High Angular Resolution Susceptibility Imaging and Estimation of Fiber Orientation Distribution Functions in Primate Brain

- Dimitrios G. Gkotsoulias¹, Roland Müller¹, Carsten Jäger², Torsten Schlumm¹,
 Toralf Mildner¹, Cornelius Eichner³, André Pampel¹, Jennifer Jaffe^{4,5}, Tobias Gräßle^{5,6,7},
 Niklas Alsleben², Jingjia Chen⁸, Catherine Crockford^{4,5,9}, Roman Wittig^{4,5,9}, Chunlei Liu^{8,10} and Harald E. Möller¹
- 7 ¹Nuclear Magnetic Resonance Methods & Development Group, Max Planck Institute for Human
- 8 Cognitive and Brain Sciences, Leipzig, Germany
- 9 ² Department of Neurophysics, Max Planck Institute for Human Cognitive and Brain Sciences,
- 10 Leipzig, Germany
- 11 ³ Department of Neuropsychology, Max Planck Institute for Human Cognitive and Brain Sciences,
- 12 *Leipzig, Germany*
- 13 ⁴ Max Planck Institute for Evolutionary Anthropology, Leipzig, Germany
- 14 ⁵ Taï Chimpanzee Project, Centre Suisse de Recherches Scientifiques en Côte d'Ivoire, Côte d'Ivoire
- 15 ⁶ Helmholtz Institute for One Health, Greifswald, Germany
- 16 ⁷ Robert Koch Institute, Epidemiology of Highly Pathogenic Microorganisms, Berlin, Germany
- 17 ⁸ Electrical Engineering and Computer Sciences, University of California, Berkeley, CA, USA
- ⁹ Institute of Cognitive Sciences, CNRS UMR5229 University of Lyon, Bron, France
- 19 ¹⁰ Helen Wills Neuroscience Institute, University of California, Berkeley, CA, USA
- 20 Corresponding author:
- 21 Dimitrios G. Gkotsoulias
- 22 Max Planck Institute for Human Cognitive and Brain Sciences
- 23 Stephanstraße 1A
- 24 04103 Leipzig
- 25 Germany
- 26 Tel.: +49 341 9940 186
- 27 E-mail: gkotsoulias@cbs.mpg.de
- 28 Word count:
- 29 Text: 5220 words (without legends, references and statements)
- 30Abstract:229 words
- 31References:71
- **32** Figures: 8

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33 Declaration of interest

34 The authors declare no competing interest.

35 Data and code availability statement

- 36 The dataset acquired and used within the scope of this study will be made publicly available,
- 37 upon publication of the current work.
- 38 The code (scripts) created or used within the scope of this study are available upon request
- 39 and further considerations.

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40 Abstract

Uncovering brain-tissue microstructure including axonal characteristics is a major 41 42 neuroimaging research focus. Within this scope, anisotropic properties of magnetic susceptibility in white matter have been successfully employed to estimate primary axonal 43 44 trajectories using mono-tensorial models. However, anisotropic susceptibility has not yet been considered for modeling more complex fiber structures within a voxel, such as intersecting 45 46 bundles, or an estimation of orientation distribution functions (ODFs). This information is 47 routinely obtained by high angular resolution diffusion imaging (HARDI) techniques. In applications to fixed tissue, however, diffusion-weighted imaging suffers from an inherently 48 49 low signal-to-noise ratio and limited spatial resolution, leading to high demands on the 50 performance of the gradient system in order to mitigate these limitations. In the current work, 51 high angular resolution susceptibility imaging (HARSI) is proposed as a novel, phase-based 52 methodology to estimate ODFs. A multiple gradient-echo dataset was acquired in an entire 53 fixed chimpanzee brain at 61 orientations by reorienting the specimen in the magnetic field. 54 The constant solid angle method was adapted for estimating phase-based ODFs. HARDI data were also acquired for comparison. HARSI yielded information on whole-brain fiber 55 architecture, including identification of peaks of multiple bundles that resembled features of 56 57 the HARDI results. Distinct differences between both methods suggest that susceptibility 58 properties may offer complementary microstructural information. These proof-of-concept 59 results indicate a potential to study the axonal organization in *post-mortem* primate and human 60 brain at high resolution.

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61 Highlights

- Introduction of High Angular Resolution Susceptibility Imaging (HARSI) for
- 63 advancing Quantitative Susceptibility Mapping (QSM).
- HARSI-derived fiber orientation distributions in fixed chimpanzee brain.
- HARSI-based visualization of complex fiber configurations.
- Comparisons between HARSI and High Angular Resolution Diffusion Imaging.
- Potential for high-resolution *post-mortem* imaging of fiber architecture.

68

69 Keywords

- 70 Anisotropic magnetic susceptibility; diffusion-weighted imaging; gradient-recalled echo;
- 71 high angular resolution; orientation distribution function, quantitative susceptibility
- 72 mapping.

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73 Abbreviations

3D = three-dimensional; CAD = computer aided design; CITES = Convention on International 74 75 Trade in Endangered Species of Wild Fauna and Flora; CSA = constant solid angle; DTI = 76 diffusion tensor imaging; DWI = diffusion-weighted imaging; EPI = echo planar imaging; 77 ESPIRiT = iTerative Eigenvector-based Self-consistent Parallel Imaging Reconstruction; FDT = FMRIB Diffusion Toolbox; FLASH = Fast Low-Angle SHot; FLIRT = FMRIB's Linear Image 78 79 Registration Tool; FSL = FMRIB Software Library; GM = gray matter; GRAPPA = GeneRalized Autocalibrating Partially Parallel Acquisitions; GRE = gradient-recalled echo; HARDI = high 80 angular resolution diffusion imaging; HARSI = high angular resolution susceptibility imaging; 81 iLSQR = iterative LSQR; ME = multi echo; MLE = maximum likelihood estimation; MRI = 82 magnetic resonance imaging; MP2RAGE = Magnetization-Prepared 2 RApid Gradient Echoes; 83 NMI = normalized mutual information; ODF = orientation distribution function; PBS = 84 phosphate-buffered saline; PE = phase-encoding; PFA = paraformaldehyde; QSM = 85 quantitative susceptibility mapping; RF = radiofrequency; ROI = region of interest; SSIM = 86 structural similarity index measure; STI = susceptibility tensor imaging; STL = 87 stereolithography; SVD = singular value decomposition; V-SHARP = Variable-kernel 88 Sophisticated Harmonic Artifact Reduction for Phase data; WM = white matter. 89

90 Mathematical Symbols

δB_0 :	local offset of the amplitude of the magnetic flux density;
BW:	bandwidth;
<i>b</i> :	<i>b</i> -value;
FA:	fractional anisotropy;
FOV:	field of view;
f_p :	partial-Fourier factor;
<i>H</i> ₀ :	magnitude of the applied magnetic field;
Ĥ:	unit vector along the direction of the applied magnetic field;
k :	spatial frequency vector;
MD:	mean diffusivity;
MMS:	mean magnetic susceptibility;
MSA:	magnetic susceptibility anisotropy;
<i>n</i> :	number (integer);
<i>R</i> :	GRAPPA acceleration factor;
R_{2}^{*} :	effective transverse relaxation rate;
r:	position vector;
SD:	standard deviation;
SNR:	signal-to-noise ratio;
T_1 :	longitudinal relaxation time;
TA:	acquisition time;
TE:	echo time;
ΔΤΕ:	echo spacing;
TR:	repetition time;
	b: FA: FOV: f_p : H_0 : \hat{H} : MD: MMS: MSA: n : R : R_2^* : T_1 : TA: TE: ΔTE:

114	<i>x</i> , <i>y</i> , <i>z</i> :	cartesian coordinates;
115	α:	RF pulse flip angle,
116	γ:	gyromagnetic ratio;
117	φ :	signal phase;
118	$\lambda_1, \lambda_2, \lambda_3$:	eigenvalues of the diffusion tensor;
119	μ ₀ :	vacuum permeability;
120	χ:	bulk volume magnetic susceptibility;
121	χ	magnetic susceptibility tensor;
122	χ_1, χ_2, χ_3 :	eigenvalues of the magnetic susceptibility tensor;
123	<i>X</i> ij:	magnetic susceptibility tensor element;
124	$\mathcal{F}, \mathcal{F}^{-1}$:	Fourier transform and inverse Fourier transform;
125	T:	transpose of a matrix.

