## Structural MRI correlates of amyotrophic lateral sclerosis progression

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Running Title: Volumetric MRI and DTI correlates of progression in ALS

**Keywords:** Amyotrophic lateral sclerosis (ALS), progression, voxel-based morphometry (VBM), diffusion tensor imaging (DTI), fractional anisotropy (FA).

### 1 ABSTRACT

 $\mathbf{2}$ **Purpose:** Amyotrophic lateral sclerosis (ALS) presents with varying degrees of brain degeneration that can extend beyond the corticospinal tract (CST). Furthermore, the 3 clinical course and progression of ALS varies widely. Brain degeneration detected 4 using structural magnetic resonance imaging (MRI) could reflect disease progression.  $\mathbf{5}$ Subjects and methods: On study registration, 3-Tesla volumetric MRI and diffusion 6 tensor imaging scans were obtained at baseline in 38 healthy controls and 67 patients  $\overline{7}$ with sporadic ALS. Patients had Amyotrophic Lateral Sclerosis Functional Rating 8 Scale-Revised (ALSFRS-R) scores of  $\geq$  36 and did not have the C9ORF72 repeat 9 expansion. Six months later, changes in ALSFRS-R (delta-ALSFRS-R) scores were 10calculated and three groups of patients were extracted, namely, patients with slow 11 progression with delta-ALSFRS-R scores  $\leq 3$  (n = 19), intermediate progression with 12delta-ALSFRS-R scores = 4, 5, and 6 (n = 36), and rapid progression with 13delta-ALSFRS-R scores  $\geq$  7 (n = 12). We analyzed voxel-based morphometry and 14tract-based spatial statistics among these subgroups and controls. Results: In 15comparison with controls, patients with ALS showed gray matter atrophy and 1617decreased fractional anisotropy beyond the motor cortex and CST, especially in the frontotemporal lobes and basal ganglia. Moreover, the degree of change was highly 18

1	proportional to delta-ALSFRS-R at the 6-month assessment. Conclusion: A more
2	rapid disease progression and poorer functional decline were associated with greater
3	involvement of the extra-motor cortex and basal ganglia, suggesting that the spatial
4	extent of brain involvement can be an indicator of the progression in ALS.

### 1 INTRODUCTION

 $\mathbf{2}$ Amyotrophic lateral sclerosis (ALS) is a fatal neurodegenerative disease involving degeneration of both upper and lower motor neurons, and is associated with varying 3 degrees of extra-motor brain degeneration.[1-3] These findings suggest that motor 4 neuron degeneration contributes to a wider progressive process that spreads through  $\mathbf{5}$ multiple brain regions, potentially explaining the clinical heterogeneity and 6 pathological spectrum of ALS and frontotemporal dementia (FTD).[2-5] Moreover,  $\overline{7}$ transactive response DNA-binding protein 43 kDa (TDP-43) is the key common 8 pathological hallmark of ALS and a subgroup of FTD cases. [5,6] 9 Advanced imaging techniques, such as volumetric brain magnetic resonance 10imaging (MRI) and diffusion tensor imaging (DTI), provide insight into ALS 11 pathophysiology. More specifically, volumetric brain MRI reveals subtle atrophic 12changes in brain structures, while DTI allows for the visualization of fibre tract 13

14 involvement.

In terms of the brain structures involved in ALS, volumetric MRI has revealed involvement of both cortical and subcortical structures, including motor and extra-motor regions, such as the brain cortex and basal ganglia including the thalamus and caudate nucleus.[7,8] Moreover, DTI enables the assessment of white matter

1	(WM) integrity using common measures, such as fractional anisotropy (FA), mean
2	diffusivity, and other parameters.[9,10] Indeed, DTI has already produced promising
3	results in assessing widespread WM pathology in patients with ALS, most of which
4	refer to changes in FA,[8,11-13] reflecting directional changes in water diffusivity and
5	average diffusion in all directions.[9,10]
6	Symptoms in patients with ALS are progressive. However, advancement of the
7	disease, as well as its course among individual patients, varies widely.[14-17] Further,
8	the relationship between the extent of brain pathology and the progression of patients
9	with ALS remains unclear. In the present study, we examined whether the extent of
10	MRI-assessed brain damage was related to the progression of sporadic ALS

11 phenotypes.

