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# Spectral-based thickness profiling of the corpus callosum enhances anomaly detection in fetal alcohol spectrum disorders Spectral-based thickness profiling of the corpus callosum in fetal alcohol spectrum disorders

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#### Scope Statement

The diagnosis of fetal alcohol spectrum disorders (FASD) encompasses the pathological consequences of prenatal alcohol exposure. The main target of the teratogenic effects of ethanol is the brain, leading subjects with FASD to exhibit not only a smaller brain but also recurrent focal brain abnormalities such as the commonly reported abnormal corpus callosum (CC). We previously showed a narrowing of the CC for brain size, using manual measurement and its usefulness in diagnostic procedure. This study introduces a fast and normalization-free tool to characterize CC morphology by automatically measuring its length and thicknesses on anatomical brain MRI. We described the slimming of the posterior part of the CC, considering brain size, in a series of 89 subjects with FASD compared to 126 typically developing controls. In addition to providing a detailed description of callosal damage in FASD, our study provides a better understanding of the fetotoxic damage of ethanol, independent of the overall reduction in brain size. We are convinced that our innovative tool for describing CC anatomy, which could be used in other pathologies, and our description of brain abnormalities in FASD, the frequency of which is a public health issue, will be of particular interest to your readers.

#### Conflict of interest statement

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest

#### CRedIT Author Statement

David Germanaud: Conceptualization, Data curation, Funding acquisition, Methodology, Resources, Supervision, Validation, Writing - review & editing. Eliot Kerdreux: Validation, Writing - review & editing. Julien Lefèvre: Conceptualization, Methodology, Software, Supervision, Validation, Visualization, Writing - review & editing. Justine Fraize: Conceptualization, Formal Analysis, Investigation, Methodology, Resources, Software, Validation, Visualization, Writing - original draft, Writing review & editing. Lucie Hertz-Pannier: Conceptualization, Funding acquisition, Supervision, Validation, Writing - review & editing. Monique Elmaleh-Bergès: Data curation, Resources, Writing - review & editing. Richard Delorme: Resources, Writing - review & editing. Yann Leprince: Methodology, Supervision, Validation, Visualization, Writing - review & editing.

#### Keywords

FASD, fetal alcohol spectrum disorder, FAS, fetal alcohol syndrome, FDR, false discovery rate, MRI, magnetic resonance imaging, NDD, neurodevelopmental disorders, NS-FASD, non-syndromic FASD Corpus callosum, fetal alcohol spectrum disorders, fetal alcohol syndrome, Spectral analysis, diagnostic imaging, scaling analysis

#### Abstract

#### Word count: 350

Fetal alcohol spectrum disorders (FASD) range from fetal alcohol syndrome (FAS) to non-syndromic forms (NS-FASD). The neuroanatomical consequences of prenatal alcohol exposure are mainly the reduction in brain size, but also focal abnormalities such as those of the corpus callosum (CC). We previously showed a narrowing of the CC for brain size, using manual measurement and its usefulness to improve diagnostic certainty. Our aim was to automate these measurements of the CC and identify more recurrent abnormalities in FAS subjects, independently of brain size reduction.

We developed a fast, automated, and normalization-free method based on spectral analysis to generate thicknesses of the CC continuously and at singular points (genu, body, isthmus, and splenium), and its length (LCC). We applied it on midsagittal section of the CC extracted from T1-anatomical brain MRI of 89 subjects with FASD (52 FAS, 37 NS-FASD) and 126 with typically development (6-20 y-o). After adjusting for batch effect, we compared the mean profiles and thicknesses of the singular points across the 3 groups. For each parameter, we established variations with age (growth charts) and brain size in the control group (scaling charts), then identified participants with abnormal measurements (<10th percentile).

We confirmed the slimming of the posterior half of the CC in both FASD groups, and of the genu section in the FAS group, compared to the control group. We found a significant group effect for the LCC, genu, median body, isthmus, and splenium thicknesses (p<0.05). We described a body hump whose morphology did not differ between groups. According to the growth charts, there was an excess of FASD subjects with abnormal LCC and isthmus, and of FAS subjects with abnormal genu and splenium. According to the scaling charts, this excess remained only for LCC, isthmus and splenium, undersized for brain size.

We characterized size-independent anomalies of the posterior part of the CC in FASD, with an automated method, confirming and extending our previous study. Our new tool brings the use of a neuroanatomical criterion including CC damage closer to clinical practice. Our results suggest that an FAS signature identified in NS-FASD, could improve diagnosis specificity.

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#### Funding statement

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#### Ethics statements

#### Studies involving animal subjects

Generated Statement: No animal studies are presented in this manuscript.

#### Studies involving human subjects

Generated Statement: The studies involving humans were approved by Paris-Saclay research ethics committee (CER-Paris-Saclay-2020-094). Controls' data were used within the framework of the ethical authorizations of the primary studies (Gene and autism, Inserm C07-33). The studies were conducted in accordance with the local legislation and institutional requirements. The ethics committee/institutional review board waived the requirement of written informed consent for participation from the participants' legal guardians/next of kin because written informed consent from the FASD participants' legal guardian/next of kin was not required to participate in this study in accordance with the national legislation and the institutional requirements. Written informed consent from the control participants'

legal guardian/next of kin was required to participate in the initial study in accordance with the national legislation and the institutional requirements.

#### Inclusion of identifiable human data

Generated Statement: No potentially identifiable images or data are presented in this study.

#### Data availability statement

Generated Statement: The data analyzed in this study is subject to the following licenses/restrictions: The datasets presented in this article are not readily available because the data that support the findings of this study are available on request from the corresponding author. The data are not publicly available due to privacy or ethical restrictions.. Requests to access these datasets should be directed to Justine Fraize, justine.fraize@inserm.fr.

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- Funding information: French National Agency for Research; French National Institute for PublicHealth research
- 28 Abbreviations: FASD, fetal alcohol spectrum disorder; FAS, fetal alcohol syndrome; FDR, false
- discovery rate; MRI, magnetic resonance imaging; NDD, neurodevelopmental disorders; NS FASD, non-syndromic FASD.

# Keywords: Corpus callosum, fetal alcohol spectrum disorders, fetal alcohol syndrome, Spectral analysis, diagnostic imaging, scaling analysis.

### 33 Abstract

#### 34 Introduction

Fetal alcohol spectrum disorders (FASD) range from fetal alcohol syndrome (FAS) to nonsyndromic forms (NS-FASD). The neuroanatomical consequences of prenatal alcohol exposure are mainly the reduction in brain size, but also focal abnormalities such as those of the corpus callosum (CC). We previously showed a narrowing of the CC for brain size, using manual measurement and its usefulness to improve diagnostic certainty. Our aim was to automate these measurements of the CC and identify more recurrent abnormalities in FAS subjects, independently of brain size reduction.

