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# Diffusion tensor imaging during recovery from severe traumatic brain injury and relation to clinical outcome: a longitudinal study

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Diffusion tensor imaging (DTI) has been proposed as a sensitive biomarker of traumatic white matter injury, which could potentially serve as a tool for prognostic assessment and for studying microstructural changes during recovery from traumatic brain injury (TBI). However, there is a lack of longitudinal studies on TBI that follow DTI changes over time and correlate findings with long-term clinical outcome. We performed a prospective longitudinal study of 30 adult patients admitted for subacute rehabilitation following severe traumatic brain injury. DTI and conventional MRI were acquired at mean 8 weeks (5-II weeks), and repeated in 23 of the patients at mean 12 months (9-15 months) post-trauma. Using a region-of-interest-based approach, DTI parameters were compared to those of healthy matched controls, scanned during the same time period and rescanned with a similar interval as that of patients. At the initial scan, fractional anisotropy was reduced in all the investigated white matter regions in patients compared to controls ( $P \le 0.01$ ) due to decreased diffusivity parallel  $(\lambda_{\parallel})$  and increased diffusivity perpendicular  $(\lambda_{\perp})$  to axonal fibre direction. Fractional anisotropy in the cerebral peduncle correlated with  $\sim$ I year Glasgow outcome scale score (r = 0.60, P < 0.00I) and in this sample predicted dichotomized outcome with 76% accuracy when taken alone, and with 100% accuracy in combination with clinical evaluation by functional independence measure at the time of the first scan. At follow-up DTI, fractional anisotropy in patients had increased in the internal capsule and in centrum semiovale ( $P \leq 0.01$ ) due to an interval increase of  $\lambda_{\parallel}$  with unchanged  $\lambda_{\perp}$ . In these regions, fractional anisotropy and  $\lambda_{\parallel}$  reached normal or supranormal levels, primarily in patients with favourable outcome. In the cerebral peduncle and in corpus callosum,  $\lambda_{\parallel}$  and  $\lambda_{\perp}$  both increased during the scan interval and, particularly in patients with unfavourable outcome, fractional anisotropy remained depressed. No significant DTI parameter changes over time were found in controls, or in CSF of patients. These findings support that DTI is a clinically relevant biomarker in TBI, which may have prognostic value and also might serve as a tool for revealing changes in the neural tissue during recovery.

**Keywords:** diffusion tensor imaging (DTI); traumatic brain injury (TBI); magnetic resonance imaging (MRI); outcome prediction; neuroplasticity

**Abbreviations:** CP = cerebral peduncle; CSO = centrum semiovale; DAI = diffuse axonal injury; DTI = diffusion tensor imaging; FA = fractional anisotropy; FLAIR = fluid-attenuated inversion recovery; FIM = functional independence measure; GCS = Glasgow coma scale; GOS = Glasgow outcome scale; ISS = injury severity score; MD = mean diffusivity; PCC = posterior aspect of corpus callosum; PLIC = posterior limb of internal capsule; PTA = post-traumatic amnesia; PUT = putamen; ROIs = regions of interest; TBI = traumatic brain injury

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#### Introduction

Traumatic brain injury (TBI) is a major cause of death and severe disability under the age of 45 years in Western countries (MacKenzie, 2000). Diffuse-type (non-focal) injuries are generally the most devastating, yet their assessment in vivo is hampered by the low sensitivity of conventional imaging. The key mechanism of primary injury is diffuse axonal injury (DAI), which results from rotational acceleration-deceleration causing shear strain deformation and subsequent disconnection of axons. DAI is characterized by microscopic lesions scattered throughout the white matter, with the parasagittal white matter, corpus callosum and the dorsolateral upper brainstem being most commonly involved. Secondary hypoxic-ischaemic injury due to, e.g. insults of hypotension, hypoxia and/or increased intracranial pressure, is known to markedly worsen prognosis following TBI (see e.g. Chesnut et al., 1993). With time both of these diffuse-type injuries lead to Wallerian-like degeneration of white matter (Graham and Gennarelli, 1997).

Recently, much interest has been directed towards the potential of diffusion tensor imaging (DTI) as a tool for in vivo quantification of white matter microstructural alterations following TBI (see e.g. Schiff, 2006). DTI is a relatively new MRI modality that non-invasively provides information regarding the degree and directionality of tissue water diffusion (Basser et al., 1994). This technique describes the diffusion process using three eigenvectors, of which the magnitudes, the eigenvalues  $(\lambda_1, \lambda_2, \lambda_3)$ , quantify the diffusion in three orthogonal directions. Due to barriers to water diffusion imposed by e.g. myelin and membranes, hindrance of diffusion is larger across than along axonal fibres, causing diffusion in white matter to be anisotropic. Anisotropy is commonly expressed relative to the magnitude of the diffusion tensor as the fractional anisotropy (FA) (Pierpaoli and Basser, 1996), and this index ranging from 0 to 1 is found to be higher in intact white matter consisting of highly parallel fibres. Mean diffusivity (MD), or 'apparent diffusion coefficient', refers to the average of the three eigenvalues. While commonly only these summary parameters, FA and MD, are reported, the underlying eigenvalues hold additional valuable information as they may be selectively affected with certain pathological processes (Song et al., 2002).

In a recent experimental study, correlations between DTI and histology of DAI were demonstrated (Mac Donald et al., 2007). Prior clinical DTI-studies on TBI have found reduced FA in several white matter areas, both within lesions and in tissue appearing normal on conventional MRI (Rugg-Gunn et al., 2001; Arfanakis et al., 2002; Chan et al., 2003; Ptak et al., 2003; Huisman et al., 2004; Inglese et al., 2005; Salmond et al., 2006; Nakayama et al., 2006). At post-acute stages, MD in areas of decreased FA has been found to be normal or increased (Rugg-Gunn et al., 2001; Chan et al., 2003; Inglese et al., 2005; Salmond et al., 2006; Nakayama et al., 2006). The eigenvalues were reported

in one of the aforementioned studies of five patients with mild TBI (Arfanakis et al., 2002) and in one case study (Le et al., 2005), suggesting that decrease of the major eigenvalue,  $\lambda_1$ , and increase of the minor eigenvalues  $\lambda_2$  and  $\lambda_3$  may underlie FA (and MD) alterations. Some association has been reported between DTI values (in splenium and internal capsule) and short-term outcome (Huisman et al., 2004). However, as most prior studies were cross-sectional, few investigated correlations of DTI with long-term (>6 months) clinical outcome. Moreover, little is known about the long-term evolution of diffusion abnormalities during recovery from TBI. Apart from reports on one or two patients (Arfanakis et al., 2002; Naganawa et al., 2004; Le et al., 2005; Voss et al., 2006), longitudinal DTI studies in TBI have not, to our knowledge, been published previously. DTI repeated during rehabilitation and correlated with long-term clinical outcome may add to our understanding of the natural course of diffuse traumatic injuries and of the mechanisms of neuroplasticity and repair operating during recovery from TBI.

We performed a prospective longitudinal study of 30 patients with severe TBI, comparing results to 30 healthy matched controls. With the current study we sought to examine the correlation between white matter DTI measures in the late subacute (or early chronic) phase and 1-year clinical outcome, and to investigate whether DTI repeated about 1 year post-trauma would detect white matter microstructural alterations. Additionally, we wished to determine which diffusivity changes underlie FA (and MD) abnormalities in severe TBI. We hypothesized that, for one or more of the investigated white matter areas, (i) FA would be reduced in TBI patients in the late subacute phase, (ii) FA would increase in patients during the scan interval, (iii) FA would deviate more from control values, at both scan time points, in patients with poorer long-term clinical outcome.

#### **Material and Methods**

#### **Subjects**

The study was approved by the local Scientific Ethics Committee (KF 01-038/03). Informed consent was obtained from the participants or from next of kin, meeting criteria of the Helsinki Declaration.