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126 1. Introduction

Volume magnetic susceptibility (χ) is a dimensionless quantity (in SI units), which 127 describes the degree of magnetization of a material placed inside an external magnetic field. 128 In biological tissues, local structural characteristics lead to spatial variations of susceptibility 129 and, thus, to local field disturbances and measurable differences in the resonance frequency in 130 131 magnetic resonance imaging (MRI). Based on the nature of these disturbances, susceptibility 132 may be paramagnetic ($\chi > 0$) or diamagnetic ($\chi < 0$). In reverse, quantifying the susceptibility 133 properties of tissue can lead to a non-invasive elucidation of microstructural properties and 134 details at the whole-brain scale, without the need for sophisticated microscopy techniques 135 (Möller et al., 2019).

Quantitative susceptibility mapping (QSM) methods provide voxel-wise susceptibility 136 estimations based on the signal phase in gradient-recalled echo (GRE) acquisitions and a series 137 138 of post-processing steps (Deistung et al., 2017; de Rochefort et al., 2010; Liu et al., 2015; Shmueli et al., 2009). Although various approaches have been developed for this purpose, robust 139 140 mapping of γ from MRI phase data remains challenging because the field perturbation (and, 141 hence, the signal phase) associated with a susceptibility distribution is inherently non-local 142 and depends on the distribution's orientation in the magnet (Schäfer et al., 2009). Briefly, following appropriate combination of the complex multi-channel data from a phased-array 143 144 coil and removal of phase wraps (Robinson et al., 2017) and background-field contributions (Schweser et al., 2017), field-to-source inversion methods are used to solve (in the Fourier 145 146 domain) the ill-posed problem of going from the signal phase (as a measure of the local magnetic flux density offset, δB_0) to the local variations in χ . Notably, this is typically 147 performed under the assumption that χ representing an imaging voxel is a scalar, isotropic 148 quantity (Deistung et al., 2017). While this assumption may be justified in regions of cerebral 149 150 gray matter (GM), multiple studies have shown that the bulk susceptibility in cerebral white 151 matter (WM) exhibits a highly anisotropic character-primarily, as a result of the specific 152 arrangement of the myelin sheaths enveloping axons at a molecular level, leading to an 153 accumulated macroscopic effect on the voxel level (Li et al., 2017; Liu, 2010; Wharton & Bowtell, 2012). 154

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155 Consequently, brain tissue susceptibility cannot be fully understood and exploited if its 156 anisotropic characteristics are not taken into consideration-similarly to diffusion tensor 157 imaging (DTI) that exploits the anisotropic characteristics of diffusion as an expansion of simple measurements of the mean diffusivity (MD). Methods proposed for addressing this 158 issue, such as susceptibility tensor imaging (STI), consider multiple GRE acquisitions by 159 160 reorienting the object (e.g., the human head) inside the magnet—as current MRI technology does not allow to reorient the magnetic field around the imaged object (Liu, 2010). In the basic 161 162 STI approach, susceptibility is depicted as a second-rank symmetric tensor with six unique parameters, in a similar way as orientation-dependent diffusivity is modeled in DTI (Basser et 163 al., 1994a; 1994b). Obtaining GRE phase measurements along six or more unique orientations 164 allows for the reconstruction of a second-rank tensor χ , based on a linear system of equations 165 constructed by the relationship (Li et al., 2017; Liu, 2010): 166

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$$\delta B_0(\mathbf{r}) = \frac{\varphi(\mathbf{r}, \mathrm{TE})}{2\pi\gamma \cdot \mathrm{TE}} = \mu_0 H_0 \cdot \mathcal{F}^{-1} \left[\frac{1}{3} \widehat{\mathbf{H}}^T \, \mathcal{F}(\mathbf{\chi}) \, \widehat{\mathbf{H}} - \widehat{\mathbf{H}} \cdot \mathbf{k} \frac{\mathbf{k}^T \, \mathcal{F}(\mathbf{\chi}) \, \mathbf{H}}{k^2} \right], \tag{1}$$

In Eq. 1, $\varphi(\mathbf{r}, \text{TE})$ is the signal phase in image space at position \mathbf{r} and echo time TE, γ is the gyromagnetic ratio, μ_0 is the vacuum permeability, H_0 and $\hat{\mathbf{H}}$ are, respectively, the magnitude of the applied magnetic field and its unit vector (defining the laboratory frame's *z*-direction), and \mathbf{k} is the spatial frequency vector. \mathcal{F} and \mathcal{F}^{-1} denote the Fourier transform and its inverse, respectively, and the subscript ^{*T*} the transpose. Note that the χ_{33} tensor component has also been suggested as an STI-based estimation of a scalar susceptibility (Langkammer et al., 2018).

174 Despite being a useful approximation of the diffusion signal for a certain range of *b*values (Novikov et al., 2018), DTI is mathematically incapable of resolving multiple fiber 175 176 orientations within a voxel, thus providing limited information for the vast majority of WM 177 regions (Jones et al., 2013). Important improvements are achieved with High Angular Resolution Diffusion Imaging (HARDI) techniques, sampling 60 or even more diffusion 178 directions (Frank et al., 2001; Tournier et al., 2004; Tuch et al., 2002; 1999). This includes high-179 quality estimations of fiber orientation distribution functions (ODFs) and resolving 180 intersecting fiber bundles. Compared to these developments in diffusion-weighted imaging 181 (DWI), the need for physical rotation of the object and the complex processing pipeline of 182 multi-orientational susceptibility imaging has led to datasets of limited angular resolution so 183 184 far. For example, STI acquisitions in formalin-fixed mouse brain specimens were obtained with

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185 19 orientations, which were evenly distributed on a spherical surface if a sufficiently large 186 radiofrequency (RF) coil could be used (Liu et al., 2012) but restricted to rotations about the 187 sample's long axis with a tightly fitting solenoid (Li et al., 2012). In-vivo acquisitions in humans 188 achieved 16 rotation angles (about the anterior-posterior and the left-right direction) up to ±50° with a relatively open quadrature coil (Li et al., 2012) but only 12 orientations with angles up 189 190 to ±25° with a spatially more constrained head array (Bilgic et al., 2016a). Such constraints 191 impose limitations on the quality of tensor-based analyses and, more importantly, prohibit to 192 go beyond STI for microstructural information, such as susceptibility-based ODFs (Liu et al., 2013). 193

In the current work, we introduce High Angular Resolution Susceptibility Imaging 194 195 (HARSI) as an advanced QSM approach for *post-mortem* acquisitions-similar to HARDI 196 techniques developed in the context of DWI. The goal is to investigate the orientation-197 dependent susceptibility at high angular resolution to achieve WM characterization beyond 198 state-of-the-art tensor-based methods. A multi-echo (ME) GRE dataset comprising 61 unique 199 directions is presented, and HARSI-based STI estimates are compared to single-orientation 200 QSM results. Additionally, ODFs are obtained by applying the generalized constant solid angle (CSA) method (Kamath et al., 2012). The results indicate comparable potential in 201 resolving intersecting fiber orientations as HARDI-based ODFs and suggest strong prospects 202 203 for obtaining complementary information on WM microstructure.