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#### 42 Methods

43 We developed a fast, automated, and normalization-free method based on spectral analysis

44 to generate thicknesses of the CC continuously and at singular points (genu, body, isthmus,

45 and splenium), and its length (LCC). We applied it on midsagittal section of the CC extracted

46 from T1-anatomical brain MRI of 89 subjects with FASD (52 FAS, 37 NS-FASD) and 126 with

47 typically development (6-20 y-o). After adjusting for batch effect, we compared the mean

48 profiles and thicknesses of the singular points across the 3 groups. For each parameter, we

49 established variations with age (growth charts) and brain size in the control group (scaling

50 charts), then identified participants with abnormal measurements (<10<sup>th</sup> percentile).

# 51 Results

We confirmed the slimming of the posterior half of the CC in both FASD groups, and of the genu section in the FAS group, compared to the control group. We found a significant group effect for the LCC, genu, median body, isthmus, and splenium thicknesses (p<0.05). We described a body hump whose morphology did not differ between groups. According to the growth charts, there was an excess of FASD subjects with abnormal LCC and isthmus, and of FAS subjects with abnormal genu and splenium. According to the scaling charts, this excess

remained only for LCC, isthmus and splenium, undersized for brain size.

# 59 Conclusion

60 We characterized size-independent anomalies of the posterior part of the CC in FASD, with an

automated method, confirming and extending our previous study. Our new tool brings the

62 use of a neuroanatomical criterion including CC damage closer to clinical practice. Our results

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#### 64 1 Introduction

65 The diagnosis of fetal alcohol spectrum disorders (FASD) encompasses the pathological 66 consequences of prenatal alcohol exposure, which range from fetal alcohol syndrome (FAS) 67 to non-syndromic, non-specific forms (NS-FASD) (Astley, 2004; Cook et al., 2016; Hoyme et al., 68 2016). The diagnosis of fetal alcohol syndrome (FAS) is determined by a consensual set of 69 clinical features, which include facial dysmorphia, growth retardation, and microcephaly. On 70 the other hand, the diagnosis of non-syndromic fetal alcohol spectrum disorder (NS-FASD), 71 which associate neurodevelopmental disorders with prenatal alcohol exposure, remains 72 probabilistic. The main target of the teratogenic effects of ethanol is the brain, leading 73 individuals with FASD to exhibit not only a smaller brain but also recurrent focal brain 74 abnormalities that are detectable via magnetic resonance imaging (MRI).

75 One of the most commonly reported focal brain abnormalities is the corpus callosum. This 76 large bundle of white matter fibers composed of interhemispheric homotopic axonal 77 projections turns out to be a privileged indicator of the consequences of prenatal alcohol 78 exposure. The last four large radiological description studies reported thinning, hypoplasia, 79 complete or partial agenesis of the corpus callosum in series composed of children either 80 prenatally exposed or with a diagnosis of FASD (Autti-Rämö et al., 2002; Astley, 2004; Boronat et al., 2017; Treit et al., 2020; Fraize et al., 2023c). The prevalence of corpus callosum 81 82 anomalies that are visible to the naked eye, although partly subjective, could approach 3 to 83 10% in the FASD population. Computational neuroimaging has sought to uncover more subtle 84 anomalies or more objective morphometric descriptions. Several studies conducted on 85 subjects with FASD have suggested that the midsagittal corpus callosum area (Riley et al., 86 1995; Sowell et al., 2001; Astley et al., 2009; Dodge et al., 2009; Fraize et al., 2023c), thickness 87 (Yang et al., 2012a), and volume (Gautam et al., 2014; Biffen et al., 2020; Inkelis et al., 2020) 88 may be reduced compared to controls. These changes have also been correlated with the 89 amount of prenatal alcohol consumption (Biffen et al., 2017; Jacobson et al., 2017). In addition 90 to a global reduction in the size of the corpus callosum in FASD, the posterior region appears 91 to be more severely affected in size (Sowell et al., 2001; Dodge et al., 2009; Fraize et al., 2023a) 92 or in shape, resulting in a flattened or misshapen appearance (Sowell et al., 2001; Bookstein 93 et al., 2002). However, these results need to be qualified, because even within the same team, 94 they were not always confirmed. In the study by Yang et al., where three series from different 95 sites were pooled, the thinning on the posterior part initially described (Sowell et al., 2001) 96 was found to be significant in only one sub-group (Yang et al., 2012a). Despite these detailed 97 descriptions, no neuroanatomical criterion referring explicitly to specific anomalies of the 98 corpus callosum have been added to the diagnostic guidelines (Astley, 2004; Cook et al., 2016; 99 Hoyme et al., 2016). Yet, we recently reported the narrowing of the isthmus to be a recurrent 100 anomaly in FAS, using objective manual measurements of callosal thickness and normative 101 scaling analysis (Fraize et al., 2023c). We proposed to integrate it into an explicit compound 102 neuroanatomical marker in the diagnostic decision tree. The ultimate goal is for 103 neuroanatomy to contribute to clinical assessment, especially for subjects with non-104 syndromic forms.

To our knowledge, there is no fully automated reference tool for the measurement of the corpus callosum thickness, let alone automated analysis methods to tag and obtain individual measurements for singular points. Semi-automated measurement tools currently exist. For instance, Luders et al. proposed a technique beginning with manually delineating the corpus 109 callosum on the sagittal midsection manually (Luders et al., 2006a). The upper and lower 110 contours are then differentiated to compute the mean distance and generate the median line. 111 The thickness of the corpus callosum is subsequently derived from this median line and 112 compared at each interval. Following this pioneering study, the approach was implemented 113 in the analysis of correlation with gender, IQ, and attention (Luders et al., 2006b, 2009, 2014; 114 Westerhausen et al., 2011). Adamson et al. proposed another more automated method, albeit 115 still involving human intervention (Adamson et al., 2011). Firstly, the two extremities are 116 manually placed on the contour of the corpus callosum which is automatically generated. 117 These two points are then adjusted to maximize the length of the center line. Subsequently, 118 the center line is divided into 40 points. Finally, the thickness of the corpus callosum is 119 determined by using either the orthogonality to the center line or by applying the Laplace 120 equation. A fully automated method was proposed by Herron et al. based on a series of radial 121 lines emanating from a centroid and intersecting the corpus callosum that are verticalized to 122 unwrap the structure, define a median line and measure thickness (Herron et al., 2012; Li et 123 al., 2017). The process relies on spatial normalization, the measurements being obtained in 124 the Montreal Neurological Institute (MNI) space and transformed back to native anatomical

space by inverting the affine spatial normalization transformation.

