Increased facial asymmetry in focal epilepsies associated with unilateral lesions

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The epilepsies are now conceptualized as network disruptions: focal epilepsies are considered to have network alterations in the hemisphere of seizure onset, whilst generalized epilepsies are considered to have bi-hemispheric network changes. Increasingly, many epilepsies are also considered to be neurodevelopmental disorders, with early changes in the brain underpinning seizure biology. The development of the structure of the face is influenced by complex molecular interactions between surface ectoderm and underlying developing forebrain and neural crest cells. This influence is likely to continue postnatally, given the evidence of facial growth changes over time in humans until at least 18 years of age. In this case–control study, we hypothesized that people with lateralized focal epilepsies (i.e. unilateral network changes) have an increased degree of facial asymmetry, compared with people with generalized epilepsies or controls without epilepsy. We applied three-dimensional stereophotogrammetry and dense surface models to evaluate facial asymmetry in people with epilepsy, aiming to generate new tools to explore pathophysiological mechanisms in epilepsy.

We analysed neuroimaging data to explore the correlation between face and brain asymmetry. We consecutively recruited 859 people with epilepsy attending the epilepsy clinics at a tertiary referral centre. We used dense surface modelling of the full face and signature analyses of three-dimensional facial photographs to analyse facial differences between 378 cases and 205 healthy controls. Neuroimaging around the time of the facial photograph was available for 234 cases. We computed the brain asymmetry index between contralateral regions. Cases with focal symptomatic epilepsy associated with unilateral lesions showed greater facial asymmetry compared to controls ($P = 0.0001$, two-sample t-test). This finding was confirmed by linear regression analysis after controlling for age and gender. We also found a significant correlation between duration of illness and the brain asymmetry index of total average cortical thickness ($r = -0.19$, $P = 0.0075$) but not for total average surface area ($r = 0.06$, $P = 0.3968$). There was no significant correlation between facial asymmetry and asymmetry of regional cortical thickness or surface area. We propose that the greater facial asymmetry in cases with focal epilepsy caused by unilateral abnormality might be explained by early unilateral network disruption, and that this is independent of underlying brain asymmetry. Three-dimensional stereophotogrammetry and dense surface modelling are a novel powerful phenotyping tool in epilepsy that may permit greater understanding of pathophysiology in epilepsy, and generate further insights into the development of cerebral networks underlying epilepsy, and the genetics of facial and neural development.

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Introduction

Many genetic syndromes involve facial morphological characteristics, and the facial ‘Gestalt’ can be an important clue in the identification of genetic conditions. Facial morphology reflects environmental influences, as well as individual genomic variation. Atypical face shape can arise from pathogenic genetic variation, as in Down syndrome, and is an important diagnostic clue in many genetic conditions. Face and brain development are intricately linked, likely driven by complex molecular interactions between surface ectoderm and underlying forebrain and neural crest cell migration. Abnormal facial morphology can be associated with underlying brain pathology. At a structural level, the brain exhibits natural asymmetry about the mid-sagittal plane, which in autism has its counterpart in quantifiable changes in facial asymmetry. At a genetic level, genome-wide gene expression is asymmetric from an early developmental stage, and retains differences throughout life.

Facial morphology can also be used to interpret genetic variation: for example, in a set of putatively pathogenic variants, a genetic variant might be considered to have some functional consequence if a particular pattern of quantitative facial change, known to be associated with that variant, is present. Genome-wide association studies for facial features in Latin Americans have identified several loci, with strong candidate genes, influencing normal facial variation. A novel method to predict face shape variation in people of West African/European mixed ancestry is based on gender, ancestry, and genotype. Overall, heritability of 60–90% has been estimated for aspects of face shape.

Three-dimensional (3D) stereophotogrammetry has become an important tool in studies of facial shape, dysmorphology, and facial development genetics. It accurately captures the geometry of the face as a mesh of tens of thousands of surface points. Dense surface models (DSMs) capture variation in facial morphology, based on a dense correspondence of surface mesh points of a set of 3D facial images. Studies using DSM of face shape have delineated facial phenotypes arising from genetic anomaly and teratogen exposure, often enhancing expert dysmorphology review. We previously showed, using DSMs, that individuals with epilepsy and pathogenic structural genetic variants have a significantly more atypical face shape than those without such variants. The properties of interictal functional networks are substantially different between focal or generalized seizures, and the timing of network disruption leading to epileptogenesis is largely unknown in both focal and generalized...
epilepsies. Polygenic contribution has been established for
generalized epilepsies, whilst it is less clear for focal ones.25,26 We explored structural asymmetries in the
brain and face in the epilepsies, as a step towards further
understanding network disruption and pathophysiological
mechanisms.

