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Individual differences in GABA content are reliable but are not uniform across the human cortex

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22 **Abstract**

23 ¹H magnetic resonance spectroscopy (MRS) provides a powerful tool to measure gamma-
24 aminobutyric acid (GABA), the principle inhibitory neurotransmitter in the human brain.
25 We asked whether individual differences in MRS estimates of GABA are uniform across
26 the cortex or vary between regions. In two sessions, resting GABA concentrations in the
27 lateral prefrontal, sensorimotor, dorsal premotor, and occipital cortices were measured in
28 twenty-eight healthy individuals. GABA estimates within each region were stable across
29 weeks, with low coefficients of variation. Despite this stability, the GABA estimates
30 were not correlated between regions. In contrast, the percentage of brain tissue per
31 volume, a control measure, was correlated between the three anterior regions. These
32 results provide an interesting dissociation between an anatomical measure of individual
33 differences and a neurochemical measure. The different patterns of anatomy and GABA
34 concentrations have implications for understanding regional variation in the molecular
35 topography of the brain in health and disease.

36

37 **Keywords:**

38 Individual differences; GABA; Magnetic resonance spectroscopy; Cortex; Molecular
39 Topography; Inhibition

40

41

42 **Introduction**

43 Immunohistochemical, enzymatic, chromatographic and radioreceptor assays in humans
44 and non-human species have demonstrated that γ -aminobutyric acid (GABA)
45 concentrations vary across brain regions (Baxter, 1970). The initial work on this problem,
46 performed predominantly *ex vivo*, helped establish GABA's role as the primary inhibitory
47 neurotransmitter in the vertebrate brain. Recent studies have focused on the local
48 distribution of GABA receptor subtypes (Watanabe et al., 2002), including genetic
49 contributions to the molecular topography across the entire brain (Hawrylycz et al., 2012).
50 While this work has characterized synaptic GABA mechanisms and suggests that gene
51 transcription is relatively homogenous throughout the neocortex, an open question
52 concerns whether individual differences in GABA levels are uniform throughout the
53 cortex or are region-specific. The answer to this question is important for understanding
54 GABA's role in mediating widespread versus local brain functions.

55 *In vivo* ^1H magnetic resonance spectroscopy (MRS) measures metabolite
56 concentrations, including GABA, with sufficient sensitivity to detect individual
57 differences. To date, three studies have assayed different regions and reported that GABA
58 levels were not correlated between brain regions (Boy et al., 2010; Grachev and Apkarian,
59 2000; Grachev et al., 2001). However, these studies did not assess measurement
60 reliability, a prerequisite for investigating individual differences. Consequently, the lack
61 of relationships between brain regions in these studies could arise from inter-regional
62 differences in measurement reliability.

63 To evaluate the spatial scale at which GABA levels are mediated in the brain, we
64 obtained Mescher-Garwood point-resolved spectroscopy (MEGA-PRESS) measurements

65 of GABA from the lateral prefrontal (LPF), sensorimotor (SM), dorsal premotor (PMd),
66 and occipital (OCC) cortices. Measurements were made during two separate sessions,
67 approximately two weeks apart, to assess reliability (Bogner et al., 2010; Evans et al.,
68 2010; Geramita et al., 2011; Near et al., 2014; O'Gorman et al., 2011; Stephenson et al.,
69 2011). These measurements were combined across the two sessions and used to compare
70 GABA estimates between regions. As a point of contrast, we compared brain tissue per
71 volume between the same four measurement regions. This measure and a coregistration
72 procedure were used to assess the reliability of voxel positioning across sessions.

73

74 **Materials and methods**

75 *Participants*

76 Twenty-eight males ($21.8 \pm .4$ years of age) were scanned in two sessions (16 ± 3 days
77 apart). All participants provided informed consent following a protocol approved by the
78 IRB of the University of California, Berkeley, and were screened for magnetic resonance
79 imaging contraindications.

