

1 Tracing the development and lifespan change of population-level 2 structural asymmetry in the cerebral cortex

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27
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29 30 31 **Abstract**

32 Cortical asymmetry is a ubiquitous feature of brain organization that is subtly altered in some neurodevelopmental
33 disorders, yet we lack knowledge of how its development proceeds across life in health. Achieving consensus on the
34 precise cortical asymmetries in humans is necessary to uncover the genetic and later influences that shape them, such
35 as age. Here, we delineate population-level asymmetry in cortical thickness and surface area vertex-wise in 7 datasets
36 and chart asymmetry trajectories longitudinally across life (4-89 years; observations = 3937; 70% longitudinal). We find
37 replicable asymmetry interrelationships, heritability maps, and test asymmetry associations in large-scale data. Cortical
38 asymmetry was robust across datasets. Whereas areal asymmetry is predominantly stable across life, thickness
39 asymmetry grows in childhood and peaks in early adulthood. Areal asymmetry correlates phenotypically and genetically
40 in specific regions, and is low-moderately heritable (max $h^2_{\text{SNP}} \sim 19\%$). In contrast, thickness asymmetry is globally
41 interrelated across the cortex in a pattern suggesting highly left-lateralized individuals tend towards left-lateralization also
42 in population-level right-asymmetric regions (and vice versa), and exhibits low or absent heritability. We find less areal
43 asymmetry in the most consistently lateralized region in humans associates with subtly lower cognitive ability, and confirm
44 small handedness and sex effects. Results suggest areal asymmetry is developmentally stable and arises in early life
45 through genetic but mainly subject-specific stochastic effects, whereas childhood developmental growth shapes
46 thickness asymmetry and may lead to directional variability of global thickness lateralization in the population.

51 **1. Introduction**

52 The brain's hemispheres exhibit high contralateral symmetry^{1,2}, homotopic regions are under similar genetic influence
53³⁻⁵ and show highly correlated developmental change^{3,6}. Despite this, structural asymmetry is also a ubiquitous aspect
54 of brain organization^{7,8}. Cortical thickness and surface area are known to exhibit distinct asymmetry patterns^{7,9}, albeit
55 reported inconsistently^{7,8,18-22,10-17}. Yet achieving consensus on cortical asymmetries in humans is a prerequisite to
56 uncover the genetic-developmental and lifespan influences that shape and alter them. Although an extensive literature
57 in search of structural asymmetry deviations in various conditions and disorders is in several cases being challenged by
58 newer data²³, at least some aspects of cortical asymmetry are confirmed to be subtly reduced in neurodevelopmental
59 disorders such as autism^{24,25}, but also through later life influences such as aging¹⁸, and Alzheimer's disease^{18,26}. Hence,
60 altered cortical asymmetry at various lifespan stages may be associated with reduced brain health. However, it is
61 currently unknown how cortical asymmetry development proceeds across life in health, because no previous study has
62 charted cortical asymmetry trajectories from childhood to old age using longitudinal data.

63
64 Compounding the lack of longitudinal investigation, previous large-scale studies do not delineate the precise brain
65 regions exhibiting robust cortical asymmetry⁷, relying on brain atlases with predefined anatomical boundaries that may
66 not conform well to the underlying asymmetry of cortex^{7,27}. Taking an atlas-free approach to delineate asymmetries that
67 reliably reproduce across international samples as starting point (i.e. population-level asymmetries) would better enable
68 mapping of the developmental principles underlying structural cortical asymmetries, as well as the genetic and individual-
69 specific factors associated with cortical lateralization. Furthermore, such an approach would help resolve the many
70 reported inconsistencies for cortical asymmetry maps^{7,8,18-21,10-17} – e.g. reports of both right- and left- thickness
71 lateralization in medial^(11,13,14,28 and 17-20) and lateral prefrontal cortex (PFC; ^{17,18,20,22,28 and 8,10-12,16}), and right-^{11,31} and
72 left-^{7,29,30} areal lateralization of superior temporal sulcus (STS) – while serving as a high-fidelity phenotype for future
73 brain asymmetry studies to complement existing low-resolution atlases⁷.

74
75 Determining the developmental and lifespan trajectories of cortical asymmetry may shed light on how cortical
76 asymmetries are shaped through childhood or set from early life, and provide evidence of the timing of expected brain
77 change in normal development. Although important in and of itself, this would also provide a useful normative reference,
78 as subtly altered cortical asymmetry – in terms of both area and thickness – has been linked at the group-level to
79 neurodevelopmental disorders along the autism spectrum^{24,25}, suggesting altered lateralized neurodevelopment may be
80 a neurobiologically relevant outcome in at least some cases of developmental perturbation^{24,25}. For areal asymmetry,
81 surprisingly few studies have charted developmental^{30,31} or aging-related effects^{7,28}, although indirect evidence in
82 neonates suggests adult-like patterns of areal asymmetry are evident at birth and may exhibit little change from birth to
83 2 years³¹ despite rapid and concurrent developmental cortical expansion³². For thickness asymmetry, longitudinal
84 increases in asymmetry have been shown during the first two years of life¹⁹, with suggestions of rapid asymmetry growth
85 from birth to 1 year¹⁹, and potentially continued growth until adolescence³³. However, previous lifespan studies mapped
86 thickness asymmetry linearly across cross-sectional developmental and adult age-ranges^{10,17}, mostly concluding
87 thickness asymmetry is minimal in infancy and maximal age ~60. In contrast, recent work established thickness
88 asymmetry shows a non-linear decline from 20 to 90 years that is reproducible across longitudinal aging cohorts¹⁸. Thus,
89 although offering viable developmental insights^{10,17}, previous lifespan studies of thickness asymmetry do not accurately
90 capture the aging process, and likely conflate non-linear developmental and aging trajectories with linear models. A
91 longitudinal exploration of the lifespan trajectories of thickness asymmetry accounting for dynamic change is needed to
92 further knowledge of normal human brain development.

93
94 Correlations between cortical asymmetries may provide a window on asymmetries formed under common genetic or
95 developmental influences. Contemporary research suggests brain asymmetries are complex, multifactorial and largely
96 independent (i.e. uncorrelated) traits³⁴⁻³⁶, contrasting earlier theories emphasizing a single^{37,38} or predominating factor
97^{39,40} controlling various cerebral lateralizations. Yet while there has been much research on whether asymmetries of
98 various morphometric measures^{8,11,16} or imaging modalities²⁹ relate to one another, few have focused on interregional
99 relationships between asymmetries derived from the same metric. Where reported, evidence suggests cortical
100 asymmetries may be mostly independent^{27,41,42} – in line with a multifactorial view^{34,35,43} – and a recent study found
101 asymmetry in anatomically connected regions of the cortical language network was no more related than in regions
102 selected at random²⁹. Currently, it is not known whether or how cortical asymmetries may correlate within individuals,
103 though this may signify coordinated genetic or later development of left-right brain asymmetries – a genetic or later
104 developmental account depending on joint evidence of trait heritability, and whether or not phenotypic correlations are
105 underpinned by genetic correlations.

106
107 Finally, altered development of cerebral lateralization in general has been widely hypothesized to relate to average poorer
108 cognitive outcomes^{17,44,45}. Specifically in the context of cortical asymmetry, however, although one previous study
109 reported larger thickness asymmetry may relate to better verbal and visuospatial cognition¹⁷, phenotypic asymmetry-
110 cognition associations have been rarely reported^{17,46,47}, conflicting^{46,47}, not directly comparable^{17,46}, and to date remain
111 untested in large-scale data. Still, recent work points to small but significant overlap between genes underlying
112 multivariate brain asymmetries and those influencing educational attainment and specific developmental disorders
113 impacting cognition²⁷, indicating either pleiotropy between non-related traits or capturing shared genetic susceptibility to
114 altered brain lateralization and cognitive outcomes. Furthermore, most large-scale studies of the factors widely assumed
115 to be important in the context of asymmetry have adopted brain atlases offering limited spatial precision^{7,23,27}.
116 Accordingly, such studies did not detect associations with handedness^{7,48} that were not found until a recent study applied
117 higher resolution (i.e. vertex-wise) mapping in big data²². Therefore, as a final step, we reasoned that combining an

118 optimal delineation of population-level cortical asymmetries with big data would enhance detection and quantification of
119 such effects – i.e. general cognitive ability, handedness and sex.

120
121 Here, we first delineate population-level cortical areal and thickness asymmetries using vertex-wise analyses and their
122 overlap in 7 international datasets. To gain insight into their development, we then trace a series of lifespan and genetic
123 analyses. Specifically, we chart the developmental and lifespan trajectories of cortical asymmetry for the first time
124 longitudinally across the lifespan. We then examine phenotypic interregional asymmetry correlations – under the
125 assumption correlations indicate coordinated development of left-right asymmetries through genes or lifespan influences
126 – test heritability using both extended twin and genome-wide single nucleotide polymorphism (SNP) data, and whether
127 phenotypic associations are underpinned by genetics. Finally, we screened our set of robust, population-level
128 asymmetries for association with general cognitive ability and factors purportedly related to asymmetry in UK Biobank
129 (UKB)⁴⁹. Based on findings of aging-related dedifferentiation in thickness asymmetry¹⁸, we hypothesized trajectories of
130 cortical thickness would show developmental growth in thickness asymmetry (i.e. differentiation), but remained agnostic
131 regarding lifespan areal asymmetry development.

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134 **2. Results**

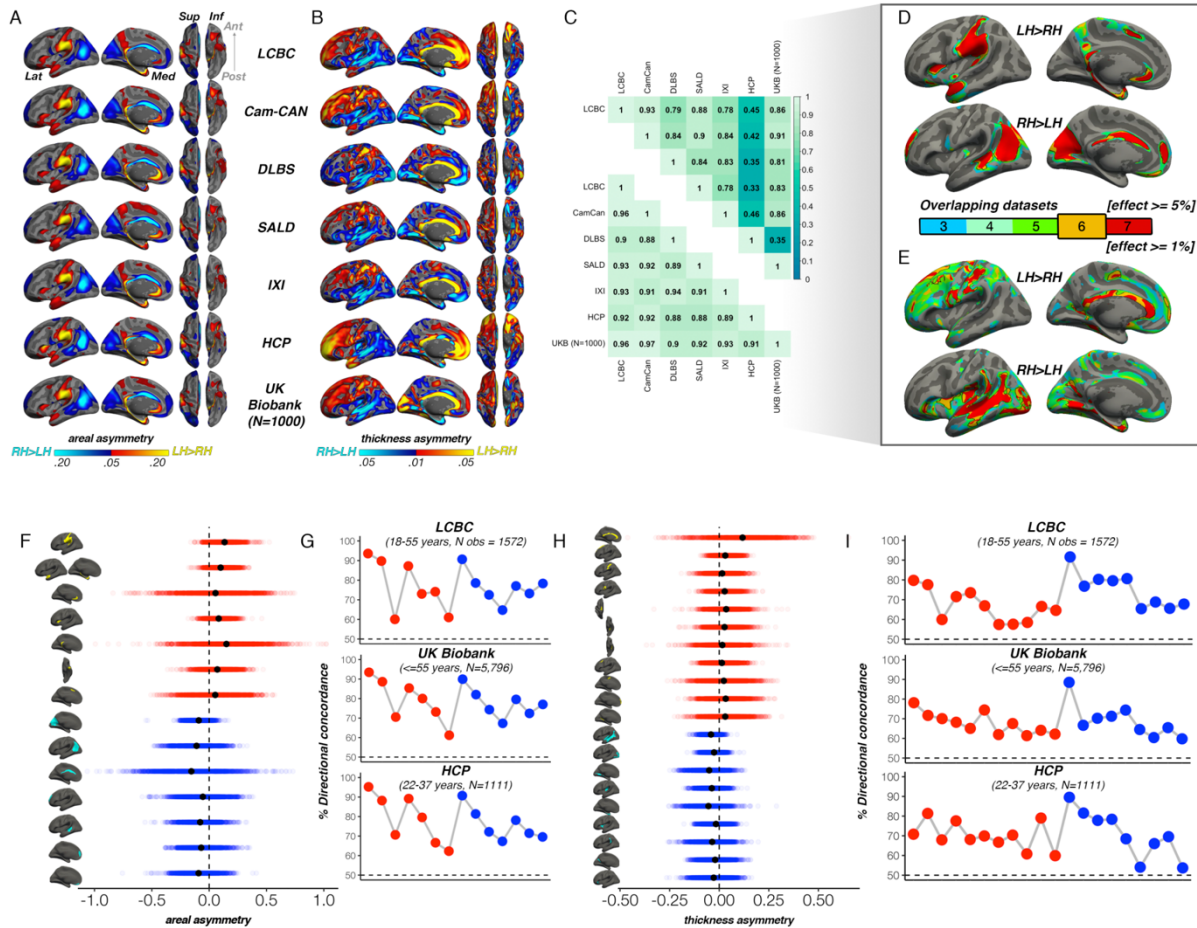
135 **2.1 Population-level asymmetry of the cerebral cortex**

136 First, to delineate cortical regions exhibiting population-level areal and thickness asymmetry, we assessed asymmetry
137 vertex-wise in 7 independent adult samples and quantified overlapping effects (Methods). Areal asymmetries were highly
138 consistent across all 7 datasets (Figure 1A): the spatial correlation between surface AI maps ranged from $r = .88$ to $.97$
139 (Figure 1C). Across all 7 datasets (Figure 1D), overlapping effects for strong leftward areal asymmetry were observed in
140 a large cluster in supramarginal gyrus (SMG) that spanned postcentral gyrus, planum temporale and primary auditory
141 regions (and conformed well to their anatomical boundaries; see Figure 1–figure supplement 1A for significance), anterior
142 insula and temporal cortex, rostral anterior cingulate, medial superior frontal cortex, and precuneus, the latter spanning
143 parahippocampal and entorhinal cortex. Overlapping effects for strong rightward areal asymmetry were evident in
144 cingulate, inferior parietal cortex, STS, medial occipital cortex, mPFC and rostral middle frontal cortex (Figure 1D). This
145 global pattern agrees with previous reports^{7,21,22}.

