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# **Multifaceted atlases of the human brain in its infancy**

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**Supplementary Fig. 1** | **Neurodevelopmental timeline.** Schematic illustration of key neurobio-logical processes<sup>[1,](#page-24-0)2</sup> and cortical folding patterns<sup>[3,](#page-24-2)4</sup> during gestational and perinatal periods.



**Supplementary Fig. 2** | **Existing neonatal and infant atlases. a**,**b**, Commonly used T1w and T2w atlases of neonates and infants<sup>[5–](#page-24-4)[7](#page-24-5)</sup>. **c**, Spherical atlases of surface mean curvature of neonates and infants $^{8}$  $^{8}$  $^{8}$ .



**Supplementary Fig. 3** | **Longitudinal infant scans.** T1w and T2w images and white surfaces of an infant scanned between two weeks and two years of age.



**Supplementary Fig. 4** | **Surface and volume features.** Graphical illustrations of **a**, cortical thickness; **b**, surface area; **c**, average convexity; **d**, mean curvature; and **e**, tissue volume.



**Supplementary Fig. 5** | **Cortical and volumetric developmental velocities.** IBA velocity curves for surface and volumetric features, estimated via the first derivatives of generalized additive model (GAM)-fitted trajectories. Annotated data points mark the peak growth ages.

<span id="page-6-0"></span>

**Supplementary Fig. 6** | **Cortical ROIs.** Desikan-Killiany cortical parcellation mapped onto the inflated white surfaces of the IBA.



**Supplementary Fig. 7 | Hemispheric asymmetry of surface area.** Region-specific laterality index for surface area of the IBA. Positive laterality is associated with left lateralization (two-tailed *t*test: *p* < 0.01) and negative laterality is associated with right lateralization (two-tailed *t*-test:  $p < 0.01$ ).

<span id="page-8-0"></span>

**Supplementary Fig. 8** | **Regional developmental trajectories of average convexity.** Growth curves of average convexity for the IBA cortical regions. Shaded regions indicate whether average convexity is greater or lower than the whole-brain average.

<span id="page-9-0"></span>

**Supplementary Fig. 9** | **Analysis of average convexity. a**, Regional growth rates in terms of average convexity for the first (*top row*) and second (*bottom row*) postnatal years. **b**, ROI-specific mean laterality index for average convexity.

<span id="page-10-0"></span>

**Supplementary Fig. 10** | **Regional developmental trajectories of mean curvature.** Growth curves of mean curvature for the IBA cortical regions. Shaded regions indicate whether mean curvature is higher or lower than the whole-brain average.

<span id="page-11-0"></span>

**Supplementary Fig. 11** | **Analysis of mean curvature. a**, Regional growth rates in terms of mean curvature for the first (*top row*) and second (*bottom row*) postnatal years. **b**, ROI-specific mean laterality index for mean curvature.

<span id="page-12-0"></span>

Supplementary Fig. 12 | Hemispheric asymmetry of average convexity. Region-specific laterality index for average convexity of the IBA. Positive laterality is associated with left lateralization (two-tailed *t*-test:  $p < 0.01$ ) and negative laterality is associated with right lateralization (twotailed *t*-test:  $p < 0.01$ ).

<span id="page-13-0"></span>

Supplementary Fig. 13 | Hemispheric asymmetry of mean curvature. Region-specific laterality index for mean curvature of the IBA. Positive laterality is associated with left lateralization (twotailed *t*-test:  $p < 0.01$ ) and negative laterality is associated with right lateralization (two-tailed *t*-test:  $p < 0.01$ ).



**Supplementary Fig. 14** | **Preschool atlases.** We augment our infant brain atlases with preschool atlases constructed every year between 3 and 5 years of age. These atlases are constructed using MRI data of 49 subjects (recruited as part of the BCP) scanned between 2.5 and 5.5 years of age. We constructed these atlases using our surface-volume atlas construction pipeline. **a,b**, Transverse sections of the T1w and T2w atlases. **c**, White (*blue*) and pial (*red*) surface atlases superimposed on the tissue maps. **d,e**, Dorsal views of the white and pial surface atlases for both hemispheres, colored by average convexity and mean curvature, respectively.