Given the complex molecular interactions between sur-
face ectoderm and underlying developing forebrain and
neural crest cells during embryogenesis, likely to continue
postnatally,27,28 we hypothesized that, independent from
underlying brain asymmetry, people with lateralized focal
epilepsies have an increased degree of facial asymmetry,
compared with people with idiopathic generalized
epilepsy (IGE) or controls without epilepsy, on the
basis that lateralized focal epilepsies are currently concep-
tualized as involving uni-hemispheric networks, whilst
IGEs are considered to involve both hemispheres.29

Methods

Subjects

The study was approved by the relevant ethics committee.
Written informed consent was obtained from participants,
or informed assent was obtained from parents or guardi-
ans. Individuals with epilepsy were consecutively recruited
at the National Hospital for Neurology and Neurosurgery
(UK). Controls were recruited as volunteers, unaffected relatives of patients or healthy infants,
from the UCL Institute of Child Health (London, UK).
The data gathered included age, gender, ethnicity, epi-
lepsy diagnosis,30 brain MRI results, intellectual disabil-
ity, and history of facial injury or surgery. Control
subjects had no known genetic syndrome, previous facial
surgery, or trauma. Non-Europeans were excluded be-
cause of the lack of ethnically matched controls.
Participants with poor quality surface reconstructions,
known bilateral lesions, or unclassified epilepsy, were
also excluded. Inclusion and exclusion criteria are sum-
marized in Supplementary Fig. 1.

Epilepsy syndrome classification was based on analysis
of seizure semiology, EEG-videotelemetry recording, brain
MRI scan, and in some cases, additional investigations
such as PET scan and intracranial EEG recording30
(Supplementary Data 1).

Face imaging

For all patients, 3D face images were captured with a
single device (Vectra CR 3D; Canfield Scientific Inc.)
with the subjects seated, facing directly towards the cam-
era and with the face and chin fully uncovered. A bright
target was used to direct gaze, and up to three images
were taken with the subject’s face as close to a neutral
expression as possible. Two operators (K.C. and S.B.)
manually annotated patient images with 22 facial
landmarks previously shown to be accurate and reproduc-
cible.31 The manual annotation was performed blinded to
any clinical data. Control subject images were acquired
previously with an identical device but annotated by a
different operator (P.H.). We assessed intra- and inter-
operator reproducibility by randomly selecting 20 images
to be landmarked twice by S.B. and K.C. Mean land-
mark error was <1.5 mm and intra-class correlation coef-
cients were 0.999–1.000.

A DSM of a set of landmarked face surfaces, described
in detail elsewhere,17,32 comprises modes of shape variation
arising from a principal component analysis of surface
point displacement. Prior to the principal component ana-
lysis, using a base mesh (whole face or patch) and aligned
sparse landmarks (Supplementary Fig. 2), a dense corres-
dpondence of surface points across all faces is computed.
The proportion of face shape variance covered by each
principal component (PC) is calculated, with PCs ordered
in terms of decreasing variance coverage. For a DSM of a
collection of faces of varying age, the first PC typically
reflects facial growth and correlates strongly with age.17
We retained sufficient PCs to cover 99% of shape variance
in each constructed DSM (full face and face patches),
including both original faces and their mirrored forms (re-
flexion in any plane but usually x = 0).

Each face surface captured has as many as 30 000
mesh points. The ‘signature’ of a face surface is the set of
position differences at constituent image mesh points from
corresponding points on the mean of age/gender-
matched healthy controls, normalized against the vari-
ation in controls. The ‘signature weight’ of a surface is
the square root of the sum of the squared normalized dif-
ferences across all of the densely corresponded points.
Signature weight is a rough estimate of facial dysmor-
phism. A ‘signature heat map’ visualizes the significance
of localized differences using a red–green–blue spectrum
with, for example, red and blue reflecting extreme oppos-
ite displacements and green coinciding with the mean of
the matched controls. Thus, an axis normal to the face
surface reflects inward/outward displacement; a lateral (x)
axis might be used to visualize hypertelorism or dystopia
canthorum; a vertical (y) axis to reflect unusual nose
length; and, a depth (z) axis may reflect mid-facial hypo-
plasia (Supplementary Fig. 3).

The difference between the DSM representations of a
face and its mirrored form can also be interpreted as a sur-
face reflecting the ‘raw asymmetry’ of the original face. If
a face was perfectly symmetric, the difference would corres-
pond to the mean face in the DSM constituted by faces
and their mirrored forms. A signature heat map of an ori-
ginal-mirrored difference can be used to demonstrate the
significance of regions of facial asymmetry compared to
that of healthy controls. The signature weight of this differ-
ence, ‘signature asymmetry index (SAI)’, quantifies degrees
of facial asymmetry. Raw asymmetry and signature asym-
metry are compared in Supplementary Fig. 4. It is impor-
tant to note that a raw asymmetry heat map shows
differences in millimetres between original and mirrored face surfaces on the original face surface. A signature asymmetry heat map shows differences in standard deviations of the ‘artificial’ surface defined by the original-mirrored difference from similar differences for a set of matched controls.