12

## 13 SUBJECTS AND METHODS

The subjects included 73 patients with sporadic ALS (45 males, 28 females; age, 60.9  $\pm$  7.9 years) who had ALS Functional Rating Scale-Revised (ALSFRS-R) scores of  $\geq$  36 on an initial MRI scan, and 38 healthy controls (19 males, 19 females; age, 59.2  $\pm$  8.4 years). None of the subjects included in this study had any medical or family history of neurodegenerative disorders. Moreover, none of the subjects

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1	exhibited focal deep WM abnormalities with hyperintensities on T2-weighted MRI that
2	were more severe than grade 2, based on the Fazekas Hyperintensity Rating
3	System.[18] We confirmed that none of the patients with ALS had mutations in
4	superoxide dismutase-1 (SOD1), TDP-43, fused in sarcoma (FUS), and TRK-fused
5	gene (TFG), which are the most commonly occurring ALS mutations in the Japanese
6	population. We also found no mutations chromosome 9, open reading frame 72
7	(C9ORF72) and found no mutations.[19] All patients with ALS satisfied the criteria for
8	definite ALS using the El Escorial criteria.[20]
9	At registration, both patients with ALS and healthy controls underwent MRI scans.
10	All patients participating in the present study were admitted for diagnosis at the
11	Nagoya University Hospital, and their MRI scan was the first examination for
12	diagnosis. Their cognitive scores were assessed using the Mini-Mental State
13	Examination (MMSE) [21] for general cognitive assessment, and the Frontal
14	Assessment Battery (FAB) [22] for frontal lobe cognitive function. We also assessed
15	clinical and physical scores using the ALSFRS-R.[23] After 6 months, only
16	ALSFRS-R scores were reassessed in the 67 patients with ALS, and changes in
17	ALSFRS-R (delta-ALSFRS-R from diagnosis) were calculated based on direct
18	observations [24]. Patients with ALS who had died within 6 months of registration ( $n =$

6; the cause in all cases was respiratory failure) were excluded from the present study 1  $\mathbf{2}$ for several reasons. First, five of the patients had been transferred to another hospital or home doctor, and we could not directly assess their neurological or activities of daily 3 living (ADL) condition at the point of death. Second, the ages of the patients with ALS 4 who had died were significantly higher than those of other ALS groups and healthy  $\mathbf{5}$ controls (age has been reported to influence the progression of ALS [14,25]). Finally, 6 only a small number of patients with ALS died. We divided the remaining 67 patients 7into the following three subgroups based on a previous study [26]: A) a slow 8 progression group (delta-ALSFRS-R from diagnosis scores  $\leq$  3), B) an intermediate 9 progression group (delta-ALSFRS-R scores from diagnosis = 4, 5, and 6); and C) a 10rapid progression group (delta-ALSFRS-R scores from diagnosis  $\geq$  7). Using this 11 12approach for disease progression classification, the backgrounds and characteristics of patients in the slow progression and rapid progression groups were almost equal, 13although the number of cases between groups varied. We also performed similar 14investigation for the delta-ALSFRS-R from onset. 15Informed consent was obtained before subject participation. This study was 16

18 Patient registration and follow-up in the present study was carried out using the

approved by the ethics committee of Nagoya University Graduate School of Medicine.

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Japanese Consortium for Amyotrophic Lateral Sclerosis (JaCALS) research system.