Thirty adult patients (age 18–65 years, mean 34 years; 23 males, 7 females) with severe TBI were recruited from the Brain Injury Unit at Copenhagen University Hospital Hvidovre, Denmark, to which they were admitted for subacute rehabilitation between 2003 and 2005. Severe TBI was defined as a post-resuscitation Glasgow Coma Scale (GCS; Teasdale and Jennett, 1974) score ≤8 measured within 24 h post-injury and prior to the initiation of paralytics or sedatives. Patients were referred from neuro-intensive units, and admitted for rehabilitation only if they had subnormal GCS after cessation of sedation. All adult patients with severe TBI admitted during the recruitment period were evaluated for study eligibility. Patients were excluded if they had any previous history of TBI or other neurological disorder, if contraindications to MRI or to sedation

Table I Clinical characteristics of patients

Patient	Age at scan I (years)		Cause of trauma	Post-resuscitation GCS	Neuro-surgery	ISS	Secondary insults	Days to GCS > 8	Duration of PTA (days)	FIM at scan I	FIM at I year	
I	19	М	MVA	4	_	35	+	10	>FU	29	83	3
2	23	F	MVA	3	_	43	+	36	79	47	120	3
3 <sup>a</sup>	23	F	Fall	3	_	45	+	>FU	>FU	18	18	2
<b>4</b> <sup>a</sup>	21	F	MVA	6	+	25	_	12	39	79	117	3
5 <sup>a</sup>	34	Μ	MVA	3	_	66	+	126	>FU	18	30	3
6 <sup>a</sup>	40	F	Fall	3	+	25	+	9	>FU	18	20	3
7 <sup>a</sup>	40	Μ	Assault	3	_	29	+	4	88	87	122	4
8 <sup>a</sup>	60	Μ	Fall	3	+	25	_	21	>FU	34	35	3
9 <sup>a</sup>	28	Μ	MVA	NA	_	34	_	24	66	122	125	5
10	54	Μ	Fall	NA	_	25	_	14	119	60	125	4
$II^{a}$	26	Μ	MVA	3	_	35	_	2	25	110	126	5
I2 <sup>a</sup>	24	Μ	MVA	3	_	26	_	1	39	93	125	4
13 <sup>a</sup>	65	Μ	Fall	3	_	29	_	3	39	116	120	4
<b>14</b> <sup>a</sup>	31	Μ	MVA	5	+	25	+	7	48	38	102	4
15 <sup>a</sup>	37	Μ	MVA	NA	+	38	_	14	40	117	122	5
16 <sup>a</sup>	22	Μ	MVA	NA	_	43	_	7	31	120	125	5
17 <sup>a</sup>	19	Μ	MVA	6	_	33	_	2	23	II3	124	5
18 <sup>a</sup>	41	F	MVA	6	+	34	_	10	65	55	113	4
19 <sup>a</sup>	26	Μ	MVA	6	_	25	+	22	65	106	124	4
20	60	Μ	Fall	3	_	26	+	18	289	31	30	3
21 <sup>a</sup>	22	Μ	MVA	3	_	43	+	9	178	18	103	3
22	61	Μ	Fall	5	+	25	+	22	>FU	18	25	3
23 <sup>a</sup>	23	Μ	MVA	3	_	25	+	П	107	23	Ш	3
24 <sup>a</sup>	18	F	MVA	3	_	29	+	15	66	24	105	3
25 <sup>a, b</sup>	40	Μ	Fall	3	+	25	_	10	84	100	117	4
26 <sup>a</sup>	53	Μ	Fall	4	+	25	+	5	171	18	Ш	4
27	28	Μ	Fall	3	_	38	+	15	180	18	36	3
28	31	Μ	MVA	3	_	38	+	33	>FU	18	22	3
29 <sup>a</sup>	27	Μ	MVA	6	_	45	+	10	77	49	113	4
30 <sup>a</sup>	26	F	MVA	7	_	29	_	4	58	59	126	5

<sup>a</sup>Patients who had follow-up DTI; <sup>b</sup>excluded from DTI analysis (acquisition error). MVA = motor vehicle accident; GCS = Glasgow coma scale; NA = not available (GCS ≤ 8 but exact GCS not documented); > FU = exceeds ~I year follow-up; ISS = injury severity score (> 25 indicates extra-cranial injury); PTA = post-traumatic amnesia; FIM = functional independence measure; Scan I = initial MRI; GOS = Glasgow outcome scale. See text for details.

during MRI were present, or if MRI could not be performed within 12 weeks post-trauma for safety or practical reasons.

After discharge, patients were re-admitted for clinical follow-up on average 12 months (9–15 months) post-injury (one patient who moved far away was instead visited and evaluated in his home by the treating physician). During, or as close as possible, to this stay a second scan was obtained in 23 of the patients. For the remaining patients follow-up DTI could not be acquired due to: relocation (n=1), inability to complete the repeat examination because of poor cooperation (n=4), insertion of MRI-incompatible implants (n=1), or scanner failure (n=1). Table 1 summarizes clinical data for the patients studied.

Thirty healthy controls, without any history of significant TBI or neurological disorder, were selected to match the patient group with respect to distribution of age, sex, educational level and abuse of alcohol and drugs (Table 2). Of these, 14 were investigated longitudinally with a time interval comparable to that of the patients.

#### Clinical assessments

For all patients, clinical data and ratings were documented in medical files. Cause of trauma was classified as motor vehicle accident (n=19), fall (n=10) or assault (n=1). Accidents with any direct involvement of a motor vehicle (including pedestrian or bicyclist hit by car) were classified as motor vehicle accident. GCS was registered frequently in the acute phase and daily during rehabilitation, only to be discontinued if stable at 15. As an indicator of the total injury severity to all organ systems, Injury Severity Score (ISS, Greenspan *et al.*, 1985) was assessed based on clinical data from the acute phase (ISS >25 indicates extracranial injury). Secondary insults were defined as the occurrence of any of the following in the acute or subacute phase: hypotension (systolic blood pressure <90 mmHg), hypoxia (oxygen saturation <90% or cyanosis in field) or high intracranial pressure (ICP >20 mmHg) (Jones *et al.*, 1994). Neurosurgery was defined as surgery that involved craniotomy, excluding insertion of ICP monitoring devices.

The number of days from TBI until GCS >8 was registered as a measure of coma duration, and the Galveston Orientation and Amnesia Test (Levin et~al., 1979) was repeatedly applied to establish duration of post-traumatic amnesia (PTA). Functional Independence Measure (FIM; Granger et~al., 1986) was documented regularly, including at both scan time points (sum score ranges from 18 indicating 'total assist', to 126 indicating 'complete independence'). Functional outcome at  $\sim$ 12 months post-TBI was

Table 2 Demographic characteristics of patient and control groups

	Scan I			Scan 2			
	Patients (n = 30)	Controls (n = 30)	Group differences	Patients (n = 23)	Controls (n = 14)	Group differences	
Age, scan I (years), mean (SD) Sex: M/F Education (years), mean (SD) Excessive alcohol intake (> 2I drinks per week for men, > I4 for women), Y/N Use of drugs (cannabinoids or	34.I (I4.3) 23/7 I3.3 (3.I) 5/25	34.0 (13.9) 23/7 13.4 (2.3) 4/26	$P > 0.99^{a}$ $P = 1.0^{b}$ $P > 0.99^{a}$ $P = 1.0^{b}$ $P > 0.6^{b}$	32.4 (I2.9) I7/6 I3.4 (3.1) 4/I9	31.2 (8.1) 9/5 13.7 (2.7) 0/14	$P > 0.7^{a}$ $P > 0.7^{b}$ $P > 0.7^{a}$ $P = 0.3^{b}$	
psycho-stimulants) > once a month, Y/N	3/2/	1/27	<i>F &gt;</i> 0.6	3/20	0/14	P — 0.3	

<sup>&</sup>lt;sup>a</sup>Independent-samples t-test; <sup>b</sup>Fishers exact test. Scan I = initial MRI; Scan 2 = follow-up MRI.

evaluated using the 5-point Glasgow Outcome Scale (GOS; Jennett and Bond, 1975), ranging from 1 = dead to 5 = good recovery. Based on previous literature (see e.g. Choi *et al.*, 2002), GOS = 1-3 was considered as unfavourable outcome and GOS = 4-5 as favourable outcome, thus distinguishing whether or not patients were able to live independently. All clinical ratings were performed by trained staff, neurologists and neuropsychologists unaware of DTI results.