80

81 *Magnetic Resonance Imaging and Spectroscopy Acquisition*

82 MR data were acquired using a 3 Tesla Siemens TIM/trio scanner (Berlin/Munich,
83 Germany) with a 32-channel radiofrequency head coil. Each scanning session consisted
84 of two T1-weighted anatomical scans (sagittal MPRAGE, TR/TE = 1900/2.52ms, 900 ms
85 TI, flip angle = 9° , FoV 250 x 176, 1 mm³ voxel size, acceleration factor of two) and
86 eight MEGA-PRESS scans (320 transients per scan – 160 Off and 160 On, TR/TE =
87 1500/68 ms, 1.9 ppm and 7.5 ppm On- and Off-resonance edit pulse frequencies, 45 Hz

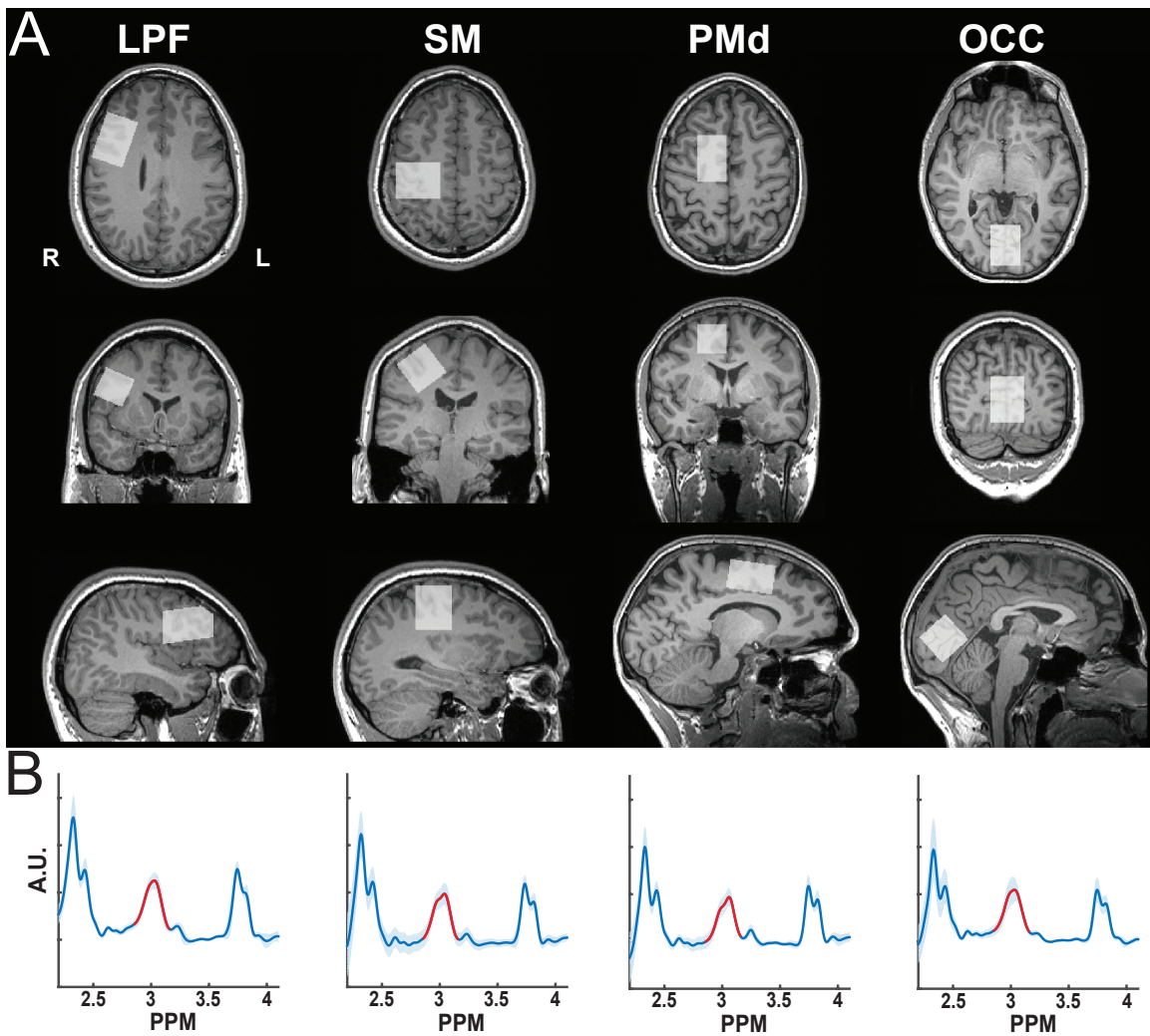
88 edit pulse bandwidth, delta frequency of -1.7 ppm relative to water – optimized for signal
89 detection at 3.00 ppm, 50 Hz water suppression bandwidth, TA = 8.4 min). MEGA-
90 PRESS averages were collected in pairs, alternating between On- and Off-resonance
91 editing pulses.