126 Regardless of how the thickness profile was obtained in these different studies (Sowell et al., 127 2001; Luders et al., 2009; Yang et al., 2012b; Danielsen et al., 2020), the subsequent analyses 128 and comparisons required normalization into a common space. This normalization step is 129 supported by a hypothesis, not always explicit, about how the callosal thickness varies as a 130 function of the reference, either the full brain or the corpus callosum itself. It is also difficult 131 to anticipate how these post-normalization analyses would accommodate incompleteness of 132 the structure, for instance posterior agenesis for the corpus callosum, in terms of distortions 133 or loss of signal, depending on the choice of normalization or template (Mangin et al., 2016). 134 Normalization-based procedures and the underlying hypotheses are legitimate, but 135 questionable when studying pathological populations with abnormally small brain or high risk 136 of dysgenesis of the studied structure, which is the case with FASD and corpus callosum. At 137 the very least, this encourages strategies of generation and analysis of the corpus callosum 138 thickness profile that minimize the need for spatial normalization, above all spatial averaging, 139 and enable explicit size effect models to be implemented. Indeed, the local size deficits must 140 be interpreted by taking global brain size into account (scaling analysis) with a model that 141 allows proportions to vary with brain size (allometric scaling). The relevance of the power law 142 to describe the phenomena associated with brain size variations is firmly established (Toro et 143 al., 2009; Germanaud et al., 2012; Liu et al., 2014; de Jong et al., 2017; Warling et al., 2021; 144 Fraize et al., 2023b).

145 In this study, we first introduce a new method that is fast and fully automated, based on a first 146 step of spectral analysis of the shape of the corpus callosum, which makes it possible to define 147 and measure a continuous thickness profile at the individual level. We then propose a 148 normalization-free strategy of analysis of this profile based on automatically defined local 149 singular extrema. Lastly, we apply this spectral-based thickness profiling to a series of subjects 150 with FASD and controls. We characterize brain size independent callosal anomalies in a fully 151 automated manner, that were compared with the ones previously manually characterized in 152 the same population (Fraize et al., 2023c).

153 2 Materiel and methods

#### 154 Participants

155 Eighty-nine consecutive subjects with FASD, aged 6 to 20 years, were retrospectively 156 included from a clinical series of patients attending the dedicated child neurology consultation 157 for neurodevelopmental disorders at Robert-Debré University Hospital (RD) between 2014 158 and 2020. FASD diagnosis was established on the basis of the guidelines of Astley (Astley, 159 2004) and a full differential diagnosis work-up was completed, including a systematic brain 160 MRI. Individuals prenatally exposed to another embryo-fetotoxic agent were not included. 161 FASD subjects were split into two groups: the syndromic FAS (including partial FAS) and the 162 non-syndromic ones (NS-FASD). This series and the precise diagnostic procedure have already 163 been described in previous studies (Fraize et al., 2023b, 2023c). Clinical and radiological 164 characteristics of the 52 FAS subjects (58.4%) and the 37 NS-FASD subjects (41.6%) are 165 detailed in Table 1.

One hundred and twenty-six typically developing subjects, aged 6 to 20 years, with no report of PAE, developmental delay or family history of neurological or psychiatric condition (1<sup>st</sup> degree) were included for comparison. A subgroup of 40 subjects was matched with the FASD group for the acquisition site (MRI scanner and sequence) as part of a research program on autism in the RD Psychiatry Department. Other typically developing subjects were part of previously published studies (Germanaud et al., 2014; Bouyeure et al., 2018).

There were no significant differences in the control group compared to the FASD group for sex (50.8% *vs*. 58.4% of males respectively, p=0.334) and age at MRI (12.08 *vs*.11.32 years of age respectively, p=0.116).

	<b>FAS</b> n = 52	<b>NS-FASD</b> n = 37	FASD groups comparison p-value
Sociodemographic assessment			
Sex: male n (%)	27 (51.9)	25 (67.6)	0.209
Age at MRI, mean in years (SD)	10.93 (3.57)	11.88 (3.55)	0.219
Clinical assessment, n (%)			
(1) Prenatal alcohol exposure			
4.Confirmed, severe	21 (40.4)	16 (43.2)	0.959
3.Confirmed, moderate or unquantified	26 (50.0)	19 (51.1)	1.000
2.Not documented	5 (9.6)	2 (5.4)	0.748
1.No exposure	0 (0.0)	0 (0.0)	-
(2) FAS facial features			
4.Severe	31 (59.6)	2 (5.4)	<0.001
3.Moderate	21 (40.3)	1 (2.7)	<0.001
2.Mild	0 (0.0)	30 (81.1)	<0.001
1.None	0 (0.0)	4 (10.8)	0.057
(3) Growth deficiency			
4.Significant	19 (36.5)	3 (8.1)	0.005
3.Moderate	11 (21.2)	2 (5.4)	0.077
2.Mild	9 (17.3)	9 (24.3)	0.586
1.None	13 (25.0)	23 (62.2)	0.001
Brain anatomy			

(4) Structural central nervous system damage	40 (76.9)	19 (51.4)	0.022	
Head circumference (smallest known)				
(4) ≤ - 2 SD: microcephaly	34 (65.4)	13 (35.1)	0.009	

Table 1. Demographic, clinical, radiological data of FASD subjects. FAS: fetal alcohol syndrome;
 FASD: fetal alcohol spectrum disorder; NS-FASD: non-syndromic fetal alcohol spectrum disorder; SD: standard deviation. *In bold, p-values <0.05.*

This study was conducted in accordance with the principles of the Declaration of Helsinki. Subjects' data were studied in accordance with French regulation (MR-004, declaration of conformity n°2059980v0), following approval by the Paris-Saclay research ethics committee (CER-Paris-Saclay-2020-094). Controls' data were used within the framework of the ethical authorizations of the primary studies (Gene and autism, Inserm C07-33, 08-029 and 11-008).

# 184 2.1 MRI data

185 For both FASD subjects and 40 site-matched controls, MRI acquisitions were 186 performed in the Department of Pediatric Radiology of RD Hospital at 1.5T (Ingenia, Philips 187 Healthcare, Amsterdam, the Netherlands) with a 3DT1 FFE-TFE sequence (1 mm isotropic; TR 188 = 8.2ms; TE = 3.8ms; TI = 0.8s; Flip = 8°; SENSE = 2). Another group of 31 controls was acquired 189 at the Frédéric Joliot Hospital (SHFJ, CEA-Saclay) at 1.5T (Signa, GE Healthcare, Milwaukee, US) 190 with a 3DT1 GE FSPGR sequence  $(1x1x1.2 \text{ mm}; \text{TR} = 9.9\text{ms}; \text{TE} = 2\text{ms}; \text{TI} = 0.6\text{s}; \text{Flip} = 10^\circ)$  and 191 a third one of 55 controls subjects on a 3T (Siemens Trio, Siemens Healthineers, Oxford, UK) 192 at NeuroSpin (NS, CEA-Saclay) with a 3DT1 Siemens MPRAGE sequence (1mm isotropic; 193 TR=2.3s; TE = 3ms; TI = 0.9s; Flip = 9°; GRAPPA 2). A visual quality check was systematically 194 performed (JF, DG) to exclude images of insufficient quality.