#### MRI data acquisition

MRI including DTI was acquired 5–11 weeks (mean 8 weeks) after trauma. A more uniform time interval was not achievable, mainly because patients had to be medically stable when scanned. All patients were referred to conventional MRI for clinical purposes. DTI and other sequences not reported here were performed as an extension of the MRI examination. The majority of patients (n = 25) were sedated for the initial MRI, since they were unable to cooperate for MRI. Intravenously administered propofol was used for sedation, and patients were monitored by anaesthesiology staff. Oxygen supply and mechanical ventilation were provided when necessary.

All patients and controls were scanned on the same 1.5 T MRI scanner (Magnetom Vision; Siemens Medical Solutions, Erlangen, Germany) using a standard circular-polarized head coil. During the study period, MRI sessions for patients and controls were interleaved in time, and no major upgrades were carried out on the scanner. A 3D sagittal T1-weighted sequence (TR/TE/TI =  $13.5/7/100 \, \text{ms}$ , flip angle  $15^\circ$ , spatial resolution of  $\sim 1 \, \text{mm}^3$ ) was acquired in all subjects. For patients, additional conventional sequences included: axial T2-weighted images (spin-echo, TR/TE =  $5400/99 \, \text{ms}$ , 27 contiguous, 5 mm thick slices,  $0.5 \times 0.5 \, \text{mm}^2$  in-plane resolution), coronal T2\*-weighted gradient-echo images (TR/TE =  $544/15 \, \text{ms}$ , 34 contiguous, 5 mm thick slices,  $0.9 \times 0.9 \, \text{mm}^2$  in-plane resolution), axial and sagittal FLAIR (TR/TE/TI =  $9000/110/2500 \, \text{ms}$ , 34 contiguous, 5 mm thick slices,  $0.9 \times 0.9 \, \text{mm}^2$  in-plane resolution).

All subjects underwent DTI using a diffusion-weighted spinecho single-shot echo-planar imaging (EPI) sequence acquired with diffusion encoding in 6 non-collinear directions and averaged over six datasets for a total acquisition time of  $\sim\!15\,\mathrm{min}$ . The sequence parameters were as follows: TE = 60 ms, field of view 230 mm, matrix 128 × 128, 30 axial slices, 5 mm slice thickness, b values 0 and  $\sim\!740\,\mathrm{s/mm^2}$  with diffusion sensitizing gradient pulses of duration = 29 ms ( $\delta$ ) and separation = 52 ms ( $\Delta$ ).

Follow-up MRI was acquired in 23 of the patients (9–15 months post-injury, mean 12 months), and in 14 of the controls. A minimum of DTI and 3D T1-weighted images were obtained at follow-up with the parameters described earlier. Subjects were repositioned as close as possible to their position in the previous scan. For ethical reasons patients were sedated only if follow-up MRI was requested for clinical purposes and patients were unable to cooperate for MRI because of cognitive impairment. While 19 patients were fully cooperative, four were sedated for the follow-up MRI. Four patients were not sufficiently cooperative to complete the follow-up MRI but could not be sedated.

For one patient, careful inspection of the diffusion-weighted images acquired at the initial scan revealed an abnormally low signal-to-noise ratio (most likely due to miscalibration of the radio-frequency transmitter reference). We therefore excluded DTI data for this patient (initial and follow-up scan) from statistical analysis.

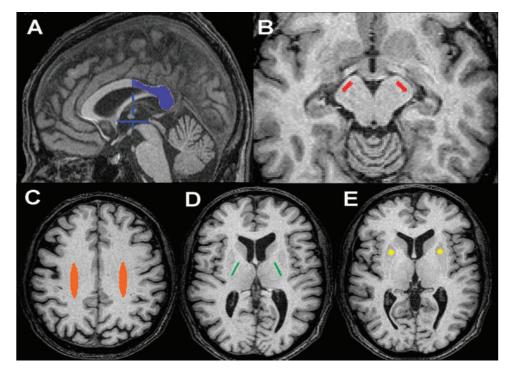
#### MRI data analysis

#### Evaluation of conventional MRI

The conventional images were qualitatively evaluated for all patients by an experienced neuroradiologist (M.H.) blinded to the DTI findings and clinical ratings. This evaluation included classification of all visible lesions based on their signal characteristics (see e.g. Gentry, 2002). Additional careful inspection of the regions of interest (ROIs) was done subsequently.

#### Regions of interest

Images were transferred to an offline workstation for post-processing, and were visually checked for quality. All ROIs were outlined manually on spatially normalized 3D T1-weighted structural images (Fig. 1). Spatial normalisation of the T1-weighted images according to the MNI template was performed using a 12 parameter transformation in SPM2 (http://www.fil.ion.ucl.ac.uk/spm). Using image display software (MIPAV, version 2.0, http://mipav.cit.nih.gov) the following white matter ROIs were positioned for each individual scan: posterior aspect of the corpus callosum (PCC), posterior limb of internal capsule (PLIC), centrum semiovale (CSO) and cerebral peduncle (CP). Additional ROIs in ventricular CSF and in the putamen (PUT), expected to be relatively unaffected by TBI, served as internal references for MD. In order to minimize misregistration stemming from



**Fig. 1** ROIs used in the study. ROIs were drawn on normalized 3D TI-W images (shown) for each individual scan. (**A**) Posterior aspect of corpus callosum (PCC). Anterior border is defined by midpoint of the AC-PC line; (**B**) cerebral peduncle (CP); (**C**) centrum semiovale (CSO); (**D**) posterior limb of internal capsule (PLIC); (**E**) putamen (PUT). See text for details.

EPI-related susceptibility artifacts, we avoided ROIs in the most frontal cerebral areas. As structural changes were expected to occur over time, ROIs were redrawn/repositioned for all follow-up scans to ensure identical anatomical positioning for initial and follow-up scans. ROIs were positioned by anatomic guidance, not lesion guidance, and were outlined bilaterally in the axial plane, except for PCC which was outlined in the sagittal plane. For statistical analysis, bilateral measurements were averaged.

The PCC ROI [volume (mean  $\pm$  SD) = 2513  $\pm$  479  $\mu$ l] was drawn according to the callosal borders on the midsagittal slice plus the four adjacent parasagittal slices on each side, with the anterior border being defined arbitrarily by a line perpendicularly crossing the midpoint of the anterior-posterior commissural (AC–PC) line. Anatomically, the PCC included the splenium, isthmus and posterior part of the body of corpus callosum. The PLIC (171  $\pm$  2  $\mu$ l) was sampled by a rectangle in the centre of the structure on the four axial slices where it appeared broadest. For the CSO (4820  $\pm$  46  $\mu$ l) an ellipse was placed centrally in the hemispherical white matter on 8–10 axial slices. The CP (150  $\pm$  0  $\mu$ l) was sampled by a polygonal ROI on five slices of the upper mesencephalon. For reference (MD only), a circular ROI was placed in the centre of the PUT (672  $\pm$  0  $\mu$ l), transversing 10–12 axial slices and ventricular CSF was sampled on one axial slice (43  $\pm$  5  $\mu$ l).

Except for the PCC, the borders of the ROIs were kept distant from adjacent tissue/CSF. For PCC a step-wise erosion algorithm, with each step eroding the exterior voxel layer in the sagittal plane, was subsequently applied to test for possible partial volume effects, i.e. the unintentional inclusion in the ROIs of other than the tissue of interest. Due to global atrophy during the scan interval, the volumes of some ROIs (particularly the PCC) were smaller at the follow-up scan in many patients.

All ROIs were outlined by the same rater (A.S.). For evaluation of intra-rater reproducibility, ROIs were positioned 3 times (with evaluations separated by 1–2 days) in four subjects (two controls, two patients). Between-scan reproducibility was estimated using additional data from three healthy subjects scanned twice with a maximum interval of 4 weeks.

Every individual ROI was inspected carefully for lesions visible on conventional sequences (T1, T2, T2\*, FLAIR). Since DAI lesions were often punctate and multiple we did not attempt to eliminate DAI lesions from the ROIs. Instead, individual ROIs were excluded from statistical analysis (both initial and follow-up) only if they contained non-DAI lesions. If one ROI was excluded, the contralateral one was used for analysis (bilateral ROIs).