**Supplementary Fig. 15** | **Infant brain MRI post-acquisition processing.** Brain MRI scans quality-checked with our pediatric brain image quality control algorithm<sup>[17](#page-25-0)</sup> are fed into iBEAT v2.0 (<https://ibeat.wildapricot.org>) for infant-centric preprocessing to obtain tissue segmentation maps and white and pial surfaces.

#### **a Surface-Volume Atlas Construction**



**Supplementary Fig. 16** | **IBA construction pipeline. a**, Overview of the steps involved in constructing the surface-volume IBA. **b**, Parallel transport of longitudinal deformations to the IBA12 space. **c**, Weighting of parallel transported deformations.

 $\tau_{0}$ -1.5  $\tau_{0}$   $\tau_{0}$ +1.5  $\tau_{0}$  10.5 12 13.5

Age (months)

<span id="page-17-0"></span>

**Supplementary Fig. 17** | **Quantitative comparison of atlases. a**, Violin plots for median values of cortical features of the surface atlases. The IBA yields higher absolute average convexity than ANTs (two-tailed paired *t*-test: *p* = 2.9 × 10−29; single star) and higher absolute mean curvature than Spherical Demons (two-tailed paired *t*-test: *p* = 1.1 × 10−17; double star) and ANTs (twotailed paired *t*-test:  $p = 1.3 \times 10^{-34}$ ; double star). **b**, Violin plots for gradient magnitudes of the T1w and T2w intensity atlases. The IBA yields higher gradient magnitudes than ANTs (twotailed paired *t*-test:  $p_{T1w} = 1.0 \times 10^{-9}$ ,  $p_{T2w} = 1.9 \times 10^{-7}$ ; star). The green crossbars in the violin plots mark the means.

#### **Supplementary Note 1: Results**

**Surface atlases across infancy.** We assessed the degree of cortical folding of each surface atlas with surface-wide median absolute values of average convexity and mean curvature (Supplementary Fig. [17a](#page-17-0)). A higher median value signifies greater cortical folding. The average convexity median is comparable for Spherical Demons and IBA because they both capture coarse-scale cortical folds. The mean curvature median for the IBA is the highest, suggesting that the IBA not only captures coarse-scale gyral and sulcal patterns but also retains fine-scale secondary and tertiary cortical folds.

**Volumetric atlases across infancy.** We assessed the quality of the ANTs intensity atlases and IBA using the gradient magnitude, which quantifies structural sharpness (Supplementary Fig. [17b](#page-17-0)). The IBA has higher gradient magnitudes than the ANTs atlases and is therefore sharper with more structural details.

**Surface and volumetric development.** We measured the average convexity of 34 cortical regions-of-interest (ROIs) delineated via FreeSurfer using the Desikan-Killiany atlas<sup>[18](#page-25-1)</sup> (Supplementary Fig. [6\)](#page-6-0). All regions (Supplementary Fig. [8\)](#page-8-0) show increasing trends but at varying rates ranging from 19% to 34% and 1.2% to 5.7% for the first and second postnatal years (Supplementary Fig. [9a](#page-9-0)), respectively. Average convexity exhibits higher growth rate in association cortices compared with primary cortices. The growth rates (Year 1, Year 2) are (24.2%, 1.5%) for the primary visual cortex, (23.3%, 3.3%) for the primary somatosensory cortex, (22.9%, 3.8%) for the primary motor cortex, (27.0%, 3.6%) for the primary auditory cortex, (27.1%, 4.2%) for the temporal association cortex, (27.1%, 3.6%) for the parietal association cortex, and (23.9%, 3.7%) for the prefrontal association cortex.

