# Population-level asymmetry of the cerebral cortex: reproducibility, lifespan changes, heritability, and individual differences

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# Abstract

1 Cortical asymmetry is a ubiquitous feature of brain organization that is altered in neurodevelopmental disorders, yet we 1 lack knowledge of how its development proceeds across life in health. Achieving consensus on cortical asymmetries in 1 humans is necessary to uncover the genetic-developmental mechanisms that shape them and factors moderating cortical 1 lateralization. Here, we delineate population-level asymmetry in cortical thickness and surface area vertex-wise in 7 1 datasets and chart asymmetry trajectories across life (4-89 years; observations = 3937; 70% longitudinal). We reveal 1 asymmetry interrelationships, heritability, and test associations in large-scale data (N=~37,500). Cortical asymmetry was 1 robust across datasets. Whereas areal asymmetry is predominantly stable across life, thickness asymmetry grows in 1 development and declines in aging. Areal asymmetry correlates in specific regions, whereas thickness asymmetry is 2 globally interrelated across cortex in a pattern suggesting highly left-lateralized individuals tend towards left-lateralization 2 also in population-level right-asymmetric regions (and vice versa). Areal asymmetry is moderately heritable (max h<sup>2</sup><sub>SNP</sub> 2 ~19%), and phenotypic correlations are reflected by high genetic correlations, whereas heritability of thickness 2 asymmetry is low. Finally, we detected an asymmetry association with cognition and confirm recently-reported 3 handedness links. Results suggest areal asymmetry is developmentally stable and arises in early life, whereas 3 developmental changes in thickness asymmetry may lead to directional variability of global thickness lateralization. Our 3 results bear enough reproducibility to serve as a standard for future brain asymmetry studies.

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# 50 1. Introduction

51 52 53 54 The brain's hemispheres exhibit high contralateral symmetry <sup>1,2</sup> and homotopic regions are amongst the most genetically <sup>3-5</sup> and developmentally linked <sup>3,6</sup>. However, structural asymmetry is also a ubiquitous aspect of brain organization <sup>7</sup> Cortical thickness (CT) and surface area (SA) are known to exhibit distinct asymmetry patterns <sup>7,9</sup>, but these have been reported inconsistently 7.8,10-20. Yet disrupted cortical asymmetry is a confirmed feature of neurodevelopmental disorders 55 56 <sup>21</sup>, aging <sup>10</sup>, and Alzheimer's disease <sup>10,22</sup>. Hence, achieving consensus on cortical asymmetries and understanding the genetic-developmental and lifespan influences that shape and alter them is necessary to discover precise biomarkers for 57 disease. To reach consensus, an atlas-free description of asymmetries that reliably replicate across international samples 58 (i.e. population-level asymmetries) is needed. This would enable precision mapping of the genetic and individual-specific 59 factors moderating cortical lateralization, and serve as a high-fidelity phenotype for future studies on brain asymmetry. 60 Furthermore, it is unknown how cortical asymmetry development proceeds across life, as no previous study has mapped 61 62 cortical asymmetry trajectories longitudinally across the lifespan.

Although several studies have mapped cortical asymmetry 7,8,18-20,23,10-17, conflicting results may be partly due to the use 63 64 of brain atlases with varying spatial resolutions, especially if asymmetry conforms poorly to the predefined anatomical 65 boundaries. Still, even amongst studies adopting an atlas-free approach, conflicting results abound <sup>13–18</sup>. For example, for CT asymmetry, medial prefrontal cortex (mPFC) has been reported to show both extensive rightward 14,16,17 and 66 leftward <sup>10–12,20</sup> lateralization. Beyond regional inconsistencies, a recent meta-analysis confirmed the cortex is globally 67 68 organized in a characteristic pattern of CT asymmetry, wherein anterior and posterior regions are thicker in the left and 69 right hemisphere, respectively <sup>7</sup>. Notably, while this agrees with some reports <sup>10–12,20,24</sup>, it is less compatible with many 70 others 8,13-19,25. Furthermore, that study applied a relatively course brain atlas, and there is currently no high-resolution 71 72 73 74 75 complement to describe cortical asymmetries that reliably reproduce across international samples (but see <sup>10,24</sup>). For areal asymmetry, while results have been broadly more consistent 7,8,14,19,23,26, there nevertheless remain important discrepancies, such as reports of right-7,27,28 and left-14,26 lateralization of superior temporal sulcus (STS).

An accurate description of the lifespan trajectories of cortical asymmetry may shed light on mechanisms underlying diverse aspects of asymmetry across life. For CT, longitudinal increases in asymmetry have been shown during the first two years of life <sup>11</sup>, with suggestions of rapid asymmetry growth from birth to 1 year <sup>11</sup>, and continued growth until adolescence <sup>29</sup>. However, previous studies mapped CT asymmetry linearly across cross-sectional developmental and adult age-ranges <sup>13,20</sup>, mostly concluding CT asymmetry is minimal in infancy and maximal age ~60. In contrast, recent work established CT asymmetry shows a non-linear decline from 20 to 90 years that is reproducible across aging cohorts <sup>10</sup>. Thus, although offering viable developmental insights <sup>13,20</sup>, previous lifespan studies of CT asymmetry do not accurately capture the aging process, and likely conflate non-linear developmental and aging trajectories with linear models. A longitudinal exploration of the lifespan trajectories of CT asymmetry accounting for dynamic change is needed to further knowledge of normal brain development.

In addition, few studies have charted developmental <sup>26,28</sup> or aging effects <sup>7</sup> on SA asymmetry. However, indirect evidence suggests SA asymmetry may exhibit little change from birth to 2 years <sup>26</sup> despite rapid and concurrent developmental cortical expansion <sup>30</sup>. Determining the developmental timing of cortical asymmetry will provide a useful normative reference, as subtly altered asymmetry in neurodevelopmental disorders suggests early life perturbations in left-right brain organization contribute to lifelong detriment in brain health <sup>21,31</sup>.

91 92 Correlations between cortical asymmetries in adults may provide a window on asymmetries formed under common 93 genetic-developmental influence. Yet while there has been much research on whether asymmetries of various morphometric measures <sup>8,14,19</sup> or imaging modalities <sup>27</sup> relate to one another, few have focused on interrelationships 94 95 between asymmetries derived from the same metric. Where reported, evidence suggests cortical asymmetries are mostly 96 independent <sup>32,33</sup> – in line with a multifactorial view of asymmetry phenotypes <sup>34–36</sup> – and a recent study found asymmetry 97 in anatomically connected regions of the cortical language network was no more related than in regions selected at 98 random <sup>27</sup>. Currently, it is not known whether or how cortical asymmetries correlate within individuals, though this may suggest coordinated development of left-right brain asymmetries. 100

Altered lateralization has been hypothesized to relate to poorer cognitive outcomes <sup>20,37,38</sup>. In line with this, recent work 101 102 suggests genetic overlap between cortical asymmetry, educational attainment, and neurodevelopmental disorders <sup>31</sup> 103 and reduced brain torque 25,39,40 - a gross morphological asymmetry with a strong population-level bias - associates 104 with lower cognition <sup>41</sup>. For CT and SA asymmetry, however, reported asymmetry-cognition associations have been 105 conflicting 20,42,43 and remain untested in large-scale data. Furthermore, most large-scale studies of the factors moderating cortical asymmetry have adopted brain atlases offering limited spatial precision 7,31,44. Accordingly, previous 106 large-scale studies did not detect associations with handedness 7,45 that were not found until a recent study applied 107 108 vertex-wise mapping in big data <sup>24</sup>. Similarly, it is unclear to what degree poor-fitting atlases drive down heritability estimates of cortical asymmetry <sup>7,31</sup>, as estimates improve when brain measures better conform to the biology under 109 110 genetic investigation <sup>46,47</sup>. However, no previous study has assessed heritability after precisely delineating regions of cortex that are asymmetric at the population level, and cortex-wide heritability maps have all used the same atlas we 111 112 propose fits poorly to the asymmetry of cortex <sup>48</sup>. 113

Here, we 1) delineate population-level cortical SA and CT asymmetries using vertex-wise analyses and their overlap in r international datasets, and 2) map their trajectories longitudinally across the lifespan. We 3) investigate interregional asymmetry correlations, asking whether and how asymmetries correlate within individuals. Next, we 4) tested heritability

of cortical asymmetry using both an extended twin design and genome-wide single nucleotide polymorphism (SNP) data.
 Finally, we 5) screened our set of robust, population-level asymmetries for association with general cognitive ability, handedness, sex, and brain size in UK Biobank (UKB) 49.

#### 121 122 123 2. Results

#### 124 2.1 Population-level asymmetry of the cerebral cortex

125 First, to delineate cortical regions exhibiting population-level SA and CT asymmetry, we assessed asymmetry vertex-126 wise in 7 independent samples and quantified overlapping effects (Methods). SA asymmetries were markedly consistent 127 across all 7 datasets (Fig. 1A): the spatial overlap between AI maps ranged from r = .88 to .97 (Fig. 1C). Across all 7 128 datasets (Fig. 1D), strong leftward SA asymmetry was observed in a large cluster in supramarginal gyrus (SMG) that 129 spanned the length of postcentral gyrus, extended inferiorly into planum temporale and primary auditory regions and 130 conformed markedly to their anatomical boundaries (see Figure 1-figure supplement 1A for significance). We also 131 observed consistently strong leftward asymmetry in anterior insula, anterior temporal cortex, rostral anterior cingulate, 32 medially in superior frontal cortex, and precuneus, the latter extending the length of parahippocampal gyrus into 133 entorhinal cortex. Strong rightward SA asymmetry was consistently evident in cingulate cortex, inferior parietal cortex, STS, lateral and medial occipital cortex, and in mPFC and rostral middle frontal cortex (Fig. 1A). The global pattern 134 135 agrees with previous reports 7,23,24, and effects showed markedly high overlap across datasets (Fig. 1D) 136

137 For CT, an anterior-posterior pattern of left-right asymmetry was evident in most datasets (Fig. 1B), consistent with recent 138 reports <sup>7,10,24</sup>. Though spatial correlations between AI maps were high, they were notably more variable (r = .33 - .93; 139 Fig. 1C); HCP showed lower correlation with all datasets (r = .33 - .46) whereas all other datasets correlated highly with 140 each other (min r = .78). Strong leftward CT asymmetry was evident in cingulate cortex, postcentral gyrus, and in superior 141 frontal cortex - with consistent effects across datasets (Fig. 1E) - and in medial and lateral prefrontal cortex, though the 142 latter two were less consistent among datasets. Strong rightward CT asymmetry was consistently evident in a large 143 cluster in and around STS and lateral temporal cortex (Fig 1E; Figure 1-figure supplement 1B), insula, lingual gyrus, 144 anterior parahippocampal and entorhinal cortex. Both SA and CT asymmetry extended beyond these described effects Ī45 (Figure 1–figure supplements 1-2). 146

Based on effect size criteria (Fig. 1D-E; Methods), we derived a set of robust clusters exhibiting population-level asymmetry for SA (14 clusters) and CT (20 clusters) to be used in further analyses (see Supplementary file 1E-F for anatomical descriptions, see Figure 1–figure supplement 3 for variances). We then formally compared our approach to asymmetry estimates derived from a gyral-based atlas often used to assess asymmetry <sup>7,19,31</sup>, finding fairly poor correspondence with the vertex-wise structure of cortical asymmetry, particularly for CT (Figure 1–figure supplement 4).