In order to investigate endophenotypic differences in face shape, we used multi-folded discrimination testing (closest mean; support vector machines; linear discriminant analysis) to determine baseline discrimination rates between controls, focal cryptogenic and focal symptomatic subgroups. After removing individuals with facial injuries, the IGE subgroup size numbered only 27, with almost a 2:1 female:male ratio, which we considered unsuitable for multi-folded discrimination testing. Anthropometric comparisons were made against appropriate age-range matched controls (e.g. noting the narrower age range of the IGE smaller subgroups, with 10 males and 17 females).

Statistical analysis

For each DSM generated, we calculated means of the differences between original and mirrored facial forms for controls. For both cases and controls, the log of the SAI was normally distributed. All subgroup comparisons of differences between original and mirrored facial forms for a set of faces. Once an ‘asymmetry’ candidate PC was identified, appropriate left and right-sided anthropometric measures (L and R) were used to compute an associated asymmetry measure \((R - L)/(R + L)\).

Brain MRI imaging and processing

From the 378 subjects with available facial asymmetry measures, there were T1-weighted MRI scans for 239 subjects taken around the time of acquiring SAI. In total, three different 3D-T1-weighted MRI sequences were used: (i) a coronal T1W 3D inversion-recovery fast spoiled gradient echo (IR-FSPGR) with repetition time/echo time/inversion time = 8.1/3.1/450 ms; field-of-view 187 × 240 × 240 mm; matrix 170 × 256 × 256 (176 scans); (ii) an axial T1W 3D (FSPGR BRAVO) with TE/TR/TI 3.6/0.2/400 ms, field-of-view 240 × 240 × 183 mm, matrix 256 × 256 × 166, parallel imaging acceleration factor 2 (43 scans); and (iii) a 3D T1-weighted inversion-recovery fast spoiled gradient recalled echo with TE/TR/TI 3.1/7.4/400 ms, field-of-view 224 × 256 × 256 mm, matrix 224 × 256 × 256, parallel imaging acceleration factor 2 (20 scans). Sequences 1 and 2 were used for data acquired between August 2004 and March 2013 on a single 3T MRI GE Signa HDx scanner (GE, Milwauke, WI, USA) using an 8-channel head coil. Sequence 3 was used for data acquired from September 2013 onwards, on a 3T GE Discovery MR750 (GE, Milwauke, WI, USA) with a 32-channel head coil.

Following a visual inspection, MRI scans with resections were excluded before using FreeSurfer 6.0\textsuperscript{33,34} for the automated segmentation of brain regions. From the FreeSurfer processed images, we extracted information on 102 brain regions defined in the Desikan-Killiany atlas\textsuperscript{35}: 70 regional measures for cortical thickness including average cortical thickness and surface area for each hemisphere, 16 sub-cortical volumes and 26 measures for hippocampal subfields.\textsuperscript{36} Regional measures were adjusted for intracranial volume, age, sex and scanner using linear regression. For an automated quality control step, we employed a script developed by the ENIGMA consortium,\textsuperscript{37} which, for every brain region, identifies potential outliers based on the distribution in the cohort: values showing a z-score of ≥4.7 in either direction were marked as outliers. Following this automated quality control, five highlighted subjects’ segmented brain scans were manually inspected and finally excluded as outliers. Using the resulting 234 scans, we computed the brain asymmetry index (BASI) between contralateral regions, where the BASI of each brain region was defined as the difference between the left and right regional measure, divided by their average. Data on duration of illness was available for 194/234 of these subjects, including focal cryptogenic \((n = 97)\), focal symptomatic \((n = 70)\) and IGE \((n = 27)\).

We computed Pearson’s correlation between duration of illness and the BASI of average thickness and surface area of cortical brain regions to investigate the effect duration of illness has on the brain. We also computed Pearson’s correlation between SAI and the BASI of average thickness and surface area of cortical brain regions.