2	MRI protocol: Three-dimensional T1-weighted images, conventional MRI
3	(T2-weighted and FLAIR images), and DTI data were acquired on a 3.0 Tesla scanner
4	(Trio, Siemens, Munich, Germany). Structural T1 and T2/FLAIR images were
5	reviewed to exclude potential abnormalities. For the T1-weighted images, 192 axial
6	slices were obtained using a repetition time (TR) of 1,570 ms, an echo time (TE) of
7	2.15 ms, an inversion time of 800 ms, a flip angle of 15°, an acquisition matrix of 256
8	$\times$ 256, a reconstruction matrix of 256 $\times$ 256, a field of view (FOV) of 256 mm $\times$ 256
9	mm, an in-plane resolution of $1.0 \times 1.0 \text{ mm}^2$ , and a slice thickness of 1.0 mm, no gap.
10	Diffusion-weighted images were obtained, employing optimal methods using a
11	Stejskal-Tanner sequence with single shot spin echo-type, echo-planar imaging, a flip
12	angle of 90°, and a TR of 7,800 ms, with a 32-channel phased-array head coil. The TE
13	corresponding to the respective b-factor was 84 ms for 1,000 s/mm <sup>2</sup> . Echo spacing was
14	0.69 ms, and the matrix size was 128 $\times$ 128 with a readout bandwidth of 1,776
15	Hz/pixel. Sixty-three axial slices, 2.0 mm thick with no interslice gaps, were used to
16	image the entire brain with a FOV of 256 mm $\times$ 256 mm. A motion-probing gradient
17	was applied to 12 orientations after acquisition of $b = 0$ images. The 128 × 128 data
18	matrix was not interpolated.

1	Voxel-based morphometry analysis of gray matter: Three-dimensional T1-weighted
2	images were analyzed using Statistical Parametric Mapping (SPM12; Wellcome
3	Department of Imaging Neuroscience, London, UK; http://www.fil.ion.ucl.ac.uk/spm)
4	[27] and VBM12 (Department of Psychiatry, University of Jena, Thuringia, Germany)
5	running on Matlab (MathWorks, Natick, MA, USA) with Diffeomorphic Anatomical
6	Registration using Exponentiated Lie algebra (DARTEL).[28] To facilitate an unbiased
7	comparison among regions of interest in different patients, gray matter (GM) images
8	were smoothed by convolving an 8-mm isotropic Gaussian kernel.
9	Diffusion tensor imaging analysis: DTI data was processed with the FSL 5.0.8
10	software package (www.fmrib.ox.ac.uk/fsl).[29] Pre-processing included eddy currents,
11	motion correction, and brain-tissue extraction. After pre-processing, we concatenated
12	diffusion tensor images into 13 ( $1b = 0 + 12b = 1,000$ ) volumes and a diffusion tensor
13	model was fitted at each voxel, generating FA maps. DTI group analyses included
14	tract-based spatial statistics (TBSS). For group analyses, DTI sets were warped to the
15	Montreal Neurological Institute (MNI) 152 template, available as standard T1 data in
16	the FSL software package. FA maps were created using DTIFIT first, followed by
17	alignment to a common target (FMRIB58_FA template). FA maps were calculated
18	using the FSL diffusion toolbox and aligned to a 1*1*1 mm MNI 152 standard space.

1	We then created a mean FA skeleton with a threshold of $FA > 0.2$ and projected
2	individual FA data onto this, as well as applying the same projection to the other maps.
3	Statistical analysis: For MRI group comparisons, the pre-processed data were
4	analyzed using an analysis of covariance model; age and gender were considered
5	nuisance variables. The statistical threshold for results was $p < 0.05$ , corrected for
6	multiple comparisons using family-wise error (FWE) in comparisons between patients
7	with ALS and healthy controls. An uncorrected $p < 0.001$ was used for multiple
8	comparisons among the subgroups of patients with ALS in GM volumes, and a
9	corrected $p < 0.05$ was applied for multiple comparisons using threshold-free cluster
10	enhancement (TFCE) [30] in TBSS using 5,000 permutations in the permutation test as
11	implemented in the FSL submodule <randomise>. Ordinary statistical analyses were</randomise>
12	performed using the Statistical Package for the Social Sciences (SPSS) version 20
13	(IBM, Armonk, NY, USA).

14

## 15 **RESULTS**

16 **Demographic and clinical characteristics**: The data of patients with ALS and healthy 17 controls are summarized in Table 1. There were significant differences between 18 baseline MMSE (p = 0.002) and FAB scores (p < 0.001) of patients with ALS and