146 For thickness, an anterior-posterior pattern of left-right asymmetry was evident in most datasets (Figure 1B), consistent
147 with more recent reports^{7,17,18,22,28}. Though spatial correlations between AI maps from independent datasets were high,
148 they were notably more variable ($r = .33 - .93$; Figure 1C); HCP showed lower correlation with all datasets ($r = .33 - .46$)
149 whereas all other datasets correlated highly (min $r = .78$). Consistent leftward thickness asymmetry effects were evident
150 in cingulate, postcentral gyrus, and superior frontal cortex (Figure 1E), whereas consistent effects for rightward thickness
151 asymmetry were evident in a large cluster in and around STS (Fig 1E; Figure 1–figure supplement 1B), insula, lingual
152 gyrus, parahippocampal and entorhinal cortex. Of note, both areal and thickness asymmetry extended beyond these
153 described overlapping effects (Figure 1–figure supplements 1-2 & 5).

154 Based on effect size criteria (Figure 1D-E; Methods), we derived a set of robust clusters exhibiting population-level areal
155 (14 clusters) and thickness asymmetry (20 clusters) for further analyses (see Supplementary file 1E-F for anatomical
156 descriptions). The proportion of individuals lateralized in the population direction in each cluster was highly similar across
157 datasets, on average ranging between 61-94% for area, and 57-90% for thickness (Figure 1F-I). We then formally
158 compared our approach to asymmetry estimates derived from a gyral-based atlas often used to assess asymmetry^{7,16,27},
159 finding fairly poor correspondence with the vertex-wise structure of cortical asymmetry for atlas-based regions,
160 particularly for thickness asymmetry (Figure 1–figure supplement 3).

161



162
 163 **Figure 1. A)** Mean areal and **B)** thickness asymmetry in each dataset. Warm and cold colours depict leftward and
 164 rightward asymmetry, respectively. **C)** Spatial overlap (Pearson's r) of the unthresholded maps between datasets for
 165 areal (lower matrix) and thickness asymmetry (upper). **D)** Overlapping effects across datasets were used to delineate
 166 clusters exhibiting population-level areal (lower threshold = 5%) and **E)** thickness asymmetry (lower threshold = 1%)
 167 based on a minimum 6-dataset overlap (black outlined clusters). **F, H)** Raw distribution of the individual-level
 168 asymmetry index (AI) in adults extracted from clusters exhibiting areal and thickness asymmetry, respectively. Mean AI's are in black,
 169 Raw distributions are shown for the LCBC (18-55 years, N obs = 1572) dataset with mixed effects data (outliers defined in lifespan
 170 analysis removed on a region-wise basis; Methods; Supplementary File 1E-F). X-axis denotes the AI of the average
 171 thickness and area of a vertex within the cluster. **G, I)** Proportion of individuals with the expected directionality of
 172 asymmetry within each cluster exhibiting areal and thickness asymmetry, respectively, shown for the three largest adult
 173 datasets. The X-axes in G and I are ordered according to the clusters shown in F and H, respectively. Lat=lateral;
 174 Med=medial; Post=posterior; Ant=anterior; Sup=superior; Inf=inferior.

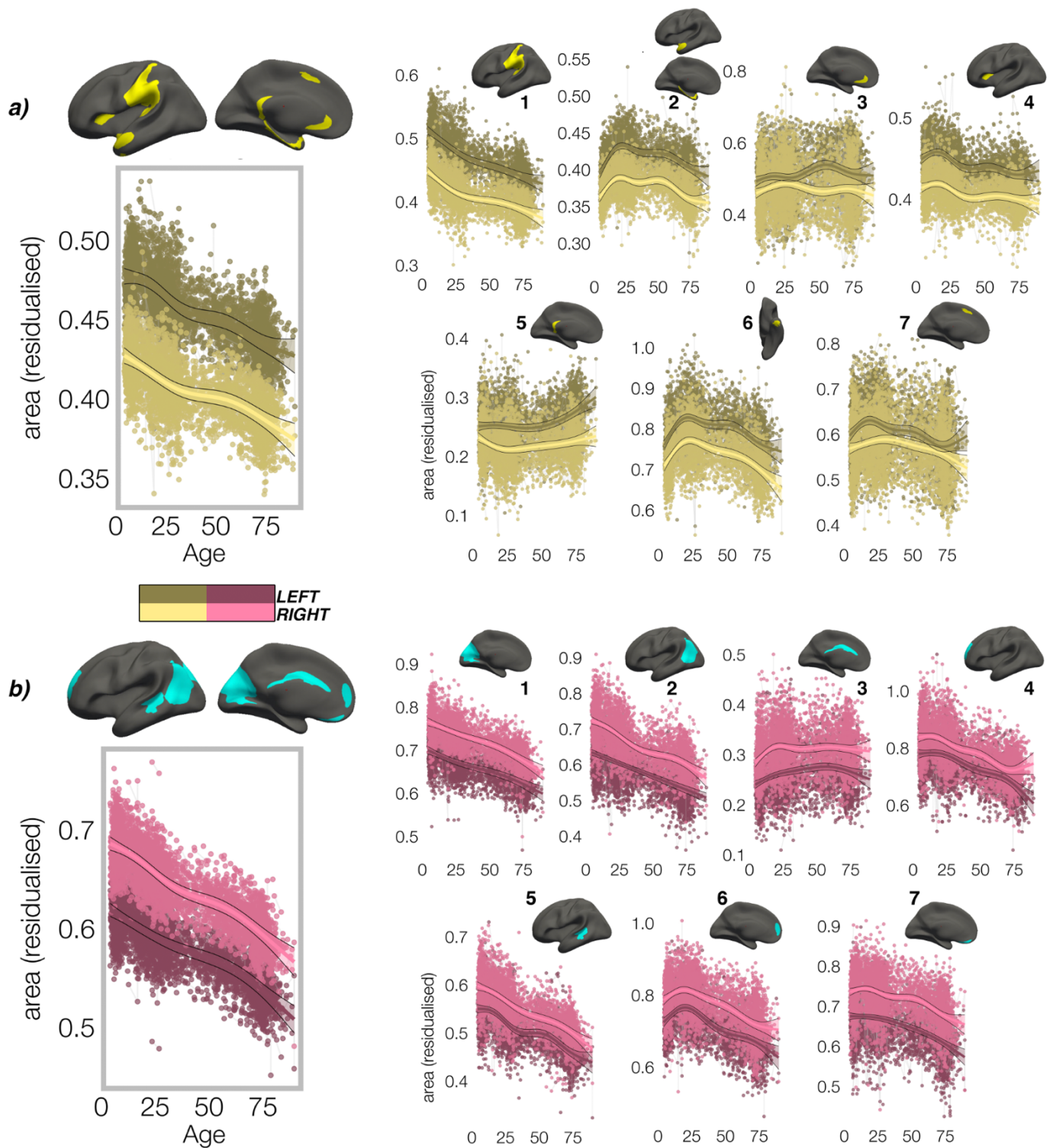
175 176 177 178 179 **2.2 Lifespan trajectories of population-level cortical asymmetries**

180 Having delineated regions exhibiting population-level areal and thickness asymmetry, we aimed to characterize the
 181 developmental and lifespan trajectories of cortical asymmetry from early childhood to old age, using a lifespan sample
 182 incorporating dense longitudinal data (Methods). For this, we used the mixed-effects LCBC lifespan sample covering the
 183 full age-range (4-89 years). To account for non-linear lifespan change, we used Generalized Additive Mixed Models
 184 (GAMMs) to model the smooth left- (LH) and right hemisphere (RH) age-trajectories in our robust clusters (Methods).
 185

186 In all clusters, the homotopic areal trajectories revealed areal asymmetry was strongly established already by age ~4,
 187 and the lifespan trajectories of both leftward (Figure 2A) and rightward (Figure 2B) asymmetries were largely parallel.
 188 Specifically, a large left-asymmetric region in and around SMG/perisylvian (#1; Figure 2A) showed strong asymmetry by
 189 age ~4 that was largely maintained throughout life through steady aging-associated decline of both hemispheres,
 190 whereas leftward asymmetry of temporal cortex (#2,6) and anterior insular (#4) was maintained through developmental
 191 expansion and aging-associated decline of both hemispheres. Others (retrosplenial #5; mPFC #3,7) showed growth from
 192 pre-established asymmetry and more variable lifespan trajectories. On the other side, rightward asymmetries showed
 193 largely preserved asymmetry through aging-associated decline of both hemispheres (Figure 2B; medial occipital #1;
 194 lateral parietal #2; STS #5; orbitofrontal #7), through bilateral developmental expansion and aging-associated decline
 195 (mPFC #6), or steadily expanding bilateral surface area until mid-life (cingulate; #3). There was also little indication of

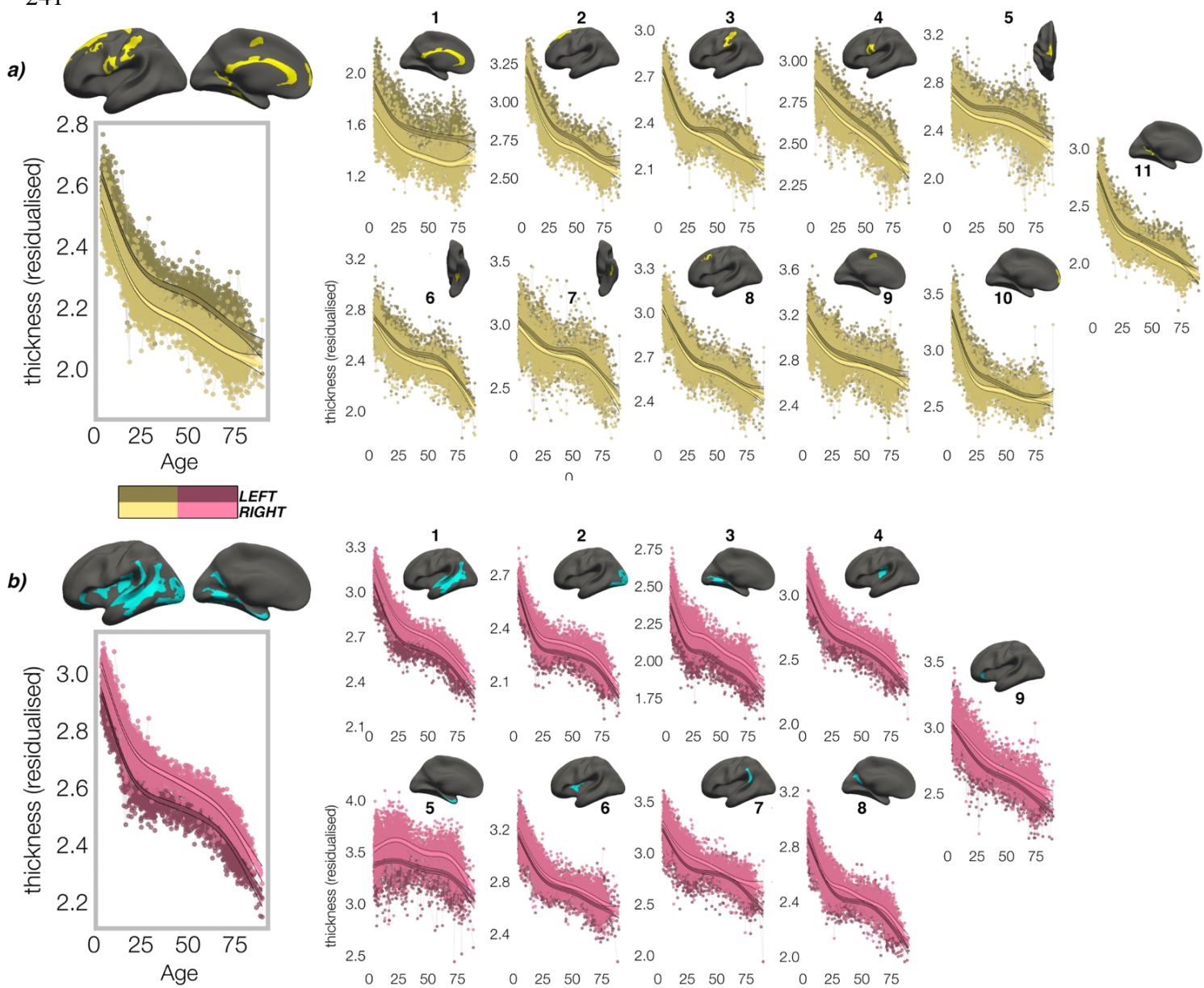
196 relative hemispheric differences during cortical developmental expansion from 4-30 years ([Figure 3–figure supplement](#)
197 [3A](#)) or aging from 30-89 years ([Figure 3–figure supplement 5](#)). Though lifespan areal asymmetry trajectories did show
198 significant change at some point throughout life in most clusters ([Supplementary file 1E](#)), factor-smooth GAMM
199 interaction analyses confirmed that areal asymmetry was significantly different from zero across the entire lifespan in all
200 clusters ([Figure 3–figure supplements 1-2](#)), and the average trajectories across all leftward and rightward clusters were
201 clearly parallel (though still both exhibited a significant difference; bordered plots in [Figure 2A-B](#); [Supplementary file 1E](#)).
202