92 MRS data were acquired within each of four voxels, designed to target right
93 lateral prefrontal cortex (LPF; 25 x 40 x 25 mm), right sensorimotor cortex (SM; 30 x 30
94 x 30 mm), right dorsal premotor cortex (PMd; 25 x 40 x 25 mm), and bilateral occipital
95 cortex (OCC; 30 x 30 x 30 mm). Voxel orientations maximized the amount of grey
96 matter relative to white matter and CSF within each voxel, while also accommodating
97 each individual participant's anatomy. The LPF and SM voxels were prescribed in
98 reference to the first T1-weighted scan, and the PMd and OCC voxels were prescribed in
99 reference to the second T1-weighted scan. Thus, the imaging protocol consisted of one
100 T1 weighted scan followed by LPF (x 2) and SM (x 2) acquisitions. A separate T1
101 weighted scan was then acquired, followed by PMd (x 2) and OCC (x 2, if time allowed)
102 MRS acquisitions. Shimming for each voxel involved a combined automated and manual
103 routine that was performed immediately after each voxel was positioned. Each voxel was
104 sampled in two consecutive 8.4-minute scans and the order of scans was consistent across
105 all participants and visits. Maintaining a constant order for all participants controlled for
106 temporal relationships that could influence data acquisition during each scan session.

107 The T1-weighted image was resliced into axial and coronal views, and voxels
108 were positioned relative to anatomical landmarks using all three planar views (Fig. 1A).
109 The outer surfaces of all voxels remained several millimeters inside the brain to allow for
110 imperfect RF profiles for volume selection and editing, a limitation of the MEGA-PRESS

111 sequence (Kaiser et al., 2008) and ensured that measurements did not extend outside the
112 cortical surface. Gradient orders for each voxel were optimized to reduce artifacts as
113 determined during pilot testing (Ernst and Chang, 1996).

114



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116
117

Fig. 1.

118 Voxel Positioning and GABA Estimation. (A) MRS measurements were made during two scanning
119 sessions from voxels prescribed in the lateral prefrontal (LPF), sensorimotor (SM), dorsal premotor (PMd),
120 and occipital (OCC) cortices. (B) GABA+ signal was quantified by integrating the difference spectra under
121 the peak centered at 3.00 ppm.

122

123

124 The LPF voxel was centered over the inferior frontal junction, with the longest
125 axis extending anterior to posterior. One surface of the LPF voxel followed the outer
126 surface of the cortex in both the coronal and axial views. The SM voxel was centered
127 over the hand knob, parallel to the anterior to posterior axis. One surface of the SM voxel
128 was parallel to the cortical surface in the coronal and axial views. The PMd voxel was
129 positioned with its posterior surface aligned to the precentral sulcus, the lateral surface
130 parallel to the right medial wall of the longitudinal fissure, and the dorsal surface parallel
131 to the cortical surface along the anterior to posterior axis. The OCC voxel was centered
132 bilaterally over the calcarine sulcus extending equally into the left and right hemispheres.
133 The ventral surface of the OCC voxel was parallel to the straight sinus.

134 Sagittal, axial, and coronal views of each voxel, registered to the T1-weighted
135 image acquired at the first session, were used to guide positioning of each voxel at the
136 second session. First, the center coordinates and orientation for each voxel from the first
137 session were used to initialize the position of each voxel at the second session. To adjust
138 for differences in head position, manual translations and rotations were made using the
139 anatomical landmarks identified during the first session.

140

141 *Data Analysis*

142 All data were analyzed using customized routines in Matlab (Natick, MA). The scans
143 were exported in Siemens .rda format, with sets of 10 consecutive transients averaged
144 and stored in a single .rda file. This yielded 32 .rda files for each scan (16 On and 16 Off).
145 Preprocessing of the spectra included zero-filling spectra from 1024 to 4096 data points

146 and apodization with a 4 Hz Gaussian function. Off-resonance spectra were manually
147 phase corrected and aligned with reference to creatine (Cr). Correction values were
148 applied to the paired On-resonance spectra (Evans et al., 2013; Near et al., 2015). The
149 mean and standard deviation were calculated at each frequency of each On- and Off-
150 resonance spectrum, and the number of deviant values (> 2 standard deviations from the
151 mean) was tallied. The spectra were visually inspected to identify those which should be
152 excluded from further analysis based on the number of deviant values and overt
153 corruption or distortion of the spectra (Near et al., 2013; Simpson et al., 2015). The
154 complete analysis code is available for download at <https://osf.io/3gsdt/>. The mean
155 number of spectra removed was $.5 \pm .4\%$ for the LPF, $.4 \pm .3\%$ for the SM, $.3 \pm .2\%$ for
156 the PMd, and 0% for the OCC voxel. There was no evidence that the quality of data
157 changed within a session or between sessions as assessed by the number of deviant values.