204 2. Methods

205 2.1. Brain specimen

206 The *post-mortem* specimen used for the acquisitions was a whole brain obtained from an 207 adult wild alpha-male chimpanzee (Pan troglodytes verus; male, 45 years). The animal had died 208 from natural causes in Taï National Park (Parc National de Taï), Côte d'Ivoire, without human 209 interference. Approximately 18 h after death, a specifically trained veterinarian performed the 210 brain extraction wearing full personal protective equipment and adhering to the necroscopy 211 protocols at the field site. All procedures followed the ethical guidelines of primatological 212 research at the Max Planck Institute for Evolutionary Anthropology, Leipzig, which were 213 approved by the Ethics Committee of the Max Planck Society. Immediately after extraction,

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the brain was preserved by immersion in 4% paraformaldehyde (PFA). The specimen was
transferred to Germany under strict observation of CITES (Convention on International Trade
in Endangered Species of Wild Fauna and Flora) protocol regulations. After fixation for 6
months, superficial blood vessels were removed, and the PFA was washed out in phosphatebuffered saline (PBS) at pH 7.4 for 24 days.

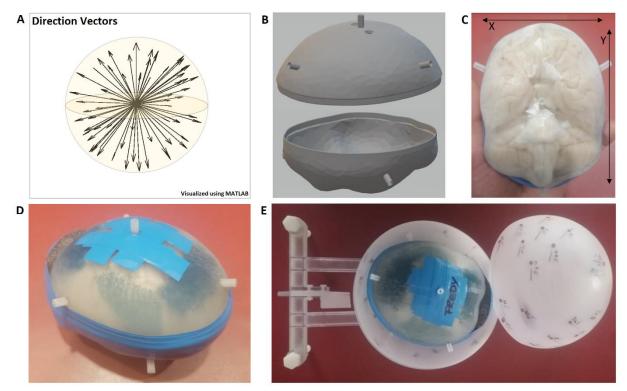
219 2.2. Brain container for reorientation imaging

For preparatory experiments, the specimen was centered in an oval-shaped acrylic container of suitable size (15cm long-axis and 10cm short-axis diameter) and stabilized with sponges. The container was filled with liquid perfluoropolyether (Fomblin[®]; Solvay Solexis, Bollate, Italy) to protect the tissue from dehydration and to achieve approximate matching of the susceptibility at the brain surface (Benveniste et al., 1999). With this setup, a threedimensional (3D) high-resolution T_1 -weighted MP2RAGE (Magnetization-Prepared 2 RApid Gradient Echoes) dataset was acquired.

227 Phase-sensitive acquisitions at multiple orientations with respect to the main magnetic 228 field require physical rotations of the object. During these measurements, the sample may be 229 subjected to gravity-induced non-linear deformations, which are inconsistent between scans 230 unless measures are taken to preserve the shape. This leads to inaccuracies and may introduce artifacts during post-processing, which requires excellent registration of the acquired volumes. 231 In previous *post-mortem* experiments in mice (Li et al., 2012; Liu et al., 2012) and also in humans 232 (Alkemade et al., 2020; 2022), the problem of inconsistent deformations was avoided by 233 keeping the fixed brain within the skull after surgical separation of the head. In the current 234 work, a specific brain mask was derived from the 3D T_1 -weighted dataset and a custom-made 235 236 container was designed consisting of an inner and an outer part (Figure 1B-E). Based on the 237 mask, the surface of the individual anatomy was reconstructed and split into a top and a 238 bottom mesh using Python (Figure 1B). The algorithm further allowed for a parameterization of the design, for example, to consider an additional distance from the tissue or modify the 239 240 wall thickness for sufficient stability. Stereolithography (STL) files were then produced using 241 CAD (computer-aided design) software (Fusion 360®; Autodesk, San Rafael, CA, USA). The 242 outer container was a spherical structure of sufficient size (16cm diameter) to take up the 243 anatomically shaped inner container, which was rigidly connected via eight adjustable screws

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244 (Figure 1E). The spherical outer shell also consisted of two parts (top and bottom) with further 245 indications of 60 unique orientations on its surface. The orientations were calculated 246 employing an electrostatic repulsion optimization model using *MRtrix3* (Jones et al., 1999; Tournier et al., 2019). The outer container was then positioned on a custom-made holder that 247 included an additional position indicator (Figure 1E). The combined setup ensured robust 248 249 positioning of the specimen in the RF coil with an orientation error $\leq 3^{\circ}$ for all axes. Note that a refined orientation information was obtained during post-processing from image 250 251 registration (see below) and used in all subsequent analyses. All container and holder parts were 3D-printed on an Objet Eden260VS (Stratasys, Eden Prairie, MN, USA) using Objet 252 MED610 Biocompatible Clear material (Stratasys). 253



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Figure 1. (A) Direction unit vectors of 61 evenly distributed orientations on the surface of a sphere as 255 calculated by *MRtrix3*. (B) Design of the inner container based on the surface rendering of a 3D T_1 -256 257 weighted dataset. (C, D) 3D-printed container, adapted to the brain's individual anatomy with indications of the approximate dimensions. The specimen is immersed in Fomblin, and the 258 container is carefully sealed using tape (x=105mm, y=125mm). (E) View of the specimen "Fredy" 259 260 inside the anatomical container, positioned inside an outer, spherical container with indications of 261 the calculated directions for reorientations. The outer container is positioned on a custom-made holder with an additional angle indicator that supports robust positioning in the RF coil and 262 accurate reorientation. 263

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264 2.3. Image acquisition

All MRI experiments were performed at 3 T on a MAGNETOM Skyra Connectom A 265 (Siemens Healthineers, Erlangen, Germany) that achieves a maximum gradient strength of 300 266 mT/m (Fan et al., 2022). In order to avoid damage to the gradient coil during long scanning 267 268 sessions, a first-order approximation of the acoustic response was computed in Matlab from 269 the simulated gradient time course (IDEA DSV file) of each individual imaging protocol with its specific acquisition parameters (Labadie et al., 2013) and carefully inspected for potentially 270 271 harmful vibrations. The brain container and holder were then positioned inside a 32-channel 272 receive array coil (Siemens Healthineers), and a complex-valued 3D Fast Low-Angle SHot 273 (FLASH) reference dataset (Frahm et al., 1986) was acquired after shimming. Subsequently, 60 274 additional consecutive acquisitions were performed with varying sample orientations and the 275 same parameters as in the reference scan (1mm isotropic nominal resolution; field of view, FOV = 160×160 mm; RF pulse flip angle, $\alpha = 30^{\circ}$; repetition time, TR = 50 ms; 12 echoes 276 277 with TE = 3.54 ms and 6.98 ms for the first two echoes and an echo spacing, $\Delta TE = 3.75$ ms, 278 for the remaining 10 echoes; bandwidth, BW = 600 Hz/pixel). GeneRalized Autocalibrating 279 Partially Parallel Acquisitions (GRAPPA) with acceleration factor R = 2 (Griswold et al., 2002) 280 and a partial-Fourier scheme (Feinberg et al., 1986) with partial-Fourier factor, $f_p = 7/8$ were employed in phase-encoding (PE) direction (always along the physical z-axis), to accelerate 281 282 the measurements (acquisition time, TA \approx 12 min per orientation; total TA \approx 12:12 h). The slab orientation was always along the y-axis, and the vendor's 3D distortion correction was applied 283 284 to all acquisitions.