203 In contrast, though homotopic trajectories of thickness clusters were more variable, they were non-parallel, and mostly
204 characterized by developmental increase in thickness asymmetry from age 4-30, through seemingly unequal rates of
205 continuous thinning between hemispheres ([Figure 3](#); [Figure 3–figure supplements 1-3](#)). Importantly, in 10/20 clusters the
206 data indicated developmental increase in thickness asymmetry corresponded to a significant relative hemispheric
207 difference in the rate of developmental thinning. Mostly, these conformed to a pattern whereby the thicker homotopic
208 hemisphere thinned comparatively slower ([Figure 4](#)): leftward thickness asymmetry developed through comparatively
209 slower thinning of the LH that was significant in 6 clusters (superior, lateral and medial PFC #2 #8 #10, precentral #4,
210 inferior temporal #6, calcarine #11; [Figure 3A](#); [Figure 4](#)), whereas rightward asymmetry developed through significantly
211 slower RH thinning (STS #1, planum temporale #7, anterior insula #9; [Figure 3A](#); [Figure 4](#)), or significantly faster RH
212 thickening (#5 entorhinal). Only one other cluster exhibited a relative hemispheric difference seemingly driven by faster
213 thinning of the thicker hemisphere (#8 posterior cingulate; [Figure 4](#)). In these clusters, asymmetry development was
214 generally evident until a peak in early adulthood (median age at peak = 24.3; see [Figure 4](#)) for both leftward and rightward
215 clusters, around a point of inflection to less developmental thinning (see also [Figure 3–figure supplement 4](#)). The average
216 trajectories across all leftward and rightward clusters also indicated developmental asymmetry increase (bordered plots;
217 [Figure 3](#)). Despite the developmental growth, factor-smooth GAMMs nevertheless confirmed the developmental
218 foundation for thickness asymmetry was already established by age ~4 (95% of clusters exhibited small but significant
219 asymmetry at age ~4; [Figure 3–figure supplement 2B](#)), and again asymmetry trajectories showed significant change at
220 some point throughout life ([Supplementary file 1F](#)). Across clusters delineated here we observed little evidence aging-
221 related change from 30-89 years corresponded to a relative hemispheric difference in the rate of aging-related thinning,
222 except in regions overlapping with our previous report¹⁸ (e.g. medial PFC #10; [Figure 3–figure supplement 5B](#); [Figure](#)
223 [3–figure supplement 4](#)). Thus, across population-level thickness asymmetries, the data indicated either developmental
224 growth in asymmetry, or conserved relative asymmetry through development and aging despite absolute asymmetry
225 change. Results were robust to varying the number of knots used to estimate trajectories ([Figure 3–figure supplement](#)
226 [1](#)).
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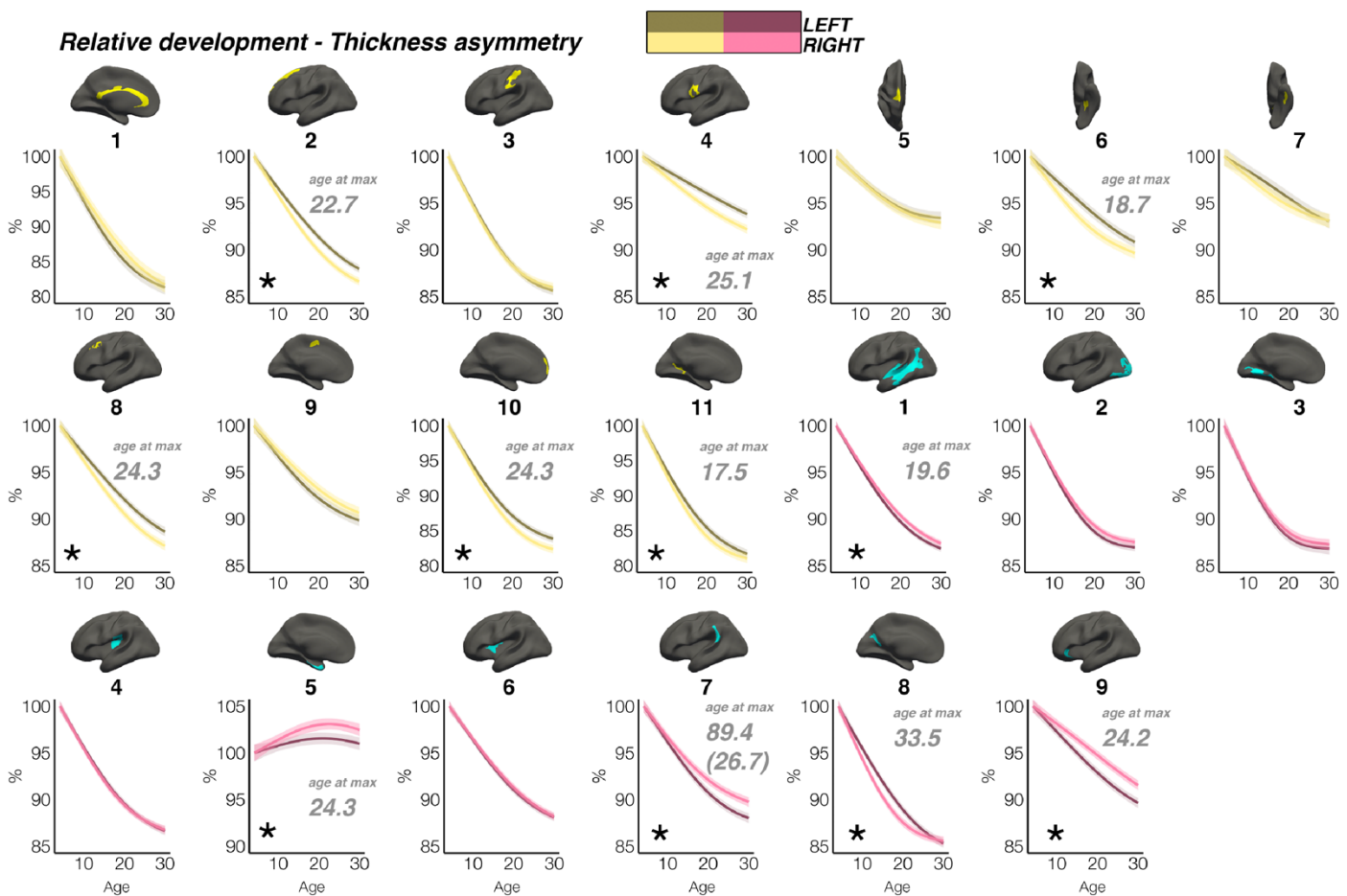
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 230 **Figure 2:** Homotopic lifespan trajectories of surface area in clusters exhibiting population-level **A)** leftward (yellow plots;
 231 yellow clusters) and **B)** rightward (pink plots; blue clusters) areal asymmetry (mm^2). Larger plots on the left show the
 232 mean age trajectory across all clusters exhibiting leftward (top) and rightward (bottom) asymmetry. Note that the unit of
 233 measurement is the average surface area of a vertex within the cluster. Dark colours correspond to LH trajectories. All
 234 age trajectories were fitted using GAMMs. Data is residualized for sex, scanner and random subject intercepts. Clusters
 235 are numbered for reference.
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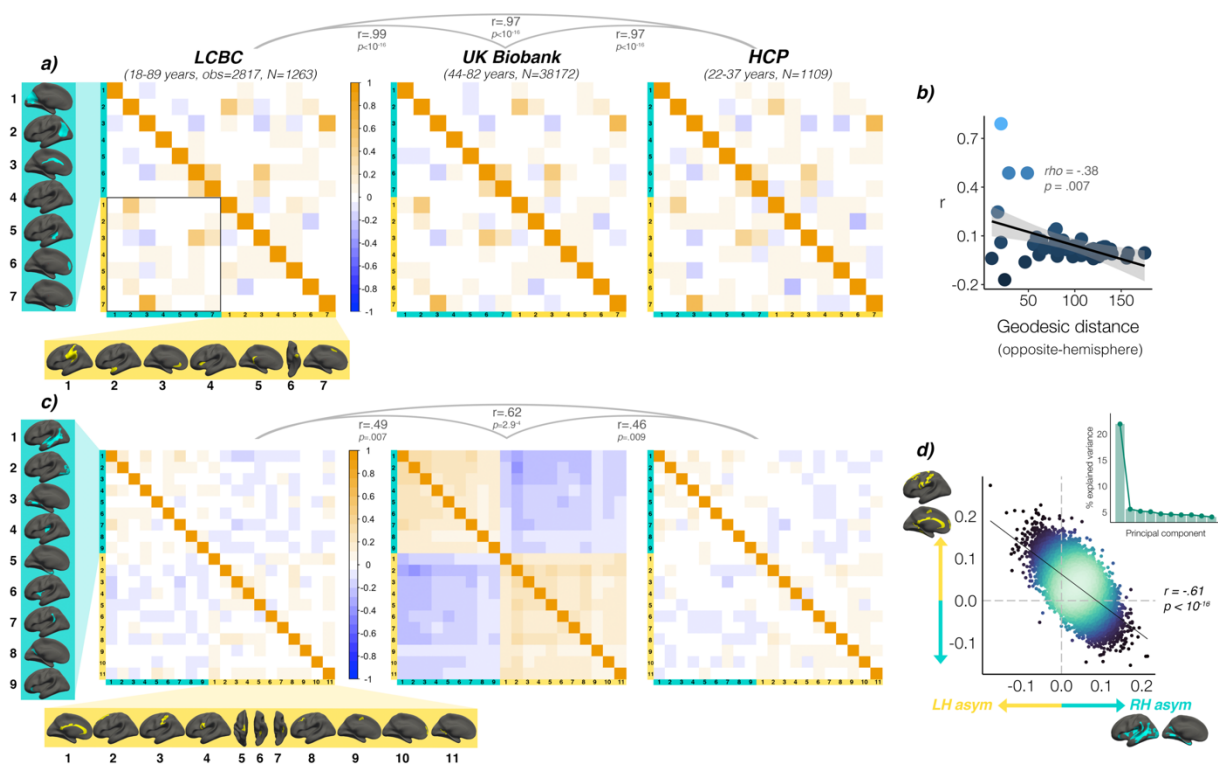
Figure 3: Homotopic lifespan trajectories of cortical thickness in clusters exhibiting population-level **A)** leftward (yellow plots; yellow clusters) and **B)** rightward (pink plots; blue clusters) thickness asymmetry (mm). Larger plots on the left show the mean age trajectory across all clusters exhibiting leftward (top) and rightward (bottom) asymmetry. 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.