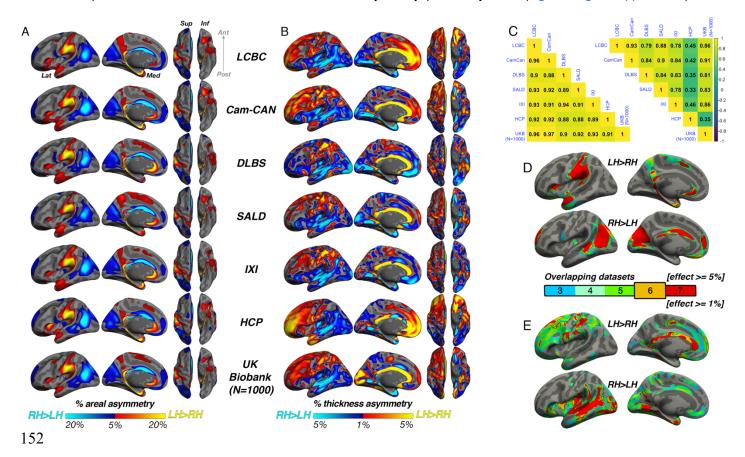


Figure 1. A) Mean SA and B) CT asymmetry in each dataset. Warm and cold colours depict leftward and rightward asymmetry, respectively. C) Spatial overlap (Pearson's r) of the unthresholded maps between datasets for SA (lower matrix) and CT asymmetry (upper). D) Overlapping effects across datasets were used to delineate clusters exhibiting population-level SA (lower threshold = 5%) and E) CT asymmetry (lower threshold = 1%) based on a minimum 6-dataset overlap (black outlined clusters). Post=posterior; Lat=lateral; Med=medial; Ant=anterior; Sup=superior; Inf=inferior.

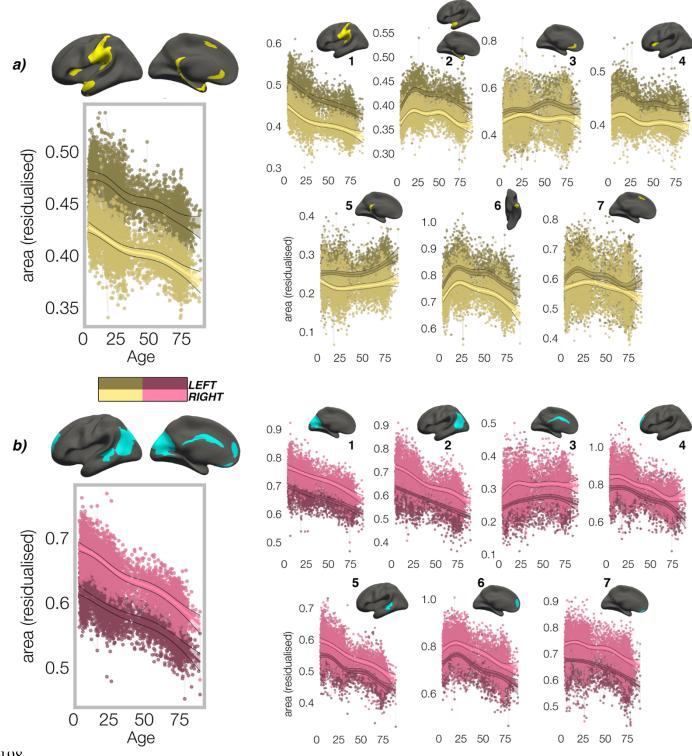
# 163 2.2 Lifespan trajectories of cortical asymmetry

We have recently shown that cortical regions exhibiting age-related reduction of CT asymmetry correspond with regions exhibiting strong asymmetry on average <sup>10</sup>. Thus, having delineated regions exhibiting population-level SA and CT asymmetry, we aimed to characterize the trajectories of SA and CT asymmetries longitudinally across the lifespan (4-89 years). To account for potentially non-linear trajectories, we used Generalized Additive Mixed Models (GAMMs) that enabled modelling the smooth left- (LH) and right hemisphere (RH) age-trajectories within our robust clusters (Methods).

170 In all clusters, SA asymmetry was strongly established already by age ~4 years, and the lifespan trajectories of both 171 172 leftward (Fig. 2A) and rightward (Fig. 2B) SA asymmetries were largely parallel. Specifically, a large left-asymmetric region in and around SMG/perisylvian (#1; Fig. 2A) showed strong asymmetry by age ~4 that was maintained throughout 173 life through steady aging-associated decline of both hemispheres, whereas leftward asymmetry of temporal cortex (#2,6) 174 and anterior insular (#4) was maintained through developmental expansion and aging-associated decline of both 175 hemispheres. Others (retrosplenial #5; mPFC #3,7) showed growth from pre-established asymmetry and more variable 176 177 178 179 lifespan trajectories. On the other side, rightward asymmetries showed largely preserved asymmetry through agingassociated decline of both hemispheres (Fig 2B; medial occipital #1; lateral parietal #2; STS #5; orbitofrontal #7), through bilateral developmental expansion and aging-associated decline (mPFC #6), or steadily expanding bilateral SA until midlife (cingulate; #3). Though asymmetry trajectories did show significant change at some point throughout life in most 180 clusters (Supplementary file 1E), factor-smooth GAMM interaction analyses confirmed that asymmetry was significantly 181 different from 0 across the entire lifespan in all SA clusters (Figure 3-figure supplements 1-2), and the average 182 trajectories across all leftward and rightward clusters were clearly parallel (though still exhibited a significant difference; 183 bordered plots in Fig. 2A-B; Supplementary file 1E).

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185 In contrast, though homotopic trajectories of CT clusters were more variable, they were mostly characterized by 186 developmental increase and aging-associated decrease in asymmetry (i.e. non-parallel lifespan trajectories), through 187 188 unequal rates of continuous thinning between the hemispheres from age ~4 (Fig. 3A-B; see Figure 3-figure supplements 1-2). Specifically, leftward CT asymmetry developed through comparatively slower thinning trajectories of the LH, 189 whereas rightward asymmetry developed through slower RH thinning. In general, asymmetry development was evident 190 up to a peak around age ~25 for both leftward (Fig. 3A; superior frontal #2; precentral #4, frontal #8,9,10; calcarine #11) 191 and rightward clusters (Fig 3B; #1-9) and declined thereafter (see also Figure 3-figure supplement 3). Factor-smooth 192 GAMMs confirmed that the developmental foundation for CT asymmetry was already established by age ~4 (95% of CT 193 clusters exhibited small but significant asymmetry at age ~4; Figure 3-figure supplement 2B), and again asymmetry 194 trajectories showed significant change at some point throughout life (Supplementary file 1F). The average trajectories 195 across all leftward and rightward clusters showed developmental asymmetry increase up to age ~25 and aging-196 associated asymmetry decrease from mid to old age (bordered plots; Fig 3). Results were robust to varying the number 197 of knots used to estimate trajectories (Figure 2-figure supplement 1).





200 201 Figure 2: Homotopic lifespan trajectories of SA in clusters exhibiting population-level a) leftward (yellow plots; yellow clusters) and b) rightward (pink plots; blue clusters) areal asymmetry (mm<sup>2</sup>). Larger plots on the left show the mean age 202 trajectory across all clusters exhibiting leftward (top) and rightward (bottom) asymmetry. Note that the unit of 203 measurement is the average surface area of a vertex within the cluster. Dark colours correspond to LH trajectories. All 204 age trajectories were fitted using GAMMs. Data is residualized for sex, scanner and random subject intercepts. Clusters 205 206 207 are numbered for reference.

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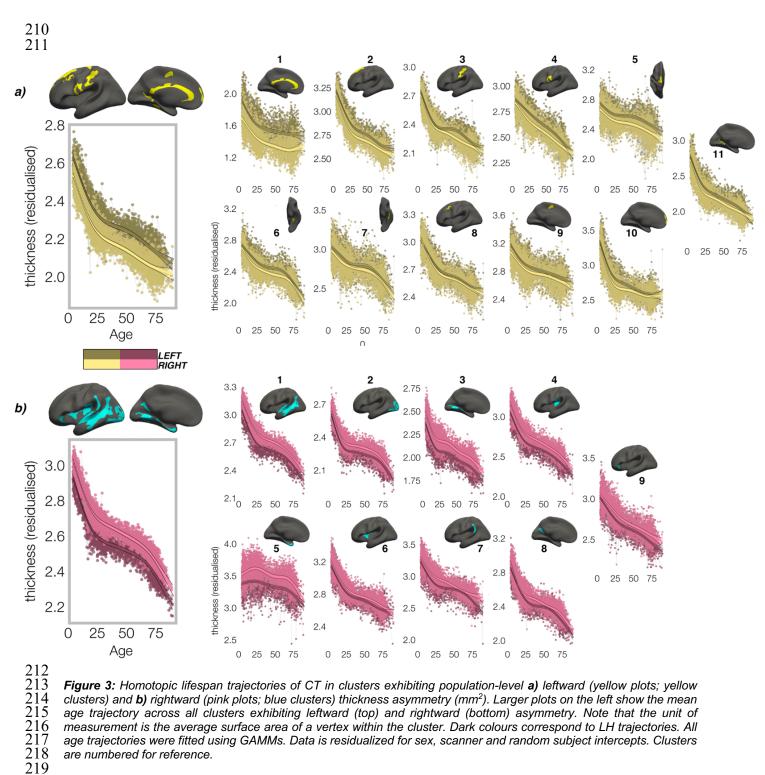


Figure 3: Homotopic lifespan trajectories of CT in clusters exhibiting population-level a) leftward (yellow plots; yellow clusters) and b) rightward (pink plots; blue clusters) thickness asymmetry (mm<sup>2</sup>). Larger plots on the left show the mean age trajectory across all clusters exhibiting leftward (top) and rightward (bottom) asymmetry. Note that the unit of measurement is the average surface area of a vertex within the cluster. Dark colours correspond to LH trajectories. All age trajectories were fitted using GAMMs. Data is residualized for sex, scanner and random subject intercepts. Clusters are numbered for reference.

# 222 223 2.3 Interregional asymmetry correlations

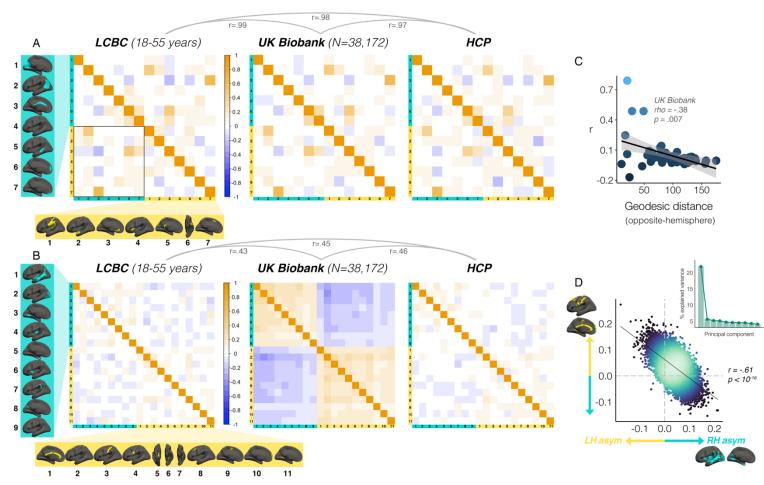
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224 225 We then investigated whether cortical asymmetry correlates within individuals (Methods).