1	those of controls; decreases in FAB scores were especially severe (Table 1). During
2	baseline MRI scans, we observed no differences among the rapid (delta-ALSFRS-R
3	from diagnosis scores $\geq$ 7; n = 12; 8 males, 4 females; age, 61.3 ± 7.7 years; onset form,
4	limbs: $n = 10$ , bulbar: $n = 2$ ), intermediate (delta-ALSFRS-R from diagnosis scores = 3,
5	4, and 5; $n = 36$ ; 19 males, 17 females; age, $60.4 \pm 7.2$ years; onset form, limbs: $n = 27$ ,
6	bulbar: $n = 9$ ), and slow (delta-ALSFRS-R from diagnosis scores $\leq 3$ ; $n = 19$ ; 13 males,
7	6 females; age, $60.4 \pm 7.2$ years; onset form, limbs: $n = 14$ , bulbar: $n = 5$ ) progression
8	groups in terms of age, gender ratio, onset form, and MMSE, FAB, and ALSFRS-R
9	scores at patient registration. However, 6 months after the baseline MRI scan, there
10	were significant differences in ALSFRS-R among the three groups (Figure 1A and 1B,
11	and Table 2).
12	VBM results: There were lower cortical and subcortical GM volumes in patients with
13	slow (Figure 2A), intermediate (Figure 2B), and rapid (Figure 2C) progression ALS
14	compared with controls (p $< 0.05$ , corrected for multiple comparisons using FWE), but
15	the location of these changes differed. In the slow progression ALS group, these
16	reductions were localized in the precentral knob of the motor cortex, and extra motor

regions, such as the caudate head, medial frontal gyrus, thalamus, and cingulate gyrus. 17

In the intermediate progression group, significant GM volume reductions appeared in 18

1	the frontotemporal lobes, a region not affected in the slow progression group. In the
2	rapid progression group, GM volume reductions were more widespread and severe
3	than in the other two ALS groups. The regions involved included the basal ganglia,
4	particularly the caudate head and thalamus, and the dorsomedial frontal cortex,
5	including the anterior cingulate cortex and the lateral part of the orbitofrontal cortex.
6	Further reductions were seen in the inferior frontal gyrus, dorsolateral prefrontal cortex,
7	insula, and temporal pole, in addition to motor cortex regions.
8	Direct comparisons between the slow and rapid progression groups revealed that the
9	rapid progression group had significant GM atrophic changes in the caudate nucleus
10	head, thalamus, insula, and dorsomedial frontal cortex, with an uncorrected statistical
11	threshold of $p < 0.001$ (Figure 2D). However, these trends were not statistically
12	significant after correction (FWE corrected at $p < 0.05$ ).
13	DTI results: Lower FA on TBSS analysis exhibited widespread areas in the slow
14	(Figure 3A), intermediate (Figure 3B), and rapid (Figure 3C) progression groups
15	compared with controls. The decreases in all three ALS groups were commonly
16	observed beyond extra motor regions, including the corona radiata and internal capsule
17	of the pyramidal tracts, specifically, the region surrounding the caudate nucleus,

18 thalamus, and anterior horn of the lateral ventricle. The decreases were larger and more

1	widespread in subcortical regions of the dorsomedial frontal cortex and the lateral part
2	of the orbitofrontal cortex, according to the patient's disease progression. Specifically,
3	the rapid progression group showed more severe and widespread involvement than the
4	slow progression group, with decreases extending into the WM of the insula, pars
5	opercularis, the posterior temporal and occipital lobes, and regions around the basal
6	ganglia, such as the nucleus head and thalamus (Figure 3D) (p < 0.05, corrected for
7	multiple comparisons using TFCE).
8	A comparison of ALSFRS-R changes from onset to diagnosis and from diagnosis to
9	6 months after revealed that ALS patients in the rapid progression group showed
10	significant sigmoid-like slope progression changes, but those in the slow and
11	intermediate group showed changes that were relatively sequential (Supplemental
12	Figure 1, A-C). Multiple linear regression models with age and sex as covariates in
13	SPM or FSL showed no significant correlations between ALSFRS-R changes from
14	

- 15 in TBSS (uncorrected, p < 0.001). These results indicate that the extent of cerebral
- 16 involvement influences ALS progression.
- 17