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250
251 **Figure 4:** Relative developmental trajectories of homotopic cortical thickness in clusters exhibiting population-level
252 thickness asymmetry. To highlight development, the x-axis covers the age-range 4-30 years, although relative change was
253 calculated from full lifespan models (Methods). Darker trajectories indicate LH trajectories. Shaded areas indicate 95% CI.
254 A relative difference in developmental thinning rates between hemispheres is suggested if the CI's of relative LH and RH
255 trajectories diverge to be non-overlapping (denoted with *). These indications should be interpreted in combination with
256 the full lifespan GAMM trajectories shown in Figure 3. Where relative hemispheric differences are indicated, age at the
257 point of maximum thickness asymmetry across life is denoted in grey (Methods). Since one cluster (R7) was estimated to
258 exhibit maximum thickness asymmetry at age 89.4 (see Figure 3), age at maximum asymmetry for the developmental peak
259 is also given in parentheses (Figure 3).

260
261
262 **2.3 Interregional asymmetry correlations**
263 We then investigated whether cortical asymmetry correlates within individuals (AI's corrected for age, sex, scanner;
264 Methods). For areal asymmetry, a common covariance structure between asymmetries was detectable across datasets:
265 Mantel tests revealed the correlation matrices derived independently in LCBC, UKB and HCP data all correlated almost
266 perfectly ($r \geq 0.97$, all $p < 9.9 \times 10^{-5}$; Figure 5A; Figure 5-figure supplement 1A). The highest correlations (or "hotspots") all
267 reflected positive correlations between regions that are on average left-asymmetric and regions that are on average right-
268 asymmetric (i.e. higher leftward asymmetry in one region related to higher rightward asymmetry in another; Figure 5A
269 black outline); leftward asymmetry in SMG/perisylvian (#1L) was related to higher rightward asymmetry in inferior parietal
270 cortex (#2R; $r = .48$ [LCBC]), leftward anterior cingulate asymmetry (ACC; #3L) was related to higher rightward
271 asymmetry in mPFC (#6R, $r = .47$), and leftward asymmetry in a superior frontal cluster (#7L) was related to rightward
272 asymmetry in the cingulate (#3R, $r = .68$). None of the relationships could be explained by brain size, as additionally
273 removing the effect of intracranial volume (ICV) from cluster AI's had a negligible effect on their interrelations (max
274 correlation change = 0.008). Post-hoc tests confirmed that opposite-direction asymmetries were more correlated if closer
275 in cortex (Methods); geodesic distance was lower between cluster-pairs that were more correlated ($\rho = -.35$, $p = .01$
276 [LCBC]; $-.38$, $p = .007$ [UKB; Figure 5C]; $-.34$, $p = .02$ [HCP]), though this was driven by the aforementioned "hotspots".
277 By contrast, same-direction areal asymmetries were not more correlated if closer in cortex (leftward [all $p > .5$]; rightward
278 [all $p > .5$]). This suggests specific areal asymmetries that are closer in cortex and opposite in direction may show
279 coordinated development.
280

281 For thickness asymmetry, the correlation matrix exhibited a clear pattern in UKB that was less visible but still apparent
 282 in LCBC and HCP (Figure 5B; Figure 5-figure supplement 1B). Mantel tests confirmed that the covariance structure
 283 replicated between all dataset-pairs (LCBC-UKB $r = .49, p = .007$; LCBC-HCP $r = .62, p < 2.9^{-4}$; UKB-HCP $r = .46, p =$
 284 $.009$). The observed pattern suggested higher leftward asymmetry in regions that are on average left-asymmetric was
 285 associated with less rightward asymmetry in regions that are on average right-asymmetric. However, given that the AI
 286 measure is bidirectional, closer inspection of the correlations revealed that higher leftward asymmetry in regions that are
 287 left-asymmetric actually corresponded to more *leftward* asymmetry in right-asymmetric regions, and vice versa (and on
 288 average; see Figure 5-figure supplement 2). In other words, individuals may tend towards either leftward lateralization
 289 or rightward lateralization (or symmetry) on average, irrespective of the region-specific direction of mean thickness
 290 asymmetry in the cluster. Similarly, asymmetry in left-asymmetric regions was mostly positively correlated, and
 291 asymmetry in right-asymmetric regions was mostly positively correlated. Again, additionally removing ICV-associated
 292 variance had negligible effect (max correlation change = 0.004). Post-hoc principal components analysis (PCA) in UKB
 293 revealed PC1 explained 21.9% of the variance in thickness asymmetry and suggested a single component may be
 294 evident for thickness asymmetry (Figure 5D). Accordingly, we found a correlation of $r = -.61$ between mean asymmetry
 295 across all leftward vs. mean asymmetry across all rightward clusters in UKB ($p < 2.2^{-16}$ [means weighted by cluster size]; see Figure
 296 4D; $r = -.56, p < 2.2^{-16}$ [unweighted means]; $r = .66, p < 2.2^{-16}$ [PC1 across all leftward vs. PC1 across all rightward]). Though less strong, all
 297 relationships were significant in LCBC ($r = -.12; p = 7.4^{-11}$ [weighted]; $r = -.05; p = .005$ [unweighted]; $r = .19; p < 2.2^{-16}$ [PC1 vs. PC1])
 298 and significant or trend-level in HCP ($r = -.11; p = 1.6^{-4}$ [weighted]; $r = -.04; p = .15$ [unweighted]; $r = .12, p = 3.33^{-5}$ [PC1 vs. PC1]; see
 299 Figure 5-figure supplement 3). These results suggest thickness asymmetry may be globally interrelated across the cortex
 300 and show high directional variability in the adult population.



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 302
 303 **Figure 5:** Interregional correlations between **A)** areal asymmetries and **B)** thickness asymmetries for each replication
 304 dataset (AI's residualized for age, sex, scanner). AI's in rightward clusters are inverted, such that positive correlations
 305 denote positive asymmetry-asymmetry relationships, regardless of direction of mean asymmetry in the cluster (i.e. higher
 306 asymmetry in the population-direction). Yellow and blue brain clusters/colours denote leftward and rightward
 307 asymmetries, respectively (clusters numbered for reference). A consistent covariance structure was evident both for
 308 areal ($r \geq .49$) and thickness asymmetry ($r \geq .49$; results above matrices). Black box in A highlights relationships
 309 between opposite-direction asymmetries (i.e. leftward vs rightward regions). **C)** For areal asymmetry, asymmetry in
 310 opposite-direction cluster-pairs that were closer in cortex were more positively correlated (datapoints show cluster-pairs).
 311 **D)** A single component explained 21.9% variance in thickness asymmetry in UKB (inset plot). Accordingly, we found a
 312 correlation of $r = -.61$ ($p < 10^{-16}$) in UKB between mean asymmetry across leftward clusters (Y-axis) vs. mean asymmetry
 313 across rightward clusters (X-axis; AI's in rightward clusters inverted). Lines of symmetry (0) are in dotted grey (see also
 314 Figure 4-figure supplements 1-3).

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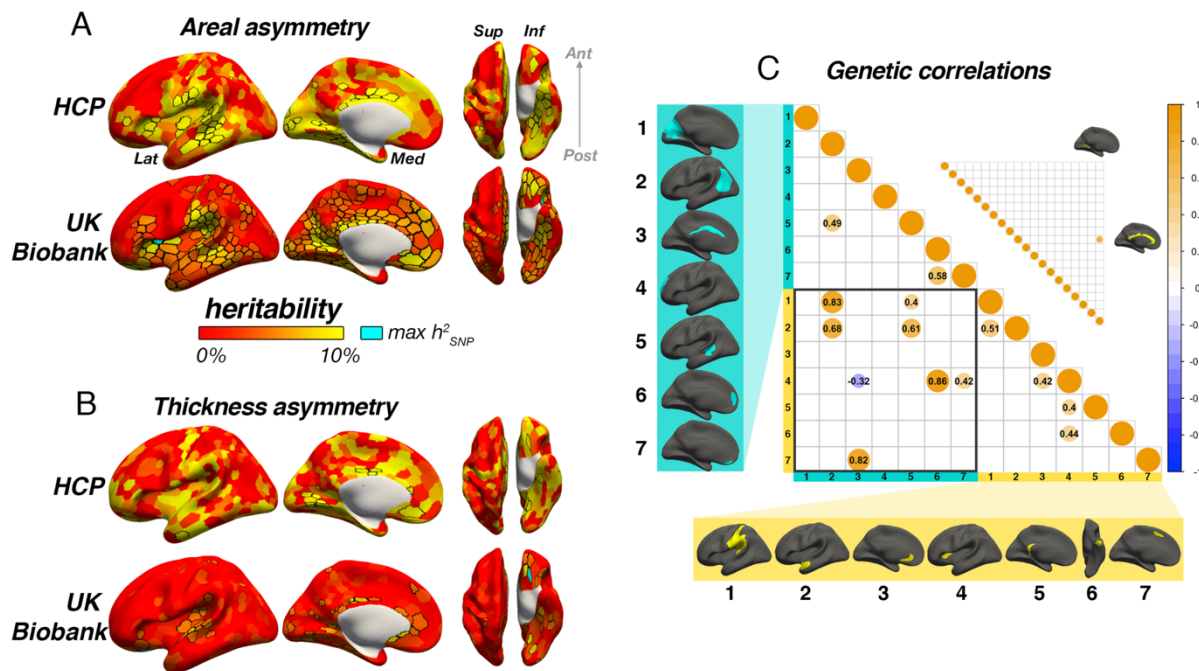
319 2.4 Heritability

320 Although heritability of the global measures for each hemisphere was high (area $h^2_{\text{twin}} = 92\%$; $h^2_{\text{SNP}} = 67\%$; thickness
321 $h^2_{\text{twin}} = 81\%$; $h^2_{\text{SNP}} \sim 36\%$), heritability of global asymmetry measures was substantially lower (area $h^2_{\text{twin}} = 16\%$ [95% CI
322 = 5 - 27%]; $h^2_{\text{SNP}} = 7\%$ [3 - 10%]; thickness $h^2_{\text{twin}} = 16\%$ [5 - 27%]; $h^2_{\text{SNP}} \sim 1\%$ [0 - 5%]). All estimates for global measures
323 were post-corrected significant ($p < .008$; see [Supplementary file 1G](#)) except the SNP-based estimate for global thickness
324 asymmetry in UKB ($p = .22$). Of our robust asymmetry clusters, four areal asymmetries showed significant twin-based
325 heritability in HCP (post-correction; leftward SMG/perisylvian and anterior insula, and rightward cingulate and STS), all
326 of which were also significant in the SNP-based analyses (h^2_{twin} range = 19 - 27%; h^2_{SNP} range = 8 - 19%). Additionally,
327 SNP-based analyses revealed 9/14 (64%) areal asymmetry clusters exhibited significant heritability (post-correction;
328 [Supplementary file 1H](#)). Importantly, highest SNP-based heritability was observed for leftward areal asymmetry in the
329 anterior insula cluster ($h^2_{\text{SNP}} = 18.6\%$, $p < 10^{-10}$; see [Supplementary file 1H](#)), which was substantially higher than the next
330 highest estimates in SMG/perisylvian ($h^2_{\text{SNP}} = 10.7\%$, $p = 3.01^{-9}$), retrosplenial cortex, gyrus rectus and the cingulate (all
331 $h^2_{\text{SNP}} = 8-10\%$). For thickness, two robust asymmetries survived correction in the twin-based analyses (rightward STS
332 and lingual gyrus). Of these, only STS was also significant in the SNP-based analysis but did not survive correction.
333 Moreover, only 3/20 (15%) thickness asymmetries exhibited significant SNP-based heritability ($h^2_{\text{SNP}} = 3-7\%$). Cluster-
334 wise heritability estimates were significantly lower for thickness asymmetry than for area using a SNP-based approach
335 ($\beta = -1.1$, $p = .0008$; [Supplementary file 1I](#)) but not a twin-based approach ($\beta = -.03$, $p = .33$).
336