# 195 2.2 MRI processing

196 *2.2.1 Total brain volume* 

197 The total brain volume was obtained by *volBrain* (Manjón and Coupé, 2016), and was highly 198 correlated (R<sup>2</sup> = 75%) with the previously used proxy of brain size, that is, the axial reference 199 brain surface (**Figure 1, sup. mat.**) (Fraize et al., 2023c).

#### 200 2.2.2 Midsagittal section of the corpus callosum

The mask of the midsagittal section of the corpus callosum was obtained within the *Morphologist2015* framework of *BrainVisa* (<u>https://brainvisa.info/</u>) after oversampling of the T1-weighted images at 0.5 mm isotropic resolution. This section was localized in the interhemispheric plane by intersecting the white matter mask with the midsagittal plane in the Talairach space. The mask was checked systematically for any obvious segmentation error that could be manually corrected (**Table 1, sup. mat.**).

#### 207 2.2.3 Spectral analysis of the shape using the Fiedler vector

From the mask of the midsagittal section of the corpus callosum, we built a 26-connectivity graph. To do so, we considered the 3D points from the one row of voxel of the mask and added 210 edges among the 26 possible neighbors if belongs to mask. We used the Fiedler vector of this 211 graph, the first non-trivial eigenvector of the Laplacian matrix, to compute a quasi-isometric 212 parameterization (Lefevre et al., 2012; Coulon et al., 2015). This mathematical tool tracked 213 the main elongation vector and identified extremal points. We added a simple algorithm to 214 reposition the rostrum so that its position is correct (see details in **sup. mat. Figure 2**). The 215 Laplacian graphs were perturbed to create a 'new' Fiedler vector that followed the correct 216 elongation (Lefèvre et al. 2023). From this 'new' Fiedler vector, we calculated isolines 217 (equivalent value). Then, regular bins were defined between the min and max values of the 218 Fiedler vector. It provided slices of the shape, of irregular width. The barycenter of each slice 219 was computed to form the midline (see the irregularly spaced red dots on the **Figure 1**). From 220 this midline and reparametrized vector, we obtained new isolines and slices of constant and 221 regular thickness. Using PCA within each slice, the main direction, roughly orthogonal to the 222 median line, was used to extract regular thicknesses. We finally obtained a map of the corpus 223 callosum thickness on regularly and optimally spaced slices (between 50 and 80) following the 224 longitudinal orientation of the shape. The code used to perform spectral analysis of the corpus 225 callosum midsagittal section is released on

226 <u>https://github.com/JulienLefevreMars/CorpusCallosumParameterization</u>.

#### 227 2.2.4 Thickness profile and singular points

228 The first parameter of interest extracted was the length of the corpus callosum (LCC) obtained 229 from the length of the curvilinear abscissa between the two extreme points. Then, we targeted 230 the local singular extrema on the continuous thickness profile curve fitted with cubic 231 smoothing spline (smooth.spline() R function). The smoothing parameters were set at the 232 same level for each subject. Spar is the smoothing parameter controlling the trade-off 233 between fidelity to the data and roughness of the function estimate. It is derived from the 234 lambda parameter, scaled between 0 and 1. Here, we fixed the spar parameter at 0.4. To 235 characterize the morphology of the corpus callosum, radiologists and clinicians usually 236 measure the thickness of the genu at the thickest point anteriorly, the body (local thickness), 237 the isthmus at the thinnest point posteriorly and the splenium at the thickest point 238 posteriorly)(Garel et al., 2011; Fraize et al., 2023c). From the thickness profiles, we extracted 239 the positions and the thicknesses of the genu (GT) and the splenium (ST), the local maximums 240 of the two extremities, and of the isthmus (IT), the local minimum between these two points. 241 In addition, we looked for localized thickening, a hump, within the body (Figure 1). As the amplitude of this thickening could potentially be small and to make sure that it was 242 243 independent of curve smoothing variations, we sought it on the thickness profile curve 244 between the genu and the isthmus, by varying the level of smoothing (10 levels in addition to 245 the one initially chosen, from 0.2 to 0.7). To locate the body hump, we identified the local 246 maximum(s) whose position was consensual on the curvilinear abscissa on more than 8 of the 247 smoothing levels. We extracted the body hump thickness (BHT) or the mean thickness if there 248 were several humps (no more than two). We also extracted the median of the thicknesses 249 between the genu and the isthmus, as the median body thickness (MBT). All these processing 250 steps are summed up in Figure 1.

- 251 These length and thickness parameters were correlated with available gold standard manual
- 252 measures using the PACS measurement tools (Carestream, New York, NY, USA) (Fraize et al.,
- 253 2023c) by establishing the coefficient of determination  $R^2$  and the mean percentage error

254 (MPE= mean of the difference between manual and automated measurements divided by 255 manual measurement).



256

257 Figure 1. Pipeline to obtain the thickness profile for each subject and identify the points of

- 258 interest: the genu, the body hump (\*see details in the text and in Figure 3), the isthmus and 250 the colonium
- the splenium.

#### 260 2.3 Modeling and statistical analysis

261 Statistics were performed using R Project for Statistical Computing (RRID:SCR\_001905), with 262 a 5% alpha risk. A False Discovery Rate (FDR) method was systematically applied to correct for 263 multiple comparisons (Benjamini and Hochberg, 1995) at each analysis step (all parameters 264 together). Group differences in clinical characteristics and parameters were evaluated using 265 two-sample *t*-tests for continuous variables, and a Chi-square test for categorical variables, 266 ANOVA for group effect. To assess the normality assumption of the t-tests and the ANOVA, 267 we first performed the Kolmogorov-Smirnov test for each of the 3 groups, and the p-values 268 were not significant for any of the groups. A p-value is significant when the data do not appear 269 to be normally distributed.

270 Since the data were acquired on 3 sites, we adjusted for batch effect prior to analyses using 271 ComBat, a method based on an empirical Bayes framework (Johnson et al., 2007; Fortin et al., 272 2018), integrating into the model sex, age, and diagnosis as covariates to be spared, 273 considering their possible interaction (Table 3, sup. mat.). We then performed unifactorial 274 group comparisons between FASD and controls knowing that these groups were matched for 275 age and sex. First we compared the whole thickness profile after rigid length normalization to 276 provide a continuous quantitative comparison of the radiological aspect of the corpus 277 callosum. Second, we compared the five parameters previously defined (callosal length and 278 the thickness of the 4 singular points). Lastly, we implemented clinically inspired normative 279 analysis to provide an individual-based comparison of these five parameters, accounting for 280 two major covariates i.e., age and brain size: first a normative growth analysis (age) then a 281 normative scaling analysis (brain size).

