagnosed with autism spectrum disorder was more rightward asymmetric compared to children without autism spectrum disorder (71). This asymmetry may also relate to handedness, as genomic loci associated with handedness (72, 73) are also associated with brain asymmetry and are expressed during prenatal brain development (53). Further evidence implicating asymmetry of sensorimotor cortices with handedness comes from (46), who found that reduced leftward asymmetry of cortical thickness in the upper limb region of the postcentral gyrus was significantly associated with left-handedness.

Not all of the functional asymmetries seen in adults (51) were present in neonates. Here, the symmetric networks were all association networks, consistent with previous work demonstrating that the maturation of RSNs in neonates follows a sequence of primary-to-association (74–77). Moreover, as these networks have been associated with higher-order cognitive processes in adults, the emergence of asymmetries in these networks may be more experience-dependent. For instance, functional asymmetry in the frontal cortex has been associated with emotional regulation (78, 79), reward responses (80) and cognitive set shifting (the process of consciously redirecting attention) (81); asymmetry in the visual association RSN might be related to rightward asymmetry of biological motion processing (82); and asymmetry in the temporoparietal network might relate to belief reasoning (reasoning about the content of others' mental states) (83). Further research is required to establish how functional asymmetries at birth relate to cognition and behaviour in later life. Given the marked impact that preterm birth has on cortical morphology (84–86) and functional connectivity (75, 77, 87, 88), it was surprising to find no differences in cortical asymmetry between preterm and term-born neonates at TEA. This is in contrast to (33), who found differences in functional asymmetry between preterm and term-born neonates at TEA.

However, that study was limited by relatively small sample sizes (33). Moreover, previous work has shown that structural asymmetries in preterm (18) and term (19, 20) neonates are similar, and recently, (89) reported no differences in white matter asymmetry between preterm and term-born neonates at TEA. Together, these findings indicate that brain asymmetries may be robust to the effects of preterm birth, and that "multiple hits" are required to disrupt brain asymmetry (for example, preterm birth *and* polygenic risk) (90, 91). This may explain why cortical asymmetry is altered in psychiatric and neurodevelopmental disorders like schizophrenia (7, 8) and autism spectrum disorder (5, 6), which have complex and multifactorial aetiologies (92, 93).

Limitations. The variability in sulcal morphology between subjects, and between hemispheres, meant that the surface-based template could not be perfectly symmetric, potentially biasing the results of the other structural and functional features. Although it was not possible to include sulcal depth asymmetry as a per-vertex explanatory variable in our main analyses due to limited compute power, we conducted a separate experiment that demonstrated this residual variability had minimal impact on the results (Figures S7 and S8). Moreover, cortical surfaces were registered to a symmetric template using sulcal depth maps, which may have impacted the investigation of functional asymmetry, particularly in cortical regions where structural and functional correspondence is poor (94). Even though asymmetries in some association RSNs were observed here, it is possible that asymmetries in other association RSNs were not detected as a result of registering to a structural surface-based template. As such, further exploration of functional asymmetry using functional alignment is warranted, and may give insight into the development of higher order cognitive processes.

Conclusion

The structural and functional asymmetries of the neonatal cortex are likely the result of prenatal genetic factors, which are robust to early life environmental perturbations. Moreover, the asymmetric organisation of cortical structure and function at birth may constrain the development of lateralised cognitive processes and behaviours such as language and face processing.

Materials and Methods

Participants. Neonates were participants in the dHCP, approved by the National Research Ethics Committee (REC: 14/Lo/1169), and were scanned at the Evelina Newborn Imaging Centre, Evelina London Children's Hospital between 2015 and 2019. Term neonates were included if they were born between 37⁺⁰ and 41⁺⁶ weeks' GA, if they were scanned $\geq 37^{+0}$ weeks' PMA, and if both structural and functional data were available. Preterm neonates were included if they were born $<37^{+0}$ weeks' GA, if they were scanned $\geq 37^{+0}$ PMA, and if both structural and functional data were available. Both term and preterm neonates were

excluded if their scans had incidental findings with possible/likely significance for both clinical and imaging analysis (e.g. destructive white matter lesions). However, incidental findings with possible clinical significance but unlikely analysis significance were permissible (95). Data from 442 healthy term-born neonates (200 females), and 103 preterm-born neonates (48 females) were included. Term neonates were born at 39.9 ± 1.2 weeks' GA, and scanned at 41.2 ± 1.7 weeks' PMA. Preterm neonates were born at 32.1 ± 3.5 weeks' GA, and scanned at 40.8 ± 2.1 weeks' PMA. Figure 2 shows the distribution of GA and PMA for both preterm and term neonates.