337 We then estimated asymmetry heritability cortex-wide⁵⁰ ([Figure 6](#)). For areal asymmetry, 69 parcels survived FDR-
338 correction in HCP, 84% (58) of which were also FDR-corrected significant in the SNP-based analysis. Moreover, a total
339 of 267 (53%) parcels exhibited significant FDR-corrected SNP-based heritability for areal asymmetry in UKB data
340 (significant $p[FDR] < .05$ parcels in each sample are depicted with black outlines in [Figure 6A](#)). Beyond significance, a
341 consistent heritability pattern for areal asymmetry was clearly evident using twin- and SNP-based data from independent
342 samples, with higher heritability notably in anterior insula, SMG, Sylvian fissure, STS, calcarine sulcus, cingulate, medial
343 and orbitofrontal cortex, and fusiform. This overlap was substantiated by a spatial correlation of $r = .46$ between maps; p
344 $< 10^{-16}$. Moreover, maximum SNP-heritability (cyan parcel in [Figure 6](#)) was observed in anterior insula (parcel $h^2_{\text{SNP}} =$
345 16.4% ; $p < 10^{-10}$), confirming this region constitutes the most heritable cortical asymmetry in humans (and not improving
346 on the cluster-wise estimate).
347

348 For thickness asymmetry, 15 parcels survived FDR-correction in the twin-based analysis, 7 of which were also post-
349 corrected significant in the SNP-based analysis. However, significant FDR-corrected SNP-heritability was observed in
350 only 11% (57) of parcels, including around superior temporal gyrus, planum temporale, the posterior insula/Sylvian
351 fissure, anterior insula, and in orbitofrontal cortex (max $h^2_{\text{SNP}} = 16.6\%$), along the cingulate and in medial visual cortex.
352 Beyond significance, we observed little obvious visual overlap in twin- and SNP-based heritability patterns (spatial
353 correlation was significant but low; $r = .24$; $p = .01$), and higher estimates pertained to regions that were limited in extent
354 but generally showed no clear global pattern common to both datasets, with the possible exception of calcarine and
355 cingulate cortex. Furthermore, cortex-wide heritability estimates were significantly lower for thickness asymmetry than
356 for area using both a SNP-based ($\beta = -0.71$, $p < 2^{-16}$) and twin-based approach ($\beta = -.33$, $p = 1.08^{-7}$).
357

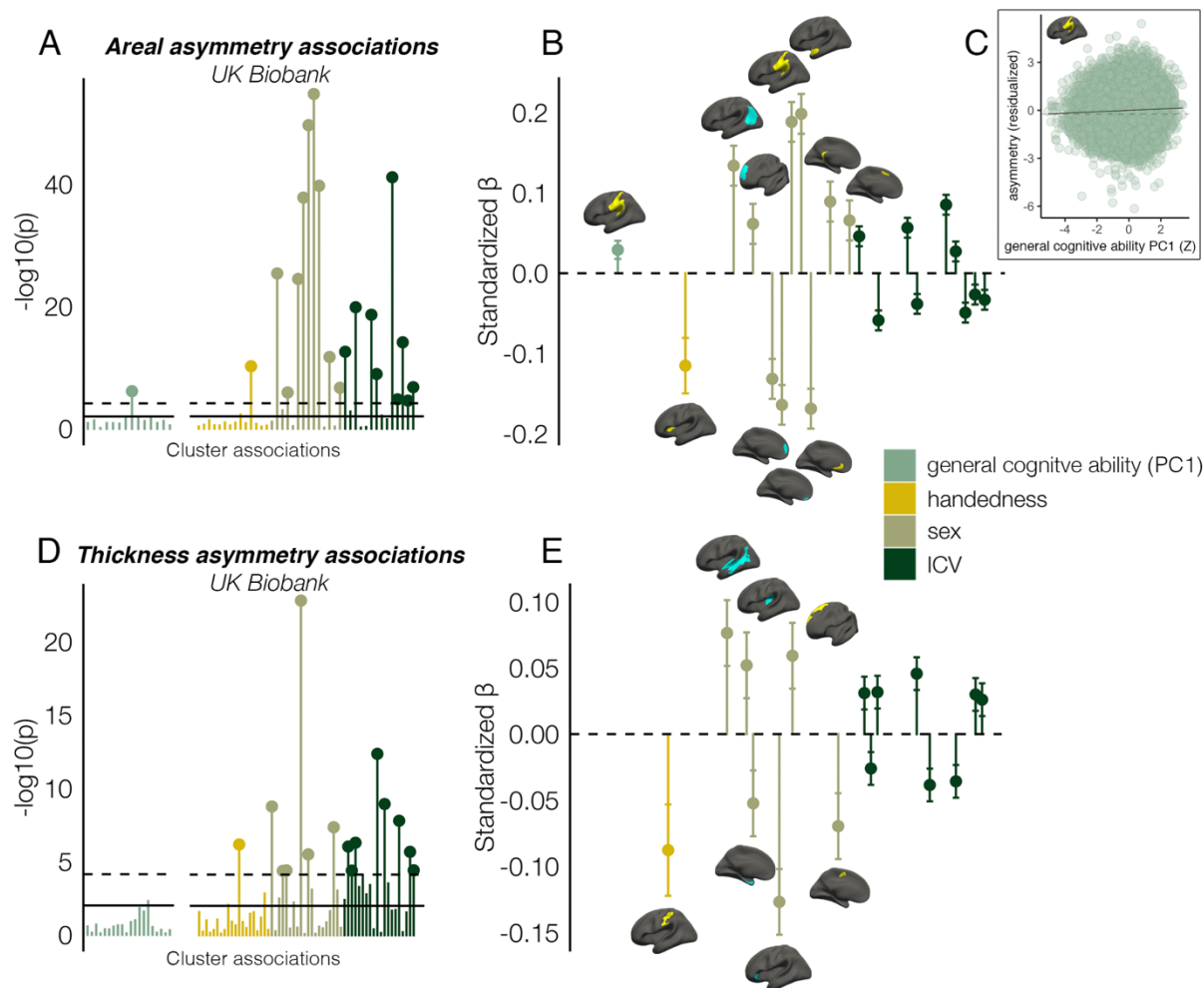
358 For areal asymmetry, large genetic correlations explained several phenotypic correlations evident in [Figure 5A](#) ([Figure](#)
359 [6C](#)): high genetic correlations were found between leftward asymmetry in SMG/perisylvian and higher rightward
360 asymmetry in lateral parietal cortex (LPC; $r_G = .83$; $p[FDR] = 6.58^{-5}$), between leftward superior frontal cortex asymmetry
361 and rightward asymmetry along the cingulate ($r_G = .82$; $p[FDR] = 1.15^{-2}$), and between leftward anterior
362 temporal/parahippocampal asymmetry and rightward asymmetry in LPC ($r_G = .68$; $p[FDR] = 1.16e^{-2}$). Genetic correlations
363 between anterior insula and two rightward superior frontal clusters were also observed ($r_G = .86$; $p[FDR] = 1.21^{-6}$; $r_G =$
364 0.42 ; $p[FDR] = 6.64^{-4}$) in the absence of phenotypic correlations ([Figure 5](#)), and several same-direction asymmetries
365 showed moderate genetic correlation. In contrast, only one post-corrected significant genetic correlation was observed
366 for thickness asymmetry (see [Figure 6C](#); $r_G = 0.68$; $p[FDR] = 2.97^{-2}$).
367



368
369 **Figure 6.** Heritability of areal (A) and thickness asymmetry (B) estimated cortex-wide using twin-based (HCP data; top
370 row) and SNP-based methods (UKB data; bottom row). Unthresholded effect maps are shown. Parcels in black outline
371 show significance at $p[FDR] < .05$. Cyan parcels depict the point of maximum observed SNP-heritability (area $h^2 = 16.4\%$;
372 thickness $h^2 = 16.6\%$). C) SNP-based genetic correlations between areal (lower matrix) and thickness asymmetries
373 (upper matrix). For area, genetic correlations explained several phenotypic correlations (Figure 5A). For thickness, one
374 pair survived FDR-correction (shown). AI's in rightward clusters are inverted such that positive genetic correlations
375 denote asymmetry-asymmetry genetic relationships, regardless of direction of mean asymmetry in the cluster (i.e. higher
376 asymmetry in the population-direction). Yellow and blue brain clusters/colours denote leftward and rightward
377 asymmetries, respectively (clusters numbered for reference).

378
379
380 **2.5 Associations with Cognition, Handedness, Sex, and ICV**

381 Finally, several significant associations were observed between factors-of-interest and asymmetry in our clusters (Figure
382 7; Supplementary file 1J-K). Notably, all effect sizes were small. For general cognitive ability, we found one association,
383 wherein higher areal asymmetry in the largest leftward cluster (SMG/perisylvian) was significantly associated with better
384 cognition ($\beta = .03$ [CI = 0.02 – 0.04], $p = 7.4 \cdot 10^{-7}$, Figure 7C). Although small, we note this association was far from only just
385 surviving correction at our predefined alpha level ($\alpha = .01$; Methods). This was checked in the substantially reduced non-
386 imputed subset of data with no missing cognitive variables and retained the lowest p -value ($N = 4696$; $\beta = 0.04$ [CI = 0.01
387 - 0.07]; $p = 6.9 \cdot 10^{-3}$). We also post-hoc tested areal asymmetry associations with the 11 separate cognitive tests (Figure 7–
388 figure supplement 1). For handedness, reduced leftward areal asymmetry in anterior insula and thickness asymmetry
389 along postcentral gyrus was evident in left-handers, in line with our recent vertex-wise mapping in UKB²². For sex effects,
390 which were also small, males typically exhibited slightly stronger areal asymmetry in large clusters (e.g. leftward
391 SMG/perisylvian and temporal pole; rightward inferior parietal and superior frontal) but reduced leftward and rightward
392 asymmetry in mPFC. For thickness, males exhibited more rightward asymmetry in STS and posterior insula, more
393 leftward thickness asymmetry in superior frontal cortex, but reduced rightward thickness asymmetry in entorhinal cortex
394 and anterior insula, and reduced leftward asymmetry in caudal superior frontal cortex. As ICV effects were typically most
395 nominal, these are shown in Figure 7–figure supplement 2. Of note, none of the reported associations changed
396 appreciably when controlling for additional brain-size related covariates²⁸ (Supplementary file 1J-K).
397



398
 399
 400 **Figure 7.** Associations with General cognitive ability (first principal component), Handedness, Sex, and Intracranial
 401 volume (ICV) in UKB, in clusters exhibiting population-level areal (upper) and thickness asymmetry (lower). **A, D)**
 402 Significance of associations (negative logarithm; corrected [$p < 7.3e^{-5}$] and uncorrected threshold [$p = .01$] shown by
 403 dotted and non-dotted line, respectively). X-axis displays the test for each cluster-association. As maximum sample size
 404 was used to test each association, effects on general cognitive ability were tested in separate models with fewer
 405 observations ($N = 35,199$; separated association plots) than Handedness, Sex and ICV ($N=37,570$). **C)** Visualization of
 406 the found association between leftward areal asymmetry in the large supramarginal cluster upon general cognitive ability
 407 (PC1 across 11 cognitive tests). The line of null association is shown for comparison (dotted) **B, E)** Right plots denote
 408 effect sizes, 95% confidence intervals (error bars) and cortical location of associations surpassing Bonferroni-corrected
 409 significance. Als in rightward clusters were inverted. Right handers and females are coded 0, such that a negative effect
 410 for general cognitive ability / handedness / sex / ICV / denotes less asymmetry in higher cognition / left handers / males
 411 / larger brains. Associations with ICV are shown in [Figure 7-figure supplement 2](#). Yellow and blue clusters denote leftward
 412 and rightward asymmetries, respectively.

413 414 415 416 **3. Discussion**

417 Combining the strengths of a vertex-wise delineation of population-level cortical asymmetry in 7 international datasets
 418 and dense longitudinal data, we offer the first description of the longitudinal developmental and lifespan trajectories of
 419 cortical asymmetry, advancing knowledge on normal human brain development. We show areal asymmetry is
 420 predominantly stable across life, whereas we trace developmental growth in many thickness asymmetries signifying
 421 differentiation of thickness asymmetry from early childhood to the mid-20s. We further demonstrate the replicable
 422 interregional relationships between asymmetries within individuals, provide the most detailed heritability maps for cortical
 423 asymmetry to date, and uncover novel and confirm previously-reported associations with factors purportedly important
 424 in the context of asymmetry – all with small effects. All maps are available at neurovault.org/XXXX.