158 Peak integration was performed using a previously published method (Yoon et al.,
159 2010). In brief, the signal was integrated beneath the GABA+ peak (range: 2.85 to 3.15
160 ppm, Fig. 1B) in the difference spectra and the Cr peak (range: 2.93 to 3.10 ppm) in the
161 summed On- and Off-resonance spectra. The ratio of total GABA+ to total Cr signal
162 (GABA+/Cr) was calculated from the average preprocessed spectra acquired within each
163 scan. This GABA+/Cr ratio accounts for scanner-related factors that might impact signal-
164 to-noise differently within/between scans or days, and that could differentially impact
165 reference peaks away from 3 ppm (Mullins et al., 2014). Data included in the final
166 analyses were comprised of spectra from two scans (160 measures each) acquired within
167 each session (4 total scans) and screened for artifacts. Participants who provided three or
168 fewer scans were excluded. This conservative approach to data inclusion yielded LPF

169 data from 20 participants, SM data from 22 participants, PMd data from 24 participants,
170 and OCC data from 15 participants. Due to time constraints in the scanner, and because
171 the OCC voxel was always acquired last, the OCC data were only acquired in a subset of
172 participants at both sessions. We note that the OCC findings are considered exploratory
173 because they were obtained from a smaller sample.

174 Pearson correlations of GABA+/Cr ratios between sessions were performed to
175 assess reliability across days for each voxel, and coefficients of variation were calculated
176 within participants for each voxel, as an estimate of the signal-to-noise ratio. Using the
177 data averaged across the two sessions, Pearson correlations between pairs of voxels were
178 performed to test whether individual differences in GABA+/Cr ratios in one brain area
179 predicted differences in another brain area. The same comparisons were performed for
180 GABA+ estimates alone to rule out the possibility that Cr estimates might account for
181 any observed relationships. The GABA+ estimates taken on their own are more
182 susceptible to differences in the magnetic field across scans or other scanner related
183 factors, but this analysis helps to constrain interpretations.

184 The percent total volume of grey matter, white matter, and cerebrospinal fluid
185 (CSF) were calculated within each voxel using the FMRIB's Automated Segmentation
186 Tool (Zhang et al., 2001; <http://fsl.fmrib.ox.ac.uk/>). The percent tissue relative to total
187 voxel volume ($([\text{grey matter} + \text{white matter}]/\text{total volume})$) was first used to compare the
188 reliability of voxel placement between the two scans. Agreement between scans is
189 unlikely to be accounted for by artifacts that are specific to a single scan, such as head
190 motion. These same measures were used to compare percent tissue between voxels. We
191 note that while head motion might globally affect T1-weighted images, we used one T1-

192 weighted image to calculate tissue percentages for the PMd and OCC voxels and a
193 separate T1-weighted image to calculate tissue percentages for the LPF and SM voxels at
194 each session. This approach controlled for motion artifacts that could introduce artificial
195 relationships in tissue estimates across regions that would be expected for an image
196 derived from a single scan.

197 To further assess the reliability of voxel placement between visits, we
198 coregistered the T1-weighted images from the second visit to those acquired at the first
199 visit using the FMRIB FLIRT registration toolbox (rigid-body coregistration with six
200 degrees of freedom). The resulting registration matrices were applied to three-
201 dimensional reconstructed masks of the MRS voxels acquired at the second visit, with
202 reference to the appropriate T1-weighted images. After coregistration, we calculated the
203 percent overlap of each pair of voxels between visits (e.g., the LPF voxel at visit 1
204 relative to the LPF voxel at visit 2) using the fslmaths tools.

205 Total tissue percentage, percent GM, and percent WM for each voxel were
206 correlated with the metabolite estimates to test for relationships between GABA+/Cr and
207 tissue subtypes. Coefficients of variation (CVs) were used to assess the relative
208 variability of measurements across sessions, with lower values reflecting greater
209 reliability.