# 282 2.3.1 Unifactorial group comparison

283 We compared the thickness profiles of the controls with those of the two FASD groups. After 284 rigid spatial normalization in the curvilinear abscissa axis, we oversampled thicknesses along 285 this normed axis (n = 100) then adjusted for site effect. We studied the effect of FASD, using 286 a linear mixed model considering diagnosis (controls vs. FAS or NS-FASD) as a fixed effect and 287 random effect for each subject to account for subject-specific variability. Nonparametric 288 cluster-based permutation analyses were carried out using a method inspired by EEG-MEG 289 analysis to locate and group zones of significantly different thicknesses for spatial consistency 290 (originally, time-points with temporal consistency in EEG signals), considering corrections for 291 multiple comparisons (Maris and Oostenveld, 2007). Significance probability was calculated 292 using the cluster-mass statistic (cluster-forming alpha = 0.05, randomizations = 1000).

#### 293 2.3.2 Normative analyses

To define the growth curves, the relationships between measured parameters (LCC and thicknesses at singular points adjusted for site effect) and age were modelled in the control group. We applied a general additive model considering homoscedasticity over the age range to fit the model and obtain percentiles of the distribution (Wood and Fasiolo, 2017; Dinga et al., 2021).

To define the scaling curves, the relationships between measured parameters (P) and brain size (total brain volume, TBV) were modelled in the control group, by a power law with scaling coefficient a and constant b (P = b × TBV<sup>a</sup>) to take into account expected allometric effects

- 302 (changes in proportions with size) (Liu et al., 2014; de Jong et al., 2017; Warling et al., 2021).
- 303 Using bootstrap resampling and empirical quantiles, we obtained the unbiased prediction
- intervals (90<sup>th</sup> and 10<sup>th</sup> percentiles) (Guenther, 1971; Lee and Scholtes, 2014).

For each parameter, FASD subjects with measurements below the 10<sup>th</sup> percentile curve were counted as normatively too small for age or for brain size. An abnormality was considered recurrent when the number of too-small measurements in the FAS or NS-FASD group exceeded the theoretically expected 10% of the individuals (binomial test).

309 3 Results

# 310 **3.1** Identification of singular points

311 The method was successfully applied to all subjects. For the two FAS subjects with posterior

- agenesis and the one with an obvious posterior thinning, the thickness profile was also
- extracted and analyzed (**Figure 2**). They were not included for further analysis as they were
- obvious outliers with missing singular points.





Figure 2. Application of the method on the three FAS subjects with partial agenesis (A, B) or
with too thin corpus callosum (C), which could also be considered as a very posterior
agenesis of the splenium. Note that our method detects the longest elongation and allows us
to obtain thicknesses by slice. On the other hand, detection of singular points was not possible.

From the thickness profiles, we were able to identify for each subject the position and thickness of the genu, isthmus and splenium automatically.

We divided the subjects into 4 types to define the presence or not of the body hump. In type 1, the position of the body hump was obvious and consensual for all smoothing levels, accounting for 78 subjects (36.8%). In type 2, the position of the body hump was obvious and consensual for more than 8 smoothing levels, accounting for 70 subjects (33.0%). In type 3, two body humps were obvious and consensual for more than 8 smoothing levels, accounting for 30 subjects (14.2%). In type 4, no body hump was identified, accounting for 34 subjects (16.0%) (**Figure 3**).



Type of body hump



Figure 3. Body hump identification. Example of subject by group, variation of smoothing level to identify local maximums. First row: T1 anatomical image with location of the hump (orange arrow). Second row: the corpus callosum mask on sagittal midsection. Third row: Fiedler vector value (posterioranterior gradient from 0 to 1). Fourth row: slice thickness (scaled gradient from red greatest to smallest blue thickness). Fifth row: thickness profile as a function of position along the curvilinear abscissa. Variation in smoothing level (colored curves) and position of local maximums between genu and isthmus, from lowest smoothing level (bottom dark purple point) to highest (top light-yellow point). Type I: position of the body hump obvious and consensual for all smoothing levels. Type 2: position of the body hump obvious and consensual for more than 8 smoothing levels. Type 3: two body humps obvious and consensual for more than 8 smoothing levels. Type 4:

no body hump. Distribution of types by group: control (C) and FASD (FAS and NS-FASD). Comparison of proportion of type between groups. ns: f not significant, p-value <0.05; p-values were adjusted for multiple comparisons using the FDR method.

329 The BHT was thus only considered for type 1, 2 and 3 subjects (n=178).

The measurements obtained by our method were strongly correlated ( $R^2 > 50\%$ ), with the gold standard of manual measurements, the most highly correlated being that of the LCC ( $R^2 = 90.3$ %) (**Figure 4**). For this measurement, the error was minimal (mean percentage error MPE=1.6%). This error was moderate for the isthmus, genu and splenium but systematically underestimated (positive MPE < 15%). The manual location for the body thickness measurement (at the central point) did not directly correspond to the measurements collected in the current study, resulting in larger MPE (~ 20%).





Figure 4. Comparison with manual measurements. Top left: number of subjects (n), 338 339 coefficient of determination ( $R^2$ ), mean percentage error (MPE= mean of the difference between manual and automated measurements divided by manual measurement), 340 341 correlation line 1 to 1 in grey dotted line. Note that, n=181 corresponds to the total number 342 of subjects who had manual measurements in the previous study (Fraize et al., 2023c, 343 excluding the subgroup of 3T controls), n=146 corresponds to the total number of subjects 344 who had manual measurements in the previous study and had hump with type 1, 2, 3. 345 Agenetic subjects were excluded.

#### 346 3.2 Control and FASD comparison

# 347 **3.2.1** Unifactorial comparison of thickness profiles

348 Comparing the thickness profiles of control and FAS subjects after rigid length normalization,

349 we identified two significantly different sections, one around the genu and one consisting of

350 the whole posterior half but with a peak in effect size in the anterior part of the splenium. For

NS-FASD, the zone of significance was less extended, and limited to the posterior half (Figure5).



353

**Figure 5. Comparison of the thickness profiles.** First row: mean profile of the control group in black (n=126), the FAS group in red (n=52), the NS-FASD group in orange (n=37), after rigid length normalization. Second row: cluster of significantly different thicknesses (controls *vs*. FAS in red or NS-FASD in orange, p-value of cluster mass statistic < 0.05, including adjustment

358 for multiple comparisons). Third row: effect size (t-statistic of the linear mixed model).

# **359 3.2.2** Unifactorial comparison of length and thickness of singular points

There was no significantly different proportion of body hump type between the FASD group and the control group. The distribution of types by group is detailed in **Figure 3**.

A significant group effect was found for the length of the corpus callosum, the genu, the median body, the isthmus, and the splenium thicknesses. The difference between the control group and the FAS group was significant for all parameters. The difference between the control group and the NS-FASD group was significant only for the length of the corpus callosum and the isthmus thickness (p<0.05) (**Figure 6**).



367

368 Figure 6. Comparison of length and thicknesses of singular points. Group effect (control, FAS

and NS-FASD) on ANOVA. Top bracket, p-value of t-test of controls versus FAS or NS-FASD. ns: p > 0.05, \*:  $p \le 0.05$ , \*\*:  $p \le 0.01$ , \*\*\*:  $p \le 0.001$ , \*\*\*\*:  $p \le 0.0001$ . p-values were adjusted for multiple comparisons using the FDR method.