425
 426 **3.1. Population-level asymmetry**
 427 Our vertex-wise analysis of cortical asymmetries that reproduce across adult cohorts replicates and completes a recent
 428 low-resolution meta-analysis ⁷, and can serve as a high-fidelity phenotype for future brain asymmetry studies. The marked

429 consistency across samples here suggests consensus may now be reached regarding cortical asymmetry phenotypes
430 in humans, as our results agree with most reported results for areal asymmetry ^{7,8,11,21,31}, as well as several, typically
431 more recent reports for thickness asymmetry ^{7,17-19}. Indeed, for thickness asymmetry – for which findings have been
432 particularly mixed ^{7,8,18-20,10-17} – the left-right patterning here is compatible with low-resolution meta-analyses ⁷,
433 asymmetries evident in the first months of life ¹⁹, a large-scale mapping in mid-old age ²², reports using alternative
434 analysis streams ^{17,19}, and possibly the overall pattern of brain torque ^{7,51} – a gross hemispheric twist leading to frontal
435 and occipital bending at the poles ⁵². The high overlap in effects between 7 datasets from 4 countries here suggests
436 these results likely apply universally. This evident consensus suggests genetic-developmental programs regulate mean
437 brain lateralization with respect to both area and thickness in humans. However, the genetic findings presented herein
438 suggest these may have reached population fixation, as heritability of even our optimally delineated asymmetry measures
439 was generally low. This indicates either subject-specific stochastic mechanisms in early neurodevelopment or later
440 developmental influences primarily determine cortical asymmetry. Tracing their lifespan development, we show the
441 lifespan trajectories of areal asymmetry primarily suggest this form of cerebral asymmetry is developmentally stable at
442 least from age ~4, maintained throughout life, and formed early on – possibly *in utero* ^{27,31}. One interpretation of lifespan
443 stability combined with low heritability may be stochastic early life developmental influences determine interindividual
444 differences in areal asymmetry more than later developmental change. However, future work linking prenatal and
445 childhood trajectories is needed to affirm this. Still, we also found relatively stronger heritability and reproducible
446 heritability maps for areal asymmetry (notably, anterior insula exhibited ~19% SNP-based heritability). This also illustrates
447 region-dependent interindividual genetic effects upon areal asymmetry, and the fact that phenotypic correlations were
448 underpinned by high genetic correlations suggests specific areal asymmetries are formed under common genetic
449 influence. In contrast, our findings of childhood development of thickness asymmetry until a peak around age ~24 ¹⁸,
450 higher directional variability in adult samples, and lower heritability, converge to suggest thickness asymmetry may be
451 more shaped through subject-specific effects in later childhood development, possibly as the brain grows in interaction
452 with the environment. This interpretation applied to asymmetry agrees with work suggesting cortical area in general may
453 trace more to early life factors ⁵³⁻⁵⁵ whereas thickness may be more related to and impacted by lifespan influences ^{54,56}.

454
455 **3.2. Lifespan trajectories**
456 Our longitudinal description of cortical asymmetry lifespan trajectories gleaned novel insight into normal brain maturation
457 and development. For areal asymmetry, adult-like patterns of lateralization were strongly established already before ~4
458 years, indicating areal asymmetry traces back further and does not primarily emerge through later cortical expansion ⁵⁷.
459 Rather, the lifespan trajectories predominantly show stability from childhood to old age, as areal asymmetry was generally
460 maintained through periods of developmental expansion and aging-associated change that were region-specific and
461 bilateral. This agrees with evidence indicating areal asymmetry may be primarily determined *in utero* ³¹, and indirect
462 evidence suggesting little change in areal asymmetry from birth to 2 years despite rapid and concurrent cortical expansion
463 ^{31,32,57}. It may also fit with the principle that the primary microstructural basis of cortical area ⁵⁵ – the number of and
464 spacing between cortical minicolumns – is determined in prenatal life ^{55,56}, and agree with evidence suggesting
465 asymmetry at this microstructural level may underly hemispheric differences in surface area ⁵⁸. The developmental
466 trajectories agree with studies indicating areal asymmetry is established and strongly directional early in life ^{30,31}. That
467 anatomical change in later development specifically in surface area follows embryonic gene expression gradients may
468 also agree with a prenatal account for areal asymmetry ⁵⁶. Our results may therefore constrain the extent to which areal
469 asymmetry can be viewed as a plastic feature of brain organization, and may even suggest areal asymmetry may
470 sometimes be a marker for innate hemispheric specializations shared by most humans. Although future research is
471 needed to characterize asymmetry structure-function relationships, the high degree of precision with which a large
472 leftward areal asymmetry follows the contours of auditory-related regions in the Sylvian fissure ([Figure 1–figure](#)
473 [supplement 1](#)) which show left functional lateralization in humans may be one example ⁵⁸⁻⁶⁰; we found ~94% of individuals
474 exhibited leftward areal asymmetry here – the most consistently lateralized cortical region in humans ([Figure 1F](#)).

475
476 In stark contrast, although weak thickness asymmetry was evident by age 4, we observed considerable childhood
477 developmental growth in many regional thickness asymmetries. Developmental trajectories showed non-linear
478 asymmetry growth by virtue of accelerated thinning of the non-dominant hemisphere (10/20 clusters showed a relative
479 hemispheric difference in the rate of developmental thinning; [Figure 4](#)). This led to maximally established asymmetry
480 around ~24 years of age. These trajectories clearly suggest differentiation of the cortex is occurring with respect to
481 thickness asymmetry in development, possibly (though not necessarily) suggesting thickness asymmetry may be more
482 amenable to experience-dependent change. Indeed, as cortical thinning in childhood is thought to partly reflect likely
483 learning-dependent processes such as intracortical myelination ⁶¹ and possibly pruning of initially overproduced
484 synapses ^{62,63} and neuropil reduction, thickness asymmetry growth may suggest hemispheric differences in the
485 developmental optimization of cortical networks at least partly shaped by childhood experience. This raises the possibility
486 thickness asymmetry may be a marker of ontogenetic hemispheric specialization within neurocognitive networks, and
487 may also fit with animal models suggesting lateralized training can alter hemispheric imbalance of cortical thickness ⁶⁴.
488 However, this interpretation is speculative, and our results could be used to guide intervention-based approaches to
489 experimentally test plasticity of thickness asymmetry in humans. Our lifespan results are often difficult to reconcile with
490 earlier lifespan reports finding different mean thickness asymmetry patterns ^{10,12,15} and modelling asymmetry linearly
491 across cross-sectional developmental and adult age-ranges ^{10,15,17}. However, our findings in development agree with
492 work finding a similar left-right thickness asymmetry pattern shows rapid longitudinal asymmetry increase in the first
493 years of life ¹⁹, with especially rapid increase in mPFC ¹⁹. As we observed rapid asymmetry differentiation that spanned
494 across childhood and adolescence in most prefrontal regions and several others ([Figure 3](#); [Figure 4](#); [Figure 3–figure](#)
495 [supplements 3 & 4](#)), we extend these earlier findings in neonates ¹⁹. Likely, the combination of longitudinal data and

496 nonlinear modelling was critical to capture early developmental growth in thickness asymmetry within a lifespan
497 perspective, because large interindividual variation in hemispheric thickness estimates at any age may hinder detection
498 of subtle change effects even in large cross-sectional samples⁶⁵, possibly rendering follow-up data all but essential in
499 the context of cortical asymmetry change. As prefrontal thickness asymmetry seems particularly vulnerable in some
500 neurodevelopmental disorders²⁴, aging, and Alzheimer's disease¹⁸, these trajectories may provide a useful normative
501 reference, for example regarding the timing of expected brain change in development. With regards to aging, most
502 clusters delineated here did not exhibit the relative hemispheric difference in rates of cortical thinning we have previously
503 shown is a feature of aging in heteromodal cortex¹⁸, except in clusters overlapping with our previous analysis (Figure 3–
504 figure supplement 5). This agrees with our previous work showing aging-related loss in thickness asymmetry is specific
505 to heteromodal cortical regions vulnerable in aging. In these regions, we also found strong evidence of early
506 developmental growth in thickness asymmetry (Figure 3–figure supplement 4). Developmental differentiation and aging-
507 related dedifferentiation of thickness asymmetry underscores its proposed role in supporting optimal brain organization
508 and function, though it seems not all thickness asymmetries that grow in childhood development decline in aging.
509

510 3.3. Interregional correlations

511 For areal asymmetry, we uncovered a covariance structure that almost perfectly replicated across datasets. In general,
512 this fit with a multifaceted view^{29,34,35}, in which most asymmetries were either not or only weakly correlated – but reliably
513 so – contrasting views emphasizing a single biological^{37,38} or overall anatomical factor⁶⁶ controlling cerebral
514 lateralization. However, we also identified several regions wherein areal asymmetry reliably correlated within individuals,
515 showing the variance in cortical asymmetries is not always dissociable, as often thought^{29,34,35}. The strongest
516 relationships all pertained to asymmetries that were proximal in cortex but opposite in direction. Several of these were
517 underpinned by high asymmetry-asymmetry genetic correlations, illustrating cerebral lateralizations in surface area that
518 are formed under common genetic influence, possibly in agreement with likely prenatal origins for areal asymmetry^{31,55}.
519

520 For thickness asymmetry, we also uncovered a common covariance structure – particularly clear in UKB – that
521 nevertheless replicated with moderate precision across datasets (Figure 5C). Furthermore, a single component explained
522 a relatively high proportion of variance in thickness asymmetry in UKB, and a high correlation across 38,172 individuals
523 further suggested thickness asymmetry may be globally interrelated across the cortex (Figure 5D). These data for
524 thickness indicate individuals may tend towards either leftward asymmetry, rightward asymmetry, or symmetry, both
525 globally across the cortex and irrespective of the region-specific average direction of asymmetry (Figure 5–figure
526 supplements 2-3). Though it is unclear why the relationships were weaker in the other datasets tested, we nevertheless
527 found similarly significant relationships in each (Figure 5–figure supplement 3). This result seems in broad agreement
528 with the notion that some lateralized genetic-developmental programs may trigger lateralization in either direction³⁵ or
529 lose their directional bias through environmental interaction³⁵. As thickness asymmetry seems established at but minimal
530 from birth¹⁹, genetic effects may determine the average region-specific hemispheric bias in the population, but later
531 developmental change may subsequently confer major increases upon its directional variance³⁵. Overall, the evidence
532 converges to suggest a high degree of developmental change may shape thickness asymmetry and lead to higher
533 directional variability in the population. Thus, far from being independent phenotypes^{29,34}, thickness asymmetries may
534 be globally interrelated across the cortex and their direction coordinated through development.
535

536 3.4. Genetic influences

537 For areal asymmetry, we found replicable patterns of low-moderate heritability across datasets and across twin and
538 genomic methods. We also found areal asymmetry in the anterior insula is, to our knowledge, the most heritable brain or
539 behavioural asymmetry yet reported with genomic methods^{22,27,67–69}, with common SNPs explaining ~19% variance.
540 This is a substantial improvement on our recent report of < 5%²², and illustrates a benefit of our data-driven population-
541 mapping approach. As we reported recently²², we confirm asymmetry in this region associates with handedness.
542 Furthermore, highest SNP and twin-based heritability for areal asymmetry was found in all regions that constitute the
543 earliest emerging cortical asymmetries *in utero*^{70–73}: anterior insula, STS, PT, medial occipital cortex, and
544 parahippocampal gyrus (Figure 6A). However, observations of significant heritability were not restricted to these regions,
545 as most areal asymmetries exhibited significant – albeit often lower – SNP-based heritability, as did most parcels when
546 estimated cortex-wide, and significant SNP-based heritability was also evident in regions not found in the present
547 analyses to show strong areal asymmetry, such as Broca's area (but see Figure 1–figure supplement 4). These effects
548 agree with and elaborate on two genetic explorations using atlas-based methods^{7,27} and reports of heritable areal
549 asymmetry in handedness-associated clusters²². However, as noted above, although heritability of either hemisphere
550 was high, areal asymmetry heritability was still only moderate at best, suggesting both genetics but primarily subject-
551 specific stochastic effects likely underly its formation. By contrast, thickness asymmetry was generally not heritable, or
552 showed low and localized heritability effects with no clear global pattern. We also observed more divergent results using
553 twin and genomic methods for thickness, possibly due to low-power for twin-models, though we note the SNP-based
554 effects we observed were somewhat in agreement with a previous twin study⁷.
555

556 Considered together, lifespan stability possibly from birth³¹, less interindividual directional variability, higher heritability,
557 and phenotypic and genetic correlations all converge to suggest comparatively higher genetic influence upon
558 interindividual differences in areal asymmetry. This also agrees with work showing genetic variants associated with
559 (mostly areal) asymmetry are primarily expressed in prenatal life²⁷. By contrast, childhood developmental change, high
560 interindividual directional variability and low heritability for thickness asymmetry converge to fit a scenario whereby
561 thickness asymmetry may be more shaped through individual lifespan exposures⁵⁶, or where its developmental direction
562 may be triggered by random influences⁷⁴. Whether region-specific thickness asymmetry change relates to the maturation

563 of lateralized brain functions ^{74,75} will be an important question for future research. Regardless, our results support a
564 differentiation between early-life and later developmental factors in shaping areal and thickness asymmetry, respectively.
565

566 3.5. Individual differences

567 Screening population-level asymmetries for association with general cognitive ability revealed one region –
568 SMG/perisylvian – wherein higher leftward areal asymmetry related to higher cognition. Interestingly, this cluster was
569 consistently the most lateralized across individuals, with ~94% directional concordance (Figure 1G), suggesting highly
570 regulated genetic-developmental programs shape its laterality in humans. Asymmetry here is likely related to brain
571 torque, which leads to interhemispheric anatomical differences especially around the Sylvian fissure ^{52,76}. This may
572 therefore agree with recent work suggesting brain torque relates to cognitive outcomes ^{77,78}. However, as seems typical
573 of brain associations in big data ⁷⁹ and may be expected for any single structural measure explaining a complex
574 phenomenon, the association was notably small. Also of note, no other asymmetry showed evidence of cognitive
575 association (Figure 7–figure supplement 1), suggesting previously reported associations in small samples will likely not
576 replicate ¹⁷. That the association we find was specific to the most lateralized areal asymmetry in humans may suggest
577 disruptions in early life cerebral lateralization lead to cognitive deficits – detectable in later life as small effects in big data.
578 This may also agree with work suggesting differences in general cognitive ability relate primarily to areal phenotypes ^{53,56}
579 formed early in life ⁵⁵.