 $\overline{2}\overline{2}\overline{6}$ For SA, a common covariance structure between asymmetries was detectable across datasets: LCBC, UKB and HCP 227 all correlated almost perfectly ( $r \ge 0.97$ , all  $p < 9.9^{-5}$ , Fig. 4A; Figure 4-figure supplement 1A). The highest correlations 228 (or "hotspots") all reflected positive correlations between regions that are on average left-asymmetric and regions that 229 are on average right-asymmetric (i.e. higher leftward asymmetry in one region related to higher rightward asymmetry in  $\overline{230}$ 231another; Fig 3A black outline); leftward asymmetry in SMG/perisylvian (#1L) was related to higher rightward asymmetry in inferior parietal cortex (#2R; r = .46 [LCBC]), leftward anterior cingulate asymmetry (ACC; #3L) was related to higher

232 rightward asymmetry in mPFC (#6R, r = .46), and leftward asymmetry in a superior frontal cluster (#7L) was related to 233 rightward asymmetry in the cinculate (#3R, r = .67). None of the relationships could be explained by brain size, as 234 additionally removing the effect of intracranial volume (ICV) from cluster AI's had a negligible effect on their interrelations 235(max correlation change = 0.003). Post-hoc tests confirmed that opposite-direction asymmetries were more correlated if  $\bar{2}\bar{3}\bar{6}$ closer in cortex (Methods); geodesic distance was lower between cluster-pairs that were more correlated (rho = -.37, p = .01 [LCBC]; -.38, p = .007 [UKB; Fig. 4C]; -.32, p = .02 [HCP]), though this was driven by the aforementioned "hotspots".  $\overline{2}\overline{3}8$ By contrast, same-direction SA asymmetries were not more correlated if closer in cortex (leftward [all p > .5]; rightward 239 [all p > .5]). This suggests specific SA asymmetries that are closer in cortex and opposite in direction may show 240 coordinated development. 241

242 For CT asymmetry, the correlation matrix exhibited a clear pattern in UKB that was less visible but still apparent in LCBC 243 and HCP (Fig. 4B; Figure 4-figure supplement 1B). Mantel tests confirmed that the covariance structure replicated 244 between all dataset-pairs (LCBC-UKB r = .43, p = .01; LCBC-HCP r = .45, p = .005; UKB-HCP r = .46, p = .01). The 245 observed pattern suggested higher leftward asymmetry in regions that are on average left-asymmetric was associated 246 with less rightward asymmetry in regions that are on average right-asymmetric. However, given that the AI measure is 247 bidirectional, closer inspection of the correlations revealed that higher leftward asymmetry in regions that are leftasymmetric actually corresponded to more leftward asymmetry in right-asymmetric regions, and vice versa (and on 248 249 average; see Figure 4-figure supplement 2). In other words, individuals may tend towards either leftward lateralization 250 or rightward lateralization (or symmetry) on average, irrespective of the region-specific direction of mean asymmetry in 251 the cluster. Similarly, asymmetry in left-asymmetric regions was mostly positively correlated, and asymmetry in rightasymmetric regions was mostly positively correlated. Again, additionally removing ICV-associated variance had 253 254 negligible effect (max correlation change = 0.007). Post-hoc principal components analysis (PCA) in UKB revealed PC1 explained 21.9% of the variance in CT asymmetry and strongly suggested a single global factor for CT asymmetry (Fig. 255 4D). Accordingly, we found a strong correlation between mean asymmetry across all leftward vs. mean asymmetry across all rightward clusters in UKB (r = -.61,  $p < 2.2^{-16}$  [means weighted by cluster size]; see Fig. 4D; r = -.56,  $p < 2.2^{-16}$  [unweighted raw means]; r = .66,  $p < 2.2^{-16}$  [PC1 across all leftward vs. PC1 across all rightward]; r = -.56,  $p < 2.2^{-16}$  [spatial average across vertices]). Though less strong, all relationships were significant in LCBC (r = -.10;  $p = 1.3^{-4}$  [weighted]; r = -.05; p = .03 [unweighted]; r = .04; p = .15 [unweighted]; r = .05; p = .04 [spatial average]. 256 257 258259 260 .13, p = 2.31<sup>-5</sup> [PC1 vs. PC1]; r = -.05; p = .07 [spatial average]; see Figure 4-figure supplement 3). Opposite-direction CT 261 asymmetries that were closer in cortex were more negatively correlated in LCBC (rho = .29, p = .003) but not HCP (p = 262 .33) or UKB (p = .84), whereas CT asymmetry in left-asymmetric (rho = -.40, p = .003 [LCBC]; rho = -.44,  $p = 8.1^{-4}$  [UKB], 263 rho = -.28, p = .04 [HCP]) and right-asymmetric (rho = -.34, p = .04 [LCBC]; rho = -.48, p = .003 [UKB], rho = -.58, p = .04264 2.0<sup>-4</sup> [HCP]) regions was more positively correlated in cluster-pairs that were closer in cortex. These results suggest CT



asymmetry is globally interrelated across the cortex and shows high directional variability in the adult population.

**Figure 4:** Interregional correlations between **A**) SA asymmetries and **B**) CT asymmetries for each replication dataset (Al's residualized for age, sex, scanner). Al's in rightward clusters are inversed, such that positive correlations denote positive asymmetry-asymmetry relationships regardless of direction. Yellow and blue brain clusters/colours denote leftward and rightward asymmetries, respectively (clusters numbered for reference). A consistent covariance structure was evident both for SA ( $r \ge .97$ ) and CT asymmetry ( $r \ge .43$ ; results above matrices). Black box in A highlights relationships between opposite-direction asymmetries (i.e. leftward vs rightward regions). **C**) For SA, opposite-direction cluster-pairs that were closer in cortex were more positively correlated (datapoints show cluster-pairs). **D**) A single component explained 21.9% variance in CT asymmetry in UKB (inset plot). Accordingly, we found a strong correlation (r= -.61;  $p < 10^{-16}$ ) in UKB between mean asymmetry across leftward clusters (Y-axis) vs. mean asymmetry across rightward clusters (X-axis; Al's in rightward clusters inversed). Lines of symmetry (0) are in dotted grey (see also Figure 4-figure supplements 1-3).

# 281 2.4 Heritability

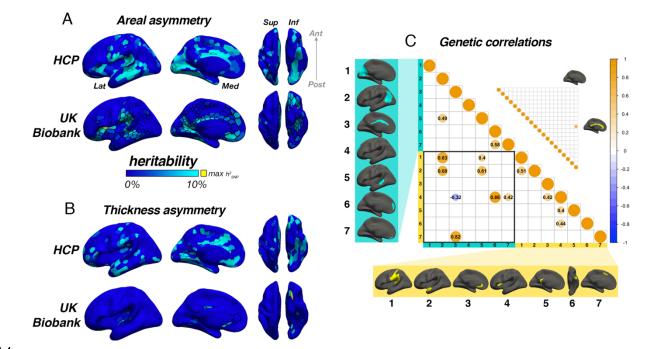
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Heritability of global AI measures was low and only significant for SA asymmetry in UKB (SA  $h_{SNP}^2 = .07$  [95% CI = .03 - .10];  $p = 2.16e^{-4}$ ; CT  $h_{SNP}^2 = .01$  [-.02 - .05]; p = .22, Supplementary file 1G). For SA, only two clusters showed significant heritability in HCP and these did not survive multiple comparison correction. In contrast, SNP-based analyses revealed 71% (10/14) of SA asymmetry clusters exhibited significant heritability (Supplementary file 1H). Importantly, highest heritability was observed for leftward SA in the anterior insula cluster ( $h_{SNP}^2 = 18.6\%$ ,  $p < 10^{-10}$ ; see note in Supplementary file 1H), which was substantially higher than the next highest estimates in SMG/perisylvian ( $h_{SNP}^2 = 10.7\%$ ,  $p = 3.01e^{-9}$ ), retrosplenial cortex, gyrus rectus and the cingulate (all  $h_{SNP}^2 = 8-10\%$ ). For CT, no cluster survived in HCP, only 3/20 (15%) clusters exhibited significant SNP-heritability, and estimates were lower ( $h_{SNP}^2 = 3-7\%$ ; Supplementary file 1I).

290 291 292 293 293 294 295 We then estimated cortex-wide heritability using a fine-grained parcellation <sup>50</sup> (Fig. 5). For SA, though no parcels survived correction in HCP, 53% (267/500) of parcels exhibited significant SNP-heritability (post-correction) in UKB (p/FDR]<.05; black outlines in Fig. 5A; parcels with suggestive significance in HCP [also in black outline] survived correction in UKB). Beyond significance, a consistent heritability pattern for SA asymmetry was clearly evident in both samples, notably in anterior insula, SMG, Sylvian fissure, STS, calcarine sulcus, cingulate, medial and orbitofrontal cortex, and fusiform 296 (spatial correlation between maps; r = .38;  $p < 10^{-16}$ ). Importantly, maximum SNP-heritability (yellow parcel in Fig. 5) was observed in anterior insula (parcel h<sup>2</sup><sub>SNP</sub> = 16.4%;  $p < 10^{-10}$ ), confirming this region constitutes the most heritable cortical 297  $\overline{298}$ asymmetry in humans (and not improving on the cluster-wise estimate). For CT, we observed little overlap in heritability 299 estimates between datasets (spatial correlation was significant but low; r = .12; p = .01). Significant FDR-corrected SNP-300 301 heritability was observed in 11% (57/500) of parcels, including around superior temporal gyrus, planum temporale, the posterior insula/Sylvian fissure, anterior insula, and in orbitofrontal cortex (max h<sup>2</sup><sub>SNP</sub> = 16.6%), along the cingulate and 302 in medial visual cortex. However, SNP-heritability for CT asymmetry was substantially lower ( $\beta = -0.71$ ,  $p < 2e^{-16}$ ), and 303 higher estimates pertained to regions that were limited in extent but showed no clear global pattern. 304

For SA, large genetic correlations explained several phenotypic correlations in Fig. 4A (Fig. 5C): high genetic correlations were found between leftward asymmetry in SMG/perisylvian and higher rightward asymmetry in lateral parietal cortex (LPC; rG = .83;  $p(FDR) = 7.76e^{.05}$ ), between leftward superior frontal cortex asymmetry and rightward asymmetry along the cingulate (rG = .82;  $p[FDR] = 1.36e^{.02}$ ), and between leftward anterior temporal/parahippocampal asymmetry and rightward asymmetry in LPC (rG = .68;  $p[FDR] = 1.36e^{.02}$ ). Genetic correlations between anterior insula and two rightward superior frontal clusters were also observed (rG = .86;  $p[FDR] = 1.41e^{.06}$ ; rG = 0.42;  $p[FDR] = 7.74e^{.04}$ ) in the absence of phenotypic correlations (Fig. 4), and several same-direction asymmetries showed moderate genetic correlation. For CT, one cluster-pair survived FDR-correction (see Fig. 5C; rG = 0.68;  $p[FDR] = 3.03e^{.02}$ ).

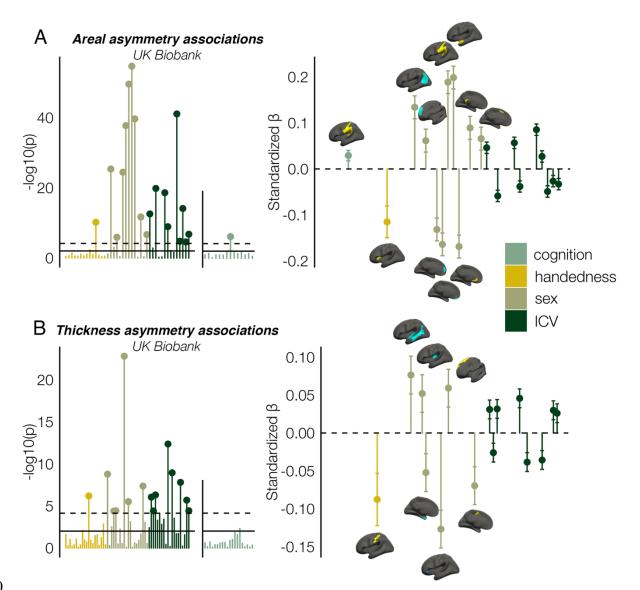


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Figure 5. Heritability of SA (A) and CT asymmetry (B) estimated cortex-wide in HCP (top row) and UKB (bottom). Unthresholded effect maps are shown. In HCP, no parcel survived FDR-correction, whereas for UKB, 53% of SA and 11% of CT parcels survived. Parcels in black outline show significance at p<.05 (uncorrected) for HCP, and at p[FDR]<.05 for UKB. Yellow parcels depict maximum SNP-heritability (SA  $h^2 = 16.4\%$ ; CT  $h^2 = 16.6\%$ ). C) SNP-based genetic correlations between SA (lower matrix) and CT asymmetries (upper). For SA, genetic correlations explained several phenotypic correlations (Fig. 4A). For CT, one pair survived FDR-correction (shown). Al's in rightward clusters were inversed such that positive genetic correlations denote asymmetry-asymmetry genetic relationships regardless of direction. Yellow and blue brain clusters/colours denote population-level leftward and rightward asymmetries, respectively (clusters numbered for reference).