#### DTI post-processing

Diffusion-weighted images were coregistered to the b=0 images using a 12 parameter algorithm in SPM2. The six repetitions for each measured direction were averaged to increase the signal-to-noise ratio. The diffusion tensor (D) and its eigenvalues  $(\lambda_1, \lambda_2, \lambda_3)$  and eigenvectors were then estimated for each voxel (Basser *et al.*, 1994), the calculations being performed in native space prior to spatial normalization. By sorting the eigenvalues in order of decreasing magnitude for each voxel  $(\lambda_1 > \lambda_2 > \lambda_3)$ ,  $\lambda_1$  represents the diffusivity along the primary diffusion direction, i.e. along the fibre axis, and is referred to as the *axial* diffusivity,  $\lambda_{\parallel}$ . The averaged water diffusivities perpendicular to the axonal fibres,  $\lambda_2$  and  $\lambda_3$ , are referred to as  $\lambda_{\perp} = (\lambda_2 + \lambda_3)/2$ , or the *radial* diffusivity (Song *et al.*, 2002). The summary parameters MD and FA were calculated voxel-wise according to (Pierpaoli and Basser, 1996).

#### Coregistration and extraction of DTI values

For each scan the b=0 images were coregistered to the corresponding spatially normalized 3D structural T1-weighted images using normalized mutual information. This transformation was then applied to the calculated diffusion parameter maps and these were resliced using tri-linear interpolation in SPM2. For all scans coregistration was visually checked by superimposing the images (including the ROIs). The coregistration was done after calculating the diffusion parameters in order to avoid any effects this spatial normalization step might have on the calculation of the diffusion tensor. The only effect the normalization has on the diffusion parameter maps is therefore a slight smoothing due to the reslicing. Following coregistration, diffusion parameters (FA, MD,  $\lambda_{\parallel}$  and  $\lambda_{\perp}$ ) were extracted from each ROI and summarized as the median value of the voxels comprising the ROI.

For those subjects who had a follow-up scan, a pairwise coregistration of the second to the first 3D T1-weighted volume was performed, followed by the normalization applied in the first scan. The calculated diffusion images were then coregistered to the T1-weighted images as described earlier.

#### Statistical analysis

Statistical analyses were performed with SPSS (v.15.0), and the threshold for statistical significance was set at P < 0.05. Shapiro–Wilk's test was used to test the distribution of DTI parameters, and since deviation from normality was not found parametric statistics were applied. For measures of intra-rater and between-scan reproducibility, the coefficient of variation (CV) was computed (CV = SD/mean). To test the principal hypotheses, independent-samples t-tests (two-tailed) were conducted to compare FA between patients and controls as well as between favourable and unfavourable outcome subgroups, while paired t-tests (two-sided) were used to examine changes over time. Bonferroni correction for multiple comparisons was made for tests of the principal hypotheses regarding FA (four white matter ROIs were tested, hence P < 0.0125 was considered significant following correction).

To further examine the basis of any FA differences, we conducted secondary comparisons on the additional diffusion parameters MD,  $\lambda_{\parallel}$  and  $\lambda_{\perp}$ . Additional secondary analyses of clinical and conventional imaging variables relative to dichotomized outcome were performed using independent-samples *t*-test (continuous normally distributed variables), Mann–Whitney U-test (continuous non-normally distributed variables) and Fisher's exact test (categorical variables). Finally, we employed a binary logistic regression analysis (forward step-wise, likelihood ratio) to determine the ability of DTI at the initial scan ( $\sim$ 8 weeks post-trauma) to predict dichotomized  $\sim$ 1-year outcome, and to assess the added value of DTI compared to prediction of outcome by clinical evaluation (FIM) only.

#### **Results**

#### Conventional MRI

All but one patient exhibited signal abnormalities consistent with DAI on one or more conventional sequences, presenting as pettechial haemorrhages on T2\*-weighted images and/or hyperintensities on FLAIR within typical locations. These abnormalities however ranged from a few subtle

lesions identified in a single anatomic location to multiple clear and widespread lesions. Graded according to location (Graham and Gennarelli, 1997), 5 patients had visible DAI lesions confined to the hemispheres (grade I), 15 had visible DAI lesions in the corpus callosum but not in the brainstem (grade II) and 9 had additional DAI-related lesions in the brainstem (grade III).

Residual lesions other than DAI were found on conventional MRI in 26 of 30 patients (initial scan); frequently several types of lesions coexisted. The following intracranial abnormalities were found (number of patients): cortical contusion(s) (15), small subdural haematoma (7), intracerebral haematoma (3), arterial dissection (1), abscess (1), territorial arterial infarction (4), focal brainstem infarct (1), diffuse hypoxic injury (1) and pyramidal tract degeneration in the brainstem (4). Individual ROIs containing non-DAI lesions on conventional MRI and therefore excluded from statistical analysis were: one left PLIC, one left CSO, two right CSO, one left CP, one right CP, one left PUT and two right PUT. Controls all had unremarkable T1-weighted images within and outside ROIs.

At follow-up general atrophy was pronounced in many patients, notably ventricular size had increased and callosal thickness decreased compared to the initial MRI. In many patients the pyramidal tract in the brainstem exhibited bilateral degenerative abnormalities at follow-up.

#### DTI

Reproducibility of DTI measures was satisfactory for all white matter ROIs, regarding both intra-rater (CV  $\leq$ 3% for FA) and between-scan (CV  $\leq$ 4% for FA) measurements. As expected, in areas of low anisotropy (PUT and CSF), variation of FA was much higher (intra-rater CV up to 26%, between-scan CV up to 19%), whereas MD showed good reproducibility (intra-rater CV  $\leq$ 2%, between-scan CV <3%).

Table 3 lists DTI results for the initial and follow-up scans of the patients (mean 8 weeks and 12 months postinjury) as compared to the controls. DTI values in controls were in the same range as those reported previously (e.g. Pierpaoli et al., 1996; Marenco et al., 2006). At the initial scan, FA was found to be significantly decreased in all white matter ROIs (PCC, PLIC, CSO, CP) in patients as compared with controls (P < 0.000001 for PCC and CP,  $P \leq 0.01$  for PLIC and CSO). These results remained significant following Bonferroni correction. Except for CP, MD in patients was not significantly different from controls at the initial scan. Investigating the underlying axial  $(\lambda_{\parallel})$ and radial  $(\lambda_{\perp})$  diffusivities, for PCC, PLIC and CP this revealed significantly decreased  $\lambda_{\parallel}$  (P<0.00001 for PCC, P < 0.001 for PLIC, P < 0.000001 for CP) as well as increased  $\lambda_{\perp}$  (P<0.0001 for PCC, P<0.05 for PLIC, P < 0.001 for CP). Hence, decrease of FA was caused by the combined effects of  $\lambda_{\parallel}$  decrease and  $\lambda_{\perp}$  increase. MD was relatively unaffected as these effects counterbalanced.

Table 3 Diffusion parameters, mean (SD) for each ROI, initial and follow-up scans