Fig. 2. Gestational age at birth and postmenstrual age at scan for preterm and term-born neonates

MRI Acquisition. MRIs were acquired in a single scan session for each neonate using a 3-Tesla Philips Achieva system (Philips Medical Systems, Best, The Netherlands). Full details regarding the preparation of neonates for scanning have been previously described (96). In brief, all neonates were scanned without sedation in a scanner environment optimised for neonatal imaging, including a dedicated 32-channel neonatal coil. MR-compatible ear putty and earmuffs were used to provide additional noise attenuation. Neonates were fed, swaddled and positioned in a vacuum jacket prior to scanning to promote natural sleep. All scans were supervised by a neonatal nurse and/or paediatrician who monitored heart rate, oxygen saturation and temperature throughout the scan (96).

T2-weighted scans were acquired with a repetition time/echo time (TR/TE) of 12s/156ms, SENSE=2.11/2.58 (axial/sagittal) with in-plane resolution of 0.8x0.8mm, slice thickness of 1.6 and overlap of 0.8mm. Images were motion corrected and super-resolution reconstructed resulting in 0.5mm isotropic resolution (full details in (97)). fMRI scans were acquired over 15 minutes 3 seconds (2300 volumes) us-

ing a multislice gradient-echo echo planar imaging sequence with multiband excitation (multiband factor 9). TR/TE was 392ms/38ms milliseconds, flip angle was 34°, and the acquired spatial resolution was 2.15mm isotropic (98, 99).

Surface Extraction. The full details of the structural pipeline are described in (100). In summary, motion-corrected, reconstructed T2-weighted images were first bias-corrected and brain-extracted. Following this, images were segmented into different tissue types using the Draw-EM algorithm (100). Next, topologically correct white matter surfaces were fit first to the grey-white tissue boundary and then to the grey-white interface of the MR intensities (101). Pial surfaces were generated by expanding each white matter mesh towards the grey-cerebrospinal fluid interface (100, 101). Separately, an inflated surface was generated from the white surface through a process of inflation and smoothing. This inflated surface was then projected to a sphere to support surface registration. The structural pipeline generated a number of univariate features summarising cortical morphology. Of these we used: cortical thickness (estimated as the Euclidean distance between corresponding vertices on the white and pial surfaces); sulcal depth (estimates of mean surface convexity/concavity (100)); and surface area, estimated for each vertex as one third the area of each triangle it is a part of. Cortical thickness and surface area were corrected for folding bias by regressing out cortical curvature, which is the same approach as the Human Connectome Project pipeline (102).

Creating Left-Right Symmetric Surface Atlas. A prerequisite for investigating cortical asymmetry at a vertex-wise level is registration to a single template space with left-right vertex-wise correspondence. Moreover, to account for rapid morphological changes in the neonatal brain, registration to a template space should be achieved using template-to-template registration with a spatiotemporal atlas. To achieve this, the pre-existing dHCP spatiotemporal atlas (32) was extended, both to increase the age range covered by the template to 28-44 weeks' PMA, and to enforce left-right symmetry of cortical shape (Figure 3).

This was achieved using MSM (41, 42) to co-register the left and right sulcal depth maps from each week of the atlas in (32). In each case, registration was run in left-to-right and right-to-left directions (replicating the approach used in (40)). Deformation maps of the left-to-right and the inverse of the right-to-left registrations were then averaged to generate an intermediate symmetric template space. Local non-symmetric template metrics (sulcal depth, surface area and cortical thickness) and anatomical meshes (in fs_LR space; (32)) were then resampled onto their corresponding symmetric template. Finally, consecutive registrations were performed between local symmetric templates to achieve a local-to-40-week PMA registration deformation (30, 31). A further resampling step was then performed, to get local template metrics and anatomical meshes into 40-week PMA symmetric template space.

Fig. 3. (a) Development of symmetric surface-based atlas. (i) Using MSM, the left and right hemispheres from each week of the (32) atlas were co-registered in order to generate left-right vertex correspondence of coarse scale patterns of cortical folding (sulcal depth). Registration was run in left-to-right and right-to-left directions. (ii) Deformation maps of the left-to-right and the inverse of the right-to-left registrations were averaged to generate an intermediate symmetric template space. (iii) Local non-symmetric template metrics and anatomical meshes were resampled into their corresponding symmetric template (dhcpSym). Consecutive registrations between local symmetric templates were then performed to achieve a local to 40-week PMA registration deformation. A further resampling step was performed to get local template metrics and anatomical meshes into 40-week PMA symmetric template space (dhcpSym40). (b) Difference between left and right 40-week PMA sulcal depth metrics for the previous non-symmetric (fs_LR) template and the new symmetric (dhcpSym) template.