210

211 **Results**

212 *Percent brain tissue is reliable but not correlated with GABA+/Cr ratios*

213 Tissue percentages within each voxel were highly correlated across sessions (LPF: r
214 = .82, $p < .001$, SM: $r = .89$, $p < .001$, PMd: $r = .82$, $p < .001$, OCC: $r = .82$, $p < .001$;

215 Fig. 2A) and exhibited low CVs (Table S1). A similar pattern was observed for percent
216 GM and percent WM (Fig. S1, S2, & Table S1). Averaged across sessions, percent total
217 tissue was $91 \pm .03\%$, $90 \pm .04\%$, $91 \pm .03\%$, and $90 \pm .04\%$ for the LPF, SM, PMd, and
218 OCC voxels, respectively. The coregistration procedure showed that there was $90.6 \pm$
219 1.4% overlap between sessions for the LPF voxels, $90.5 \pm 1.9\%$ overlap for the SM voxel,
220 $90.9 \pm 2.0\%$ overlap for the PMd voxel, and $89.8 \pm 2.5\%$ overlap for the OCC voxel. We
221 note that the automated coregistration method may introduce some error.

222 GABA+/Cr ratios were not correlated with tissue percentages (Fig. 2B), percent
223 GM (Fig. S3), or percent WM (Fig. S4) within any voxel. For this reason, and because
224 we did not estimate absolute concentrations (Kreis et al., 1993a; 1993b), we did not
225 “correct” our GABA+/Cr estimates as a function of tissue volume estimates, e.g. (Harris
226 et al., 2015). Furthermore, we did not observe any relationships between tissue
227 composition and GABA+ or Cr estimates alone for any of our voxels (GM and GABA+:
228 all voxels $p > .13$, Fig. S5; WM and GABA+: all voxels $p > .14$, Fig. S6; GM and Cr: all
229 voxels $p > .27$, Fig. S7; WM and Cr: all voxels $p > .11$, Fig. S8).

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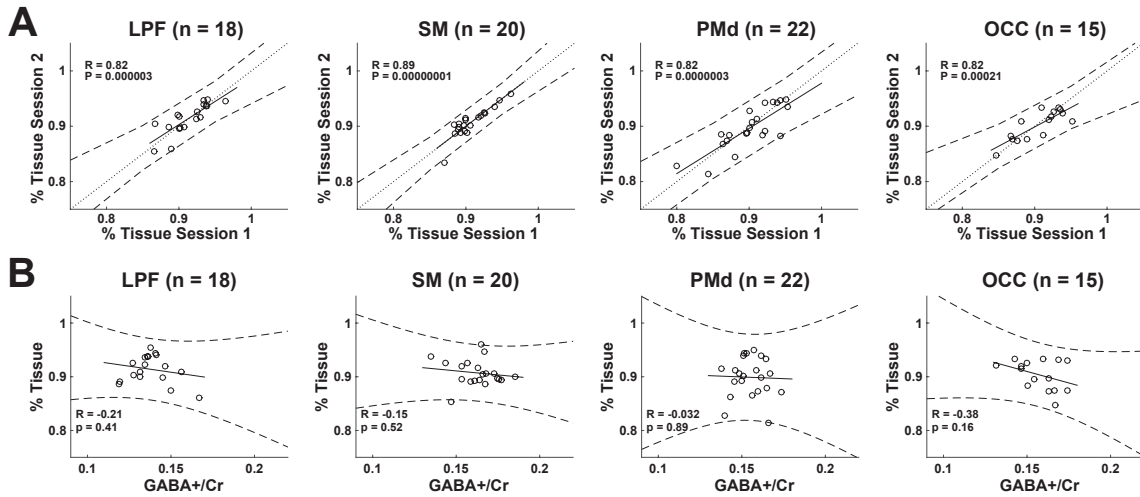
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Fig. 2.

239 Reliability of Voxel Positioning and Percent Tissue Correlation with GABA+/Cr. (A) Tissue density within
240 the lateral prefrontal (LPF), sensorimotor (SM), dorsal premotor (PMd), and occipital (OCC) voxels were
241 highly reliable across sessions in all four voxels. (B) Using average measures across sessions, percent tissue
242 per volume did not predict GABA+/Cr ratios.