#### 2.5 Associations with Cognition, Handedness, Sex, and ICV

315 316 317 318 319 320 321 322 323 324 325 326 327 328 329 330 331 332 333 Several significant associations were observed between factors-of-interest and asymmetry in our clusters (Fig. 6; Supplementary file 1J-K). Notably, all effect sizes were small. For general cognitive ability, we found one association: higher SA asymmetry in the largest leftward cluster (SMG/perisylvian) was significantly associated with better cognition  $(\beta = .03 [Cl = 0.02 - 0.04], p = 4.1e^{-7})$ . This was checked in the substantially reduced non-imputed subset of data with no missing cognitive variables and retained the lowest p-value (N = 4696;  $\beta$  =0.04 [CI = 0.01 - 0.07]; p = 6.9e<sup>-3</sup>). For handedness, reduced leftward SA asymmetry in anterior insula and CT asymmetry along postcentral gyrus was found in left-handers, in line with our recent vertex-wise mapping in UKB<sup>24</sup>. For sex effects, which were also small, males typically 334 exhibited slightly stronger SA asymmetry in large clusters (e.g. leftward SMG/perisylvian and temporal pole; rightward 335 inferior parietal and superior frontal) but reduced leftward and rightward asymmetry in mPFC. For CT, males exhibited 336 more rightward asymmetry in STS and posterior insula, more leftward CT asymmetry in superior frontal cortex, but 337 reduced rightward CT asymmetry in entorhinal cortex and anterior insula, and reduced leftward asymmetry in caudal 338 superior frontal cortex. As ICV effects were typically most nominal, these are shown in Figure 6-figure supplement 1.



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**Figure 6.** Associations with general cognitive ability (first principal component), Handedness, Sex, and estimated intracranial volume (ICV) in UKB, in clusters exhibiting population-level **A**) SA and **B**) CT asymmetry. Left plots denote significance (negative logarithm; corrected [ $p < 7.3e^{-5}$ ] and uncorrected threshold [p = .01] shown by dotted and non-dotted line, respectively). X-axis displays the test for each cluster-association. As maximum sample size was used to test each association (Handedness, Sex and ICV: N=37,570), effects on cognition were tested in separate models with fewer observations (N = 35,199; separated association plots). Right plots denote effect sizes, 95% confidence intervals (error bars) and cortical location of associations surpassing Bonferroni-corrected significance. Right handers and females are coded 0, such that a negative effect for handedness / sex / ICV / cognition denotes less asymmetry in left handers / males / larger brains / higher cognition. Associations with ICV are shown in Figure 6–figure supplement 1. Yellow and blue clusters denote leftward and rightward asymmetries, respectively.

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# 355 3. Discussion

We provide a reference for population-level cortical asymmetries using 7 international datasets and offer the first description of the longitudinal lifespan trajectories of cortical asymmetry. Our results demonstrate the replicable interregional relationships between asymmetries within individuals, provide the most detailed heritability maps for cortical asymmetry to date, uncover novel and confirm previously-reported associations with factors reportedly related to asymmetry, and further knowledge on normal brain development. All maps are available at neurovault.org/XXXX.

362 Our vertex-wise description of cortical asymmetries that reproduce across cohorts replicates and completes a recent low-363 resolution meta-analysis <sup>7</sup>, and can serve as a high-fidelity phenotype for future brain asymmetry studies. The marked 364 consistency across samples here suggests consensus may now be reached regarding cortical asymmetry phenotypes 365 in humans, as our results agree with most of the literature <sup>7,8,14,19,23,26,28</sup>, including a recent large-scale mapping in mid-

366 old age <sup>24</sup>. This consensus, along with the genetic findings presented herein, suggests genetic-developmental programs 367 regulate mean brain lateralization with respect to SA, and the trajectories observed here suggest this form of cerebral asymmetry is maintained throughout life and formed early on - likely in utero 26,31. For CT asymmetry - for which findings 368 have been particularly mixed 7,8,18-20,10-17 - the left-right patterning observed here is compatible with recent reports 10 369 studies examining CT asymmetry from birth <sup>11</sup>, global meta-analyses <sup>7</sup>, reports using alternative analysis streams <sup>11,20</sup>, anatomical asymmetries evident early in ontogeny <sup>51,52</sup>, and leftward CT asymmetry overlapping language- <sup>53</sup> and motor-370 371 372 related regions <sup>54,55</sup>. This consistency across adult samples may also indicate that mean CT asymmetry is genetically 373 regulated at the population-level in humans. However, our findings of development and decline of CT asymmetry across 374 life <sup>10</sup>, higher directional variability in adult samples and lower heritability converge to suggest CT asymmetry may be 375 more prone to lifespan change, potentially more malleable to life experience, and susceptible to lifespan accumulation 376 377 of insult. Though it remains possible CT asymmetry change could be genetically regulated into old age, this interpretation agrees with work suggesting SA may trace to prenatal factors <sup>56,57</sup> whereas CT relates more to postnatal lifespan influences 57,58 378 379

380 Conceivable sources of previously inconsistent results may be the age-distribution under study <sup>10</sup> and the existence of 381 382 varying directional asymmetries within the population (for CT asymmetry). This may partly explain why CT asymmetry metrics are more variable across datasets compared with SA<sup>7</sup>, though CT asymmetry effects are also smaller<sup>8,14,19</sup> and 383 likely contain more measurement error. Varying directional asymmetry within atlas-based parcels may also explain 384 inconsistent reports, such as in insular cortex where we observed consistent but discrepant asymmetry to that reported 385 in ENIGMA 7. However, this does not account for the discrepancy that studies using the same atlas 48 typically report 386 areal asymmetry in STS to be left-lateralized 7.27,28, as the right-lateralization evidenced here and elsewhere 14,26 seems 387 unambiguous. And although we did not find strong SA asymmetry in inferior frontal regions as reported by Kong et al 7, 388 both the unthresholded significance maps and standard parcellation analyses were compatible with this (Figure 1-figure 389 supplement 2. Figure 1-figure supplement 5). The high overlap in effects between 7 datasets from 4 countries suggests 390 our results likely apply universally, though future studies will be needed to confirm this in non-American/North European 391 samples. 392

393 Our longitudinal description of cortical asymmetry lifespan trajectories gleaned novel insight into normal brain 394 development. For SA, adult-patterns of lateralization were strongly established already before ~4 years, indicating SA 395 asymmetry traces back further and does not primarily emerge through later cortical expansion <sup>59</sup>. Rather, the lifespan 396 trajectories predominantly show stability from childhood to old age, as SA asymmetry was generally maintained through 397 periods of developmental expansion and aging-associated change that were region-specific and bilateral. This agrees 398 with evidence indicating SA asymmetry is primarily determined in utero 26, and indirect evidence suggesting little change 399 in SA asymmetry from birth to 2 years despite rapid and concurrent cortical expansion <sup>26,30,59</sup>. It may also fit with the 400 principle that the primary microstructural basis of SA 60 - the number of and spacing between cortical minicolumns - is 401 determined in prenatal life <sup>58,60</sup>, and agree with evidence suggesting asymmetry at this microstructural level may underly 402 hemispheric differences in SA 61. The developmental trajectories agree with studies indicating SA asymmetry is 403 established and strongly directional early in life 26,28. That anatomical change in later development specifically in SA 404 follows embryonic gene expression gradients may also agree with a prenatal account for SA asymmetry 58. These results 405 may therefore constrain the extent to which SA asymmetry can be viewed as a plastic feature of brain organization, and 406 may even suggest SA asymmetry may sometimes be a marker for innate hemispheric specializations shared by most 407 humans. The high degree of precision with which leftward SA asymmetry follows the contours of auditory-related regions 408 in the Sylvian fissure (Figure 1-figure supplement 1) which show left functional lateralization in humans may be one 409 example 61-63 410

411 In stark contrast, although weak CT asymmetry was evident by age 4, we observed considerable developmental growth 412 and lifespan change in CT asymmetry thereafter. Developmental trajectories showed non-linear asymmetry growth by 413 virtue of accelerated thinning of the non-dominant hemisphere, and led to maximally established asymmetry around ~25 414 years of age. These trajectories clearly suggest differentiation of the cortex is occurring with respect to CT asymmetry in 415 development, possibly, though not necessarily, suggesting CT asymmetry may be more amenable to experience-416 dependent plastic change. Still, as cortical thinning in childhood is thought to partly reflect likely learning-dependent processes such as intracortical myelination <sup>64</sup> and possibly pruning of initially overproduced synapses <sup>65,66</sup> and neuropil 417 418 reduction, CT asymmetry may reflect hemispheric differences in the developmental optimization of cortical networks at 419 least partly shaped by childhood experience. This raises the possibility CT asymmetry may be a marker of ontogenetic 420 hemispheric specialization within neurocognitive networks. Our findings in development agree with work finding a similar 421 left-right CT asymmetry pattern shows rapid asymmetry increase in the first years of life 11, with especially rapid increase 422 in leftward mPFC<sup>11</sup>. As we also observed rapid differentiation in mPFC that spanned across childhood and adolescence 423 (Fig. 3; Figure 3-figure supplement 3), we extend these earlier findings in neonates <sup>11</sup>. As prefrontal CT asymmetry 424 seems particularly vulnerable in neurodevelopmental disorders <sup>21</sup>, aging, and Alzheimer's disease <sup>10</sup>, these trajectories 425 may provide a useful normative reference. With regards to aging, most clusters exhibited the expected aging-associated 426 reduction of CT asymmetry we have previously shown is a feature of aging in heteromodal cortex <sup>10</sup>. The differentiation 427 and dedifferentiation of CT asymmetry at either end of life we show here underscores its proposed role in supporting  $\dot{428}$ optimal brain organization and function. 429

430 For SA asymmetry, we uncovered a covariance structure that almost perfectly replicated across datasets. In general, 431 this fit with a multifaceted view <sup>27,34,35</sup>, in which most asymmetries were either not or only weakly correlated, but reliably 432 so. However, we identified several regions wherein SA asymmetry reliably correlated within individuals, showing the

433 variance in cortical asymmetries is not always dissociable, as often thought <sup>27,34,35</sup>. The strongest relationships all 434 pertained to asymmetries that were proximal in cortex but opposite in direction. Several of these were underpinned by 435 high asymmetry-asymmetry genetic correlations, illustrating cerebral lateralizations in SA that are formed under common 436 genetic-developmental influence, and in agreement with likely prenatal origins for SA asymmetry <sup>26,60</sup>.

438 For CT asymmetry, we also uncovered a common covariance structure - particularly clear in UKB - that nevertheless 439 replicated with moderate precision across datasets. Furthermore, a single global factor explained a relatively high 440 proportion of variance in CT asymmetry in UKB, and a strong correlation across 38,172 individuals further suggested CT 441 asymmetry is globally interrelated across the cortex (Fig. 4D). These data for CT indicate individuals tend towards either 442 leftward asymmetry, rightward asymmetry, or symmetry, both globally across the cortex and irrespective of the region-443 specific average direction of asymmetry (Figure 4-figure supplements 2-3). This result seems in broad agreement with 444 the notion that some lateralized genetic-developmental programs may trigger lateralization in either direction <sup>35</sup> or lose 445 their directional bias through environmental interaction <sup>35</sup>. As CT asymmetry seems established at but minimal from birth <sup>11</sup>, genetic effects may determine the average region-specific hemispheric bias in the population, but developmental 446 447 change may subsequently confer major increases upon its directional variance <sup>35</sup>. Overall, the evidence converges to 448 suggest a high degree of developmental change may shape CT asymmetry and lead to higher directional variability in 449 the population. Thus, far from being independent phenotypes 27,34, CT asymmetries may be globally interrelated across 450 the cortex and their direction coordinated through development.