		FA		MD [ $\times$ 10 <sup>-3</sup>	mm²/s]	$\lambda_{\parallel} \ [\times \ 10^{-3} \text{mm}^2/\text{s}]$		$\lambda_{\perp}$ [× $10^{-3}$ mm $^2$ /s]	
ROI	Scan	Controls	Patients	Controls	Patients	Controls	Patients	Controls	Patients
PCC	 	0.55 (0.06) 0.57 (0.06)	0.42 (0.08)*** 0.37 (0.08)***	I.08 (0.10) I.06 (0.09)	I.I0 (0.07) I.27 (0.II)***	I.85 (0.14) I.85 (0.10)	I.67 (0.I2)*** I.80 (0.I3)	0.72 (0.II) 0.68 (0.II)	0.84 (0.10)*** 1.02 (0.14)***
PLIC	Ī 2	0.68 (0.05) 0.69 (0.05)	<b>0.64 (0.06)</b> ** 0.67 (0.05)	0.80 (0.06) 0.79 (0.05)	0.80 (0.05) 0.84 (0.07)**	I.55 (0.07) I.53 (0.08)	I.48 (0.09)*** I.59 (0.08)*	0.43 (0.07) 0.41 (0.07)	0.46 (0.06)* 0.46 (0.08)
CSO	- 1 2	0.39 (0.08) 0.40 (0.08)	<b>0.35 (0.06)</b> ** 0.39 (0.08)	0.88 (0.08) 0.87 (0.07)	0.89 (0.08) 0.92 (0.09)	I.28 (0.09) I.27 (0.12)	I.24 (0.10) I.33 (0.10)	0.68 (0.II) 0.67 (0.09)	0.7I (0.08) 0.7I (0.II)
CP	- I 2	0.70 (0.03) 0.72 (0.03)	0.60 (0.07)*** 0.59 (0.07)***	0.84 (0.06) 0.80 (0.07)	0.80 (0.07)* 0.90 (0.10)***	1.66 (0.09) 1.62 (0.10)	I.4I (0.I5)*** I.58 (0.I3)	0.43 (0.06) 0.40 (0.05)	0.50 (0.07)*** 0.57 (0.11)***
PUT	1 2	0.2I (0.04) 0.20 (0.03)	0.23 (0.07) 0.26 (0.05)***	0.79 (0.07) 0.78 (0.05)	0.80 (0.05) 0.82 (0.07)	0.95 (0.08) 0.93 (0.05)	0.99 (0.09) 1.03 (0.11)**	0.7I (0.06) 0.7I (0.05)	0.7I (0.05) 0.7I (0.06)
CSF	2	0.13 (0.05) 0.12 (0.04)	0.12 (0.04) 0.12 (0.07)	3.21 (0.11) 3.20 (0.19)	3.20 (0.12) 3.22 (0.18)	3.63 (0.19) 3.59 (0.31)	3.61 (0.25) 3.64 (0.38)	2.98 (0.11) 3.00 (0.15)	2.98 (0.08) 3.00 (0.14)

Initial scan (scan I): n=29 patients, 30 controls; follow-up Initial scan (scan 2): n=22 patients, I4 controls  $^*P < 0.05$   $^{**}P \le 0.01$  (uncorrected), independent-samples t-tests, patients compared with controls. For principal analyses (FA in white matter ROIs), bold values indicate that patients remained significantly different from controls following Bonferroni correction (P < 0.0125). Secondary analyses (MD,  $\lambda_{\parallel}$ ,  $\lambda_{\perp}$ ) are displayed on the right; reference ROIs for MD (PUT and CSF) at the bottom (shaded). PCC = posterior aspect of corpus callosum; PLIC = posterior limb of internal capsule; CSO = centrum semiovale; CP = cerebral peduncle; PUT = putamen; CSF = cerebrospinal fluid; FA = fractional anisotropy; MD = mean diffusivity;  $\lambda_{\parallel}$  = axial diffusivity;  $\lambda_{\perp}$  = radial diffusivity.

Table 4 Longitudinal DTI findings in 22 patients, mean (SD)

	FA		MD [× 10 <sup>-3</sup> r	$ imes$ 10 <sup>-3</sup> mm <sup>2</sup> /s] $\lambda_{\parallel}$ [ $ imes$		nm²/s]	$\lambda_{\perp}$ [× $10^{-3}$ mm $^2/s$ ]	
ROI	Scan I	Scan 2	Scan I	Scan 2	Scan I	Scan 2	Scan I	Scan 2
PCC	0.42 (0.07)	0.37 (0.08)***	1.10 (0.07)	1.27 (0.11)***	1.66 (0.11)	1.80 (0.13)***	0.84 (0.09)	1.02 (0.14)***
PLIC	0.64 (0.05)	0.67 (0.05)**	0.79 (0.05)	0.84 (0.07)***	1.47 (0.10)	1.59 (0.08)***	0.46 (0.06)	0.46 (0.08)
CSO	0.35 (0.07)	0.39 (0.08)**	0.88 (0.08)	0.92 (0.09)*	1.24 (0.11)	I.33 (0.10) <sup>***</sup>	0.71 (0.08)	0.71 (0.11)
CP	0.6I (0.07)	0.59 (0.07)*	0.80 (0.07)	0.90 (0.10)***	1.42 (0.16)	I.58 (0.I3)***	0.49 (0.07)	0.57 (0.11)***
PUT	0.22 (0.07)	0.26 (0.05)**	0.79 (0.05)	0.82 (0.07)	0.97 (0.08)	I.03 (0.II)**	0.70 (0.05)	0.71 (0.06)
CSF	0.II (0.04)	0.12 (0.07)	3.19 (0.13)	3.22 (0.18)	3.62 (0.24)	3.64 (0.38)	2.99 (0.II)	3.00 (0.14)

\*P < 0.05; \*\* $P \le 0.01$ ; \*\*\* $P \le 0.001$  (uncorrected), paired t-tests. For principal analyses (FA in white matter ROIs), bold values indicate that results remained significant following Bonferroni correction (P < 0.0125). Secondary analyses (MD,  $\lambda_{\parallel}$ ,  $\lambda_{\perp}$ ) are displayed on the right; reference ROIs for MD (PUT and CSF) at the bottom (shaded). Scan I = initial MRI; Scan 2 = follow-up MRI; PCC = posterior aspect of corpus callosum; PLIC = posterior limb of internal capsule; CSO = centrum semiovale; CP = cerebral peduncle; PUT = putamen; CSF = cerebrospinal fluid; FA = fractional anisotropy; MD = mean diffusivity;  $\lambda_{\parallel}$  = axial diffusivity;  $\lambda_{\perp}$  = radial diffusivity.

For the CSO,  $\lambda_{\parallel}$  and  $\lambda_{\perp}$  were not significantly different from controls (P > 0.1). MD was not significantly different between patients and controls in the grey matter ROI (PUT) or in CSF (P > 0.4). For these reference ROIs FA,  $\lambda_{\parallel}$  and  $\lambda_{\perp}$  are listed for completeness.

The DTI changes over time are further presented in Table 4 for the 22 patients who were rescanned  $\sim$ 12 months post-injury. During the scan interval FA increased in PLIC and CSO ( $P \leq 0.01$ ). However in PCC, FA decreased further (P < 0.0001). These findings remained significant following Bonferroni correction. Investigating the changes of the underlying eigenvalues revealed that  $\lambda_{\parallel}$  increased in all white matter ROIs (P < 0.00001 for PCC, P < 0.000001 for PLIC, P < 0.0001 for CSO and CP). In PCC and CP this was accompanied by significant increase of  $\lambda_{\perp}$  (P < 0.000001 for PCC, P < 0.001 for CP), i.e. all eigenvalues changed in the same direction and consequently

large increases of MD were seen in these ROIs (P < 0.000001 for PCC, P < 0.0001 for CP). However, in PLIC and CSO,  $\lambda_{\perp}$  did not change over time, and so the observed FA (and MD) increase was caused by a selective  $\lambda_{\parallel}$  increase in these ROIs. For each ROI the direction of change in each DTI parameter was the same in almost all patients individually. However, in a few cases values were unchanged or went slightly in the opposite direction.

In CSF no significant changes over time were seen. In PUT however, an unexpected increase of FA over time was found (P < 0.01). Computing FA in isotropic or nearly isotropic areas, such as in CSF and PUT, is subject to considerable noise (cf. the poor reproducibility in these areas), which makes it difficult to interpret this latter finding.