580
581 Consistent with our recent vertex-wise analysis in UKB ²², we confirmed leftward areal asymmetry of anterior insula, and
582 leftward somatosensory thickness asymmetry is subtly reduced in left handers. Sha et al. ²² reported shared genetic
583 influences upon handedness and cortical asymmetry in anterior insula and other more focal regions not identified here.
584 Anterior insula lies within a left-lateralized functional language network ⁸⁰, and its structural asymmetry may relate to
585 language lateralization ^{42,81,82} in which left-handers show increased incidence of atypicality ^{48,83,84}. Since asymmetry here
586 emerges early *in utero* ⁷⁰ and is by far the most heritable (see above), we agree with others ⁴² that future research will
587 find this ontogenetically foundational region of cortex ^{85,86} fruitful in understanding genetic-developmental mechanisms
588 influencing laterality. Leftward thickness asymmetry reduction in somatosensory cortex in left handers also echoes our
589 recent report ²², and may also fit a scenario whereby thickness asymmetries are partly shaped through use-dependent
590 plasticity, possibly carrying information regarding group-level hemispheric specializations of function. However, the small
591 effects highlight that cortical asymmetry cannot predict individual hand preference. Similarly, asymmetry-relationships
592 with other factors typically assumed important were all small – despite our optimization of asymmetry phenotypes – and
593 mostly compatible with those reported in the ENIGMA meta-analysis ⁷ and elsewhere ^{28,41}. Concerning sex effects –
594 which were small, differing in direction, and more predictive than ICV ⁴¹ – inconsistencies evident between ours and
595 ENIGMA include findings of increased (here) and decreased ⁷ lateral parietal areal asymmetry in males, and increased
596 ⁷ and decreased (here) entorhinal thickness asymmetry in males, and our approach detected other regions slightly more
597 asymmetric in males (e.g. STS). Possibly, differences in sample median age (here UKB = ~64; Kong et al. = 26 ⁷) and
598 potential sex-differences in age decline trajectories ⁸⁷ may underlie some inconsistencies, maybe more so for thickness
599 measures in structures vulnerable to age-related degeneration ²².

600 3.6. Limitations

601 Several limitations should be mentioned. First, our delineation of population-level asymmetry used a single analysis
602 software. As with most current papers we used FreeSurfer's default 'recon-all' function to delineate the cortex, which has
603 been extensively validated against postmortem measurements ⁸⁸ and is the software underlying most large-scale studies
604 involving brain measures. It is currently unclear to what extent differences in pipelines account for previous mixed results
605 ^{7,8,18–20,10–17}. Although we highlight there are clear commonalities between our results and studies using alternative
606 pipelines ^{17,19,20}, which may suggest our results generalize across analysis systems ^{17,19–21}, we found one instance where
607 the MRI pipeline leads to different results for thickness asymmetry (Figure 1–figure supplement 4). It is not known what
608 underlies this difference, though we find it is unrelated to the cross-hemispheric registration methods employed here, as
609 our results reproduce using standard parcellation methods and thus are likely evident in most FreeSurfer-derived
610 datasets (Figure 1–figure supplement 5). One possibility could be that thickness asymmetry may not reflect cortical
611 thickness differences per se, but rather reflect biologically meaningful hemispheric differences in intracortical myelination
612 levels that are consistently picked up on via FreeSurfer's standard delineation procedure. That the thickness asymmetry
613 pattern we observe shows a clear developmental trajectory also suggests it is a true biological effect (Figure 3; Figure 4;
614 Figure 3–figure supplements 1–4). Conceivable sources of inconsistently reported results for cortical asymmetries likely
615 include varying age-distributions (particularly for thickness) ¹⁸, and multiple asymmetries within atlas-based parcels (e.g.
616 we observed notably discrepant results to ENIGMA for insula thickness asymmetry ⁷). Still, this does not explain other
617 discrepant reports, such as areal asymmetry of STS, which was rightward in all samples here (Figure 1–figure
618 supplement 2; cf. ^{7,29,30}). Thickness asymmetries seem also more variable compared with area ⁷, though it should be
619 noted thickness in general may be slightly less reliable ⁸⁹, the asymmetry effect is smaller, and thus possibly contains
620 more error. Relatedly, while the reported areal and thickness asymmetry patterns and strengths using cross-hemispheric
621 methods agree with standard analysis (Figure 1–figure supplement 5), the magnitude of some asymmetries near the
622 boundary of the subcortex may be exaggerated via this approach ²². And although we did not find (strong) areal
623 asymmetry in inferior frontal regions as reported by Kong et al ⁷, both the unthresholded significance maps and standard
624 parcellation analyses were compatible with this (Figure 1–figure supplement 2 & 5), highlighting a limitation of our chosen
625 method. Second, while GAMMs are considered an optimal modelling technique for longitudinal lifespan data and are
626 robust to nonuniform age distributions ⁹⁰, relative underrepresentation of the mid-adulthood age-range may drive
627 trajectory inflection points around this age ¹⁸, suggesting caution is warranted regarding interpreting mid-life inflection
628 points as reflecting real change. Relatedly, as individual-level mean estimates likely contain more measurement error
629

630 when extracted from smaller clusters, the lifespan trajectories from smaller clusters may be more variable, complicated,
631 and prone to deflection by density differences along the age distribution. As can be seen in [Figures 3-4](#), spatially
632 averaging across asymmetries helps smooth out some of this noise to better reveal developmental principles underlying
633 structural asymmetries, but also trades off with accuracy, since the trajectories from distinct regions do somewhat differ.
634 Third, though the differing heritability methods enabled a replication test, important differences between methods should
635 be considered when interpreting heritability estimates, and may partly explain the common observation of higher
636 estimates from twin methods, which we also observed. For example, twin methods implicitly incorporate additive genetic
637 effects and gene-gene interactions amongst other terms, whereas SNP-based heritability incorporates only additive
638 genetic effects. Still, twin methods may in some cases be prone to overestimating heritability due to unmet assumptions,
639 particularly where the shared environment is thought to play a role ⁹¹, whereas SNP-based methods may not capture all
640 phenotype-relevant genetic variance and have their own assumptions ⁹². We also observed that twin-based estimates
641 were often substantially higher also where non-significant, which may suggest low power to detect the effects in question
642 in HCP family data, or may agree with calls that caution against overinterpreting twin-based estimates ⁹¹. Adding to this
643 complexity, the samples used for twin- and SNP-based estimation consist of young adults and older adults, respectively.
644 Hence, it is possible low SNP-based estimates for thickness asymmetry in UKB may be partly due to reduced mean
645 thickness asymmetry in older adults ^{18,28}. However, as cortex-wide twin-based estimates for thickness asymmetry were
646 also significantly lower than for areal asymmetry in the young HCP sample, this suggests age is likely not the main driver
647 behind this difference, but a confound that further hinders comparison of results between methods. Again, we also cannot
648 rule out that potential reliability differences between thickness and areal asymmetry may partially explain some
649 magnitude differences in heritability estimates. Further, genetic correlations can be high even where heritability of either
650 trait is low, and are typically higher than phenotypic correlations – known phenomena also observed here ^{93,94}. It may
651 therefore be prudent to not overinterpret their magnitudes, though we emphasize their veracity seems well-supported,
652 as one would expect true genetic correlations between developmentally-related and similar traits (here, sampled from
653 nearby in the same organ), and to track the phenotypic correlations – both of which we also observed here – indicative
654 of synchronized development of areal asymmetries through common genetic causes. Fourth, we imposed a necessary
655 cluster size limit for overlapping asymmetry effects across samples, and thus more focal asymmetries may also be
656 informative in relation to the factors tested here ²². Fifth, as only dichotomous handedness self-reports are available with
657 UKB, future studies might benefit from incorporating more nuanced handedness assessments not currently available in
658 data of this size. Relatedly, because UKB cognitive data is not exhaustive ⁹⁵ (e.g. fluid IQ ranges from 1-13), we extracted
659 the common variance across core tests to index general cognitive ability. This approach does not permit testing
660 associations with well-operationalized or specific cognitive domains (for which UKB cognitive data may not be sufficient),
661 and it remains to be seen whether cortical asymmetry may be informative in the context of specific forms of lateralized
662 cognition ⁹⁶, or using absolute non-directional measures. However, the subtlety of the only effect on cognition we find
663 here may suggest we might expect similarly weak effects, though not necessarily if brain and phenotypic measurement
664 accuracy is jointly optimized ⁹⁷.

665 Overall, we track the development of population-level cerebral cortical asymmetries longitudinally across life and perform
666 analyses to trace developmental principles underlying their formation. Developmental trajectories, interregional
667 correlations and genetic analyses converge upon a differentiation between early-life and later-developmental factors
668 underlying the formation of areal and thickness asymmetries, respectively. By revealing hitherto unknown principles of
669 developmental stability and change underlying diverse aspects of cortical asymmetry, we here advance knowledge of
670 normal human brain development.

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675 **4. Methods**

676 **4.1 Samples**

677 We used anatomical T1 -weighted (T1_w) scans from 7 independent international MRI datasets originating from 4
678 countries (see [Supplementary file 1A](#) for an overview of samples used for each analysis). Note that with the exception
679 of vertex-wise analyses in UKB (see below), all analyses made use of all available observations from each sample
680 meeting the stated age-range criteria for each analysis.

681

682 **4.1.1 Reproducibility across samples: population-level asymmetry**

683 To delineate average adult patterns of whole-cortical areal and thickness asymmetry, we restricted the age-range of all
684 samples used in the vertex-wise analyses to 18-55. **Dataset 1:** Here, the Center for Lifespan Changes in Brain and
685 Cognition (LCBC) sample comprised 1572 mixed cross-sectional and longitudinal scans (N longitudinal = 812; timepoint
686 range = 1-6) from 923 participants (mean age = 30.6 ± 9.6) collected across 2 scanners. Additionally, 125 individuals
687 were double-scanned at the same timepoint on both scanners. **Dataset 2:** The Cambridge Centre for Ageing and
688 Neuroscience (Cam-CAN) ⁹⁸ sample comprised cross-sectional scans of 321 individuals (mean age = 38.7 ± 9.7) ⁹⁹.
689 **Dataset 3:** The Dallas Lifespan Brain Study (DLBS) ¹⁰⁰ sample comprised cross-sectional scans of 160 individuals (mean
690 age = 37.5 ± 10.7). **Dataset 4:** The Southwest University Adult Lifespan Dataset (SALD) ¹⁰¹ sample comprised cross-
691 sectional scans of 301 individuals (mean age = 33.7 ± 11.5). **Dataset 5:** The IXI sample comprised cross-sectional scans
692 of 313 healthy individuals collected across 3 scanners (mean age = 36.8 ± 9.6; <http://brain-development.org/ixi-dataset>).
693 **Dataset 6:** Here, the Human Connectome Project (HCP) 1200 ¹⁰² sample comprised 1111 scans (mean age = 28.8 ±
694 3.7). **Dataset 7:** Here, the UKB sample consisted of 1000 randomly sampled cross-sectional scans (mean age = 52.1 ±
695 1.9), restricted to be comparable in size to the other datasets in this analysis.