285 Additional DWI data were acquired at 1mm isotropic nominal resolution employing a previously described 3D segmented ME echo planar imaging (EPI) technique optimized for 286 287 PFA-fixed tissue (Eichner et al., 2020). Briefly, the sequence consists of a Stejskal-Tanner sequence with multiple gradient-echo refocusing of the first (spin) echo. Combination of the 288 GREs employing maximum likelihood estimation (MLE) yields a time-efficient increase of the 289 signal-to-noise ratio (SNR) and reduced noise bias. Further acquisition parameters included 290 291 FOV = 126×126×104 mm³, TR = 10.4 s; TE = [53.5, 66, 78.5, 91] ms, BW = 1100 Hz/pixel, 292 coronal orientation, foot-head PE direction, 18 segments, 1.14ms echo spacing. Sixty unique directions of the diffusion-weighting gradient were acquired with $b = 5000 \text{ s/mm}^2$ in six 293 294 batches of 10 scans and interleaved with seven acquisitions with b = 0 (TA \approx 36 h). Emphasis

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was given to intermediate breaks to maintain steady tissue temperature throughout the entirescanning session.

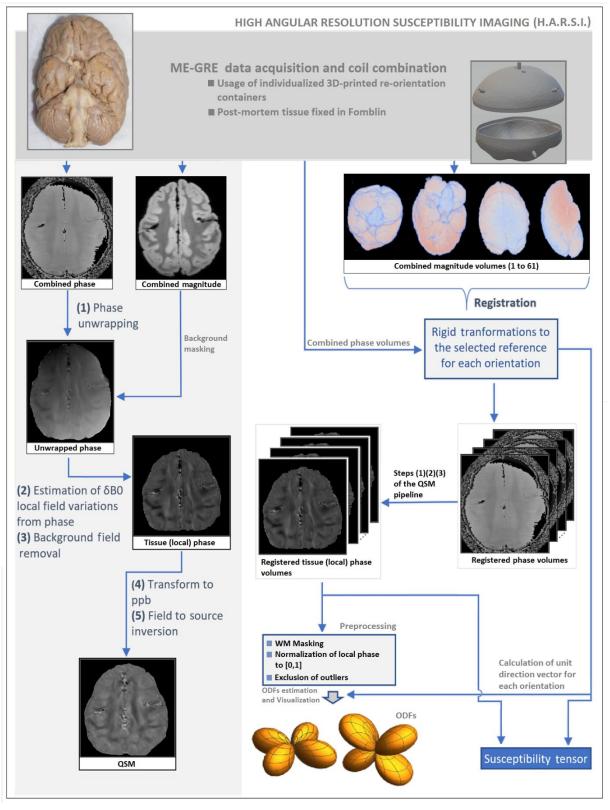
297 2.4. *Image processing*

298 The complex-valued GRE data from each coil channel (n = 32) were saved individually 299 for each orientation and the channel combination (with preservation of the phase information) 300 was performed offline, based on singular value decomposition (SVD) and ESPIRiT (iTerative Eigenvector-based Self-consistent Parallel Imaging Reconstruction) (Bilgic et al., 2016b; Metere 301 302 & Möller, 2017; Uecker et al., 2021; Uecker & Lustig, 2017). The multi-orientation phase 303 volumes were registered to the reference employing transformations that were derived from 304 registrations of the corresponding magnitude volumes using FSL-FLIRT (FSL 5.0.9) (Jenkinson 305 et al., 2012) with 6-parameter rigid transformations, a normalized mutual information (NMI) cost function, and spline interpolation. Phase unwrapping was performed on the registered 306 307 phase volumes acquired at TE = 29.48 ms using the Laplacian method (Schofield & Zhu, 2003), 308 background-phase removal using V-SHARP (Variable-kernel Sophisticated Harmonic Artifact 309 Reduction for Phase data) (Li et al., 2011; Özbay et al, 2017; Schweser et al., 2011), and field-to-310 source inversion, individually for all orientations, using an iterative LSQR solver in Matlab 311 (iLSQR) (Li et al., 2011; 2015). The iLSQR algorithm as implemented in the STI Suite (Li et al, 312 2014) was also employed for susceptibility-tensor reconstruction and a decomposition into its eigenvalues (χ_1, χ_2, χ_3) and corresponding eigenvectors. Additionally, the previously 313 314 introduced mean magnetic susceptibility (MMS) and magnetic susceptibility anisotropy (MSA) 315 were calculated as orientation-independent tensor measures (Li et al., 2017). Separately, corresponding diffusion tensor reconstructions from the DWI data as well as calculations of 316 317 eigenvalues (λ_1 , λ_2 , λ_3), eigenvectors, MD and fractional anisotropy (FA) were performed using 318 the DTIFIT tool of the FMRIB Diffusion Toolbox (FDT; FSL 5.0.9).

Following registration of the GRE and DWI acquisitions to the same reference, voxelwise CSA-ODFs were estimated separately from the orientation-dependent phase or diffusivity data using the DIPY package (Python). The DTI-based FA metric was employed for deriving a mask including only regions of sufficient tissue anisotropy (FA > 0.2). Further processing of the local phase data included outlier exclusion by thresholding and normalization to [0,1] prior to the ODF estimation (Figure 2).

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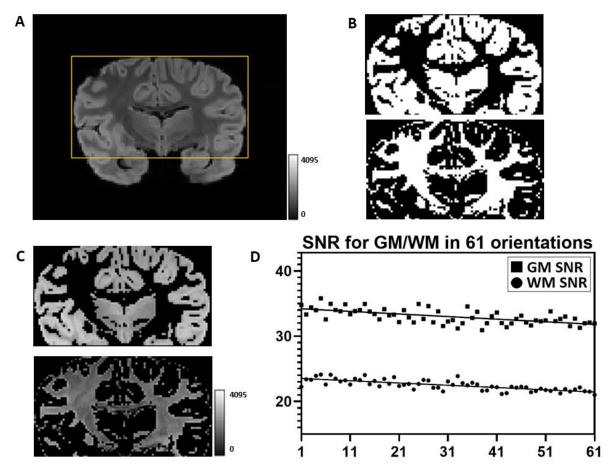


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326 Figure 2. Simplified schematics of the pipelines employed for QSM as well as STI and ODF derivation 327 from high-angular GRE phase data. The complex-valued GRE data from each of the 32 coil channels are 328 saved individually and combined using SVD-ESPIRiT. (Left) QSM pipeline starting with Laplacian 329 phase unwrapping on the combined raw phase and local δB_0 estimation and removal using V-SHARP 330 and, finally, field-to-source inversion, to obtain relative χ values employing iLSQR. (Right) STI and 331 HARSI pipeline with registration of the multi-orientation phase volumes to a reference employing 332 transformations derived from registrations of the corresponding magnitude volumes. Phase 333 unwrapping and background-phase removal is performed individually for each orientation. iLSQR is

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also employed for susceptibility-tensor reconstruction. For ODF estimation, further pre-processing(masking, normalization, outlier removal) is required.