Machine learning approach

We aimed to predict subjects’ SAI from the computed 51 BASI brain regions using regularized logistic regression. Specifically, we used the LASSO regularization,\textsuperscript{38} which is a statistical analysis that performs sparse feature selection. BASI values were normalized prior to being used in the learning algorithm: for each feature, the mean in the...
dataset was subtracted, and the values were divided by the Euclidean norm to ensure that the range for each BASI values was comparable. The dataset was split randomly into 80% training data and 20% test data. We optimized the regularization parameter, alpha, on the training set using 10-fold cross-validation with alpha values ranging from $2^{-16}$ to $2^{-4}$. We chose the alpha that led to the best correlation between measured SAI and predicted SAI. Next, we predicted the SAI for samples in the test data using the optimal parameter. This process was repeated 1000 times to account for randomness in splitting train and test data and to better evaluate the trained model’s performance. Model performance for each of the 1000 repetitions was measured using the Spearman’s rank correlation coefficient and the mean squared error (MSE) between measured SAI and predicted SAI. The BrainPainter software was used to visualize the frequency of the brain regions selected across the 1000 repetitions.

In addition to this BASI of brain regions-only model, we sought to improve model performance by incorporating additional features: laterality of the lesion in an MRI scan for symptomatic cases, and the type of epilepsy. Furthermore, we analysed only focal cryptogenic ($n = 109$) and focal symptomatic ($n = 96$) subjects separately to investigate the prediction accuracy on SAI with LASSO model trained on BASI of brain regions and laterality of the lesion in an MRI scan.

### Data availability

The authors confirm that the data supporting the findings of this study are available from the corresponding author, upon reasonable request.

### Results

#### Cohort characteristics

Of the 859 people with epilepsy initially recruited for the study, 378 were included in the analysis and compared with 205 healthy controls. The clinical characteristics of the subjects included in the study are summarized in Table 1.

### Discriminating face shape differences between controls and individuals with epilepsy

The faces of the focal cryptogenic and focal symptomatic patient subgroups were strongly distinguishable from controls but much less so from each other, suggesting they have similar degrees (and possibly similar kinds) of facial differences from controls (Table 2). Having established these discriminating differences, consideration of mean face signatures (Supplementary Fig. 5) suggested that outward, horizontal displacement of the inner canthi and vertical displacement of the subnasale were potential discriminating differences. Table 2 summarizes significant reductions found in either or both of palpebral fissure length (suggesting dystopia canthorum) and nose length in focal epilepsy cases but not in generalized epilepsy cases. This was especially so for female ($P < 0.001$ for palpebral fissure length, $P < 0.001$ for nose length) rather than male ($P = 0.077$ for palpebral fissure length, $P = 0.099$ for nose length) symptomatic cases. Right or

### Table 2 Multi-folded discrimination analysis to determine baseline discrimination rates between controls and epilepsy subgroups

| Comparison | Gender (n:N) | Facr | Palpebral fissure length | Nose length |
|------------|-------------|------|-------------------------|-------------|
|            |             | discr | (mm:mm) P (t-test)      | (mm:mm) P (t-test) |
| CTRL: FC   | F (106:45)  | 0.986 | 27.8:26.8 0.002**        | 47.0:46.0 0.108  |
|            | M (71:32)   | 0.943 | 28.8:28.4 0.292          | 49.3:47.5 0.049* |
| CTRL: FS   | F (106:59)  | 0.990 | 27.8:26.8 2.8E−05**      | 47.0:44.6 9.4E−04** |
|            | M (71:41)   | 0.959 | 28.8:28.2 0.077          | 49.3:47.9 0.099 |
| CTRL: IGE  | F (80:17)   | 0.732 | 28.0:27.5 0.153          | 46.6:45.3 0.132  |
|            | M (70:10)   | 0.697 | 28.8:28.5 0.506          | 49.3:47.7 0.102 |
| FC: FS     | F (45:72)   | 0.732 | 26.8:26.8 0.935          | 46.0:44.7 0.107  |
|            | M (32:55)   | 0.697 | 28.4:28.1 0.442          | 47.5:47.7 0.871  |

CTRL, controls; F, female; FC, focal cryptogenic unilateral epilepsy; FS, focal symptomatic unilateral epilepsy; IGE, idiopathic generalized epilepsy.
left laterality of a symptomatic lesion did not appear to exaggerate these particular face shape differences.