Controls had comparable DTI parameter values at the initial and follow-up scans in all ROIs, with no trends of any systematic effects over time. Additional testing of change over

0.57 (0.10)\*\*\*

0.68 (0.12)\*\*\*

0.45 (0.09)

0.42 (0.08)

3 erosions

2

	Scan	FA	FA $ \hspace{1cm} \text{MD [} \times \text{ I0}^{-3}\text{mm}^{2}\text{/s]} \hspace{1cm} \lambda_{\parallel} \text{ [} \times \text{ I0}^{-3}\text{mm}^{2}\text{/s]} $		mm²/s]	$\lambda_{\perp} \ [\times \ I0^{-3} mm^2/s]$			
		Controls	Patients	Controls	Patients	Controls	Patients	Controls	Patients
0 erosions	ı	0.55 (0.06)	0.42 (0.08)***	1.08 (0.10)	1.10 (0.07)	1.85 (0.14)	1.67 (0.12)***	0.72 (0.11)	0.84 (0.10)***
	2	0.57 (0.06)	0.37 (0.08)***	1.06 (0.09)	I.27 (0.II)***	1.85 (0.10)	I.80 (0.I3)	0.68 (0.11)	1.02 (0.14)***
I erosion	1	0.61 (0.06)	0.48 (0.08)***	1.00 (0.08)	1.03 (0.07)	1.83 (0.14)	I.64 (0.13)***	0.60 (0.10)	0.74 (0.10)***
	2	0.64 (0.05)	0.43 (0.08)***	0.98 (0.08)	I.I7 (0.II) <sup>*</sup> **	1.83 (0.10)	1.74 (0.15)*	0.57 (0.09)	0.89 (0.14)***
2 erosions	1	0.67 (0.06)	0.54 (0.09)***	0.93 (0.07)	0.96 (0.06)	1.80 (0.14)	I.6I (0.I5)***	0.50 (0.09)	0.64 (0.10)***
	2	0.69 (0.05)	0.50 (0.09)***	0.92 (0.07)	1.07 (0.10) <sup>***</sup>	1.82 (0.11)	1.70 (0.16)**	0.48 (0.08)	0.76 (0.13)***

0.91 (0.07)

1.01 (0.10)\*

Table 5 Erosion of PCC, effect on DTI metrics, initial and follow-up scans, mean (SD)

0.58 (0.09)\*\*\*

0.54 (0.09)\*\*\*

Initial scan (scan I): n=29 patients, 30 controls; follow-up scan (scan 2): n=22 patients, I4 controls.  $^*P < 0.05$  \*\*P < 0.01 \*\*\*P < 0.01 (uncorrected), independent-samples t-tests, patients compared to controls. For principal analyses (FA), bold values indicate that patients remained significantly different from controls following Bonferroni correction (P < 0.0125). PCC = posterior aspect of corpus callosum; FA = fractional anisotropy; MD = mean diffusivity;  $\lambda_{\parallel}$  = axial diffusivity;  $\lambda_{\perp}$  = radial diffusivity.

0.90 (0.07)

0.88 (0.07)

time in patients compared to change over time in controls (independent-samples *t*-test, data not shown) therefore yielded statistical differences comparable to those in Table 4.

0.70 (0.06)

0.72 (0.05)

As DAI lesions visible on conventional MRI were frequently present within PCC, supplemental analysis was made for the subgroup of patients without any visible abnormalities in PCC on conventional MRI (n=6, corresponding to DAI grade I or no DAI). For this subgroup FA was still significantly lower in PCC compared to the controls, both at the initial scan and at follow-up (P < 0.02).

To test and correct for partial volume effects of the PCC, a step-wise (up to 3 times) erosion of the exterior voxel layer of PCC was performed in the sagittal plane. As displayed in Table 5, this could indicate partial voluming of the uneroded ROI (FA increased, while MD,  $\lambda_{\perp}$  and, to a lesser extent,  $\lambda_{\parallel}$  decreased with each erosion step). However, when repeating statistical analysis on the eroded PCC, differences between patients and controls remained significant, even after three erosions.

Volumes of the PCC ROI in patients were generally smaller at follow-up compared to the initial scan (mean 2.1 versus 2.5 ml, P < 0.00001, paired t-test), since in most patients callosal thinning occurred during the scan interval. As this could introduce systematic differences in partial voluming, the longitudinal analysis was repeated using the eroded PCC (data not shown). Changes over time in patients remained significant following three erosions for all DTI parameters (P < 0.01, paired t-tests).

Potential influence of the occurrence of secondary insults on DTI parameters was examined, and although FA values in some ROIs appeared to be more depressed in patients with secondary insults, this did not approach significance. Additionally, careful data inspection revealed no trends towards the influence of sedation upon DTI parameters.

#### Clinical outcome correlations

Table 6 summarizes statistical analysis on demographic, clinical and conventional imaging variables when

comparing patients according to dichotomized ~1-year outcome (favourable: GOS = 4–5, corresponding to good recovery or moderate disability; unfavourable: GOS = 1–3, corresponding to severe disability, vegetative state or death). Clinical features significantly related to outcome were post-resuscitation GCS, occurrence of secondary insults, duration of coma, duration of PTA and FIM (measured at the time of the initial MRI). Presence of DAI grade III, as based on conventional MRI, just yielded significance as being associated with unfavourable outcome. The occurrence of focal contusions on conventional MRI was not significantly different between outcome groups.

1.59 (0.17)\*\*\*

1.68 (0.18)\*\*

1.80 (0.14)

1.82 (0.11)

Figure 2 illustrates the DTI findings at  $\sim$ 8 weeks post-TBI in relation to dichotomized 1-year outcome, with control values shown for comparison. There was a general tendency for patients with unfavourable outcome to deviate more from control DTI values than patients with favourable outcome, not only for FA but also for the underlying diffusivities. Following Bonferroni correction FA in CP remained significantly different between outcome groups. Further examination of the relationship between FA in CP and 1-year GOS revealed significant correlations, with higher FA being related to higher GOS (r=0.60, P<0.001, Spearman's correlation), see Fig. 3.

When FA in CP was included in a logistic regression model to predict dichotomized 1-year outcome, a moderately good predictive accuracy was found (76%,  $\chi^2$  = 15.6, P<0.0001). Not surprisingly, FIM measured at the time of the initial scan ( $\sim$ 8 weeks post-injury) also had a high predictive accuracy (90%,  $\chi^2$  = 19.6, P<0.00001). However, adding FA in CP to a model containing FIM yielded a significantly improved predictive accuracy (increment  $\chi^2$  = 20.5, P<0.00001), which in this sample reached 100%. In comparison, conventional MRI variables (e.g. DAI grade) did not improve the predictive accuracy of FIM in a logistic regression model. Neither did FA in white matter ROIs other than CP.

Figure 4 displays the results analogous to Fig. 2 for the follow-up DTI  $\sim$ 12 months post-trauma. In the favourable

**Table 6** Significance of demographic, clinical and conventional imaging variables relative to  $\sim$ I year outcome

	~I year outcome (dichotomized GOS)					
	Favourable (n = 16)	Unfavourable (n = 14)	Р			
Age, years (mean $\pm$ SD)	34.9 ± I3.I	33.I ±15.9	0.73 <sup>a</sup>			
Sex (no. males)	14	9	0.20 <sup>b</sup>			
Education, years (mean ± SD)	$13.9\pm3.3$	$12.8\pm2.8$	0.33 <sup>a</sup>			
Cause of trauma (no. MVA)	II	8	0.42 <sup>b</sup>			
Post-resuscitation GCS (median, range)	4.5 (3-7)	3 (3-6)	<b>0.036</b> °			
Neurosurgery	5 ` ′	4`´	1.0 <sup>b</sup>			
ISS (no. with $ISS > 25$ )	II	9	0.80 <sup>b</sup>			
Occurrence of secondary insults	5	12	0.004 <sup>b</sup>			
Days to GCS > 8 (median, range) <sup>d</sup>	7 (1–24)	16.5 (9-365)	<b>0.002</b> <sup>c</sup>			
Duration of PTA, days (median, range) <sup>d</sup>	6l.5 (23-17I)	327 (39–365)	0.0002°			
FIM at scan I (median, range)	96.5 (I8–I22)	20.5 (18–79)	0.00001°			
DAI grade III on conventional MRI	2 ` ′	7 ` ′	<b>0.046</b> <sup>b</sup>			
Contusion on conventional MRI	7	8	0.72 <sup>b</sup>			

alndependent-samples t-test; Fisher's exact test; Mann-Whitney U-test dlf exceeds ~I year follow-up, set to 365 days. Unfavourable outcome: GOS = I-3; favourable outcome: GOS = 4-5. For significant test results (uncorrected), P-values are marked in bold. GOS = Glasgow outcome scale; MVA = motor vehicle accident; GCS = Glasgow coma scale; ISS = injury severity score; PTA = post-traumatic amnesia; FIM = functional independence measure; Scan I = initial MRI; DAI = diffuse axonal injury.