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452 For SA asymmetry, we found replicable patterns of moderate heritability across datasets and across twin and genomic 453 methods. We also found SA asymmetry in the anterior insula is, to our knowledge, the most heritable brain or behavioural asymmetry yet reported with genomic methods  $^{31,67,68}$ , with common SNPs explaining ~19% variance. This is a substantial improvement on our recent report of < 5%  $^{24}$ , and illustrates a benefit of our data-driven population-mapping 454 455 approach. As we reported recently <sup>24</sup>, we confirm asymmetry in this region associates with handedness (see below). Furthermore, highest SNP-heritability for SA was found in all regions that constitute the earliest emerging cortical 456 457 458 asymmetries in utero <sup>51,69–71</sup>: anterior insula, STS, PT, medial occipital cortex, and parahippocampal gyrus (Fig. 6A). Still, 459 we found most SA asymmetries exhibited significant - albeit often lower - heritability, as did most parcels when estimated 460 cortex-wide, and significant heritability was also evident in regions not found in the present analyses to show strong SA 461 asymmetry, such as Broca's area (but see Figure 1-figure supplement 5). These effects agree with and elaborate on two genetic explorations using atlas-based methods 7,31 and reports of heritable SA asymmetry in handedness-associated 462 463 clusters <sup>24</sup>. By contrast, CT asymmetry was generally not heritable, or showed low and localized heritability effects. We 464 also observed divergent results using twin and genomic methods for CT, possibly due to low-power for twin-models, 465 though we note the SNP-based effects we observed were somewhat in agreement with a previous twin study 7. Overall, 466 these reproducible results can guide phenotypic selection in future genomic and biological studies on cerebral laterality. 467

468 Considered together, lifespan stability possibly from birth <sup>26</sup>, less interindividual directional variability, higher heritability, 469 and phenotypic and genetic correlations all converge to suggest comparatively higher genetic influence upon SA 470 asymmetry and possibly limited plasticity. This agrees with work showing genetic variants associated with (mostly SA) 471 asymmetry are primarily expressed in prenatal life <sup>31</sup>. By contrast, developmental change, high interindividual directional 472 variability and low heritability for CT asymmetry may fit a scenario whereby CT asymmetry may be more responsive to 473 postnatal individual exposures 58, or driven by random developmental influences 72. Whether region-specific CT asymmetry-change relates to the maturation of lateralized brain functions 72,73 will be an important question for future 474 475 research. Regardless, our results support a relative prenatal-postnatal developmental dichotomy for SA and CT 476 asymmetry. 477

478 Screening asymmetries for association with cognition revealed one region - SMG/perisylvian - wherein higher leftward 479 asymmetry related to higher cognition. Across all samples tested, this cluster was consistently the most lateralized, with 480 ~95% directional concordance (Figure 1-figure supplement 3), suggesting highly regulated genetic-developmental 481 programs shape its laterality in humans. Asymmetry here is likely related to brain torque 25,40, a gross anatomical twist of 482 the hemispheres leading to interhemispheric anatomical differences especially around the Sylvian fissure <sup>25</sup>. Given that 483 brain torque also represents a population-level norm <sup>74</sup>, this result suggests disruptions in prenatal cerebral lateralization 484 may lead to cognitive deficits detectable in later life, and agrees with recent work suggesting brain torque may be related 485 to cognitive outcomes <sup>41,74</sup>. That this was found specifically in the most lateralized SA cluster may agree with work 486 suggesting general cognitive abilities that show inter-individual stability across life 75,76 relate primarily to SA phenotypes 487 that depend mostly on prenatal factors 56,58 488

489 Consistent with our recent vertex-wise analysis in UKB 24, we confirmed leftward SA asymmetry of the anterior insula, 490 and leftward CT asymmetry of somatosensory cortex, is subtly reduced in left handers. Sha et al. <sup>24</sup> reported shared 491 genetic influences upon handedness and cortical asymmetry in anterior insula and other more focal regions not identified 492 with the approach used here. Anterior insula lies within a left-lateralized functional language network 77, and its structural asymmetry may relate to language lateralization <sup>33,78,79</sup> in which left-handers show increased incidence of atypicality 493 494 <sup>30,81</sup>. Together with observations that its asymmetry emerges early in utero <sup>69</sup>, we agree with others <sup>33</sup> that future 495 research will find this ontogenetically foundational region of cortex 82,83 a fruitful line of inquiry for understanding genetic-496 developmental mechanisms influencing laterality phenotypes. Leftward CT asymmetry reduction in somatosensory 497 cortex in left handers also echoes our recent report, where it was suggested to reflect plastic adaptation to an already-498 established hand preference <sup>24</sup>. We extend these results by showing CT asymmetry both postcentrally and in general 499 shows developmental differentiation and lifespan change. Given this region overlaps with functional representations of

500 the hands <sup>54,55,84</sup> – as in Sha et al. <sup>24</sup> – and our approach also detected no significant heritability, these findings may also 501 fit a scenario whereby CT asymmetries are amenable to alteration through use-dependent plasticity and possibly carry 502 information regarding group-level hemispheric specializations of function. However, the small effects cast doubt on the 503 504 utility of cortical asymmetry to predict individual hand preference.

505 Asymmetry-relationships with other factors were often compatible with those reported in the ENIGMA meta-analysis 7. 506 Concerning sex effects - which were small and differing in direction - we similarly observed leftward SA asymmetry in 507 temporal and SMG/perisylvian regions to be larger in males 7, replicating earlier findings 32. Previous genetic analyses 508 imply steroid-hormone pathways underly this difference <sup>32</sup>, and sex in general was found to be more predictive than ICV 509 both here and elsewhere <sup>32</sup>. We also found lower SA asymmetry in medial prefrontal cortex in males that was compatible with this earlier report <sup>7</sup>. Inconsistencies evident between ours and the ENIGMA report include findings of increased (here) and decreased <sup>7</sup> lateral parietal SA asymmetry in males, and increased <sup>7</sup> and decreased (here) entorhinal CT 510 511 512 asymmetry in males, and our approach detected other regions slightly more asymmetric in males (e.g. STS). Possibly, 513 differences in sample median age (here UKB = ~64; Kong et al. = 26<sup>7</sup>) and potential sex-differences in age decline trajectories <sup>85</sup> may underlie some inconsistencies, possibly moreso for CT measures in structures vulnerable to agerelated degeneration <sup>24</sup>.

514 515 516 517 518 519 520 521 522 523 Several limitations should be mentioned. First, our delineation of population-level asymmetry used a single analysis software. As with most current papers, we used FreeSurfer's default 'recon-all' function to delineate the cortex, which has been extensively validated against postmortem measurements <sup>86</sup> and is the software underlying most large-scale studies involving brain measures. It is currently unclear to what extent differences in pipelines account for previous mixed results <sup>7,8,18–20,10–17</sup>. Although we highlight there are clear commonalities between our results and studies using alternative pipelines <sup>11,12,20</sup>, which may suggest our results generalize across analysis systems <sup>11,12,20,23</sup>, we found one instance where the MRI pipeline leads to different results for CT asymmetry (Figure 1-figure supplement 6). It is not known what 523 524 525 526 underlies this difference, though we find it is unrelated to the cross-hemispheric registration methods employed here, as our results reproduce using standard parcellation methods and thus are likely evident in most FreeSurfer-derived datasets (Figure 1-figure supplement 5). One possibility could be that thickness asymmetry may not reflect cortical 527 528 529 530 531 532 thickness differences per se, but rather reflect biologically meaningful hemispheric differences in intracortical myelination levels that are consistently picked up on via FreeSurfer's standard delineation procedure. That the anterior-posterior CT asymmetry pattern shows a clear developmental trajectory also suggests it is a true biological effect (Figure 3; Figure 3figure supplements 1-3). Relatedly, while the reported SA and CT asymmetry patterns and strengths using crosshemispheric methods agree with standard analysis (Figure 1-figure supplement 5), it is possible the magnitude of some specific asymmetries near the boundary of the subcortex may be exaggerated via this approach 24. Second, while 533 GAMMs are considered an optimal modelling technique for longitudinal lifespan data and are robust to non-normal age 535 534 535 536 537 538 distributions <sup>87</sup>, relative underrepresentation of the mid-adulthood age-range may drive trajectory inflection points around this age <sup>10</sup>, suggesting caution is warranted regarding interpreting mid-life inflection points as reflecting real change. Third, though the differing heritability methods applied enabled replication for SA, twin studies are prone to overestimating heritability due to unmet assumptions <sup>88</sup>, whereas SNP-based methods may not capture all phenotype-relevant genetic variance and have their own assumptions<sup>89</sup>. Indeed, we found twin-based estimates were often substantially higher even 539 where only nominally significant, agreeing with recent calls for caution when interpreting twin-based heritability estimates 540 <sup>88</sup>. Fourth, we imposed a necessary cluster size limit for overlapping asymmetry effects across samples, and thus more 541 542 focal asymmetries may also be informative in relation to the factors tested here <sup>24</sup>. Fifth, as only dichotomous handedness self-reports are available with UKB, future studies might benefit from incorporating more nuanced handedness 543 assessments not currently available in data of this size. Relatedly, because UKB cognitive data is not exhaustive (e.g. 544 fluid IQ ranges from 1-13), we extracted the common variance across core tests to index general cognitive ability. This 545 approach did not permit testing associations with specific cognitive abilities, which may be highly informative in the 546 context of asymmetry, particularly in the case of lateralized cognition <sup>90</sup>. 547

548 Overall, we provide an openly-available comprehensive characterization of asymmetry in the cerebral cortex including 549 550 551 552 longitudinal lifespan changes, heritability, and individual differences that bears enough reproducibility to be used as a standard in future research.

#### 4. Methods

#### 4.1 Samples

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553 554 555 556 557 558 We used anatomical T1 -weighted (T1w) scans from 7 independent international MRI datasets originating from 4 countries (see Supplementary file 1A for an overview of samples used for each analysis). Note that with the exception of vertex-wise analyses in UKB (see below), all analyses made use of all available observations from each sample meeting the stated criteria for each analysis (e.g. age-range).

#### 560 4.1.1 Reproducibility across samples

561 To delineate average adult patterns of whole-cortical SA and CT asymmetry, we restricted the age-range of all samples 562 used in the vertex-wise analyses to 18-55. Dataset 1: Here, the Center for Lifespan Changes in Brain and Cognition 563 (LCBC) sample comprised 1572 mixed cross-sectional and longitudinal scans (N longitudinal = 812; timepoint range = 564 1-6) from 923 participants (mean age = 30.6 ± 9.6) collected across 2 scanners. Additionally, 125 individuals were double-565 scanned at the same timepoint on both scanners. Dataset 2: The Cambridge Centre for Ageing and Neuroscience (Cam-CAN) 91 sample comprised cross-sectional scans of 321 individuals (mean age = 38.7 ± 9.7) 92. Dataset 3: The Dallas 566

Lifespan Brain Study (DLBS) 93 sample comprised cross-sectional scans of 160 individuals (mean age = 37.5 ± 10.7). 567 568 Dataset 4: The Southwest University Adult Lifespan Dataset (SALD) 94 sample comprised cross-sectional scans of 301 569 individuals (mean age = 33.7 ± 11.5). Dataset 5: The IXI sample comprised cross-sectional scans of 313 healthy 570 571 individuals collected across 3 scanners (mean age =  $36.8 \pm 9.6$ ; http://brain-development.org/ixi-dataset). **Dataset 6:** Here, the Human Connectome Project (*HCP*) 1200 <sup>95</sup> sample comprised 1111 scans (mean age =  $28.8 \pm 3.7$ ). **Dataset** 572 573 7: Here, the UKB sample consisted of 1000 randomly sampled cross-sectional scans (mean age = 52.1 ± 1.9), restricted to be comparable in size to the other datasets in this analysis. 574

#### 575 4.1.2 Lifespan trajectories

576 577 578 579 580 Here, we used the full age-range of LCBC (4.1 - 89.4 years), with a sample comprising 3937 cross-sectional and longitudinal scans (N longitudinal = 2762) from 1886 individuals (females = 1139; mean age = 36.8) collected across 4 scanners (271 double-scans) 96,97.

#### 4.1.3 Interregional correlations

Here, we used the three largest datasets; LCBC (N = 923; N obs = 1572), UKB (N = 38,172), and HCP (N = 1109; two outliers removed; see 4.3.3).

#### 4.1.4 Heritability and individual differences

581 582 583 584 585 586 586 For twin heritability, we used HCP 1200 extended twin data (1037 scans from twins and non-twin siblings; age-range = 22-37; mean age = 28.9 ± 3.7). The various kinships are described in Supplementary file 1B. All included twin pairs were same-sex. For SNP-heritability, we used the UKB imaging sample with genome-wide data (N = 31,433; see 4.3.4). For 588 589 590 individual differences analyses, we used the UKB imaging sample with the maximum number of available observations for each variable-of-interest (see 4.3.5).