**Signature asymmetry index in individuals with epilepsy**

There was no correlation between SAI and age in controls or individuals with epilepsy (Supplementary Fig. 6). There was a significant correlation between SAI and epilepsy duration in all individuals with epilepsy ($n = 378$) (Pearson’s correlation coefficient $= 0.245$, $P < 0.0001$), including focal ($n = 328$) and generalized ($n = 50$) types, and this was stronger after excluding individuals with a history of head injury ($n = 65$) (Pearson’s correlation coefficient $= 0.312$, $P < 0.0001$). There was no significant correlation between SAI and age at seizure onset. We found significantly higher values of SAI in cases with focal epilepsy (including all unilateral cryptogenic and symptomatic) when compared with controls ($n = 205$) (mean 5.04, SD 0.32 vs 4.95, 0.28, $P = 0.0013$). This difference was maintained after excluding 53 subjects with a history of facial fractures or surgery ($P = 0.0034$). There was a significant difference in SAI between cases with focal unilateral symptomatic epilepsy ($n = 183$) compared to controls (mean 5.07, SD 0.30 vs 4.95, 0.28, $P = 0.0001$). The difference persisted after excluding 27 subjects with a history of facial fractures or surgery ($P = 0.0006$). We also repeated the comparison of SAI between focal symptomatic cases and controls after removing the 43 cases with clear acquired aetiology (i.e. inflammatory/infectious, tumour, ischaemic/haemorrhage and post-traumatic damage), and we found again a significant difference (mean 5.05, SD 0.29 vs 4.95, 0.28, $P = 0.0019$). We finally conducted a subanalysis of SAI between focal symptomatic cases with malformation of cortical development ($n = 45$) and controls ($n = 205$), and there was a significant difference (mean 5.10, SD 0.29 vs 4.95, 0.28, $P = 0.0015$). There was no significant difference in SAI when comparing focal symptomatic cases with hippocampal sclerosis ($n = 77$) and controls ($P = 0.1687$).

There was no significant difference in SAI between focal cryptogenic epilepsy cases ($n = 145$) versus controls (mean 4.99, SD 0.33 vs 4.95, 0.28, $P = 0.1783$); excluding 26 subjects with a history of facial fractures or surgery did not change this observation (Fig. 1). There was no significant difference in SAI between IGE cases versus controls ($P = 0.9875$), even after excluding 12 subjects with a history of facial fractures or surgery.

One-way ANOVA with Bonferroni correction for multiple comparisons confirmed that the SAI difference between all focal cases and controls was driven by the focal symptomatic unilateral cases ($P = 0.001$). Multivariate linear regression analysis also confirmed that focal symptomatic unilateral cases were the only category significantly associated with SAI (coefficient 0.089, $P = 0.004$), after controlling for age (coefficient 0.004, $P < 0.001$) and gender (coefficient 0.094, $P < 0.001$) (Table 3, Fig. 2).

**Specific facial asymmetries in individuals with epilepsy**

Table 4 lists face shape PCs and cohort subgroups for which there is a strong inverse (Pearson) correlation ($<-0.9$) between PC values of corresponding original and reflected faces.

PC10 involves vertical asymmetry of orbit and ear position as well as lateral displacement of the lower jaw. PC12 captures a horizontal deflection of the nose tip. PC31 depicts a rotation of the nose but about a 'nasion-subnasale' axis, with simultaneous vertical displacement asymmetry of the corners of the mouth. These asymmetries are best appreciated as animations (Supplementary Data 2) showing variation between $-3$ and $+3$ standard deviations. Other PCs capture asymmetries to a lesser degree and/or reflect less face shape variance (e.g. may not show a strong inverted correlation between original and reflected faces, whilst other PCs are lower down in the PC variance hierarchy, e.g. PC68, PC69 etc.). For the asymmetry delineated in PC12, left-right deflection of the nose, we used the distances between subnasale and left and right exocanthi. Distances between pronasale and left and right cheilion were used for the nose-mouth asymmetry delineated in PC31. Left and right inner canthi distances to nasion were employed to investigate the eye-depth asymmetry as featured in PC67. For the asymmetry mode PC10, we computed the distance between left vs right exocanthi and left vs right mouth corner. As with the palpebral fissure and nose length differences, these
Table 3 Multivariate linear regression analysis to identify independent predictors of SAI variation

| Variable                      | Coefficient | Standard error | t      | P < | 95% CI          |
|-------------------------------|-------------|----------------|--------|-----|-----------------|
| Age                           | 0.004       | 0.001          | 3.62   |     | <0.001**        |
| Gender (male sex)             | 0.094       | 0.025          | 3.81   |     | <0.001**        |
| Epilepsy type (controls as reference) |            |                |        |     |                 |
| FC                            | 0.029       | 0.032          | 0.91   |     | 0.362           |
| FS                            | 0.089       | 0.031          | 2.88   |     | 0.004**         |
| IGE                           | −0.011      | 0.047          | −0.24  |     | 0.809           |
| Constant                      | 4.882       | 0.043          | 114.34 |     | <0.001***       |

The model was constructed after adjusting for potential confounding factors, considered as the variables that emerged as significant (P < 0.05) in the univariate analyses.

FC, focal cryptogenic unilateral epilepsy; FS, focal symptomatic unilateral epilepsy; IGE, idiopathic generalized epilepsy. **P < 0.01.