#### 372 3.3 Normative analysis

# 373 3.3.1 Growth charts

374 There was an excess of FASD subjects below the 10<sup>th</sup> percentile for age for the length of the

375 corpus callosum, the isthmus, and only for FAS subjects for the genu and the splenium (p<0.05)</li>
376 (Figure 7).



377

Figure 7. Growth charts for length of the corpus callosum (LCC), the genu (GT), the isthmus (IT), the body hump (BHT), the median body (MBT), and the splenium (ST) thicknesses. Number of fetal alcohol spectrum disorder subjects under the 10<sup>th</sup> percentile (p-value of binomial test, p-values were adjusted for multiple comparisons using the FDR method). Controls in grey, FAS in red, NS-FASD in orange. The 95, 90, 10 and 5<sup>th</sup> percentiles are represented in dotted lines.

#### 384 3.3.2 Scaling charts

There was an excess of FAS subjects below the 10<sup>th</sup> percentile for brain size for the length of the corpus callosum, the isthmus, and the splenium (p<0.05). NS-FASD subjects were not overrepresented below the 10<sup>th</sup> percentile for brain size (p>0.05) (**Figure 8**).



Figure 8. Scaling charts for length of the corpus callosum (LCC), the genu (GT), the isthmus (IT), the body hump (BHT), the median body (MBT), and the splenium (ST) thicknesses. Number of fetal alcohol spectrum disorder subjects under the 10<sup>th</sup> percentile (p-value of binomial test, p-values were adjusted for multiple comparisons using the FDR method.). Controls in grey, FAS in red, NS-FASD in orange. The 95, 90, 10 and 5<sup>th</sup> percentiles are represented in dotted lines.

#### 394 4 Discussion

395 In this study, we introduce the first fully automated, normalization-free, fast method to 396 produce and analyze the thickness profile of the corpus callosum. We applied it to the 397 morphometric comparison of 89 subjects with FASD to 126 typically developing controls, aged 398 between 6 and 20 years old. We were able to show an apparent downsizing of the corpus 399 callosum both in length and thickness in FAS, predominating in the posterior half and less 400 pronounced in NS-FASD. We established that a recurring abnormal undersizing was observed 401 in FAS only for the length and the isthmic and splenial thicknesses when controlling for brain 402 size. Thus, these results with a new and convenient automated method not only replicate, but 403 also extend our previous results with manual measurements including the same dataset, that 404 were only able to show recurrent isthmic anomaly (Fraize et al., 2023c).

#### 405 4.1 Confirmed and newly revealed differences between FASD and controls

#### 406 4.1.1 What can be observed on native measurements?

407 After rigid linear normalization and adjustment for site, native thickness profiles showed 408 extensive but not homogeneous thinning of the corpus callosum in FASD. It was reduced in 409 the posterior half section in both FAS and non-syndromic FASD subjects and reduced in the 410 genu section only in FAS subjects (**Figure 5**). The rigid anteroposterior deformation 411 coarsely aligns the thickness profiles of each subject, enabling an initial average assessment 412 of what is visible to the radiologist in this population. It points to the posterior zone with a 413 possible additional damage of the genu in FAS and lower severity in NS-FASD.

414 Considering the native thickness of the four singular local extrema (genu, body hump, isthmus, 415 and splenium), we observed significant differences between the FAS and the control groups 416 for all these extrema and between the NS-FASD and the control groups for the isthmus only 417 (Figure 6). However, the effect on body thickness appeared much smaller, and was not 418 significant when the 3 groups were compared together (ANOVA). In addition, we showed no 419 impact of FASD on body hump morphology, since there was no significant difference in the 420 proportion of body hump type between groups (p<0.05) (Figure 3). A recent study has evoked 421 and dismissed the over-representation of "notching" among subjects with FASD (Schneble et 422 al., 2020), in the medico-judicial context of FASD recognition, but using a very qualitative 423 assessment. Our results are consistent with the fact that the body and its possible hump(s) 424 are spared from callosal thinning in FASD, which may be seen as clinically relevant per se.

425 We also showed that the overall length of the corpus callosum was reduced (p<0.001) on 426 average, with no other adjustment than site effect, in both NS-FASD and FAS (Figure 6). All 427 these results are consistent with previous studies describing a smaller corpus callosum (Riley 428 et al., 1995; Sowell et al., 2001; Astley et al., 2009; Biffen et al., 2017; Jacobson et al., 2017; 429 Fraize et al., 2023c) and pointing out the posterior part as the most affected one (Sowell et 430 al., 2001; Yang et al., 2012a; Fraize et al., 2023a). Yet, even if our FASD and control groups 431 were matched for age and sex, there were inherent differences in brain size, both age and size 432 having potentially nonlinear effects to be accounted for in further analyses.

433 4.1.2 What remains at the individual level after independent control of major covariates?

434 Since birth, the shape of the corpus callosum changes as revealed by morphometric 435 parameters (Rajapakse et al., 1996; Westerhausen et al., 2011; Herron et al., 2012). Within 436 the increasingly promoted and clinically relevant framework of normative analyses, we 437 proposed to take age into account on the basis of developmental growth charts derived from our typically developing control sample. We found FAS-recurrent anomalies (excess of FAS 438 subjects below the 10<sup>th</sup> percentile) for the LCC, the genu, the isthmus, and the splenium 439 440 thicknesses (Figure 7). This means that considering the age effect did not modify our previous 441 description of the large downsizing of the corpus callosum both in length and thickness in FAS, 442 predominating in the posterior half and in the genu. This minor effect of age on the 443 measurements is consistent with asymptotic linear low (length, splenium) or null (other 444 thicknesses) residual growth of the corpus callosum after 6 years already described in the 445 typically developing pediatric population (Garel et al., 2011; Fraize et al., 2023c).

446 In the FASD population with brain growth deficiency (Archibald et al., 2001; Astley et al., 2009; 447 Rajaprakash et al., 2014; Treit et al., 2016; Boronat et al., 2017), brain size must be properly 448 considered when interpreting other neuroanatomical measurements. Thus, to describe the 449 reduction of the corpus callosum measurements observed in FASD at the individual level, we 450 added to the classical normative analysis on growth charts (effect of age) the analysis on 451 scaling charts (effect of size). We ensured that the scaling model fitted in the control group 452 correctly projected to the smaller FASD range of brain sizes by using a biomathematical model 453 that captures the gradual change in proportions along size range. This allometric scaling was 454 modelled by a power law whose relevance and interest have been widely argued and 455 documented (Germanaud et al., 2014; Liu et al., 2014; de Jong et al., 2017; Warling et al., 456 2021). It is already used in anatomical descriptions of the corpus callosum in newborns (Lewis 457 et al., 2022). Hence, using allometry-sensitive scaling charts to account for brain size effect, 458 we showed that thinning (below the 10<sup>th</sup> percentile) remained recurrently abnormal in FAS 459 only for the isthmus and the splenium thickness (Figure 8). We additionally showed a 460 significant excess of FAS subjects with undersized total LCC for their brain size (Figure 8). So, 461 we confirmed and extended the results of our previous study (Fraize et al., 2023c), by adding 462 both brain size independent anterio-posterior length and splenium thickness impairments to 463 that of the isthmus. This involvement of the splenium is also consistent with our previous 464 findings showing a reduction of its posterior half surface independent from hemispheric size 465 (cortical surface) in a subsample of subjects (Fraize et al., 2023a).