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Figure 3. (A) Indication of the ROI (central coronal slice) used for the SNR calculation of the magnitude
GRE images and (B) GM and WM masks derived by thresholding of the reference image acquired at
TE=29.48 ms as well as (C) corresponding (magnitude) signal intensities in these masks. (D) The SNR
metrics obtained from the 61 registered, consecutively reoriented magnitude volumes shows minor
fluctuations about the reference value in both WM (circles) and GM (squares) as well as a subtle drift.
Note that the orientations in (D) are ordered according to the time of the individual acquisitions. The
drifts can be fitted to straight lines, which were separately calculated for the WM and GM segments.

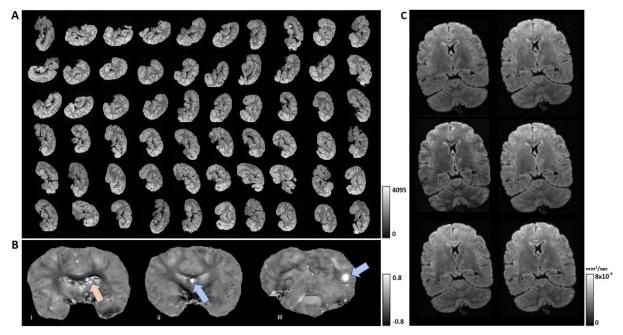
For quality assessment, the SNR was calculated for each registered GRE volume based 344 on the magnitude images. Briefly, GM and WM masks were calculated using thresholding on 345 the reference GRE dataset, and a 3D region of interest (ROI) was defined within ranges of ±20 346 voxels in anterior-posterior, ±50 voxels in inferior-superior and ±25 voxels in right-left 347 348 direction around the center (Figure 3A–C). The ROI included the most significant WM areas 349 as well as the cortical and subcortical GM. After isolating the ROI and masking, all remaining 350 voxels were included in the analysis. Finally, an ROI of 30×30×30 voxels was identified within the artifact-free background to assess the noise, and simplified SNR estimates in GM and WM 351 were obtained from the average signal intensities in the tissue segment divided by the 352 353 standard deviation (SD) of the noise.

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354 3. Results

355 *3.1. Data quality*

The image quality of the ME-GRE acquisitions at different orientations is demonstrated 356 in Figure 4A. Visual assessment of the local (tissue) phase of the reference volume for 357 identifying artifacts indicated the presence of multiple small air bubbles within the cavity of 358 the left lateral ventricle as well as single bubbles in two other regions (Figure 4B). This verified 359 360 that the bubble-removal procedure was successful in most parts of the specimen and that 361 remaining artifacts did not degrade the data quality in regions selected for the further analysis. 362 Due to the use of the close-fitting anatomically shaped container, FSL-FLIRT achieved consistent registrations to the reference of both the orientation-dependent GRE data as well as 363 the DWI data. Maximum deviations in the SNR of the orientation-dependent GRE acquisitions 364 were within ±8.4% compared to the reference result indicating consistent quality throughout 365 366 the experiment (mean SNR±SD: 33.0±1.1, range: 30.9–35.8 in GM and mean SNR±SD: 22.5±0.8, range: 20.9–23.9 in WM). Figure 3D further indicates an approximately linear decay of the SNR 367 in both segments as a function of time. This decay during more than 12h scan time is of similar 368 369 magnitude as the scan-to-scan SNR fluctuations and probably related to subtle drifts of the main field and shim currents. As such drift effects are corrected by the background-phase 370 371 removal of the QSM pipeline, they do not lead to a relevant degradation of the phase data. 372 Visual inspection of the DWI data (Figure 4C) indicates that an excellent quality is achieved with the segmented ME sequence implementation and the Connectom gradients, despite the 373 374 substantially reduced diffusivity in fixed tissue at room temperature.



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Figure 4. (A) Demonstration of the magnitude image quality obtained at TE=29.48 ms in 61 consecutive
GRE acquisitions with reorientation of the sample (center slice of each individual dataset). (B) Local
phase images at the reference orientation indicating artifacts related to remaining small air bubbles
within the cavity of the left lateral ventricle (left; orange arrow) as well as at two other positions (middle
and right; blue arrows). (C) Examples of images obtained at different directions of the diffusionweighting gradient for demonstration of the data quality of the DWI experiment.

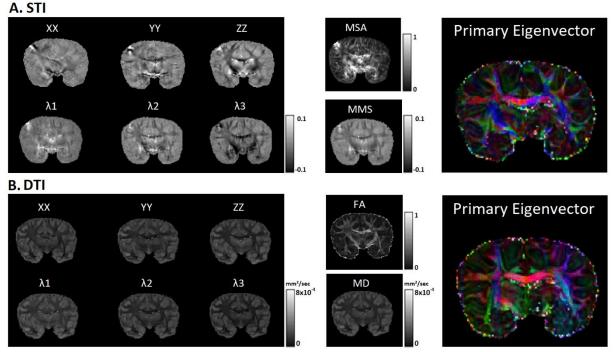




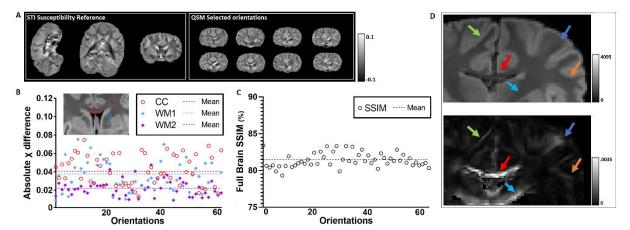
Figure 5. (A) Diagonal susceptibility-tensor components obtained with STI (left column, top row) and corresponding eigenvalues (left column, bottom row) as well as MMA and MSS (middle column) and color-coded susceptibility primary eigenvector weighted by the DTI-based FA (right column). (B) Diagonal diffusion-tensor components obtained with DTI (left column, top row) and corresponding eigenvalues (left column, bottom row) as well as FA and MD (middle column) and color-coded diffusivity primary eigenvector weighted by the DTI-based FA (right column). Note resemblances but also differences between the directions of the primary eigenvectors obtained with STI and DTI.