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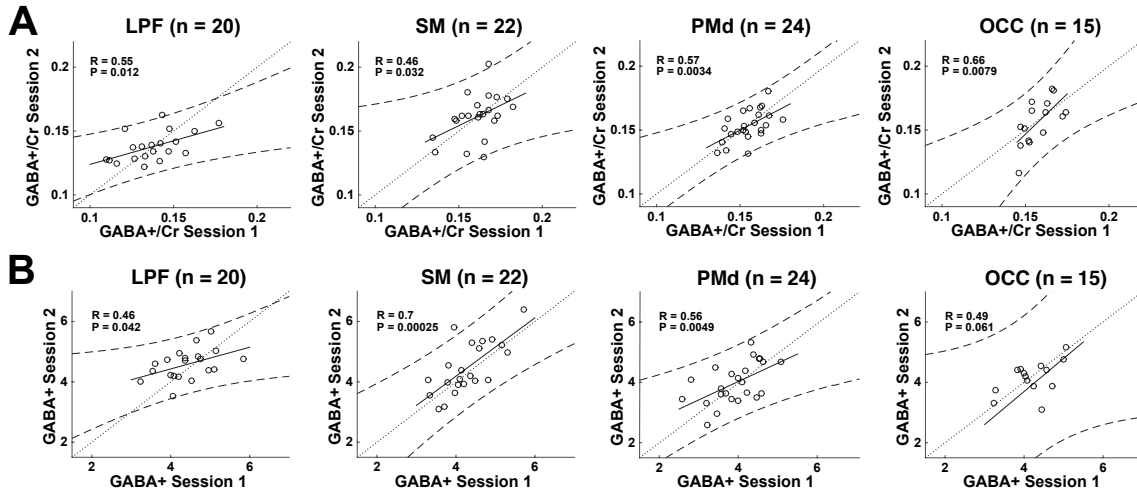
244 *GABA+/Cr ratios and GABA+ alone are reliable within sessions and across weeks*

245

246 The GABA+/Cr ratios were reliable between the two scans within each session (LPF: R
247 = .75, $p < .001$, CV = $4.6 \pm 0.9\%$; SM: R = .64, $p < .01$, CV = $3.9 \pm 1.0\%$; PMd: R = .63,
248 $p < .005$, CV = $3.9 \pm 0.7\%$; OCC: R = .52, $p < .05$, CV = $5.3 \pm 1.1\%$). GABA+/Cr ratios
249 were also stable across weeks in all four voxels (Fig. 3A). The CVs were $5.9 \pm .93\%$
250 (range .7–16.1%) for LPF, $5.3 \pm .98\%$ (range .2–16.9%) for SM, $3.8 \pm .60\%$ (range .04–
251 11.6%) for PMd, and $5.3 \pm .92\%$ (range .73–16.0%) for OCC voxels. These values are in
252 agreement with previous studies (Evans et al., 2010; Near et al., 2014; Stephenson et al.,
253 2011; Wijtenburg et al., 2013). Estimates of GABA+ alone, expressed in arbitrary units,
254 exhibited a similar pattern of reliability, although the correlation in OCC only reached

255 trend-level significance (LPF: $r = .46, p < .05$, SM: $r = .7, p < .001$, PMd: $r = .56, p$
256 $< .005$, OCC: $r = .49, p = .06$; Fig. 3B).

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Fig. 3.

262 GABA+/Cr Ratios and Raw GABA+ Estimates were Reliable. (A) GABA+/Cr ratios were reliable across
263 sessions within the lateral prefrontal (LPF), sensorimotor (SM), dorsal premotor (PMd), and occipital
264 (OCC) voxels. (B) GABA+ estimates were also reliable across sessions, indicating that scanning related
265 factors were consistent between days and that Cr alone is unlikely to account for the reliable GABA+/Cr
266 ratios.