466 These new findings may be explained by the greater number of controls (n=126 vs. 94), the 467 more reliable estimate of brain size (total brain volume vs. surface of a reference brain area), 468 the more elaborate model of regression and the more robust assessment of percentiles (Fraize 469 et al., 2023c). The addition of the ComBat batch effect adjustment could also have improved 470 sensitivity (see Table 2, sup. mat.). Previously, there was no significant site effect to be 471 corrected in the manual measures (Fraize et al., 2023c). In this case, post hoc analyses without 472 adjustment for batch effect showed no difference in the present results (data not shown). It 473 is also possible and a reasonable assumption that automated measurement of thickness of 474 the splenium is more accurate and less noisy, enabling more discriminating statistical 475 comparison.

#### 476 4.1.3 Potential neuroanatomical markers of FASD in corpus callosum

We did not find any size-independent recurrent anomalies taken one by one in our small NSFASD subgroup. But for these subjects we have already proposed a perspective of cumulative
diagnostic probability for diagnostic improvement (Fraize et al., 2023c). Arguably, the
likelihood of the causal link with alcohol exposure increases for NS-FASD subjects with one or
more anomalies found to be recurrent in FAS in the final scaling analysis (LCC, IT, ST, in Figure
8). In this case, these new results in FAS could provide additional diagnostic arguments and
ease the way to more confident diagnoses in certain subjects presenting FASD without FAS.

484 Yet, the posterior damage of the corpus callosum with preservation of the body is probably 485 not specific to FASD, as callosal anomalies are not rare in the general (Glass et al., 2008) nor 486 in the neurodevelopmentally disabled population (Jeret et al., 1985). But we have already 487 argued that the entire corpus callosum morphology could constitute a radiological signature 488 likely to increase diagnostic certainty, particularly in NS-FASD. Moreover, other focal neuroanatomical anomalies such as cerebellar damage (O'Hare et al., 2005; Cardenas et al., 489 490 2014; Sullivan et al., 2020; Fraize et al., 2023b) or deep grey nuclei volume reduction (Nardelli 491 et al., 2011; Roussotte et al., 2012; Nakhid et al., 2022), should also be considered in a 492 composite, multidimensional neuroanatomical score reflecting fetal alcohol-induced brain 493 dysmorphia.

#### 494 4.2 New method for analyzing the shape of the corpus callosum

495 Our new method for corpus callosum shape analysis was developed to automatically detect 496 the anterior point of the rostrum and decide on a posterior point of the splenium. It is 497 advantageous over the existing ones because it does not require human intervention (Luders 498 et al., 2006b; Adamson et al., 2011) and does not involve spatial normalization (Herron et al., 499 2012). In its current state, only the existence of a rostrum is considered. Our method is based 500 on the maximum elongation of this two-dimensional shape, so it can accommodate any 501 posterior shape of the corpus callosum. The three cases of agenesis or incomplete corpus 502 callosum prove that this method is robust to variation of corpus callosum shape, even 503 pathological (Figure 2), at least posterior ones. In these agenetic cases, we did not integrate 504 the detection of singular points, which are not consensual and would require human 505 supervision. For all subjects, this method produced continuous thicknesses along the entire 506 length of the corpus callosum, and unequivocally detected singular local extrema at singular 507 points (the genu, the hump of the body, the isthmus, and the splenium). Extracted thickness 508 measurements were highly correlated with the gold standard manual measurements (Figure 509 4), despite a small to moderate underestimation (MPE<+15%). The two methods deal with 510 partial volume effects on the edges differently. The manual process relies on the visualization 511 smoothing included in the PACS viewer that could potentially biased the eye of the expert. 512 The automated one relies on the segmentation of the mask of the corpus callosum – based on 513 the contrast between grey matter, white matter and CSF – providing a skinnier or even eroded 514 profile, logically resulting in a higher MPE for small measures than for large ones (genu, body, 515 isthmus). Bear in mind that noise could also be induced by inaccuracy of the thinnest 516 measurements close to the resolution of the oversampled mask (0.5 x 0.5mm). Finally, even if 517 manual measurement is the gold standard, the automated method may be more objective, 518 reproducible, and less sensitive to global brain shape variation.

519 The first step, i.e., producing the mask of the corpus callosum on the sagittal section, may 520 seem trivial but is in fact a decisive one. In our pipeline, this step was based on robust 521 intensity-based *Morphologist* segmentation bricks, but a quality check was systematically 522 performed, and manual corrections were sometimes necessary. Our method could benefit 523 from the use of other software able to provide the 2D voxel-based mask, for example 524 Freesurfer (actually 3D) or any new and specific methods (Adamson et al., 2014; Herrera et al., 525 2022), without modifying the subsequent steps. Ultimately, although not all steps are 526 encapsulated and seamlessly connected, our new tool offers the advantage of having 527 extremely short and computationally inexpensive steps. As a result, the cumulative 528 computation time per subject to generate numerical parameters is less than 5 minutes.

529 On a methodological aspect, the correction of the Fiedler vector to reposition the rostrum is 530 an example of partially-supervised information (a priori-based) in an otherwise unsupervised 531 context (Lefevre et al., 2023). It may be possible in the future to add other kinds of 532 information, of various kinds (lines), to add constraints on the Fiedler vector or more generally 533 on the Laplacian modes. More broadly, the developed methodological tool based on the 534 Fiedler vector opens the way to other fields of characterization of the shape of the corpus 535 callosum, such as the circularity, the surface per slice, or deformation per section, which could 536 be the object of further study (Coulon et al., 2015; Walsh et al., 2019).

537 For now, as far as we know, this is the only fully automated method without any human 538 intervention and normalization step for obtaining corpus callosum thicknesses. In fact, its use 539 could go far beyond FASD and be applied in other pathologies where the morphology of the 540 corpus callosum needs to be described.

541 4.3 Translating to daily clinical practice

542 In this study, we aimed to establish an analysis protocol that would ultimately be compatible 543 with translation to clinical practice. The ultimate goal is to switch from manual measurements, 544 which may be imprecise and noisy if non-expert, to secure computational automated and fast 545 measurements, which could be facilitated by a computer interface. The proposed tool and 546 analysis protocol should be acceptable in clinical practice because the produced 547 measurements correspond to those already made in clinical settings (Garel et al., 2011; 548 Ambrosino et al., 2022; Fraize et al., 2023c), and because their anatomical positioning is 549 probably more objective. Acceptability should also be promoted by the fact that it leads to a 550 normative analysis and therefore to categorial (normal, abnormal) information at the 551 individual level.