696

697 **4.1.2 Lifespan trajectories**

698 Here, we used the full age-range of the longitudinal lifespan LCBC sample (4.1 - 89.4 years), 3937 cross-sectional and
699 longitudinal scans (N longitudinal = 2762) from 1886 individuals (females = 1139; mean age = 36.8) collected across 4
700 scanners (271 double-scans) ^{65,103}.

702 **4.1.3 Interregional correlations**

703 Here, we used the three largest datasets: LCBC (N = 1263; N obs = 2817), UKB (N = 38,172), and HCP (N = 1109; two
704 outliers removed; see 4.3.3), excluding the childhood age-range from the LCBC sample not covered in any other dataset.

706 **4.1.4 Heritability and individual differences**

707 For twin heritability, we used HCP 1200 extended twin data (1037 scans from twins and non-twin siblings; age-range =
708 22-37; mean age = 28.9 ± 3.7). The various kinships are described in [Supplementary file 1B](#). All included twin pairs were
709 same-sex. For SNP-heritability, we used the UKB imaging sample with genome-wide data surpassing quality control (N
710 = 31,433; see 4.3.4). For individual differences analyses, we used the UKB imaging sample with the maximum number
711 of available observations for each variable-of-interest (see 4.3.5).

713 **4.2. MRI preprocessing**

714 T1w anatomical images (see [Supplementary file 1C](#) for MRI acquisition parameters) were processed with FreeSurfer
715 (v6.0.0) ¹⁰⁴ and vertex-wise areal and thickness morphometry estimates were obtained for each MRI observation. As the
716 LCBC sample also contained longitudinal observations, initial cross-sectional reconstructions in LCBC were
717 subsequently ran through FreeSurfer's longitudinal pipeline. As HCP data was acquired at a higher voxel resolution
718 (0.7mm isotropic), the T1w scans were processed with the --hires flag to recon-all ¹⁰⁵. Areal and thickness maps of the
719 LH and RH of each participant in each dataset were resampled from the native cortical geometry to a symmetrical surface
720 template ("LH_sym") ^{11,106} based on cross-hemispheric registration ¹⁰⁷. This procedure achieves vertex-wise alignment
721 of the data from each participant and homotopic hemisphere in a common analysis space, enabling a whole-cortical and
722 data-driven analysis of cortical asymmetry. Areal values were resampled with an additional Jacobian correction to ensure
723 preservation of the areal quantities ¹⁰⁸. We then applied an 8mm FWHM Gaussian kernel to surface-smooth the LH and
724 RH data.

726 **4.3 Data analysis**

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

729 **4.3.1 Population-level asymmetry**

730 We assessed areal and thickness asymmetry vertex-wise using FreeSurfer's Linear Mixed Effects (LME) tool ¹⁰⁹.
731 Asymmetry was delineated via the main effect of Hemisphere (controlling for Age, Age × Hemisphere, Sex, Scanner
732 [where applicable], with a random subject term). For each sample and metric, we computed mean Asymmetry Index
733 maps (AI; defined as (LH-RH) / ((LH+RH)/2)). Spatial overlap of AI maps across datasets was quantified by correlating
734 the 1-dimensional surface data between every dataset pair (Pearson's r). Next, to delineate regions exhibiting robust
735 areal and thickness asymmetry across datasets, we thresholded and binarized the AI maps by a given absolute effect
736 size (areal = 5%; thickness = 1%; achieving p[FDR] < .001 in most datasets with FreeSurfer's 2-stage FDR-procedure
737 ¹⁰⁹), and summed the binary maps. After removing the smallest clusters (<200 mm²), a set of robust clusters was defined
738 as those exhibiting overlapping effects in 6 out of 7 samples. We then extracted area and thickness data in symmetrical
739 space for each cluster, subject, and hemisphere, spatially averaging across vertices.

741 **4.3.2 Lifespan trajectories**

742 Factor-smooth GAMMs ("gamma4" ¹¹⁰) were used to fit a smooth Age trajectory per Hemisphere, and assess the smooth
743 Age × Hemisphere interaction in our clusters. GAMMs incorporate both cross-sectional and longitudinal data to capture
744 nonlinearity of the mean level trajectories across persons ¹¹¹. The linear predictor matrix of the GAMM was used to obtain
745 asymmetry trajectories and their confidence intervals, computed as the difference between zero-centered (i.e.
746 demeaned) hemispheric age-trajectories. We included Hemisphere as an additional fixed effect, sex and scanner as
747 covariates-of-no-interest, and a random subject intercept. We did not consider sex differences in lifespan asymmetry
748 change because our elected method was not well-suited to testing three-way interactions between nonlinear smooth
749 terms. A low number of basis dimensions for each smoothing spline was chosen to guard against overfitting (knots = 6;
750 see [Figure 3—figure supplement 1](#)). LCBC outliers falling > 6SD from the trajectory of either hemisphere were detected
751 and removed on a region-wise basis ([Supplementary file 1E-F](#)). To calculate relative change, we refitted lifespan GAMMs
752 adding an ICV covariate, then scaled the LH and RH fitted lifespan trajectories by the prediction at the minimum age (i.e.
753 ~4 years). Age at peak thickness asymmetry was estimated where the CI's of absolute hemispheric trajectories were
754 maximally non-overlapping.

756 **4.3.3 Interregional correlations**

757 We assessed covariance between asymmetries, separately for areal and thickness asymmetry. Here, we regressed out
758 age, sex and scanner (where applicable) from each AI, using linear mixed models after collating the data from each
759 sample (adding random intercepts for LCBC subjects), to ensure the correction was unaffected by differences in sample
760 age-distribution. Separately for each dataset, we then obtained the cluster-cluster correlation matrix. All individual AI's in
761 clusters with rightward mean asymmetry were inversed, such that positive correlations denote asymmetry-asymmetry
762 relationships regardless of the direction of mean asymmetry in the cluster (i.e. higher asymmetry in the population-
763 direction). At this point, two strong outliers in HCP data were detected and discarded for this and all subsequent analyses

764 (Figure 4—figure supplement 4). Replication was assessed using the Mantel test (“ade4”¹¹²) between each dataset-pair
765 (LCBC, UKB, HCP) across 10,000 permutations. We then post-hoc tested whether covariance between areal
766 asymmetries was related to proximity in cortex, obtaining the average geodesic distance between all clusters along the
767 ipsilateral surface (“SurfDist” Python package¹¹³), and correlating pair-wise distance with pair-wise correlation coefficient
768 (Fisher’s transformed coefficients; Spearman’s correlation). To post-hoc assess whether observed covariance patterns
769 for thickness asymmetry reflected a global effect, we ran a PCA across z-transformed AIs for all thickness clusters (pre-
770 corrected for the same covariates). Based on the results, we computed the mean AIs across all leftward clusters, and
771 across all rightward clusters, and tested the partial correlation between mean leftward thickness asymmetry in left-
772 asymmetric clusters and mean rightward thickness asymmetry in right-asymmetric clusters, in each of the three cohorts.
773

774 4.3.4 Heritability

775 Heritability of areal and thickness asymmetry was assessed using both twin- and SNP-based methods, both for our set
776 of robust clusters and cortex-wide across 500 parcels⁵⁰. For cluster analyses, significance was considered at Bonferroni-
777 corrected $p < .05$ applied separately across each metric. Cortex-wide significance was considered at $p(FDR) < .05$ (500
778 tests per map). Twin heritability was assessed using AE models in “OpenMx”¹¹⁴, which use observed cross-twin and
779 cross-sibling covariance to decompose the proportion of observed phenotypic variance into additive genetic effects [A],
780 and unique environmental effects or error [E]. Data were reformatted such that rows represented family-wise
781 observations. As is standard, we set A to be 1 for MZ twins assumed to share 100% of their segregating genes (but see
782¹¹⁵), and 0.5 for DZ twins and siblings that share 50% on average. For each phenotype we first regressed out age and
783 sex and computed z-scores. Statistical significance was assessed by comparing model fit to submodels with the A
784 parameter set to 0.
785

786 For SNP-heritability, the final genetic sample consisted of 31,433 UKB participants (application #32048) with imaging
787 and quality checked genetic data. We removed subjects that were outliers based on heterozygosity [field 22027] and
788 missingness (> 0.05), mismatched genetic and reported sex [22001], sex chromosome aneuploidies [22019], and those
789 not in the “white British ancestry” subset [22006]¹¹⁶. At variant level, after removing SNPs with minor allele frequency $<$
790 0.01, data from 654,584 autosomal SNPs were used to compute a genetic relationship matrix using GCTA (v1.93.2)¹¹⁷.
791 For each phenotype, we first regressed out age and sex and computed z-scores. Genome-based restricted maximum
792 likelihood (GREML) methods as implemented in GCTA were then used to compute SNP-heritability for each AI measure,
793 applying a kinship coefficient cut-off of 0.025 (excluding one individual from each pair), and controlling for genetic
794 population structure (first ten principal components). Bivariate GREML analysis was used to test genetic correlations
795 between asymmetry clusters¹¹⁷. These estimate the proportion of variance two asymmetries share due to genetic
796 influences through pleiotropic action of genes¹¹⁸. We tested genetic relationships only for cluster-pairs where both
797 clusters exhibited significant SNP-heritability ($p < .05$; pre-corrected; 78 tests for area, 48 for thickness). Significance of
798 genetic correlations was assessed at $p(FDR) < .05$.
799

801 4.3.5 Associations with Cognition, Sex, Handedness, & ICV

802 Finally, we assessed relationships between asymmetry in our robust clusters and general cognitive ability, handedness,
803 sex and ICV. For general cognition, we used the first principal component across the following 11 core UK Biobank
804 cognitive variables⁹⁵: Mean reaction time (log transformed) [field 20023], Numeric memory [4282], Fluid reasoning
805 [20016], Matrix completion [6373], Tower rearranging [21004], Symbol digit substitution [23324], Paired associate
806 learning [20197], Prospective memory [20018] (recoded as 1 or 0, depending on whether the instruction was remembered
807 on the first attempt or not), Pairs matching (log) [399], Trail making A (log) [6348], Trail making B (log) [6350]. Prior to
808 the PCA, for participants with cognitive data, data was imputed for missing cognitive variables via the “imputePCA” R
809 function (number of estimated components tentatively optimized using general cross validation; “missMDA” Package¹¹⁹).
810 PC1 (explaining 39.2%; Supplementary file 1L) was inverted to correlate negatively with age ($r = -.39$), ensuring higher
811 values reflected higher cognition. As fewer participants had cognitive data relative to the other variables, for each cluster
812 we ran one set of linear models to assess the marginal effect of cognition (PC1 as predictor; age, sex, ICV controlled; N
813 = 35,199), and one set of linear models to assess the marginal effects of Handedness, Sex, and ICV in a model including
814 all three predictors (age controlled, $N = 37,570$ with available handedness data). For the cognitive analysis, effects
815 identified in the imputed dataset were checked against the confidence intervals for the effect in the subset of the data
816 with no missing cognitive variables ($N = 4696$). Participants who self-reported as mixed handed were not included²².
817 Significance was considered at Bonferroni-corrected $\alpha = p < 7.3^{-5}$ (.01/136 [34 clusters \times 4]).
818

820 Data sharing/availability

821 All summary-level maps are available at neurovault.org/XXXX (upon acceptance). All code underlying the main
822 analyses is available at <https://github.com/jamesmroe/PopAsym> and on the Open Science Framework (upon
823 acceptance). All derived source data underlying all figures is also available here and in Supplementary files 2-3. All
824 datasets used in this work are openly available, with the exception of LCBC, where participants, which include many
825 children, have not consented to share their data publicly online. Other datasets used in this work are available without
826 restrictions and are not subject to application approval (DLBS; https://fcon_1000.projects.nitrc.org/indi/retro/dlbs.html);
827 CC BY-NC; SALD; http://fcon_1000.projects.nitrc.org/indi/retro/sald.html; CC BY-NC; IXI; [https://brain-
828 development.org/ixi-dataset/](https://brain-development.org/ixi-dataset/); CC BY-SA 3.0). Accordingly, we have made the individual-level data for these samples
829 available and our code can be used to reproduce vertex-wise analyses in these samples. Individual-level data for the
830 remaining samples (LCBC; Cam-CAN, HCP; UKB) may be available upon reasonable request, given appropriate

831 ethical, data protection, and data-sharing agreements where applicable. Requests must be submitted and approved via
832 the relevant channel (details are provided in Supplementary File 1).

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842 843 844 **4.4 References**

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