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390 *3.2. Tensor-based analyses*

The high-angular GRE phase dataset provided unprecedented susceptibility tensor 391 quality (Figure 5A). Similarly, an excellent diffusion-tensor quality was obtained with DWI, 392 393 which was of equivalent spatial and angular resolution as the GRE acquisitions (Figure 5B). 394 Consistently, the eigen-analysis of the diffusion data yielded a high quality of the MD and FA. The corresponding susceptibility metrics, MMS and MSA, yielded robust differentiation 395 between WM and GM. The MMS exhibited local differences also within WM, indicating a 396 397 particular sensitivity to the underlying microstructure of the voxels. The MSA results 398 suggested a high sensitivity to microstructural changes but also to spurious noise from residual artifacts. Due to this slightly enhanced noise sensitivity of MSA, the DTI-derived FA 399 map was selected as a more robust indicator of anisotropy. 400

401 The similarity of features extracted within WM with STI and DTI as indicated by a comparison of the color-coded primary eigenvectors in Figure 5 (weighted by the FA for better 402 visualization) is consistent with previous results employing a more restricted variation of 403 orientations (Li et al., 2017). Note that the limitations inherent to mono-tensorial approaches 404 405 allow for the identification of only a single maximum per voxel, corresponding to an average main fiber direction. Given this limitation, a qualitative resemblance of the STI and DTI results 406 is obvious. Absolute similarity may not be expected due to the multi-step post-processing 407 408 pipeline required for STI as well as contributions to susceptibility from other sources (e.g., iron) besides myelinated axons and differential sensitivities to fiber crossing between STI and 409 DTI. 410



411

412 Figure 6. QSM analyses performed under the assumption of a scalar susceptibility. **(A)** STI-based results **413** taking the χ_{33} tensor component (Langkammer et al., 2018) as a reference susceptibility **(left)** and **414** comparison with standard QSM results of eight (out of 61) exemplarily selected measurements with

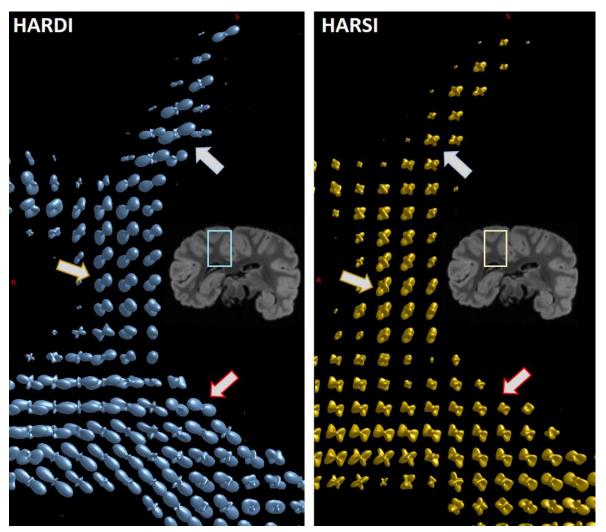
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reorientation of the specimen in the magnetic field (right). (B) Absolute difference between the reference
and QSM results obtained without consideration of orientation dependence in three selected WM ROIs.
Larger differences are obtained in areas of higher anisotropy (e.g., corpus callosum). (C) SSIM between
the reference and QSM results without consideration of orientation dependence varies between 78 and
83%. (D) Voxel-wise variance map (bottom) of 61 QSM results obtained with different orientations.
Similar to findings with DWI, increased variance is evident in areas of high structural anisotropy. The
top image shows a magnitude image at the same slice position.

422 3.3. Impact from anisotropy in QSM

423 The 'scalar' susceptibility reference derived from STI (i.e., the χ_{33} tensor component) and 424 from QSM obtained under the assumption of a scalar isotropic susceptibility for 10 exemplary 425 orientations (of the total of 61 acquisitions) are presented in Figure 6A. Visual inspection yields 426 obvious differences between acquisitions obtained with different orientation of the specimen 427 in the magnetic field. As expected, these differences are pronounced in WM regions, where the local anisotropy is high. The absolute difference between the reference χ_{33} and the 428 estimated χ obtained with acquisitions at different specimen orientation was investigated 429 430 quantitatively in three selected WM ROIs (Figure 6B), yielding a fluctuation between 0.01 and 0.045 ppm (mean: 0.022 ppm, median: 0.021 ppm). Among these regions, those with higher 431 structural anisotropy yielded larger differences upon reorienting the specimen. The corpus 432 433 callosum was characterized by the largest range of variations, followed a similar albeit reduced effect obtained in other selected WM regions. The structural similarity index measure (SSIM) 434 between χ_{33} and QSM at different orientations within the entire volume (Figure 6C) fluctuated 435 between 78 and 83% (mean: 81%, median: 81%). Additional voxel-wise mapping of the 436 437 variance of differences between the STI-based χ_{33} reference and QSM estimations at different orientations also indicated increased variance in WM areas associated with higher anisotropy 438 439 (Figure 6D). Such variance variations were observed even within bundles. These resemble previously reported comparisons of QSM and STI-based reference results underlining the 440 441 need for considering orientation dependence in WM χ estimations targeted at high accuracy.

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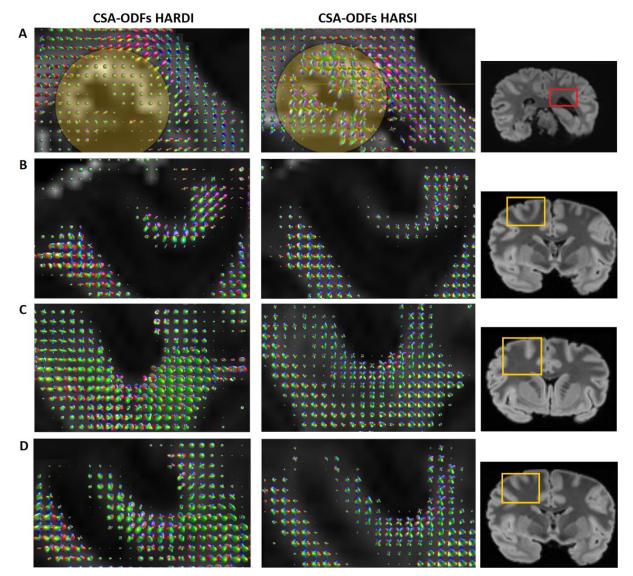
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Figure 7. Comparison of (A) HARDI and (B) HARSI-derived ODFs in a preselected ROI with WM and
surrounding GM as indicated in the insert. Color-coding of directions is not shown to better emphasize
on the directionality of the estimated spherical harmonics (4th order). Diffusion-based ODFs point
mostly towards one main orientation, while the phase-based ODFs indicate a higher sensitivity to
secondary orientations (see arrows pointing to a characteristic example).

448 3.4. ODF estimations

Characteristic examples of HARDI- and HARSI-derived ODFs with 4th-order spherical
harmonics are shown in Figure 7. Visual inspection indicates that diffusion-based ODFs point
mostly towards one main fiber orientation while the phase-based ODFs show sensitivity to the
secondary orientations, with the results indicating clearly separated lobes of similar size, in at
least 2 directions.

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Figure 8A, demonstrates the effect from residual air bubbles in the left lateral ventricle 461 leading to characteristic artifacts affecting the phase-based ODFs in the surrounding region. 462 463 In comparison, diffusion-based ODFs appear to be more immune to such perturbations. 464 Further examples of ODFs obtained in artifact-free regions with diffusion and phase-based acquisitions are presented in Figure 8B–D. These results indicate an efficiency in depicting 465 characteristics of the underlying fiber formations for both methods as well as distinct 466 differences in the local shapes of the spherical harmonics reflecting the distributions. Further 467 evident is some additional noise in HARSI-derived ODFs, as expected due to the multistep 468

<sup>Figure 8. CSA-ODFs (4th-order spherical harmonics; FA mask as background) in selected ROIs (indicated
in the right column) obtained with HARSI (left column) and HARDI (central column). (A) Remaining
air bubbles in the left ventricle produce local field distortions leading to characteristic perturbations of
the phase-based ODFs in the surrounding region (circled area), whereas the diffusion-based ODFs are
relatively immune to this artifact. (B–D) Resemblance between the methods as well as characteristic
differences in the sensitivity to second-order fibers in regions that are free from such artifacts.</sup>

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469 processing pipeline required for susceptibility data including registration of the acquisitions470 at different orientation.