Registration to Symmetric Surface Atlas. To accurately map structural asymmetry across all parts of the cortex, registration was run from all subjects' native space to their local symmetric template space, using MSM (41, 42), optimised for alignment of sulcal depth features. Here, MSM regularisation was reduced relative to (32) to encourage improved alignment of sulcal morphology in the frontal lobes (a region with high anatomical inter-individual variability). Subject metrics were subsequently resampled from their local template to the 40-week PMA template cortical surface, using the local-to-40 week PMA registration deformations described in [Methods: Creating Left-Right Symmetric Surface Atlas](#).

rs-fMRI Preprocessing. We extended the dHCP functional pipeline (99) to the cortical surface by projecting individual subject rs-fMRI timeseries from the native rs-fMRI volume space to native subject surfaces warped into rs-fMRI volu-

metric space, using a ribbon-constrained volume-to-surface mapping method similar to the Human Connectome Project pipeline (102). These surface rs-fMRI maps were then resampled onto the 40-week PMA symmetric surface template space using the MSM native-to-template space registration deformations. After resampling to symmetric surface space, rs-fMRI timeseries were smoothed with a kernel of $\sigma = 4\text{mm}$.

Dimensionality reduction prior to group ICA was achieved using MELODIC's Incremental Group PCA (MIGP) (103) with a dimensionality set at 2000. Using a group ICA, dual-regression approach, asymmetry observed in a dual-regressed single subject spatial map does not represent asymmetry in that individual *per se*, but instead represents group asymmetry that is then projected onto that individual's data. To remove this bias from the dual-regressed, single subject spatial maps, we generated symmetric group components by concatenating the left hemispheric MIGP output to the right

hemispheric MIGP output, and vice versa. This approach was only possible because our symmetric surface template had left-right vertex correspondence. Following the left-to-right and right-to-left concatenation of the MIGP output, surface-based group ICA was performed (set at a dimensionality of 25) (104). Group components were then dual-regressed (105, 106) to generate subject-level spatial maps. Of the 25 group components, 11 were labelled as signal (Figure S2). MIGP and group ICA were performed on the term neonatal cohort, and single subject spatial maps for the preterm cohort were generated by dual-regressing the term neonatal group components into the rs-fMRI timeseries of each preterm neonate scanned at TEA.

Generating Asymmetry Maps. Asymmetry maps for each cortical imaging metric (structural and functional) were generated by subtracting the right hemisphere metric from the corresponding left hemisphere metric, then normalising as $(L - R)/((L + R)/2)$. Structural asymmetry maps were smoothed with a kernel size of $\sigma = 2\text{mm}$ to improve signal-to-noise ratio, but no further smoothing of the functional asymmetry maps was performed. Individual functional asymmetry maps were then thresholded with masks that were generated by thresholding each symmetric group component at $Z > 3.1$. Individual functional asymmetry maps were masked after dual regression to ensure that all subject asymmetry maps for a given component had the same spatial extent, as required by FSL PALM (107, 108).

Statistical Analysis. Statistical analysis was performed using surface-based, vertex-wise permutation testing (FSL PALM, version alpha119¹; (107, 108)) with threshold-free cluster enhancement (TFCE; (109)). GA at birth, PMA at scan, biological sex, birthweight Z-score, and hemispheric volume asymmetry (normalised as $(L - R)/((L + R)/2)$) were included as explanatory variables. As the time between birth and scan was variable, both GA and PMA were included as explanatory variables for the term asymmetry analysis. However, GA was removed in the preterm vs. term comparison, since the objective of this experiment was to test for the effect of age at birth. As it cannot be assumed that all term neonates are healthy, birthweight Z-score was included alongside GA as an additional, albeit imperfect, explanatory variable to account for neonatal health at birth. Birthweight Z-scores were calculated using growth curves from (110)², which returned birthweight Z-scores specific for GA and biological sex. Although (111) found greater cortical asymmetry in adults with larger overall brain size, total brain volume was not included as an additional explanatory variable as it is highly correlated with both GA and PMA (32, 100, 112). Instead, we included hemispheric volume asymmetry as an additional explanatory variable, as it has been previously shown that left hemisphere has greater volume than right (15). To investigate the impact of residual structural asymmetry on functional asymmetries, a separate analysis was per-

formed where individual sulcal depth asymmetry maps were included as a separate per-vertex explanatory variable³ using the *-evperdat* and *-designperinput* flags in FSL PALM (107). Due to limitations in compute power, the number of RSNs included in this analysis was limited to four.

TFCE was performed on the group average midthickness anatomical surface, with the default H (2.0) and E (0.6) parameters (109), which are also the same as those reported in (20). Two one-sample t -tests were used to investigate asymmetry in the term neonates (C1: left > right, and C2: right > left), and two two-sample unpaired t -tests were used to investigate differences in asymmetry between term and preterm neonates at TEA (C1: term > preterm, and C2: preterm > term). Family-wise error rate corrections were applied to p -values across image features and design contrasts. p -values were computed based on 10,000 random shuffles, with statistical significance set at $p_{mcfwe} < 0.05$ (113, 114).

Data and Code Availability. Both the left-right symmetric, spatiotemporal cortical surface atlas⁴, and code used to register cortical surfaces from native space to 40-week symmetric space⁵ have been made freely available. The data and scenes used to produce the figures presented here are available from <https://balsa.wustl.edu/study/L6nnx>.

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