In terms of mean curvature, all cortical ROIs exhibit decreasing trends (Supplementary Figs. [10](#page-10-0) and [11a](#page-11-0)) at varying negative growth rates ranging from 14% to 26% and 1% to 6% in the first and second postnatal years, respectively. The negative growth rates (Year 1, Year 2) are (19.9%, 2.0%) for the primary visual cortex, (19.5%, 3.9%) for the primary motor cortex, (21.0%, 3.4%) for the primary somatosensory cortex, (20.6%, 3.7%) for the primary auditory cortex, (21.5%, 3.6%) for the temporal association cortex, (21.2%, 4.1%) for the parietal association cortex, and (18.5%, 4.1%) for the prefrontal association cortex.

We show the hemispheric lateralization of regional cortical features via the laterality index,  $LI = (left - right)/(left + right)$ , computed for each ROI. There is significant asymmetry (two-tailed *t*-test; *p* < 0.01) in average convexity (Supplementary Fig. [12\)](#page-12-0) and mean curvature (Supplementary Fig. [13\)](#page-13-0) for majority of the ROIs. The corresponding *p*-values, *t*-scores, and degrees of freedom (DoFs) are reported in Supplementary Data Files 5, 6. The ROI-specific mean LI for average convexity and mean curvature are shown in Supplementary Figs. [9b](#page-9-0) and [11b](#page-11-0).

# **Supplementary Note 2: Discussion**

**Cortical thickness.** The IBA reflects the inter-hemispheric differences in regional cortical thickness: the functionally dominant hemisphere is thinner than the non-dominant counterpart (Extended Data Fig. 10). For instance, the left pars opercularis is thinner, consistent with the functional dominance of the left hemisphere in language production and phonological processing. In contrast, the right pars triangularis is thinner, although the left hemisphere is functionally dominant. This is because pars triangularis is involved in semantic processing that is still imprecise during the first two postnatal years; therefore, the functionally dominant left hemisphere is thicker. The superior temporal gyrus is involved in auditory processing that is pertinent to language acquisition and is dependent on the left hemisphere. The left superior temporal gyrus in IBA is thinner, in line with the early development of infants' ability to process audio and spoken language during the study period. Visuospatial processing controlled by the supramarginal gyrus, inferior parietal cortex, and precuneus is dominant in the right hemisphere. However, infants do not fully acquire visuospatial processing ability during the first two postnatal years; therefore, these regions in IBA are still thicker in the right hemisphere.

**Surface area.** The IBA also reflects cortical maturation in terms of cortical surface area. Ac-cording to the radial unit hypothesis<sup>[19](#page-25-2)</sup>, cortical surface area expands during infancy due to the symmetrical proliferation of neural progenitors in the ventricular and subventricular zones $^{20}$  $^{20}$  $^{20}$ . Others speculate that intermediate glial cells, generated in the outer subventricular zone, ex-pand in a fan-like manner, and drive the tangential growth of surface area<sup>[21,](#page-25-4)22</sup>. Prior studies suggest that surface area undergoes a 2- to 4-fold expansion from infancy through adulthood<sup>[23](#page-25-6)</sup>. Postnatal surface area expansion is differential in nature, following regional differences in den-dritic length, dendritic spine density, synaptic architecture, and intra-cortical myelination<sup>23-[26](#page-26-0)</sup>. The overexpansion of cortical surface area during early infancy is implicated in the disrupted emergence and refinement of cognitive and behavioral skills, and in developmental, psychiatric, and neurological disorders<sup>[21,](#page-25-4)27,28</sup>. The IBA reveals that cortical surface area increases by  $93\%$ during the first two years after birth. Findings from our regional analysis are consistent with ex-isting studies<sup>[23,](#page-25-6) [29](#page-26-3)</sup>: regions with greatest expansion lie in the dorsolateral and medial prefrontal association cortex, lateral temporal, and parietal association cortices, whereas regions with least expansion lie in the occipital cortex, medial temporal cortex, and insula. Areas expanding slowly in the primary and secondary sensory cortices in IBA-S are generally thinner, including the pericalcarine, cuneus, precentral, and postcentral gyri. All regions, except the pars opercularis and lateral orbitofrontal gyrus, in IBA-S exhibit significant lateralization. In line with Remer et al. $^{29}$  $^{29}$  $^{29}$ , we found left-lateralization of the medial orbitofrontal gyrus, superior frontal gyrus, and transverse temporal gyrus and right-lateralization of the superior and middle temporal gyri, inferior parietal cortex, precuneus, frontal pole, paracentral gyrus, pericalcarine, pars orbitalis, and pars triangularis.