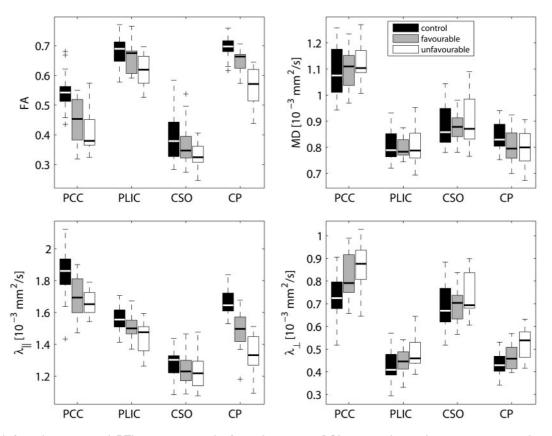


Fig. 2 Initial (~8 weeks post-injury) DTI parameters in the four white matter ROIs, grouped according to outcome at ~I year post-injury [dichotomized GOS, unfavourable outcome: GOS = I-3 (n = I4); favourable outcome: GOS = 4-5 (n = I5)]. Control values are shown for comparison (n = 30). Boxes represent lower, median (line) and upper quartiles; whiskers show the range of the data excluding outliers (+). PCC = posterior aspect of corpus callosum; PLIC = posterior limb of internal capsule; CSO = centrum semiovale; CP = cerebral peduncle.

outcome group, FA had returned to normal levels in PLIC and CSO, due to the selective interval increase of  $\lambda_{\parallel}$  which in PLIC reached even supra-normal levels at follow-up (P < 0.01). Further analysis revealed a positive correlation between individual  $\lambda_{\parallel}$  in PLIC and GOS (r = 0.47, P = 0.03, Spearman's correlation). In PCC and CP, FA remained depressed in both outcome groups, but significantly more so in patients with unfavourable outcome (P < 0.05 and

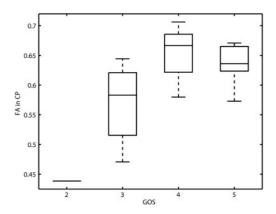


Fig. 3 Relationship between FA in the cerebral peduncle at the initial scan ( $\sim$ 8 weeks post-injury) and I-year outcome. Boxes represent lower, median (line) and upper quartiles; whiskers show the range of the data. Higher FA was related to better outcome (r = 0.60, P < 0.00I, Spearman's correlation). GOS = Glasgow outcome scale: I = dead (n = 0), 2 = vegetative state (n = I), 3 = severe disability (n = I3), 4 = moderate disability (n = 9), 5 = good recovery (n = 6); CP = cerebral peduncle; FA = fractional anisotropy.

P = 0.01, respectively). Finally, Fig. 5 displays the changes over time in favourable and unfavourable outcome patients as well as in controls.

#### **Discussion**

Using DTI, we prospectively and longitudinally examined white matter microstructure in individuals with severe TBI in the late subacute and chronic stages, and investigated the correlation to 1-year clinical outcome. In the late subacute stage (~8 weeks post-injury) we found FA to be decreased in all investigated white matter regions, due to decreased  $\lambda_{\parallel}$ and increased  $\lambda_{\perp}$ . Patients with unfavourable 1-year outcome, according to dichotomized GOS, tended to deviate more from control DTI values than patients with favourable outcome. FA in CP at the initial scan added predictive accuracy to concomitant clinical evaluation by FIM. At follow-up DTI ~12 months post-injury, FA had normalized in PLIC and CSO, primarily in patients with favourable outcome, caused by the increase of  $\lambda_{\parallel}$  to normal or supranormal levels with unchanged  $\lambda_{\perp}$ . In PCC and CP,  $\lambda_{\parallel}$  and  $\lambda_{\perp}$  both increased during the scan interval and, particularly in patients with unfavourable outcome, FA remained depressed.

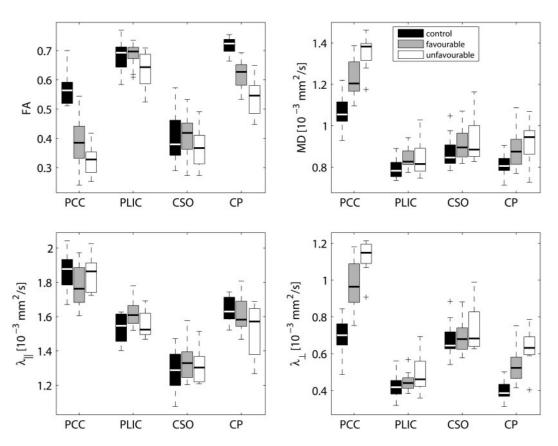


Fig. 4 Follow-up ( $\sim$ 12 months post-injury) DTI parameters in the four white matter ROIs, grouped according to outcome at I year post-injury [dichotomized GOS, unfavourable outcome: GOS = I-3 (n = 8); favourable outcome: GOS = 4-5 (n = I4)]. Control values are shown for comparison (follow-up scan, n = I4). Boxes represent lower, median (line) and upper quartiles; whiskers show the range of the data excluding outliers (+). PCC = posterior aspect of corpus callosum; PLIC = posterior limb of internal capsule; CSO = centrum semiovale; CP = cerebral peduncle.

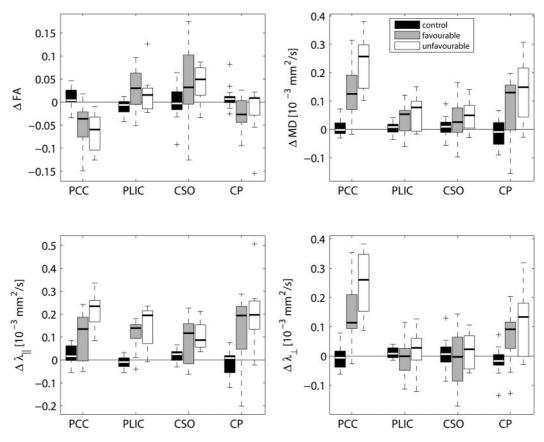


Fig. 5 Longitudinal changes ( $\Delta = \text{scan 2} - \text{scan I}$ ) of DTI parameters in the four white matter ROIs, grouped according to outcome at I-year post-injury [dichotomized GOS, unfavourable outcome: GOS = I-3 (n = 8); favourable outcome: GOS = 4-5 (n = 14)]. Control values are shown for comparison (follow-up scan, n = 14). Boxes represent lower, median (line) and upper quartiles; whiskers show the range of the data excluding outliers (+). PCC = posterior aspect of corpus callosum; PLIC = posterior limb of internal capsule; CSO = centrum semiovale; CP = cerebral peduncle.

#### Study design

The prospective longitudinal design of this study has several advantages, most importantly enabling the investigation of long-term dynamic evolution of diffusion changes, and the correlation to late clinical outcome. Serial DTI on one or two patients has previously been reported (Arfanakis et al., 2002; Naganawa et al., 2004; Le et al., 2005; Voss et al., 2006), but to our knowledge the present study is the first prospective longitudinal DTI study performed on a group of TBI patients. The study design enabled us to obtain reasonably uniform time intervals between injury-scan, scan-rescan and injury-outcome evaluation. All scans were acquired on the same scanner, and patients received a uniform intensity of rehabilitation following departmental guidelines. Furthermore, to reduce the heterogeneity inherent to clinical TBI studies, we only studied patients with severe TBI. As our patient population represented the most severely injured survivors of TBI (Engberg et al., 2006), our results are however not directly comparable to those of other studies in which patients had milder or mixed injury severity. Importantly, in the present study a large proportion of the patients had sustained secondary insults.

#### Initial DTI and association with outcome

In the late subacute stage our findings of decreased  $\lambda_{\parallel}$  and increased  $\lambda_{\perp}$  in several white matter ROIs are in line with previous findings (Arfanakis et al., 2002; Le et al., 2005). Recently, animal models of axonal injury versus demyelination have indicated that axonal injury selectively decreases  $\lambda_{\parallel}$ , while demyelination increases  $\lambda_{\perp}$  (Song et al., 2002; Sun et al., 2006). Accordingly, our results could reflect the combination of axonal injury and demyelination, but could also be the result of increased content of isotropic tissue, notably gliosis (Pierpaoli et al., 2001). Regardless of the exact proportionate contribution of these pathological processes, the observed DTI pattern is consistent with Wallerian or Wallerian-like degeneration (Pierpaoli et al., 2001; Thomalla et al., 2004), most likely reflecting consequences of DAI and/or secondary hypoxic-ischaemic injury.