Figure 2 Raw asymmetry and SAI in controls and epilepsy subgroups. (A) Difference between the average raw asymmetry in the control group (first row) and signature asymmetry in cases with focal symptomatic epilepsy and unilateral lesions (second row). The right dominant depth asymmetry in controls is consistent with the so-called Yakovlevian torque found previously in the brains of typically developing individuals. (B) The distribution of SAI in the x-axis was compared between each epilepsy subgroup and controls. The most significant facial asymmetry, as measured by SAI, occurs in cases with focal symptomatic unilateral epilepsy. CTRL, controls; FC, focal cryptogenic unilateral epilepsy; FS, focal symptomatic unilateral epilepsy; IGE, idiopathic generalized epilepsy.
specific asymmetries appear to be more significant when the lesion is focal, and in women. Once again, lesion sidedness (right or left-sided lesions) does not appear to exaggerate or bias these asymmetries (Supplementary Table 1).

### Facial and brain asymmetries in individuals with epilepsy

Duration of illness was significantly correlated with BASI of average cortical thickness \( r = -0.19 \) (\( P = 0.0075 \)) but not with BASI of surface area \( r = 0.06 \) (\( P = 0.39 \)). SAI was neither correlated with BASI of cortical thickness \( r = -0.01 \) (\( P = 0.93 \)) nor with BASI of surface area \( r = -0.05 \) (\( P = 0.48 \)) (see Fig. 3).

The LASSO model was trained on subjects of all epilepsy types to predict SAI using the BASI of brain regions and optionally additional features. The main analysis involving all 234 subjects using only the BASI of brain regions yielded an average correlation of \( -0.022 \) and an average MSE of 0.099 (Supplementary Fig. 7). Adding the additional non-imaging features yielded a mean

| PC | 10 | 12 | 31 | 55 | 28 | 53 | 61 | 67 | 18 |
|----|----|----|----|----|----|----|----|----|----|
| CTRL F | -0.997 | -0.992 | -0.979 | -0.971 | -0.963 | -0.959 | -0.934 | -0.917 |
| CTRL M | -0.997 | -0.994 | -0.984 | -0.975 | -0.936 | -0.952 | -0.939 | -0.922 |
| FS F | -0.996 | -0.992 | -0.976 | -0.978 | -0.962 | -0.959 | -0.900 | -0.950 |
| FS M | -0.998 | -0.990 | -0.975 | -0.980 | -0.956 | -0.961 | -0.902 | -0.917 |

CTRL, controls; F, female; FS, focal symptomatic unilateral epilepsy; M, male; PC, principal component.

Table 4 Correlations \( (<-0.9) \) between PC values for original and reflected faces for controls and individuals with epilepsy

![Figure 3 Correlation analysis of duration of illness and SAI vs BASI average cortical thickness and BASI average surface area. Duration of illness and BASI average cortical thickness showed \( r = -0.19 \) (\( P = 0.0075 \)) and for BASI average surface area \( r = 0.06 \) (\( P = 0.3968 \)). In the case of SAI and BASI cortical measures, the correlation was \( r = -0.01 \) (\( P = 0.9306 \)) and \( r = -0.05 \) (\( P = 0.4820 \)) for BASI average thickness and BASI average surface area, respectively. The strength of relationship shows SAI thickness decreases for longer duration of illness but is different in the case of BASI average surface area and duration of illness.](https://academic.oup.com/braincomms/article-abstract/3/2/fcab068/6237483)
correlation of −0.024 and mean MSE of 0.099. Thus, there was no notable difference in the average correlation and MSE of the two models. In addition to making predictions, the LASSO model enabled us to assess which regional BASI were most useful for predicting SAI. Of the 1000 iterations, in 683 models LASSO did not select any features besides the intercept (indicated by correlation values of exactly 0). However, in the remaining models, the most frequently selected features were the BASI of entorhinal gyrus (25.8%), fimbria (25.6%), the pallidum (25.2%), the frontal pole (16.8%), the caudal anterior cingulate (16.5%) and the side of lesion on MRI scan (15%) (Fig. 4; Supplementary Fig. 8). The final analysis was to determine the impact SAI had on focal epilepsies. We analysed only focal cryptogenic and focal symptomatic subjects. Here we found the focal cryptogenic model performed slightly better compared to focal symptomatic cases with average correlation ($n = 109$) of 0.095 (average MSE of 0.11) and average correlation ($N = 96$) of −0.03 (average MSE of 0.09), respectively.