**Average convexity.** Several hypotheses have been put forward to explain the mechanics driving gyrification, including axonal tension $30$ , tangential expansion of the cortical layers relative to sublayers generating stress<sup>[31](#page-26-5)</sup>, and biochemical prepatterning of the cortex<sup>[32](#page-26-6)</sup>. Although the sizes and shapes of gyri and sulci vary across individuals, primary gyri and sulci share common ori-entations and locations<sup>[33](#page-26-7)</sup>. Primary folds are associated with motor and sensory cortices, which mature relatively early even at birth and continue to refine postnatally. The IBA faithfully retains major gyral and sulcal folds.

Average convexity quantifies the degree of folding of primary gyri and sulci. Regionspecific growth trajectories of average convexity yielded by the IBA reveal that the temporal association cortex evolves at the fastest rate, followed by the parietal and frontal cortices. Primary sensorimotor and visual cortices grow at a slower rate. This suggests that the primary cortices are already developed at term birth; therefore, they tend to grow slower compared with association cortices, which are involved in high-order functions and are immature at birth and undergo protracted development<sup>[34](#page-26-8)</sup>.

The IBA shows inter-hemispheric differences in regional average convexity. Left-lateralized regions are mainly located in the frontal and temporal cortices, whereas right-lateralized regions are prominent in the parietal cortex. This suggests that anatomical asymmetry may correspond to functional asymmetry. For instance, the triangular and orbital parts of the inferior frontal gyrus are language-related<sup>[35,](#page-26-9) [36](#page-26-10)</sup> and therefore exhibit leftward asymmetry. Similarly, the transverse temporal gyrus is left-lateralized as it is part of the auditory processing network $37$ . The frontal pole is responsible for action selection and involves more of the left hemisphere than the right $38$ . The lateral occipital cortex and fusiform gyrus, involved in face processing, are left-lateralized<sup>[39](#page-27-0)</sup>. Furthermore, our results confirm that the parietal cortex, comprising supramarginal gyrus, superior parietal cortex, and precuneus, shows right laterality, consistent with the functional dominance of the right hemisphere in visuospatial processing tasks<sup>[40](#page-27-1)</sup>. The postcentral gyrus, which is a part of the somatosensory cortex, and the precentral gyrus, which is involved in voluntary motor movements, show rightward asymmetry $^{\rm 40}.$  $^{\rm 40}.$  $^{\rm 40}.$ 

**Mean curvature.** The human brain buckles and folds at different extents<sup>[41](#page-27-2)</sup>. At a larger scale, it curves into a spheroid split into two hemispheres. At a smaller scale, it carves into primary, secondary, and tertiary gyri and sulci in association with cortical development. The degree of small-scale cortical folding is quantified via mean curvature, which measures the extrinsic cur-vature of the cortical surface<sup>[42](#page-27-3)</sup>. The IBA shows that the absolute mean curvature decreases substantially during the first year and stabilizes in the second year. The decrease in mean curvature is due to the dynamic cortical folding associated with post-migrational processes characterized by axogenesis, dendritogenesis, synapse initiation, maturation, and pruning of both pyramidal neurons and cortical interneurons<sup>[43](#page-27-4)</sup>. Morphologically, the downward trend in mean curvature reflects the widening of sulci due to the increase in brain size, resulting in sulcal fundi and gyral crowns that curve less sharply. Mean curvature exhibits differential decrease in all cortical ROIs: the entorhinal cortex and temporal pole show fastest decline, whereas the rostral and caudal anterior cingulate cortices show slowest decrease. Asymmetry of mean curvature is significant in all regions, except the pars triangularis and lateral occipital gyrus. In line with Remer et al.<sup>[29](#page-26-3)</sup>, the posterior cingulate and rostral anterior cingulate cortices are left-lateralized and the lateral orbitofrontal gyrus is right-lateralized. The pars opercularis exhibits leftward asymmetry, consistent with the functional dominance of the left hemisphere in language.