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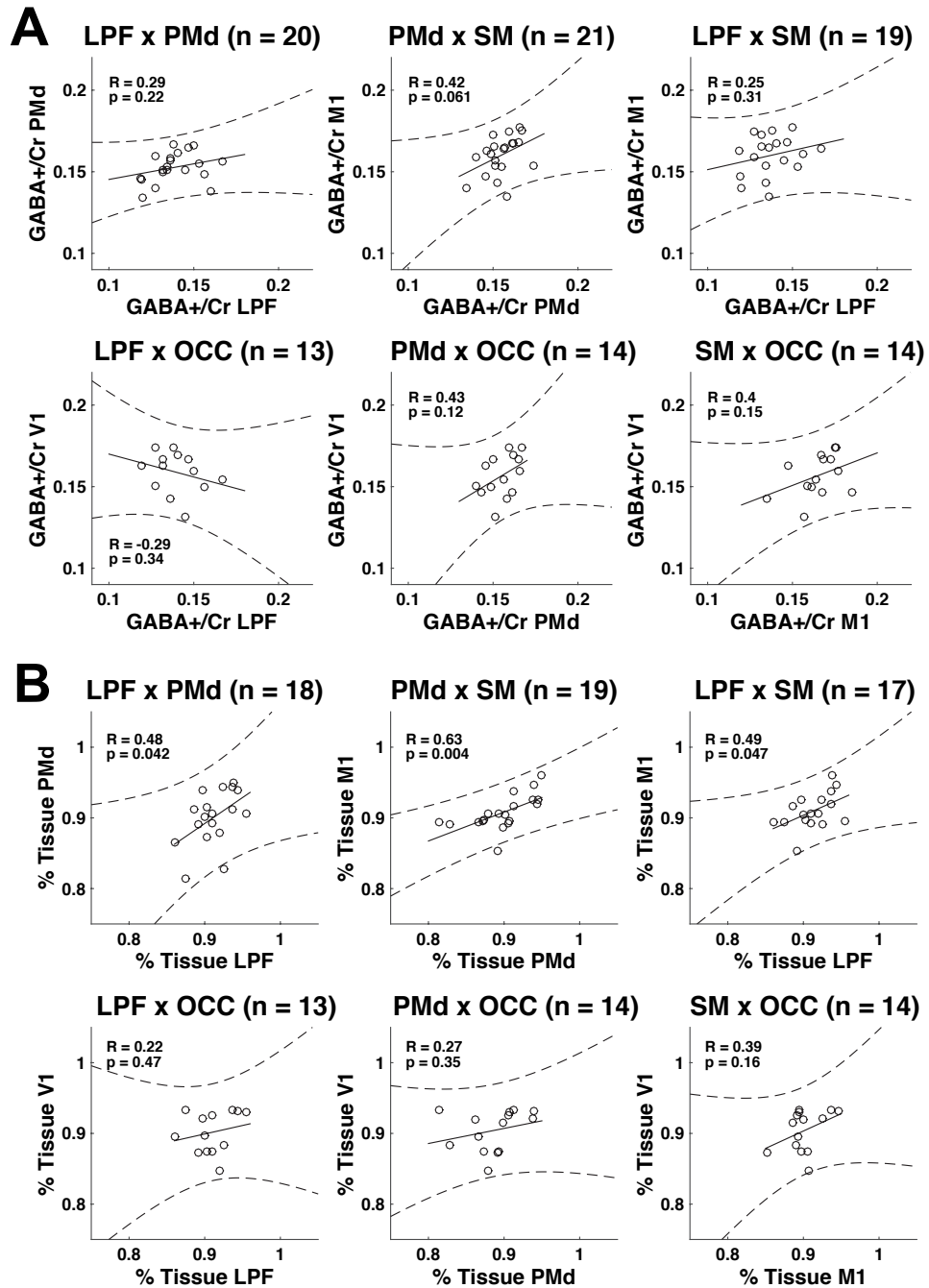
268 *GABA+/Cr and tissue comparisons across brain regions*

269 The preceding analyses indicate that MR scanner performance and MRS voxel
270 positioning were consistent across the two sessions. Moreover, the observed reliability
271 for the GABA+/Cr ratios cannot be explained by Cr measurements alone. This allowed us
272 to turn to our main question: whether individual differences in intrinsic GABA are
273 consistent between cortical regions.

274 We averaged the GABA+/Cr ratios across the two sessions and tested for
275 correlations between each pair of voxels. Importantly, individual differences in
276 GABA+/Cr within one voxel did not predict individual differences at the other voxels (all
277 p 's > .06, Fig. 4A). This result suggests that intrinsic cortical GABA+ content is
278 determined locally. The correlation approached significance for the PMd and SM voxels
279 ($p = .06$), although it is important to keep in mind that, because of their proximity, these
280 two voxels overlapped by approximately 5% of their total volume ($11.2 \pm 5.3 \text{ mm}^3$).

281 In contrast to GABA+/Cr, total tissue percentages were correlated between the
282 LPF, SM, and PMd voxels (all p 's < .05 uncorrected, Fig. 4B), with only the correlation
283 between the SM and PMd voxels surviving a more stringent multiple comparison
284 correction ($p < .0125$). Thus, individual differences in total tissue percentages were
285 consistent between the anterior voxels.

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Fig. 4.

290 Tissue Density but not GABA+/Cr is Correlated Between Voxels. (A) GABA+/Cr ratios were not
291 significantly correlated in any pairwise comparison of the four voxels. (B) Tissue density was correlated
292 between the lateral prefrontal (LPF), sensorimotor (SM), and dorsal premotor (PMd) voxels, but these
293 frontal regions were not correlated with the occipital (OCC) voxel.