#### 591 4.2. MRI preprocessing

592 T1w anatomical images (see Supplementary file 1C for MRI acquisition parameters) were processed with FreeSurfer 593 (v6.0.0) 98 and vertex-wise SA and CT morphometry estimates were obtained for each MRI observation. As the LCBC 594 sample also contained longitudinal observations, initial cross-sectional reconstructions in LCBC were subsequently ran 595 through FreeSurfer's longitudinal pipeline. As HCP data was acquired at a higher voxel resolution (0.7mm isotropic), the 596 T1w scans were processed with the --hires flag to recon-all 99. SA and CT maps of the LH and RH of each participant in 597 each dataset were resampled from the native cortical geometry to a symmetrical surface template ("LH\_sym")<sup>14,100</sup> based 598 on cross-hemispheric registration <sup>101</sup>. This procedure achieves vertex-wise alignment of the data from each participant 599 and homotopic hemisphere in a common analysis space. SA values were resampled with an additional Jacobian 600 correction to ensure preservation of the areal quantities <sup>102</sup>. We then applied an 8mm FWHM Gaussian kernel to surface-601 smooth the LH and RH data. 602

#### 603 4.3 Data analysis

604 All analyses were performed in FreeSurfer (v6.0) and R (v4.1.1). 605

#### 606 4.3.1 Reproducibility across samples: population-level asymmetry

607 We assessed SA and CT asymmetry vertex-wise using FreeSurfer's Linear Mixed Effects (LME) tool <sup>103</sup>. Asymmetry was 608 delineated via the main effect of Hemisphere (controlling for Age, Age × Hemisphere, Sex, Scanner [where applicable], 609 with a random subject term). For each sample and metric, we computed mean Asymmetry Index maps (AI; defined as (LH-RH) / ((LH+RH)/2)). Spatial overlap of AI maps across datasets was quantified using Pearson's r. To delineate 610 611 regions exhibiting robust SA and CT asymmetry across datasets, we thresholded and binarized the AI maps by a given 612 absolute effect size (SA = 5%; CT = 1%; achieving p[FDR] < .001 in most datasets with FreeSurfer's 2-stage FDR-613 procedure <sup>103</sup>), and summed the binary maps. After removing the smallest clusters (<200 mm<sup>2</sup>), a set of robust clusters 614 was defined as those exhibiting overlapping effects in 6 out of 7 samples. We then extracted SA and CT data in 615 symmetrical space for each cluster, subject, and hemisphere, spatially averaging across vertices. 616

#### 617 4.3.2 Lifespan trajectories

618 Factor-smooth GAMMs ("gamm4" <sup>104</sup>) were used to fit a smooth Age trajectory per Hemisphere, and assess the smooth 619 Age × Hemisphere interaction in our clusters. The linear predictor matrix of the GAMM was used to obtain asymmetry 620 trajectories and their confidence intervals, computed as the difference between zero-centered (i.e. demeaned) 621 622 623 hemispheric age-trajectories. We included Hemisphere as an additional fixed effect, sex and scanner as covariates-ofno-interest, and a random subject intercept. A low number of basis dimensions for each smoothing spline was chosen to guard against overfitting (knots = 6; see Figure 2-figure supplement 1). Here, outliers falling > 6SD from the trajectory of 624 625 either hemisphere were removed on a region-wise basis (Supplementary file 1E-F).

#### 626 4.3.3 Interregional correlations

627 We assessed covariance between asymmetries, separately for SA and CT. Here, we regressed out age, sex and scanner 628 (where applicable) from each AI, and obtained a cluster-cluster correlation matrix. Individual AI's in clusters with rightward 629 mean asymmetry were inversed, such that positive correlations denote asymmetry-asymmetry relationships regardless 630 of the direction of mean asymmetry in the cluster. At this point, two outliers in HCP data were detected and discarded for 631 this and all subsequent analyses (Figure 4-figure supplement 4). Replication was assessed using the Mantel test ("ade4" 632 <sup>105</sup>) between each dataset-pair (LCBC, UKB, HCP) across 10,000 permutations. We then post-hoc tested whether

633 covariance between asymmetries was related to proximity in cortex, obtaining the average geodesic distance between

all clusters along the ipsilateral surface ("SurfDist" Python package <sup>106</sup>), and correlating pair-wise distance with pair-wise
correlation coefficient (Fisher's transformed coefficients; Spearman's correlation). To post-hoc test whether observed
covariance patterns for CT reflected a global factor, we ran a PCA across z-transformed Al's for all CT clusters (precorrected for the same covariates). Based on the results, we computed the mean Als across all leftward and across all
rightward clusters and tested the partial correlation between mean leftward CT asymmetric clusters
and mean rightward CT asymmetry in right-asymmetric clusters, in each of the three cohorts.

#### 641 4.3.4 Heritability

642 Heritability of SA and CT asymmetry was assessed using both twin- and SNP-based methods, both for our set of robust 643 clusters and cortex-wide across 500 parcels <sup>50</sup>. For cluster analyses, significance was considered at Bonferroni-corrected 644 p<.05 applied separately across each metric. Cortex-wide significance was considered at p(FDR) < .05 (500 tests per 645 map). Twin heritability was assessed using ACE models in "OpenMx" <sup>107</sup>. Using observed cross-twin and cross-sibling 646 covariance, the ACE model decomposes the proportion of observed phenotypic variance into additive genetic effects [A], 647 shared environmental effects [C], and unique environmental effects and/or error [E]. Data were reformatted such that 648 rows represented family-wise observations. As is standard, we set A to be 1 for MZ twins assumed to share 100% of 649 their segregating genes (but see <sup>108</sup>), 0.5 for DZ twins and siblings that share 50% on average, and shared environment was assumed equal for twins and non-twin siblings (but see 88,109). For each phenotype we first regressed out age and 650 651 sex and computed z-scores. Statistical significance was assessed by comparing ACE model fit to submodels with the 652 parameter-of-interest removed.

653 For SNP-heritability, the final genetic sample consisted of 31,433 UKB participants (application #32048) with imaging 654 and quality checked genetic data. We removed subjects that were outliers based on heterozygosity [field 22027] and 655 missingness (> 0.05), mismatched genetic and reported sex [22001], sex chromosome aneuploidies [22019], and those 656 not in the "white British ancestry" subset [22006] <sup>110</sup>. At variant level, after removing SNPs with minor allele frequency < 657 0.01, data from 654,584 autosomal SNPs were used to compute a genetic relationship matrix using GCTA (v1.93.2) 111. 658 For each phenotype, we first regressed out age and sex and computed z-scores. Genome-based restricted maximum 659 likelihood (GREML) methods as implemented in GCTA were then used to compute SNP-heritability for each AI measure, 660 applying a kinship coefficient cut-off of 0.025 (excluding one individual from each pair), and controlling for genetic 661 population structure (first ten principal components). Bivariate GREML analysis was used to test genetic correlations 662 between asymmetry clusters <sup>111</sup>, with relationships tested only for cluster-pairs where both clusters exhibited significant 663 SNP-heritability (p < .05; pre-corrected; 78 tests for SA, 48 for CT). Significance of genetic correlations was assessed at 664 *p(FDR)* <.05.

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#### 667 4.3.5 Associations with Cognition, Sex, Handedness, & ICV

668 Finally, we assessed relationships between asymmetry in our robust clusters and cognitive ability, handedness, sex and 669 ICV. For cognition, we used the first principal component across the following 11 core UK Biobank cognitive variables 670 <sup>112</sup>: Mean reaction time (log transformed) [field 20023], Numeric memory [4282], Fluid reasoning [20016], Matrix 671 672 completion [6373], Tower rearranging [21004], Symbol digit substitution [23324], Paired associate learning [20197], Prospective memory [20018], Pairs matching (log) [399], Trail making A (log) [6348], Trail making B (log) [6350]. Prior to 673 the PCA, for participants with cognitive data, data was imputed for missing cognitive variables via the "imputePCA" R 674 function (number of estimated components tentatively optimized using general cross validation; "missMDA" Package <sup>113</sup>). 675 PC1 (explaining 39.2%; Supplementary file 1L) was inversed to correlate negatively with age (r = -.39), ensuring higher 676 values reflected higher cognition. As fewer participants had cognitive data relative to the other variables, for each cluster 677 we ran one set of linear models to assess the marginal effect of cognition (PC1 as predictor; age, sex, ICV controlled; N 678 = 35,199), and one set of linear models to assess the marginal effects of Handedness, Sex, and ICV in a model including 679 all three predictors (age controlled, N = 37,570 with available handedness data). For the cognitive analysis, effects 680 identified in the imputed dataset were checked against the confidence intervals for the effect in the subset of the data 681 with no missing cognitive variables (N = 4696). Participants who self-reported as mixed handed were not included as this 682 can be unreliable over repeat time-points <sup>24</sup>. Significance was considered at Bonferroni-corrected  $\alpha = p < 7.3^{-5}$  (.01/136 683 [34 clusters × 4]).

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# 686 Data sharing/availability

All summary-level maps are available at neurovault.org/XXXX (upon acceptance). All code underlying the main
analyses is available at <a href="https://github.com/jamesmroe/PopAsym">https://github.com/jamesmroe/PopAsym</a> and on the Open Science Framework (upon
acceptance). All derived source data underlying all figures is also available here and in Supplementary files 2-3. All
datasets used in this work are openly available, with the exception of LCBC, where participants, which include many
children, have not consented to share their data publicly online. Other datasets used in this work are available without
restrictions and are not subject to application approval (DLBS; https://fcon\_1000.projects.nitrc.org/indi/retro/dlbs.html;
CC BY-NC; SALD; http://fcon\_1000.projects.nitrc.org/indi/retro/sald.html; CC BY-NC; IXI; https://brain-

development.org/ixi-dataset; CC BY-SA 3.0). Accordingly, we have made the individual-level data for these samples available and our code can be used to reproduce vertex-wise analyses in these samples. Individual-level data for the remaining samples (LCBC; Cam-CAN, HCP; UKB) may be available upon reasonable request, given appropriate ethical, data protection, and data-sharing agreements where applicable. Requests must be submitted and approved via

698 the relevant channel (details are provided in Supplementary File 2).

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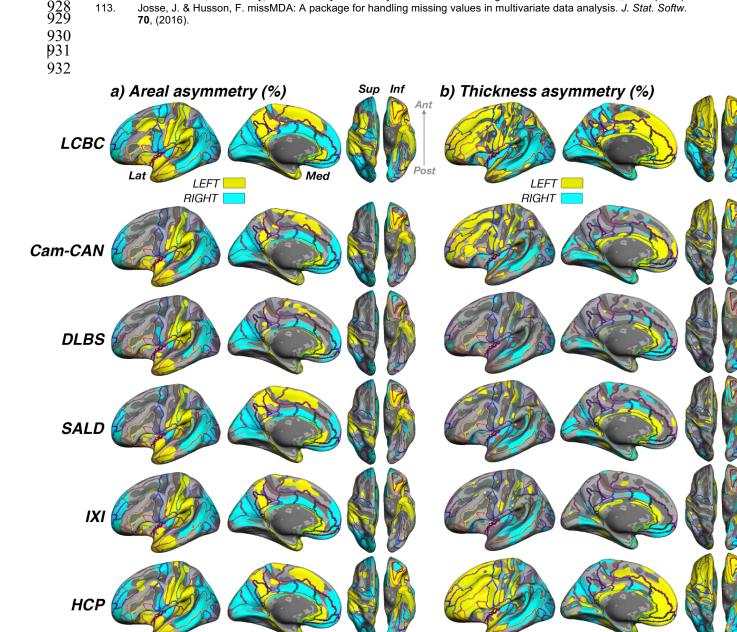
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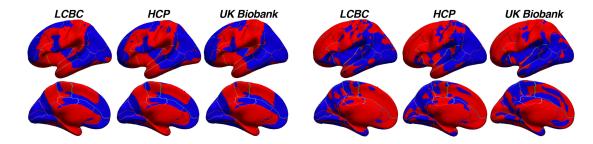


112.

#### 933 Figure 1–figure supplement 1

934 Significance of asymmetry effects across samples

A) Significance for A) SA and B) CT asymmetry across all samples. Note that because differences in sample size and test power affect the overall level of significance and consequently the FDR-correction, the visualization threshold is set to match the FDR-corrected significance level for each cortical metric in the first sample (LCBC; p < .001). Warm and cold colours depict significance of leftward and rightward asymmetry, respectively. To permit more fine grained interpretation of anatomical correspondence, an outline of the Destrieux <sup>1</sup> cortical atlas is overlain. Compare with effect sizes in Fig. 1 and 2 in main paper.