**Cortical myelination.** We analyzed cortical myelination through infancy via the T1w/T2w ratio. We observed spatiotemporal changes in myelination of the cerebral cortex throughout the study period, in line with the literature<sup>[4](#page-24-3)</sup>. Highly myelinated regions process information faster than less myelinated regions. The primary visual, motor, and somatosensory cortices are myelinated earlier than the association cortices of the frontal, parietal, and temporal lobes that are involved in higher-order functions, consistent with the functional development of the brain. We also observe a correlation between cortical thickness and myelin content: thicker cortices are lightly myelinated compared with thinner cortices that are heavily myelinated. For instance, the prefrontal cortex has high cortical thickness and low myelin.

## **Supplementary Note 3: Applications of Brain Atlases**

Human brain atlases are the basis of common coordinate frameworks  $(CCFs)$ <sup>[44](#page-27-5)</sup> that enable consistent agglomeration of data from diverse imaging modalities, bridging the study of brain architecture from macroscale (e.g., brain regions and their communication pathways) to microscale (e.g., cyto- and myelo-architectures) $45$ .

Neuroanatomical features (e.g., regional tissue volumes, cortical thickness, and surface areas) extracted from MRI data of individuals can be mapped onto an atlas for volumetric or surface correspondences, allowing for example features of normal and abnormal subjects to be compared in a common space. Inter-group differences can then be detected with the help of statistical tests. Multimodal regional features extracted with the help of an atlas can also be used to identify atypical brain development by predicting the brain age $46$ . The difference between the predicted age and the chronological age reflects premature or delayed development associated with brain disorders. In computational anatomy, neuroimaging data of individuals are mapped to a standard space, typically defined by an atlas, via non-rigid registration methods $^{47}$  $^{47}$  $^{47}$ . The resulting nonlinear transformations can be analyzed via statistical tests to investigate interindividual shape differences.

Atlases provide a standard anatomical space in which tissues, regions, and structures can be annotated at a voxel or vertex level. Tissue classification information can be propagated from an atlas to individual images for tissue segmentation<sup>[48](#page-27-9)</sup>. Brain regions, which define coherent functional units, can be parcellated in an atlas based on cyto- and myelo-architectures or func-tional connectivity<sup>[49](#page-27-10)</sup>. The atlas parcellation can be propagated for applications in stereotactic localization and structural/functional connectomics<sup>[50](#page-27-11)</sup>. Dimensionality reduction techniques can be applied to the connectivity profiles determined based on a parcellation map to obtain principal gradients, which encode systematic variations in connectivity $51$ .

#### **Supplementary Note 4: Atlas Variability**

We conducted experiments as described by Yang et al.<sup>[52](#page-28-0)</sup> to investigate the effect of sample size on brain atlas variability. Specifically, we constructed infant brain atlases with  $N = \{10, 20, 30\}$ randomly selected subjects. For each *N*, we performed subject sampling and atlas construction three times  $(K = 3)$  and quantified atlas variability by calculating surface and volumetric displacements between each pair of brain atlases using three metrics:

1. Mean volumetric displacement,  $\bar{D}_{\text{vol}}$ , computed as the average of

$$
D_{\text{vol}} = \frac{1}{V} \sum_{v=1}^{V} (|d_x^v| + |d_y^v| + |d_z^v|), \tag{1}
$$

over all atlas pairs, where *V* is the total number of brain voxels and  $(d_x^v, d_y^v, d_z^v)$  is the displacement of the *v*-th voxel of an atlas with respect to its pair.