294 **Discussion**

295 The study of individual differences is essential for understanding behavioral and
296 biological variation. In the neurosciences, this approach lends insight into biomarkers of
297 brain function and gene-environment interactions. A recurring question concerns the
298 regional specificity versus uniformity of individual differences throughout the brain. For
299 example, recent evidence suggests that a relatively homogenous ‘transcriptional blueprint’
300 exists throughout the cortex (Hawrylycz et al., 2012; Richiardi et al., 2015). Epigenetic
301 factors demonstrate homogeneity across brain regions as well. Specifically, DNA
302 methylation is more similar across different brain regions within an individual than for a
303 single brain region compared across individuals (Illingworth et al., 2015). Moreover,
304 individual differences in white matter integrity (Penke et al., 2010) and diffusivity
305 (Johnson et al., 2015), as well as gray matter density (Mechelli et al., 2005), are relatively
306 uniform throughout the brain. All of these general factors could influence
307 neurotransmitter concentrations. Indeed, local tissue percentages and tissue types have
308 previously been linked to brain metabolite concentrations, including GABA (Bergmann
309 et al., 2015; Harris et al., 2015; Jensen et al., 2005; Kreis et al., 1993b; 1993a).

310 Given these considerations it is surprising that individual differences in
311 GABA+/Cr ratios were not correlated between neighboring cortical regions. These results
312 are consistent with previous assessments of regional variation in GABA (Boy et al.,
313 2010; Grachev and Apkarian, 2000) and provide two important advances. First, we
314 performed comparisons between regions after establishing measurement reliability across
315 two sessions, a prerequisite for studying individual differences. Notably, intra-voxel
316 reliability was assessed between sessions, whereas comparisons between regions included

317 data acquired within sessions. Our conclusions are thus conservative in that inter-session
318 variability should impact reliability estimates to a greater degree than between-region
319 comparisons. Second, the local variation in intrinsic GABA stands in contrast to a
320 structural measure: The percentage of brain tissue, within the same voxels, was correlated
321 between anterior cortical regions. Taken together, these measures suggest that anatomical
322 and neurochemical individual differences occur at different spatial scales in the cortex.

323 Previous MRS studies reported correlations between behavioral or
324 neurophysiological measures and GABA estimates within targeted brain regions
325 (Bachtiar et al., 2015; Balz et al., 2016; Boy et al., 2010; Heba et al., 2016; Jocham et al.,
326 2012; Stagg et al., 2011a; 2011b; Sumner et al., 2010; van Loon et al., 2013). For
327 example, resting GABA content in primary motor cortex was positively correlated with
328 individual differences in motor sequence reaction time (Stagg et al., 2011a). Our results
329 are consistent with the hypothesis that locally determined neurotransmitter content relates
330 to the functional specialization of brain regions. Moreover, the finding that resting GABA
331 measurements within multiple cortical regions remained relatively stable across weeks
332 suggests that task-dependent changes in GABA (Floyer-Lea et al., 2006; Michels et al.,
333 2012) likely occur on top of stable basal levels.

334 Our results have important clinical implications. Abnormalities in GABA
335 concentrations have been associated with neurological diseases and trauma (Blicher et al.,
336 2015; Dharmadhikari et al., 2015; Draper et al., 2014; Hattingen et al., 2014; van der Hel
337 et al., 2013). Given the reliability observed here in healthy individuals, it may be possible
338 to relate local changes in GABA to patterns of recovery. Similarly, one could assess the

339 anatomical specificity of medications that impact GABA-dependent processes, e.g.
340 benzodiazepines or selective serotonin reuptake inhibitors (Bhagwagar et al., 2004).

341 The MRS method applied here measures metabolite concentrations throughout the
342 entire voxel, including perivesicular and cytoplasmic environments. While we did not
343 observe inter-regional correlations in GABA measurements, it is possible that specific
344 compartments, e.g. vesicular or synaptic GABA, are similar across brain regions.
345 Furthermore, we only studied young adult males. Our results may not translate to females
346 or to older populations, as GABA content has been found to differ between the sexes
347 (Epperson et al., 2002; O'Gorman et al., 2011) and to decrease with age (Gao et al., 2013).
348 In addition, the GABA+ signal at 3.00 ppm includes contributions from coedited
349 macromolecules as well as homocarnosine, a GABA derivative; indeed, this is a principle
350 limitation of the method. We did not control for macromolecules in our data, and the
351 effects we observed could include a macromolecular contribution. It is also possible that
352 differences in creatine content between regions influenced our results.

353 In summary, measurements of GABA+/Cr obtained across weeks exhibited
354 marked reliability, but had little shared variance across brain regions. Thus, while
355 individual differences in cortical GABA concentrations are stable, variation in these
356 concentrations is locally determined. These results support the use of MRS for assessing
357 local neurotransmitter concentrations, with potential clinical utility for assessing
358 sensitivity to treatment interventions or monitoring disease progression.

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365

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368

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