**Discussion**

We show that facial asymmetry is greater in individuals with focal symptomatic epilepsy associated with unilateral lesions compared to healthy controls. Actual sidedness of lesion did not appear to increase their impact on the measures. This difference was maintained after excluding individuals with unilateral lesions of established acquired aetiology. Although the size of the lesions was not systematically measured, in most cases the brain structural lesion was not extensive, and its location was deep (e.g. hippocampal sclerosis). Whilst there was a significant effect of disease duration on both brain and facial asymmetries, there was no association between brain asymmetry and facial asymmetry, suggesting that any link between brain disruption and increased facial asymmetry was not due to a direct physical brain asymmetry as measured here. We confirmed our primary hypothesis that people with lateralized focal epilepsies have an increased degree of facial asymmetry, compared with people with IGE or controls without epilepsy, and found that increased facial asymmetry reflects, indirectly, the presence of an underlying focal lesion and the network disruption it might cause.

Our findings of increased degree of facial asymmetry in focal epilepsies associated with unilateral lesions support the perspective that the brain can physically influence the face. In mice, a reduction in brain growth produced an earlier developing and more prognathic face. In our study, brain and face asymmetries did not correlate. Thus, whilst the disruption to brain physical parameters that a focal symptomatic lesion may cause, a direct physical link seems unlikely to explain our finding that focal epilepsy has greater facial asymmetry when caused by a known underlying unilateral epileptogenic lesion, independent of whether its aetiology is presumptively genetic or acquired. It is possible that the unilateral network disruption accompanying the focal epilepsy leads to the more asymmetric facial development, and that this disruption is more severe in the presence of a brain structural abnormality compared with non-lesional focal epilepsies. There is evidence that remodeling of connectome topology and structurally governed functional dynamics depends on the underlying brain abnormality, for example much more marked networks changes were identified in temporal lobe epilepsy associated with hippocampal sclerosis when compared with temporal lobe epilepsy associated with isolated gliosis, where there were negligible effects on network dynamics. We found that a developmental aetiology, in particular malformation of cortical development, was significantly associated with facial asymmetry, whilst hippocampal sclerosis of which the aetiology is controversial and most likely multifactorial was not different from controls. This suggests a stronger influence of developmental disorders on facial asymmetry.

Recent work has shown that the brain controls some of the temporal aspects of facial development. The effect of the brain on the timing of facial development has been observed in animal models. The early influences of the brain on the face may be partially erased during later stages of development; however, some processes may exert different influences at different times. There is evidence of facial growth changes over time in humans until the age of 18 years, including various horizontal and vertical linear measurements and changes in their relative proportions. Facial dysmorphology may likely arise from aberrant physical interactions between the brain.
and the face, for example, due to a growth rate that is too rapid, leading to a larger platform for the face to grow on, leaving the face relatively small. Marcucio et al. hypothesized that the temporal pattern of gene expression within the brain transmits some type of timing information to adjacent tissues. We found that disease duration is associated with reduced cortical thickness as previously demonstrated, and with increased facial asymmetry. Widespread progressive cortical thinning exceeding that seen with normal ageing has been found in individuals with focal epilepsy. Altered connectomic profiling in magnetoencephalography in focal epilepsies has been associated with disease duration. In our study, people with epilepsy-associated focal brain lesions had greater facial asymmetry compared to controls, paralleling the widespread effect on cortical thickness observed in people with epilepsy and focal brain pathology (i.e. hippocampal sclerosis). Structural brain asymmetry has been found in other neurological disorders, including autism spectrum disorder where increased facial asymmetry has been described. We also found correlation between disease duration and facial asymmetry, suggesting an ongoing effect of the epilepsy pathophysiology on facial phenotype, or alternatively that facial abnormalities grow with age.

The primate brain exhibits several directional asymmetries, i.e. Broca’s area in the inferior frontal gyrus is consistently larger and associated with language in the dominant hemisphere. The most prominent observations

Video 1 Video illustrating variation in asymmetry between −3 and +3 standard deviations for PC 10, involving vertical asymmetry of orbit and ear position as well as lateral displacement of the lower jaw.

Video 2 Video illustrating variation in asymmetry between −3 and +3 standard deviations for PC 12, capturing a horizontal deflection of the nose tip.

Video 3 Video illustrating variation in asymmetry between −3 and +3 standard deviations for PC 31, involving a rotation of the nose about a nasion-subnasale axis, with simultaneous vertical displacement asymmetry of the corners of the mouth.
of brain hemispheric structural asymmetry include the extension of the right occipital and left frontal lobes across the inter-hemispheric midline and to a shift of structures surrounding the Sylvian fissure, together referred to as the Yakovlevian anticlockwise torque,52,53 and the right frontal and left occipital impressions on the inner surface of the skull, more prominent in right-handers, known as petalia.52,54 Human brain structure is highly determined by an individual’s genotype55,56 whilst laterality seems influenced by a number of environmental factors in addition to the genetic determinants.5 Extreme directional asymmetries associated with brain laterality have been correlated with fluctuating asymmetries in other traits, such as a composite index of ear length and width, ‘atd’ angle, and the widths of wrist, hand, foot and ankle.57,58 Both brain and face asymmetries are likely determined by a complex interaction of environmental and genetic factors.5,59,60 In the current work, we could not establish the direction of the facial asymmetry, but right- vs left-sided brain lesions did not appear to increase the significance of the facial differences.