471 4. Discussion

The current work goes beyond earlier investigations of orientation dependence of 472 magnetic susceptibility in the brain in several ways: (i) While previous experiments largely 473 474 focused on fixed rodent brain, the chimpanzee brain is morphologically much closer to the 475 human brain with similar cellular composition and relative volume of WM (Herculano-Houzel, 2012). However, the smaller size (approx. 400 g compared to a typical human brain of 476 1.5 kg) allows for unconstrained reorientation in a standard head coil and more efficient 477 478 sampling supporting high angular and spatial resolution acquisitions within an acceptable 479 time. (ii) With 61 orientations, the angular resolution matches current DWI protocols that 480 support extraction of information on fiber orientation distributions to identify fiber crossings 481 or other complex patterns in WM. This permits to go beyond previous work restricted to STI. 482 (iii) Simultaneously acquired DWI data of the same angular and spatial resolution support 483 direct voxel-level comparisons of phase and diffusion-based results.

Visual comparison of the ME acquisitions at different orientations to the reference scan indicate consistent quality, which is further supported by the comparison of the achieved image SNR. Apart from local artifacts due to a few remaining air bubbles, there were no extended susceptibility artifacts, while a high quality of the registration permitted voxel-wise analysis.

489 The HARSI-derived ODFs indicated sensitivity to complex geometries associated with 490 intersecting axonal fiber bundles-similar to HARDI-derived results obtained at the same 491 spatial and angular resolution. Interestingly, a closer qualitative voxel-wise comparison of 492 estimated fiber densities suggests-in several instances-that HARSI-based results indicate 493 separated lobes of similar size in two main directions, whereas HARDI-based ODFs appear to point more towards a main direction, with smaller sized lobes existing towards other 494 495 directions. It is well documented that the water diffusion coefficient (at ambient temperature) 496 is reduced to 30–50% of the *in-vivo* value (at body temperature) after *in-situ* perfusion fixation 497 (Sun et al., 2003), with further alterations occurring during the post-mortem interval (i.e., the

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498 interval between death and fixation) (D'Arceuil & de Crespigny, 2007; Miller et al., 2011) and 499 during fixation (Georgi et al., 2019; Yong-Hing et al., 2005). Diffusion anisotropy reductions in 500 WM have also been observed (D'Arceuil & de Crespigny, 2007; Miller et al., 2011), which may be related to increased membrane permeability (Shepherd et al., 2009). Aldehyde fixation 501 finally induces moderate (T_1) or strong (T_2) shortening of tissue water relaxation times 502 503 (Pfefferbaum et al., 2004), which is, however, mitigated by soaking the specimen in PBS (Shepherd et al., 2009) as performed in the current study. Taken together, this leads to 504 505 unfavorable conditions for high-resolution DWI as correspondingly stronger *b*-values are required for resolving multiple fiber populations, without excessive prolongation of TE. For 506 507 *in-vivo* MRI of human brain, *b*-values around 3,000 s/mm² were recommended for an improved identification of peaks in the ODF (Jones et al, 2013). Considering the reduced diffusivity under 508 509 conditions of the current work, the *b*-value of $5,000 \text{ s/mm}^2$ obtained at TE = 53.5 ms with the 510 Connectom gradient system should suffice to resolve bundles intersecting at angles \geq 45° but 511 may fall short to robustly discriminate them in the range of 30–45° (Descoteaux et al., 2009). 512 Consequently, the HARDI-based ODFs will be increasingly dominated by contributions from 513 one major bundle for intersections at angles <45°.

514 For both HARDI- and HARSI-based ODF estimations, there is no immediate information about the relative position of different fiber populations within a given voxel, which limits the 515 516 differentiation of 'crossing' and 'kissing' fiber configurations (Jones et al., 2013). Minimizing 517 the number of voxels containing multiple bundles by increasing the spatial resolution is, therefore, of ongoing interest. Diffusion-based tractography in fixed mouse brain at (isotropic) 518 519 43 µm has been achieved in previous work employing a dedicated small-bore scanner 520 (Calabrese et al., 2015). Scanning of hominid whole-brain specimens requires large magnet 521 bores and is technically more challenging, but also particularly interesting due to their more complex WM architecture. Resolutions around 500 µm seem to be the current limit with 522 available hardware in such experiments (Eichner et al., 2020; Fan et al., 2022). In comparison, 523 QSM acquisitions are less demanding on the hardware, and the signal loss at TEs in the order 524 of 25 ms at 3 T or 12 ms at 7 T that are required for sufficient phase evolution is smaller than 525 that inherent to DWI. Consequently, human whole-brain (magnitude) GRE datasets at 100-526 200 µm are available as digital resources (Alkemade et al., 2022; Ding et al., 2016; Edlow et al., 527 528 2019). Although the precise registration of multi-orientation phase data remains challenging,

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the HARSI approach introduced here as a proof of concept holds great potential to go beyond current (spatial) resolution limits of diffusion-based investigations of connectivity patterns. Currently existing histological methodologies to obtain 3D information on the fiber architecture require complicated preparations (Morawski et al., 2018). These are important for a validation of MRI-derived results but currently limited to rather small brain sections.

534 A fundamental difference between the HARSI approach in comparison to HARDI techniques lies in the biophysical underpinning of the contrast mechanism, which is unrelated 535 536 to water diffusion. In WM, myelin is a major barrier to water diffusion and contributes to 537 diffusion anisotropy, however, diffusion anisotropy is also observed when no myelin is present (Beaulieu, 2002; Sen & Basser, 2005). Myelin also provides a primary contribution to 538 susceptibility, however, significant susceptibility anisotropy was not observed before 539 540 myelination sets in (Argyridis et al., 2014). Moreover, the signal phase is also strongly affected 541 by the presence of paramagnetic compounds, in particular, iron stores in oligodendrocytes 542 and astrocytes (Möller et al., 2019). Glial cells are known to cluster in short rows parallel to the 543 axons they support (Baumann & Pham-Dinh, 2001; Suzuki & Raisman, 1992), which has 544 recently allowed to obtain information on WM fiber architecture from Nissl stainings of postmortem histological slices (Schurr & Mezer, 2021). In summary, both contributions to 545 susceptibility in WM are roughly characterized by cylindrical geometries (hollow cylinders 546 547 and rows) and should, hence, report on the particular arrangement of fibers within a voxel. A 548 fundamental difference, however, is that the diamagnetic contribution to (anisotropic) 549 susceptibility from myelin results from components of anisotropic molecular structures in the 550 lipid bilayers forming myelin (Wharton & Bowtell, 2012) whereas the paramagnetic contribution may be better described as a microscopic (i.e., cellular) compartmentalization of 551 552 susceptibility sources (Chu et al., 1990; He & Yablonskiy, 2009; Lee et al., 2010).

We note that the 12 echoes acquired for each orientation provide a potential for R_2^* reconstruction and further analyses related to tissue structure and composition, which is beyond the scope of this study. Recently, progress has been made in separating contributions to (isotropic) QSM from opposite susceptibility sources by modeling the R_2^* decay with multiple complex exponentials (Chen et al., 2021) or by considering the combined effects on the frequency shift and transverse relaxation rate (Shin et al., 2021). These techniques are, in general, compatible with our HARSI approach, and a corresponding combination might

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- 560 expand the information about microstructural tissue characteristics as well as molecular and
- 561 microscopic sources of orientation dependence that are complementary to the information
- 562 accessible through DWI.