## 18 **DISCUSSION**

1	In the present study, we retrospectively investigated the association between the
2	progression pattern of ALS and the brain degeneration that extends beyond the
3	corticospinal tract, as assessed using structural MRI. Our assessments revealed the
4	importance of both cortical and subcortical structures of the frontotemporal lobes in
5	ALS (including the inferior and middle frontal, rectus, and superior temporal gyri), as
6	well as components of the basal ganglia (the caudate nucleus and thalamus). Recently,
7	both pathological and neuroradiological studies have suggested that ALS is associated
8	with widespread involvement of the basal ganglia.[5,6] Previous studies have shown a
9	correlation between the extent of microstructural abnormalities, including the basal
10	ganglia beyond the extra-motor regions with TDP-43 inclusions, and clinically severe
10 11	ganglia beyond the extra-motor regions with TDP-43 inclusions, and clinically severe stages of ALS.[31,32]
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11 12	stages of ALS.[31,32] ALS imaging studies have sought to correlate common clinical variables with
11 12 13	stages of ALS.[31,32] ALS imaging studies have sought to correlate common clinical variables with various MRI measures. Regarding DTI measures, decreased FA in the CST [33,34] has
11 12 13 14	stages of ALS.[31,32] ALS imaging studies have sought to correlate common clinical variables with various MRI measures. Regarding DTI measures, decreased FA in the CST [33,34] has been correlated with rates of disease progression.[11,33,35-37] In morphometric
<ol> <li>11</li> <li>12</li> <li>13</li> <li>14</li> <li>15</li> </ol>	stages of ALS.[31,32] ALS imaging studies have sought to correlate common clinical variables with various MRI measures. Regarding DTI measures, decreased FA in the CST [33,34] has been correlated with rates of disease progression.[11,33,35-37] In morphometric studies, GM density measures have been correlated with disability scores,[6,33,34] and

clinical signs/factors [14-16] are correlated with disease progression in ALS.
Some longitudinal studies using MRI with field strengths of over 3T (providing a
higher resolution and lower signal to noise ratio) revealed that DTI assessments offered
more sensitive parameters than cortical thinning and GM volume.[12,40,41] However,
DTI was not more sensitive than standard clinical outcome measures, such as the

6 ALSFRS-R.[42-44] We suggest that these differences in sensitivity may produce the

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7 inconsistencies in correlations between these MRI parameters and clinical metrics that

8 have thus far been observed because the pathological degeneration in ALS involves

9 mixed upper and lower motor neurons in different spinal cord and brain regions.[45]

Our objective was to investigate whether structural MRI can be used as an indicator 10of progression in the disease course of sporadic ALS. In previous studies, the rate of 11 ALS disease progression has been calculated as "ALSFRS-R full score - ALSFRS-R 12score at first visit / symptom duration".[46,47] This delta ALSFRS-R from onset is one 13of the promising prognostic markers, [26] but has not been proven to be a prediction 14marker of progression in functional decline. Regarding the progression pattern, we 15identified the following four clusters of longitudinal functional decline among our 1617cases 1) a rapid decline cluster (13%); 2) an intermediate decline cluster (24%); 3) a sigmoidal decline cluster (15%); and 3) a moderate decline cluster (48%).[16] 18

Furthermore, the identified trajectories were not exactly linear, but were curvilinear. 1 Particularly, score of the "sigmoidal decline cluster" decreased slowly in the early  $\mathbf{2}$ course and became rapid along the way. Thus, delta-ALSFRS-R from onset and 3 "delta-ALSFRS-R from diagnosis" will be different in some patients. Based on these 4 backgrounds, we compared the relationship between widespread cerebral involvement  $\mathbf{5}$ and both delta-ALSFRS-R from onset and that from diagnosis, showing that ALS 6 patients in the rapid progression group demonstrated significant sigmoidal curve 7changes in the progression slope. 8

Our study of genetically sporadic patients with ALS revealed grey matter changes in 9 regions including the thalamus and caudate nucleus of the basal ganglia, which is 10consistent with previous studies.[41,48] Moreover, in the present study not only were 11 12changes observed in widespread brain regions beyond corticospinal tracts, including the thalamus and caudate nucleus of the basal ganglia, but also these changes 13correlated with ALS progression. These results strongly indicate that ALS is a 14widespread neurodegenerative disease that exerts its influence across motor regions. 15Based on our findings, we propose two underlying neuropathological mechanisms of 1617ALS. First, both corticospinal tracts and direct regulator regions that exist around the tracts are related to basic and instrumental activities of daily living (ADL), which 18