For both focal epilepsy subgroups, we found significant discriminating facial differences from controls in terms of reduced palpebral fissure length (possibly dystopia canthorum) and reduced nose length, respectively resulting from outward displacement of the inner canthi and upward displacement of the subnasale. Some focal epilepsies have an established genetic cause, including some focal cryptogenic syndromes [autosomal dominant nocturnal frontal lobe epilepsy61; genetic epilepsy with febrile seizures plus62,63; autosomal dominant partial epilepsy with auditory features64; familial focal epilepsy with variable foc65] and some focal symptomatic syndromes associated with malformation of cortical development such as focal cortical dysplasia.66–71 A recent whole-exome sequencing study found a significant enrichment of ultra-rare deleterious variants in established epilepsy genes in individuals with familial non-acquired focal epilepsy, including cryptogenic and hippocampal sclerosis cases.72 Morphogenetic events during brain and face development are controlled and coordinated by extracellular signalling pathways, such as Sonic Hedgehog (SHH), bone morphogenetic protein, fibroblast growth factor, Nodal, and retinoid signalling.73 Signalling from the ventral midline is critical for normal midface development, a process in which SHH plays a key role.74 Although the exact molecular mechanisms that regulate SHH expression are not known, various genes are implicated in normal and abnormal variation of face and brain.4 We speculate that the same genetic changes can affect both brain and facial development.

We did not find increased facial asymmetries in people with IGE. This epilepsy type, including the electroclinical syndromes of childhood absence epilepsy, juvenile absence epilepsy, and juvenile myoclonic epilepsy, has a substantial genetic component.25 However, the exact genetic architecture underlying these common epilepsies remains to be elucidated. A recent case-control exome sequencing study revealed a significant excess of ultra-rare deleterious variation in known epileptic encephalopathy genes in patients with familial genetic generalized epilepsy and non-acquired focal epilepsy showing how genetic risk may arise from ultra-rare variants of large effect, including de novo mutations, in a small proportion of common generalized epilepsies, as in the rare epilepsies.75 It remains unclear why (mono) genetically determined common IGEs are less severe than epileptic encephalopathies and why we did not find significant facial alteration in this epilepsy type. We speculate that there is a less asymmetric underlying genetic effect, and less asymmetric network disruption in IGE, such that there is no observed increase in facial asymmetry. Also, the current conceptualization of IGE includes the presence of bilateral epileptogenic networks compared to unilateral networks involved in focal epilepsies; however, asymmetric focal volumetric brain changes have been found in IGE.47

There is a series of limitations in our study. The first is the categorization of epilepsy syndromes. Epilepsy classification evolves continuously, and the current findings might also help in this direction. We chose the old 1989 classification30 based on our initial hypothesis that the cause of focal epilepsy may differently affect the degree of facial asymmetry. The latest ILAE classification76 states that structural conditions should be considered not directly ‘genetic’ but despite there being a genetic basis, the structural correlate underpins the person’s epilepsy (for example in focal symptomatic cases with presumably genetic lesions including malformations of cortical development or dysembryoplastic neuroepithelial tumour66,77). Autism spectrum disorder is a relatively frequent co-morbidity in people with epilepsy and is known to affect facial asymmetry8; however, we could not include this factor in the analysis as not all the patients in our cohort had an adequate assessment to confirm or exclude a diagnosis of autism. Recent studies did not find a significant genetic correlation at the common variant level between autism and epilepsy in a large epilepsy cohort and, on this basis, we may speculate that facial asymmetry may be led by different mechanisms in the two conditions.25,78 We found some gender differences in facial asymmetry in individuals with epilepsy but not in controls; this is difficult to interpret given the relatively small sample size and the unclear evidence in the literature.79 There was a high number of missing data for disease duration, hence we could not control for this in relation to facial asymmetry; however, this was a cross-sectional study with limited value in interpreting facial measures longitudinally. Other limitations include limited data availability for controls (i.e. lack of handedness data) and unmeasured size of brain lesions.

We propose that the greater facial asymmetry in cases with focal epilepsy caused by unilateral abnormality might be explained by early unilateral network
disruption, and that this is independent of underlying brain asymmetry. These findings suggest that DSM models of facial asymmetry could represent a powerful novel phenotyping process in epilepsy that will permit greater understanding of pathophysiology in epilepsy, and generate further insight into the mechanisms of network disruption during facial and neural development.

Supplementary material

Supplementary material is available at Brain Communications online.

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Competing interests

The authors have no competing interests to declare.

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