The clinical significance of the measured DTI metrics is highlighted by the correlations between these quantities and long-term functional outcome. At the initial scan, DTI parameters for patients with unfavourable outcome tended to deviate more from control values than for patients with favourable outcome. The strongest correlation with 1 year

GOS was found for FA in CP, which predicted dichotomized 1-year GOS with 76% accuracy and even added predictive accuracy to FIM evaluated at the time of the initial scan. In comparison, conventional MRI variables (e.g. DAI grade) did not add predictive information to FIM, although in this group of severely injured patients we did find a just significant association between DAI grade III and unfavourable outcome. Other studies of patients with even mild TBI have found DTI abnormalities undetected by conventional MRI (Arfanakis et al., 2002; Inglese et al., 2005), clearly indicating that DTI is more sensitive to traumatic white matter injury than conventional imaging. These and the present study did not, however, apply susceptibility-weighted imaging, another MRI sequence which has proven more sensitive to haemorrhagic DAI than standard T2\*-weighted sequences (Tong et al., 2003). To determine the prognostic value of DTI, useful in clinical practice, larger studies are clearly needed.

# Longitudinal findings—microstructural reorganization?

The 1-year follow-up DTI of 22 of the patients and 14 of the controls revealed interesting changes in the patients during a period of time when the vast majority of them improved considerably in function (median FIM increased from 48 to 113 during the scan interval). If we assume that the observed increase of  $\lambda_{\parallel}$  in various white matter regions does reflect true alterations of tissue microstructure over time, which processes might underlie these late DTI changes? In PCC and CP, the increase of all eigenvalues over time most likely represents accumulation of extracellular fluid as a consequence of progressive structural degradation. In PCC, DAI-related lesions were visible on conventional MRI in the majority of patients, and it may be that with time the filling of cystic spaces by CSF contributes to these alterations. In PLIC and CSO, however, the observed interval increase of  $\lambda_{\parallel}$  was not accompanied by an increase of  $\lambda_{\perp}$ , and so is unlikely to represent a change in extracellular fluid content. In the vast majority of patients the tissue comprised by these ROIs was normal-appearing on conventional MRI.

The changes in CSO should be interpreted with caution because of the limitations of the tensor model in this complex region (see next section). However, the fact that a similar pattern of DTI changes over time was found in the highly homogeneous PLIC argues in favour of true microstructural alterations. One possible interpretation of this interesting finding is that, despite progressive general atrophy, some reorganization of tissue microstructure has taken place during the scan interval. Specifically, late axonal recovery or even axonal regrowth (without concomitant remyelination) could account for the selective increase of  $\lambda_{\parallel}$ and the resulting FA increase. In a recent report including data on one patient who emerged from a minimally conscious state as late as 19 years post-trauma, the authors

found what was interpreted as a transient increase of FA in the cuneus-precuneus area, followed by an FA increase in the cerebellar vermis (Voss et al., 2006). Our findings point towards an inference similar to that suggested by Voss and coauthors, namely that the observed FA increase over time may represent axonal regrowth at late stages following severe TBI. An increasing body of evidence points towards the role of neuroplastic changes as underlying late recovery following TBI (for a review, see Levin, 2003), and our study supports the notion that DTI may serve to probe white matter regeneration in vivo. To map the exact brain areas involved in white matter reorganization, future voxel-based analyses of longitudinal DTI data are needed. Using a voxel-based approach one could also investigate whether some relationship exists between DTI changes and brain volume changes over time. However, a major challenge to voxel-based analysis of DTI data is the registration of fibre tracts between mutually heterogeneous brains.

## Limitations and possible pitfalls

Brains that structurally change over time pose certain challenges to the interpretation of longitudinal DTI findings. The tensor model is unable to model multiple fibre populations within each voxel, and specifically in complex regions of crossing fibre populations this is an important limitation. For instance, the perpendicular crossing within one voxel of two highly anisotropic fibre populations will lead to a low FA measured in that voxel. If one of these fibre populations degenerates over time, the orientational coherence within the voxel, and hence FA, increases. This major limitation of the tensor model demands cautious interpretation of longitudinal DTI findings in complex regions where fibres intersect, such as the CSO. In this study FA maps did reveal clear inhomogeneities within the CSO that appeared homogeneous on conventional MRI. Therefore we cannot exclude the possibility that the observed increase of FA over time in CSO could be caused by degeneration of one fibre population e.g. of fibres stemming from the corpus callosum. In contrast, the other white matter ROIs, PCC, PLIC and CP are thought to consist of well-defined coherently oriented fibre bundles. This was also suggested by the high control FA values in these ROIs (Table 3) and homogeneous appearance on FA maps. For these reasons we consider it unlikely that this limitation of the tensor model would account for our findings in these regions. Future studies, using more advanced diffusion imaging techniques such as q-ball imaging (Tuch, 2004), may allow modelling of different fibre populations within each voxel.

One important issue, which has already been dealt with, is that of systematic differences in partial voluming. Corpus callosum is particularly prone to partial voluming from neighbouring CSF, and even more so when DTI voxels are larger in the z-direction. As a consequence of progressive callosal thinning following DAI one could anticipate increased partial voluming in patients, particularly at follow-up. Our results following successive erosion of the PCC could indicate partial voluming of the original ROI. However, differences between patients and controls as well as longitudinal changes remained significant following extensive erosion. As opposed to PCC, which was defined (except anteriorly) by its anatomical borders, the other ROIs were kept distant from neighbouring tissue. Although partial voluming cannot be avoided completely, the anatomical orientation of these ROIs relative to the *z*-direction makes them less susceptible to major influence by partial volume effects.

Systematic group or time differences in data acquisition need to be considered. In the present study, patients and controls were scanned interleaved, and with a similar scanrescan interval. As we found no trends towards any time effects in the control group, any major influence of scanner drift on our results is considered highly unlikely.

Most patients (n=25) needed sedation for the initial scan, while only a few (n=4) were sedated for the followup scan. The potential influence of propofol sedation on parameters measured by DTI has not been systematically investigated. While any direct effect on tissue microstructure seems theoretically implausible, an indirect effect e.g. through change of body temperature could influence all diffusivities in the same direction. However, a temperature change of more than 8°C would be required to account for the observed changes of up to 20% in the eigenvalues [the diffusion coefficient varies ~2.4%/°C in the physiological temperature range (Le Bihan, 1995)], and obviously, this cannot have occurred. Furthermore, systematic differences between sedated versus non-sedated individuals regarding noise due to motion might cause differential introduction of errors in the tensor computation (Chang et al., 2005). However, we found no tendency towards systematic differences in the DTI parameters measured in sedated versus non-sedated patients. Moreover, diffusivities measured in CSF did not tend to differ between patients and controls or between initial and follow-up scans. This argues against any major confounding of our results by factors related to sedation.

One final limitation of our study relates to the clinical scales used. It would have been desirable to compare individual DTI changes and degree of functional improvement during the scan interval. However, as the distribution of FIM values at follow-up suffered from ceiling effects, this scale did not allow for adequate investigation of such a possible relationship. The Disability Rating Scale (Rappaport *et al.*, 1982) (range 0–29) may have offered less susceptibility to ceiling effects, however this would have been at the expense of reduced sensitivity to the subtle, yet sometimes significant, changes in function within a limited window of recovery. Monitoring clinical progress and outcome in TBI patients is a general and complex problem with a difficult choice between using a set of detailed scales that are consecutively applied as recovery proceeds,

and a single, yet less detailed scale that covers all phases of recovery.

#### **Conclusions**

This prospective longitudinal study of severe TBI provides new insight into the evolution of DTI parameters during rehabilitation, and suggests clinical relevance of these quantities to long-term clinical outcome. Our findings indicate microstructural alterations during the chronic stage of severe TBI, which may represent structural reorganization relevant to clinical recovery. DTI non-invasively provides quantitative pathophysiological information in vivo, and the prospect of tracking white matter microstructural changes over time holds the promise of measuring neuroplasticity and repair following TBI, which eventually may offer a way of monitoring therapeutic response. Future longitudinal studies are warranted that combine DTI with volumetric measurements and with other MRI modalities, such as spectroscopy, ideally with multiple data acquisitions at shorter time intervals. The potential of DTI as a prognostic marker needs further investigation in larger studies.

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