563

564 CRediT Statement

- 565 Dimitrios G. Gkotsoulias: Conceptualization, Methodology, Software, Validation, Formal
- 566 analysis, Investigation, Writing Original Draft, Writing Review Editing, Visualization
- 567 Roland Müller: Methodology, Resources
- 568 Carsten Jäger: Methodology, Resources
- 569 Torsten Schlumm: Software, Data Curation
- 570 Toralf Mildner: Methodology, Resources, Writing Review Editing
- 571 Cornelius Eichner: Conceptualization, Writing Review Editing
- 572 André Pampel: Conceptualization, Writing Review Editing
- **573 Jennifer Jaffe:** Resources
- 574 **Tobias Gräßle:** Resources
- 575 Niklas Alsleben: Software
- 576 Jingjia Chen: Validation
- 577 Catherine Crockford: Resources, Writing Review Editing
- 578 Roman Wittig: Resources, Writing Review Editing
- 579 Chunlei Liu: Conceptualization, Writing Review Editing, Funding acquisition
- 580 Harald E. Möller: Conceptualization, Methodology, Resources, Writing Original Draft,
- 581 Writing Review Editing, Supervision, Project administration, Funding acquisition,
- 582 Supervision
- 583

584 Acknowledgements

This work was funded by the EU through the ITN "INSPiRE-MED" (H2020-MSCA-ITN-585 586 2018, #813120). Chunlei Liu and Jingjia Chen were supported in part by the National Institute of Aging of the National Institutes of Health (Award No. R01AG070826). We particularly 587 thank Angela D. Friederici and Nikolaus Weiskopf and further Evolution of Brain 588 Connectivity (EBC) project organizers, the Ministère de l'Enseignement Supérieur et de la 589 590 Recherche Scientifique and the Ministère des Eaux et Fôrets, Côte d'Ivoire, the Office Ivoirien 591 des Parcs et Réserves, and the staff of the Taï Chimpanzee Project for permitting and 592 supporting this research. Appreciation is extended to Michael Paquette, Riccardo Metere and

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- 593 Alfred Anwander for helpful methodological discussions and sharing of related processing
- 594 packages.

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824 Figure Captions

Figure 1. (A) Direction unit vectors of 61 evenly distributed orientations on the surface of a 825 826 sphere as calculated by MRtrix3. (B) Design of the inner container based on the surface 827 rendering of a 3D T_1 -weighted dataset. (C, D) 3D-printed container, adapted to the brain's individual anatomy with indications of the approximate dimensions. The specimen is 828 immersed in Fomblin, and the container is carefully sealed using tape (x=105mm, y=125mm). 829 (E) View of the specimen "Fredy" inside the anatomical container, positioned inside an outer, 830 spherical container with indications of the calculated directions for reorientations. The outer 831 container is positioned on a custom-made holder with an additional angle indicator that 832 833 supports robust positioning in the RF coil and accurate reorientation.

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835 Figure 2. Simplified schematics of the pipelines employed for QSM as well as STI and ODF 836 derivation from high-angular GRE phase data. The complex-valued GRE data from each of the 837 32 coil channels are saved individually and combined using SVD-ESPIRiT. (Left) QSM 838 pipeline starting with Laplacian phase unwrapping on the combined raw phase and local δB_0 estimation and removal using V-SHARP and, finally, field-to-source inversion, to obtain 839 840 relative χ values employing iLSQR. (**Right**) STI and HARSI pipeline with registration of the multi-orientation phase volumes to a reference employing transformations derived from 841 842 registrations of the corresponding magnitude volumes. Phase unwrapping and backgroundphase removal is performed individually for each orientation. iLSQR is also employed for 843 susceptibility-tensor reconstruction. For ODF estimation, further pre-processing (masking, 844 normalization, outlier removal) is required. 845

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Figure 3. (A) Indication of the ROI (central coronal slice) used for the SNR calculation of the 847 848 magnitude GRE images and (B) GM and WM masks derived by thresholding of the reference image acquired at TE=29.48 ms as well as (C) corresponding (magnitude) signal intensities in 849 these masks. (D) The SNR metrics obtained from the 61 registered, consecutively reoriented 850 magnitude volumes shows minor fluctuations about the reference value in both WM (circles) 851 and GM (squares) as well as a subtle drift. Note that the orientations in (D) are ordered 852 according to the time of the individual acquisitions. The drifts can be fitted to straight lines, 853 which were separately calculated for the WM and GM segments. 854

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Figure 4. (A) Demonstration of the magnitude image quality obtained at TE=29.48 ms in 61 consecutive GRE acquisitions with reorientation of the sample (center slice of each individual dataset). **(B)** Local phase images at the reference orientation indicating artifacts related to remaining small air bubbles within the cavity of the left lateral ventricle (left; orange arrow) as well as at two other positions (middle and right; blue arrows). **(C)** Examples of images obtained at different directions of the diffusion-weighting gradient for demonstration of the data quality of the DWI experiment.

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Figure 5. (A) Diagonal susceptibility-tensor components obtained with STI (left column, top row) and corresponding eigenvalues (left column, bottom row) as well as MMA and MSS

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(middle column) and color-coded susceptibility primary eigenvector weighted by the DTIbased FA (right column). (B) Diagonal diffusion-tensor components obtained with DTI (left
column, top row) and corresponding eigenvalues (left column, bottom row) as well as FA and
MD (middle column) and color-coded diffusivity primary eigenvector weighted by the DTIbased FA (right column). Note resemblances but also differences between the directions of the
primary eigenvectors obtained with STI and DTI.

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873 Figure 6. QSM analyses performed under the assumption of a scalar susceptibility. (A) STIbased results taking the χ_{33} tensor component (Langkammer et al., 2018) as a reference 874 susceptibility (left) and comparison with standard QSM results of eight (out of 61) exemplarily 875 selected measurements with reorientation of the specimen in the magnetic field (right). (B) 876 Absolute difference between the reference and QSM results obtained without consideration of 877 878 orientation dependence in three selected WM ROIs. Larger differences are obtained in areas 879 of higher anisotropy (e.g., corpus callosum). (C) SSIM between the reference and QSM results 880 without consideration of orientation dependence varies between 78 and 83%. (D) Voxel-wise variance map (bottom) of 61 QSM results obtained with different orientations. Similar to 881 findings with DWI, increased variance is evident in areas of high structural anisotropy. The 882 top image shows a magnitude image at the same slice position. 883

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Figure 7. Comparison of (A) HARDI and (B) HARSI-derived ODFs in a preselected ROI with
WM and surrounding GM as indicated in the insert. Color-coding of directions is not shown
to better emphasize on the directionality of the estimated spherical harmonics (4th order).
Diffusion-based ODFs point mostly towards one main orientation, while the phase-based
ODFs indicate a higher sensitivity to secondary orientations (see arrows pointing to a
characteristic example).

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Figure 8. CSA-ODFs (4th-order spherical harmonics; FA mask as background) in selected ROIs (indicated in the right column) obtained with HARSI (left column) and HARDI (central column). (**A**) Remaining air bubbles in the left ventricle produce local field distortions leading to characteristic perturbations of the phase-based ODFs in the surrounding region (circled area), whereas the diffusion-based ODFs are relatively immune to this artifact. (**B**–**D**) Resemblance between the methods as well as characteristic differences in the sensitivity to second-order fibers in regions that are free from such artifacts.

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