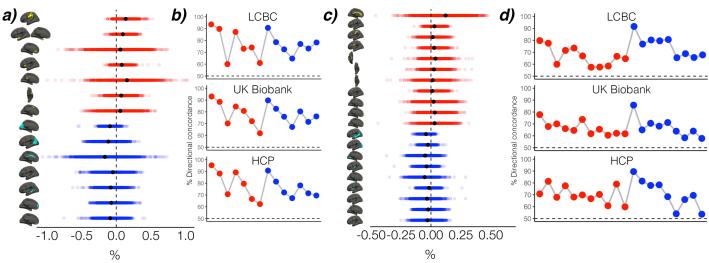
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943 Figure 1-figure supplement 2

#### 944 Unthresholded maps

945 Completely unthresholded significance maps of SA (leftmost 3 columns) and CT (rightmost 3 columns) asymmetry

- 946 "effects" for the three largest samples. Desikan-Killiany atlas is overlain.
- 947



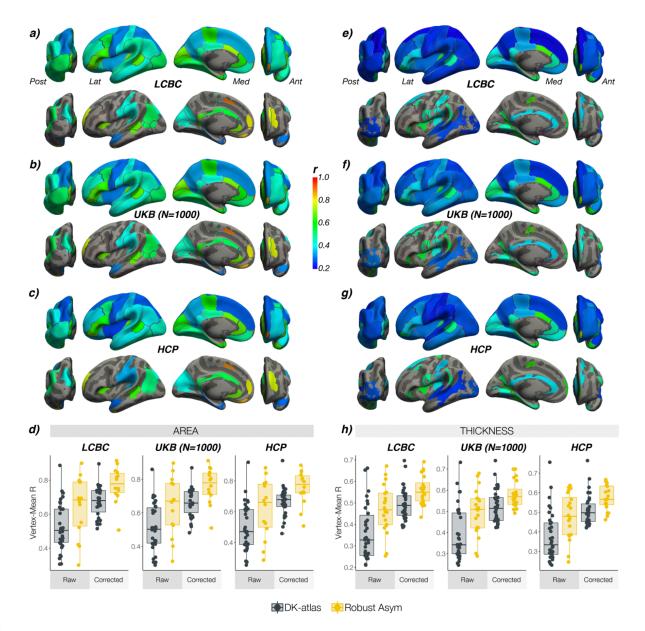
#### 948 Figure 1-figure supplement 3

949 Variances of asymmetries

950 Raw distribution of asymmetry (AI's) within population-level A) SA and C) CT asymmetries in adults (mean AI in black),

951 and the proportion of observations with the expected directionality for B) SA and D) CT clusters. B and D are ordered

952 as in A and C. Raw distributions are shown for the LCBC (18-55 years) dataset. % on the x-axis denotes the AI of the average CT and SA of a vertex within the cluster.



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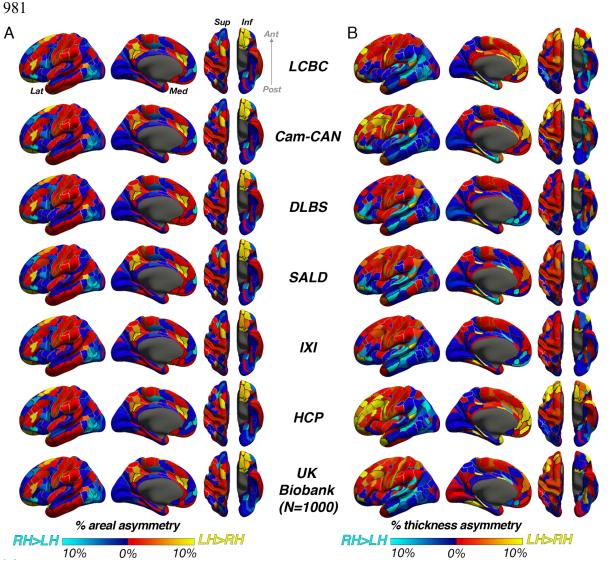
#### 957 Figure 1-figure supplement 4

958 Comparison of vertex-wise and atlas-based asymmetry estimates

959 To assess to what extent vertex-wise SA and CT asymmetry estimates adhere to the anatomical boundaries of the Desikan-960 Killany (DK) atlas, we derived AI maps per subject and extracted a vertex × subject matrix. Then, within each of the 34 DK 961 parcels we correlated the AI at each vertex with the parcel mean (i.e. the mean asymmetry across parcel vertices) and 962 computed the mean correlation for each parcel. High correlations would be expected where atlas-derived parcels fit well to <u>963</u> the underlying vertex-wise structure of cortical asymmetry. We then repeated this analysis using our set of robust 964 asymmetry clusters. As a formal test, for each cortical metric the resulting coefficients were used as response variable in 965 linear regressions with Cluster Type (DK parcels vs. Robust clusters) as predictor, controlling for cluster size (nVertices) 966 and the Cluster Type × nVertices interaction. For SA asymmetry, the average vertex-mean correlations across all Desikan-967 Killiany (DK) parcels were  $r = .53 \pm .14$  [LCBC],  $r = .51 \pm .14$  [UK Biobank], and  $r = .49 \pm .15$ , which respectively increased 968 to  $r = .65 \pm .18$ ,  $r = .64 \pm .18$ , and  $r = .62 \pm .19$  for SA asymmetry clusters. For CT, the average vertex-mean correlations 969 across all DK parcels were  $r = .36 \pm .12$  [LCBC],  $r = .39 \pm .12$  [UK Biobank] and  $r = .38 \pm .12$ , which respectively increased 970 to  $r = .47 \pm .11$ ,  $r = .50 \pm .11$  and  $r = .48 \pm .12$ . As would be expected, within parcel/cluster vertex-mean correlations were 971 significantly lower in larger parcels/clusters. Linear regressions (size controlled) revealed a significant main effect of Cluster Type in all but one association test (see SI Table 5), confirming the visual impression that DK parcels conform poorly to the 973 underlying asymmetry of cortex. A-C) Average correlation between vertex-wise estimates of SA asymmetry within DK 974 parcels to the mean across each parcel (top rows) and between vertex-wise estimates of SA asymmetry within robust 975 clusters to the mean across each cluster (bottom rows) within each dataset. D) Vertex-mean correlation coefficients for SA 976 asymmetry in DK parcels and robust asymmetry clusters, shown as raw values and after correcting for number of vertices 977 in the parcel/cluster. Comparable analyses for CT asymmetry are shown in D-H). The complete set of raw vertex-mean

978 correlation coefficients correlated highly between all dataset-pairs for both SA (min r = 0.97) and CT (min r = 0.95) 979 *Post=posterior; Lat=lateral; Med=medial; Ant=anterior.* 





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987 Mean SA and B) CT asymmetry in each dataset analysed using standard methods on the *fsaverage* template within

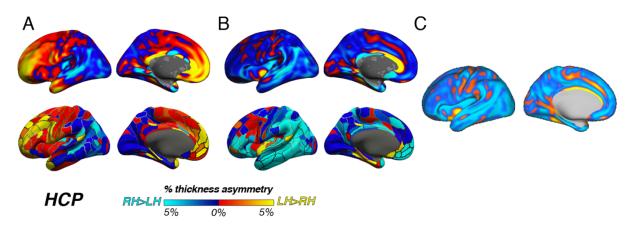
988 parcels from the HCP multimodal brain atlas<sup>2</sup>. We used this atlas here because it appeared best suited to assess

- 989 parcels that are homotopic. Warm and cold colours depict leftward and rightward asymmetry, respectively.
- 990 Post=posterior; Lat=lateral; Med=medial; Ant=anterior; Sup=superior; Inf=inferior.
- 991

<sup>984</sup> Figure 1–figure supplement 5

<sup>985</sup> Unthresholded asymmetry effects analysed using a standard brain atlas with no cross-hemispheric registration

<sup>986</sup> of data

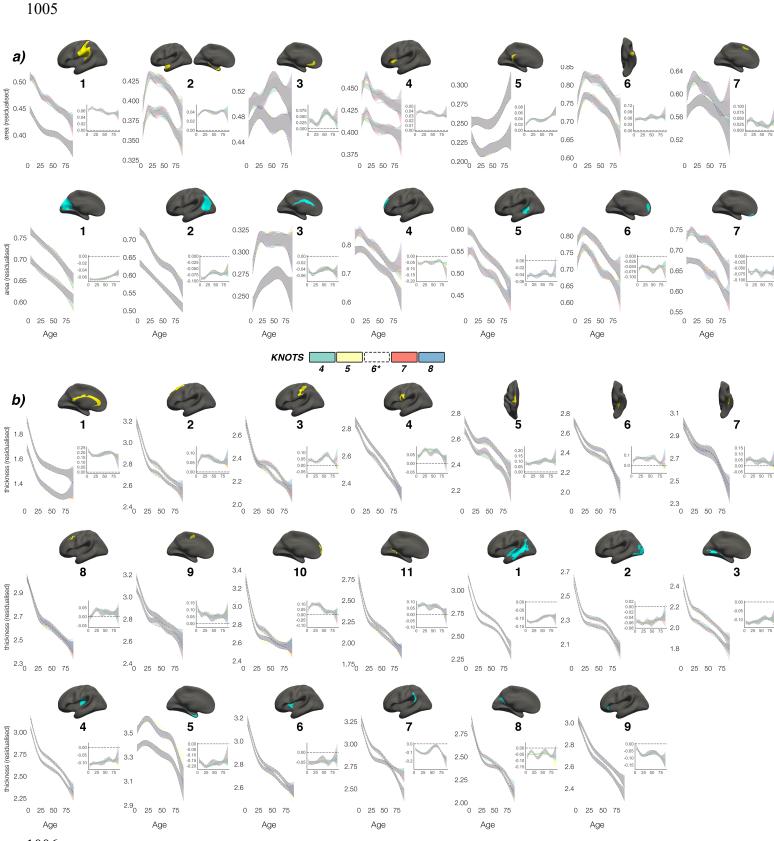


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# 993 Figure 1–figure supplement 6

# 994 HCP pipeline

995 CT asymmetry results in the HCP dataset vary depending on the preprocessing pipeline. A) Results from using the -996 hires argument to recon-all (as in main paper). We used this method to best harmonize preprocessing across cohorts 997 whilst accounting for the higher resolution of HCP data. Shown again for comparison, the top row in A is akin to the 998 results in the main paper (analysed using cross-hemispheric registration methods) whereas the bottom row is the same <u>9</u>99 data analysed using standard parcellation methods (as in Figure 1-figure supplement 5). B) CT asymmetry results 1000 using the HCP preprocessed data subject to extra preprocessing steps and inputs, analysed using cross-hemispheric 1001 registration methods (top row) and standard parcellation methods (bottom). C) Results using the HCP preprocessed 1002 data when calculating thickness asymmetry on the fs LR template. Warm and cold colours depict leftward and 1003 rightward asymmetry, respectively. Post=posterior; Lat=lateral; Med=medial; Ant=anterior; Sup=superior; Inf=inferior. 1004



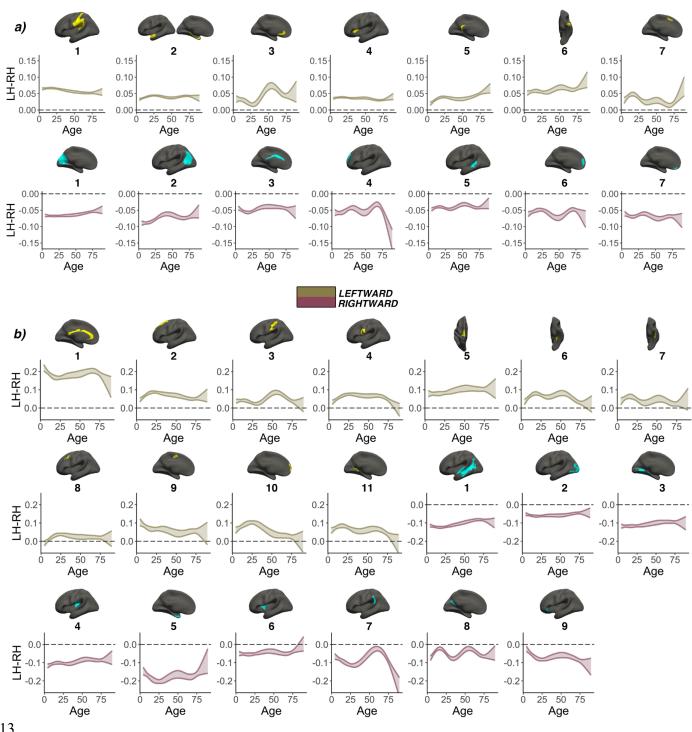
#### 1006 Figure 3–figure supplement 1

#### 1007 Knot comparison

Lifespan trajectories of population-level **a**) SA and **b**) CT asymmetries modelled with different smoothing parameters (number of knots 4-8, with the selected number of knots [6] shown in black dotted outline). Grey indicates overlap. All age trajectories were fitted using GAMMs. Inset plots show absolute asymmetry trajectories across life at the different

1011 smoothing parameters.