2. Mean surface displacement,  $\bar{D}_{\text{surf}}$ , computed as the average of

$$
D_{\text{surf}} = \frac{1}{S} \sum_{s=1}^{S} (|t_x^s| + |t_y^s| + |t_z^s|), \tag{2}
$$

over all atlas pairs, where *S* is the total number of surface vertices and  $(t_x^s, t_y^s, t_z^s)$  is the displacement of *s*-th vertex of an atlas with respect to its pair.

3. Mean log-transformed Jacobian determinant,  $\bar{D}_{\text{jacobian}}$ , computed as the average of

$$
D_{\text{jacobian}} = \frac{1}{V} \sum_{v=1}^{V} \log(|\det(J^v)|), \tag{3}
$$

over all atlas pairs, where  $det(J^v)$  is the determinant of the Jacobian matrix  $(J^v)$  computed from the *v*-th voxel of the volumetric deformation field of an atlas with respect to its pair.

The results, summarized in Supplementary Table [2,](#page-23-0) indicate that variability decreases with sample size and reaches a subvoxel level at  $N = 30$ . This confirms that 37 subjects are sufficient for atlas construction.

<b>Study</b>	<b>Type</b>	<b>Components</b>	<b>Age Range</b>	No. of Time Points
Kuklisova et al. <sup>9</sup>	Volumetric	T2w	29 - 44 weeks GA	6
(2011)		Tissue map		
Serag et al. <sup>6</sup>	Volumetric	T1w & T2w	27 - 44 weeks PMA	9
(2012)				
Shi et al. <sup>7</sup>	Volumetric	T1w & T2w	$0 - 2$ years	3
(2011)		Tissue map		
Sanchez et al. <sup>10</sup>	Volumetric	T1w & T2w	2 weeks - 4 years	13
(2012)				
Zhang et al. <sup>11</sup>	Volumetric	T1w & T2w	$1 - 12$ months	5
(2016)				
Oishi et al. <sup>5</sup>	Volumetric	T1w & T2w	2 days	1
(2011)		<b>DTI</b>		
Kazemi et al. <sup>12</sup>	Volumetric	T <sub>1w</sub>	39 - 42 weeks GA	1
(2007)				
Shi et al. <sup>13</sup>	Volumetric	T2w	$0.6 - 2$ months	1
(2010)		Tissue map		
Hashioka et al. <sup>14</sup>	Volumetric	T2w	1 week	1
(2011)				
Bozek et al. <sup>4</sup>	Surface	Fiducial cortical surfaces	36 - 44 weeks PMA	9
(2018)		Cortical features maps		
Hill et al. <sup>15</sup>	Surface	Spherical cortical surfaces	$>$ 36 weeks GA	$\mathbf{1}$
(2010)		Fiducial cortical surfaces		
		Sulcal depth map		
Wu et al. <sup>8</sup>	Surface	Spherical cortical surfaces	$1 - 72$ months	11
(2019)		Cortical features maps		
		Cortical parcellation		
Li et al. <sup>16</sup>	Surface	Spherical cortical surfaces	$1 - 24$ months	7
(2015)		Cortical features maps		
GA - gestational age		PMA - postmenstrual age	DTI - diffusion tensor imaging	

**Supplementary Table 1.** Existing neonatal and infant brain atlases.

<span id="page-23-0"></span>**Supplementary Table 2.** The effects of sample size (*N*) on atlas variability quantified via mean volumetric displacement ( $\bar{D}_{vol}$ ), mean surface displacement ( $\bar{D}_{surf}$ ), and mean log-transformed Jacobian determinant ( $\bar{D}_{\text{jacobian}}$ ).

N		$\bar{D}_{\text{vol}}$ (mm) $\bar{D}_{\text{surf}}$ (mm)	$\overline{D}_{\text{jacobian}}$
10	0.6	1.5	0.06
20	0.4	0.8	0.04
30	0.09	0.4	0.01

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