552 Based on easy-to-use scaling charts and a proper biomathematical scaling model, we propose 553 a method for detecting subject-level abnormalities, even with the partial overlap of brain size 554 between patients and controls. However, the choice of reference population and adequacy of 555 the control group raise questions. Our study included 126 typically developing individuals 556 matched for age and sex, with no prenatal exposure. The automated segmentation, profiling, 557 and singular local extrema detection enable the use of large imaging databases to establish 558 more reliable charts, potentially stratified by age and sex. Despite the need to address site 559 effects, our results show that a population of over a hundred controls currently allows for the 560 establishment of informative normative charts.

561 4.4 Identification of a singular thickening of the body section in the general population

562 Our method leads to the description of a possible anatomical particularity of the corpus 563 callosum, in FASD and more generally in healthy subjects. We identified a local thickening of 564 the body section, either single (~70%) or double (16%) in most of the subjects (Figure 4). This 565 local maximum of the thickness profile between the genu and the isthmus was automatically 566 identified by using multi-scale-smoothed profiles inspired by scaled space implementation 567 detecting robust maxima through a range of smoothing levels. This is almost equivalent to 568 applying an amplitude limit without having to quantify the hump in mm in subjects with 569 varying CC sizes. The literature on this morphological feature in the general population is 570 sparse (Krause et al., 2019; Simpson et al., 2020). Krause et al., reviewed MR images of the 571 corpus callosum of over 1,600 healthy subjects and denominated concavities in the dorsal 572 surface "undulations" and "notching". They found 50% of subjects with one notch and around 573 10% with two, and therefore possibly equivalent proportions of localized thickening.

We decided to add the median of the body thickness for all subjects, to compensate for the lack of consensus on the actual existence of this hump and the absence of an exact definition for the location of the body thickness measurement (Garel et al., 2011),. This corresponds to the median value of the thicknesses on the section between the genu and the isthmus. Although it was somewhat arbitrary, it correlated well with the manual measurement (R<sup>2</sup> = 61%). In practice, and even if this is a finalist argument, the results were ultimately consistent between the two measures.

#### 581 **4.5** Other limitations and future directions

One limitation of the proposed modeling for analyses is the lack of consideration for the effect 582 583 of sex (Ardekani et al., 2013; Lewis et al., 2022). We made this choice on the hypothesis that 584 the downsizing of the control sample by a factor of two to establish sex specific charts would 585 have lowered the statistical power of our study too much. We would have increased the risk 586 of missing results, even with a reduced residual variance due to better adequacy of the 587 modeling. It is a questionable choice that we also made and argued for our previous study, 588 showing that results were almost unaffected (meaning that with this population size, the two 589 choices may probably be equivalent). Yet as mentioned previously, with larger databases 590 being available, it will be more efficient, even with clinical applications in mind, to establish 591 differentiated female/male referential charts. It could also very well lead to the description of 592 differential FAS-related abnormalities and markers between males and females (Chen et al., 593 2011; Zhou et al., 2018; Little and Beaulieu, 2020; Treit et al., 2020).

594 The limitations associated to our cohort of FASD subjects are multiple: retrospective data, 595 absence of quantitative data on the level of exposure, over-representation of FAS subjects. 596 But we would like to confirm, since this is not possible or recommended in all countries, that 597 in our practice, brain imaging is systematic. There is no predictable bias in severity or clinical 598 representation related to MRI availability.

599 5 Conclusion

600 Our study is the first to propose a fully automated tool to assess the corpus callosum thickness 601 profile along its curvilinear abscissa and analyze it through the identification of 4 singular 602 points. We used it to describe the callosal damage in a large cohort of FASD. We confirmed 603 the excessive thinning of the isthmus for brain size. We revealed the global excessive 604 shortening of the corpus callosum and thinning of the splenium for brain size to be recurrent

- anomalies in FAS subjects. The introduction of this tool in clinical practice is at hand and our
- 606 study completes the knowledge on FASD callosal damage and reinforces the conviction that a
- 607 neuroanatomical signature of FAS could be searched for in NS-FASD to improve the specificity
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**882** Figure 1. Correlation between the two proxies of brain size, the total brain volume from

Volbrain and the axial reference brain area (measurement previously described in Fraize et al.,
 2023c. Top left, R<sup>2</sup> coefficient of correlation. Controls in grey, FAS in red, NS-FASD in orange.

# Algorithm for repositioning the rostrum in optimal position

(posterior point of the lower third of the first quarter, in reference where the maximum elongation was observed)



Thickness by slice

Quantification of the distance between initial rostrum position and the reparametrized extremity(D<sub>f</sub>, mm) and comparison by group.

	Well positioned D <sub>f</sub> =0	Short repositioning D <sub>f</sub> <6.4	Large repositioning D <sub>f</sub> >6.4
Total (n=213)	138 (64.8%)	26 (12.2%)	49 (23.0%)
Controls (n=126)	93 (73.8%)	7 (5.6%)	26 (20.6%)
FASD (n=87)	45 (51.7%)	19 (21.8%)	23 (26.4%)
Comparison %control <i>vs</i> . FASD	p=0.002	p=0.001	p=0.410

D<sub>f</sub> of control and FASD, *Control in grey FASD in red* Threshold 6.4 in dotted line



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**Figure 2.** Algorithm for repositioning the rostrum in optimal position.

887	Table 1. Manual cori	ection of the l	mask of the cor	pus callosum by group.
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	FAS	NS-FASD	Controls
	n = 52	n = 37	n = 126
Manually corrected	30.8%	32.4%	62.7%

#### 888

#### 889 Table 2. Effect of scanner, age, and sex on raw measured parameters in the control group.

	Age effect	Sex effect	Scanner effect
	pª	pa	pª
Length of the corpus callosum	0.009	0.043	0.033
Genu thickness	0.659	0.186	0.022
Body hump thickness	0.659	0.015	0.021
Body median thickness	0.659	0.010	0.002
Isthmus thickness	0.058	0.001	0.001
Splenium thickness	0.001	0.036	0.450

890 Multivariate linear regression.

891 Bold type, p<0.05, after FDR correction.

892 <sup>a</sup> *p*-value from the generalized linear model including scanner, age, and sex as covariates for

893 each parameter measured.

#### 894 Table 3. Percentage change due to site effects correction per Combat.

	Correction (%)
Length of the corpus callosum	-0.09
Genu thickness	0.31
Body hump thickness	-3.06
Body median thickness	0.45
Isthmus thickness	0.71
Splenium thickness	0.07

895 Correction = mean of (corrected value - native value)/ native value, expressed as a percentage









Mean thickness profiles by group









Type of body hump