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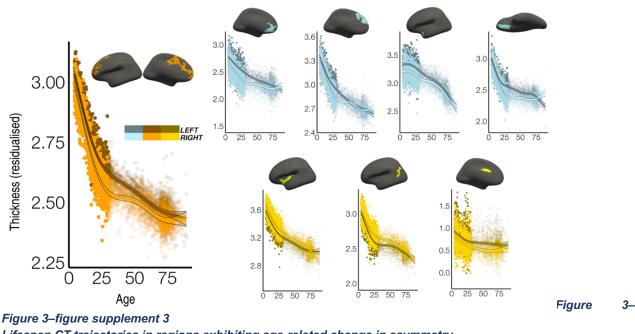


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#### 1014 Figure 3–figure supplement 2

1015 Smooth Age x Hemisphere interactions

Generalized additive mixed Model (GAMM) results for population-level **a**) SA and **b**) CT asymmetries. A smooth Age × Hemisphere interaction [s(LH)-s(RH-Age)] was fitted to model asymmetry changes across the lifespan. Specifically, GAMMs were used to compute the zero-centered age-trajectories of the left [s(LH-Age)] and right [s(RH-Age)] hemisphere for each cluster, and the asymmetry trajectory was computed as the difference between the two [s(LH-Age)-s(RH-Age)]. Gold and pink colours denote clusters defined by leftward or rightward asymmetry, respectively. For each cluster the main effect of Hemisphere was added to visualize the lifespan trajectory of absolute asymmetry. Bands represent 95% confidence intervals. Note that all SA clusters show asymmetry trajectories that are significantly different from 0 (symmetry; dotted line) across the entire lifespan, and 19/20 CT clusters were significantly asymmetric already by ~age 4.

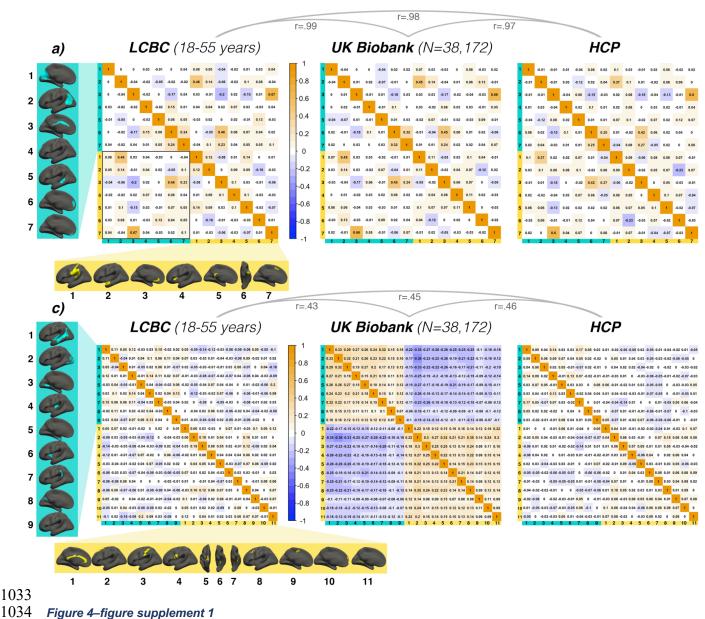


1027 Lifespan CT trajectories in regions exhibiting age-related change in asymmetry

Homotopic lifespan CT trajectories in an alternative set of regions derived from a previous analysis (clusters from Roe et al., 2021 <sup>3</sup>; derived from vertex-wise analyses of age-related CT asymmetry change in LCBC adult data [20-89 years]). Dark colours correspond to LH trajectories (colours correspond to clustering solutions in Roe et al., 2021 <sup>3</sup>). To highlight

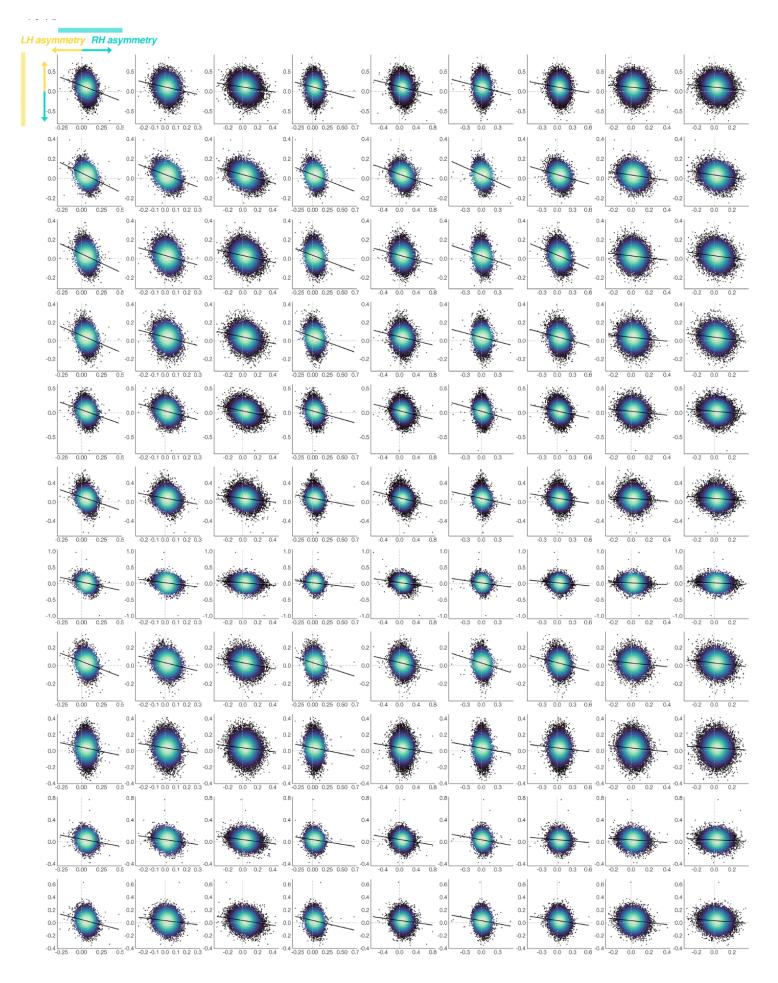
1031 development, datapoints are semitransparent after age 30. All GAMM models are equivalent to those in main paper.

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# 1035 Annotated covariance matrices

1036 Correlation coefficients of the inter-relationships between robust asymmetry phenotypes exhibiting A) SA asymmetry and 1037 C) CT asymmetry for each replication dataset (Al's residualized for age, sex and scanner). Rightward Al's are inversed, 1038 such that positive correlations denote positive asymmetry-asymmetry relationships regardless of direction. Covariance 1039 structures were highly consistent across replication datasets for SA asymmetry (A;  $r \ge .97$ ) and CT asymmetry (C;  $r \ge .42$ ), 1040 as revealed by pair-wise whole-matrix comparisons (Mantel tests; results shown above matrices). Black box in A highlights 1041 the relationships between opposite-direction asymmetries in different regions of cortex (i.e. leftward v rightward regions). 1042 Yellow and blue clusters/colours denote robust leftward and rightward asymmetries, respectively (clusters numbered for 1043 reference). Thickness inter-relationships in the lower left quadrant of UK Biobank matrix are visualized in SI Fig. 6. 1044

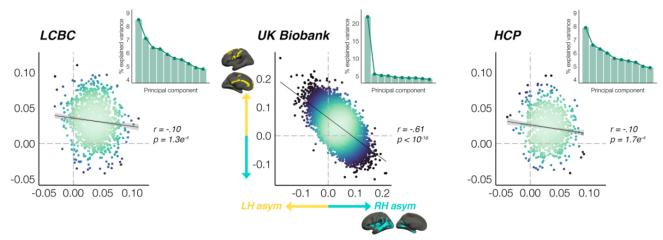


#### 1046 Figure 4–figure supplement 2

#### 1047 SI Fig. 10 – UK Biobank lower quadrant

Thickness asymmetry interrelationships between opposite-direction asymmetries (lower left quadrant of the UK Biobank correlation matrix in SI. Fig. 3; N = 38,172) are visualized to describe whether negative asymmetry-asymmetry correlations pertained to reduced or reversed thickness asymmetry. Lines of symmetry (0) are shown in grey. X-axis and Y-show raw AI data after removing the fixed effects of age and sex (i.e. data is not scaled to have a mean of 0). AI's in rightward clusters are inversed, such that positive correlations would denote positive asymmetry-asymmetry relationships regardless of direction. Order of cortical locations is in SI. Fig. 3)

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# 1057 Figure 4–figure supplement 3

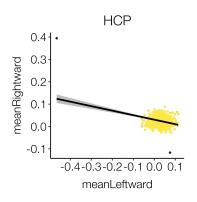
1058 SI Fig. 11 – Global thickness asymmetry relationships

Global thickness asymmetry relationships. Principal components analysis across AI's in all leftward and rightward CT asymmetry clusters revealed a single component explained most of the variance in UK Biobank, and there was evidence of a relatively stronger first component in LCBC and HCP (inset scree plots). Scatter plots show the partial correlation of the mean asymmetry across all leftward vs. all rightward clusters (means weighted by cluster size) plotted for each cohort, after AI's were corrected for age, sex and (where applicable) scanner. Lines of symmetry (0) are shown as dotted grey. AI's in rightward clusters are inversed, such that positive correlations would denote positive asymmetry-asymmetry relationships regardless of direction.

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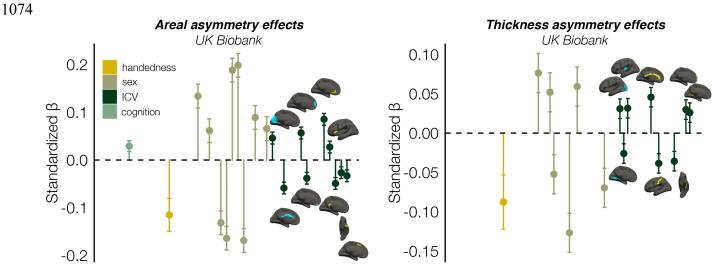


#### 1069 Figure 4–figure supplement 4

#### 1070 HCP outliers discarded

1071 Two outliers (black) were detected in the cortical thickness data of HCP and subsequently discarded for all subsequent

1072 analyses. Plot shows mean CT asymmetry across all leftward vs. mean CT asymmetry across all rightward clusters.



#### 1075 Figure 6–figure supplement 1

# 1076 ICV effects

Continuation of Fig. 5 in main paper. Cortical locations of the effects underlying the observed associations of robust SA (left) and CT (right) asymmetry phenotypes with brain size (ICV) in UK Biobank. Plots denote the effect sizes (standardized Betas) and cortical location of all associations surpassing Bonferroni-corrected significance (Fig. 5). Right handers and females are coded 0, such that a negative effect size for handedness / sex / ICV / cognition denotes less asymmetry in left handers / males / larger brains / higher cognition. Blue and yellow clusters denote leftward and rightward asymmetry, respectively.

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