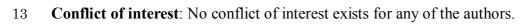
1	mainly involve motor function. This type of motor function is based on more
2	widespread neural networks and circuits, in contrast to previous reports.[49,50] Thus,
3	we suppose that widespread brain changes across motor systems affect ADL functional
4	outputs in ALS. Second, more widespread brain changes were found in accordance
5	with the progression of ALS, regardless of the ADL condition, as ALSFRS-R scores
6	were not qualitatively different at baseline MRI between the three patient subgroups.
7	We suppose that the changes across motor regions were likely due to subclinical
8	neurodegeneration, which would contribute to decline in ADL over the course of ALS.
9	The present study has several limitations. First, we examined only general cognitive
10	functions via the MMSE and FAB, and were unable to conduct neuropsychological
11	batteries focused on executive and memory functions, which can reveal subtle
12	cognitive and behavioural changes. This assessment may be important because
13	executive and memory functions are affected in frontotemporal dementia, and
14	frontotemporal dementia is significantly related to shorter survival and faster
15	progression in ALS.[47,51] This limitation may have concealed our ability to identify
16	subtle clinical abnormalities. Additionally, we regrettably did not obtain upper motor
17	
11	neuron impairment scores that could represent upper motor neuron dysfunction,[52]

1	limitations, therefore we examined MRI scans and MMSE/FAB batteries only at
2	patient registration, and did not conduct follow-up MRI scans or cognitive tests after 6
3	months. Regarding MRI technical sectors, 12 axial slices were used in the DTI
4	component of our study, which is a relatively small amount compared with other recent
5	MRI imaging studies. However, our findings suggest that the progression patterns
6	observed via VBM and DTI in patients with sporadic ALS may help with the clinical
7	diagnosis of distinct disease subtypes. Longitudinal studies over longer periods of time
8	and with a larger number of subjects are required to further clarify the clinical time
9	course and distribution of both GM and WM pathologies in ALS.[12,39,40]
10	In the present study, we observed disruptions in the motor-frontal-subcortical areas
10 11	In the present study, we observed disruptions in the motor-frontal-subcortical areas in the form of decreased GM volume and reduced WM-FA, which was associated with
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11 12	in the form of decreased GM volume and reduced WM-FA, which was associated with impaired connections and disease progression. There was also a strong association
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11 12 13 14	in the form of decreased GM volume and reduced WM-FA, which was associated with impaired connections and disease progression. There was also a strong association between impaired connections identified via the anatomical degeneration analysis using VBM and DTI, indicating the usefulness of both approaches in characterizing the
<ol> <li>11</li> <li>12</li> <li>13</li> <li>14</li> <li>15</li> </ol>	in the form of decreased GM volume and reduced WM-FA, which was associated with impaired connections and disease progression. There was also a strong association between impaired connections identified via the anatomical degeneration analysis using VBM and DTI, indicating the usefulness of both approaches in characterizing the widespread effects of ALS on brain structure. Together, these findings suggest that the

1 diagnose and individually characterize the progression of ALS.

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12	



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#### 1 **FIGURE LEGENDS**

 $\mathbf{2}$ Figure 1. Line graphs of (A) ALS change in each patient, with (B) medians and error-bars representing changes in ALSFRS-R scores between MRI scans at the time of 3 registration and 6 months after registration in the slow progression group 4 (delta-ALSFRS-R scores  $\leq 3$ , n = 19) (blue colour), the intermediate progression group  $\mathbf{5}$ (delta-ALSFRS-R scores = 4, 5, and 6, n = 36) (black colour), and the rapid 6 progression group (delta-ALSFRS-R scores  $\geq$  7, n = 12) (red colour).  $\overline{7}$ ALS. amyotrophic lateral sclerosis; ALSFRS-R, ALS Functional 8 Rating Scale-Revised; delta-ALSFRS-R scores, ALSFRS-R scores at the initial MRI scan 9 minus those taken 6 months later. 10

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Figure 2. Cortical and subcortical gray matter (GM) volume reduction at registration in the (A) slow, (B) intermediate, and (C) rapid ALS progression groups compared with controls (p < 0.05, corrected for multiple comparisons using family-wise error), and (D) between the slow and rapid progression groups (p < 0.001, uncorrected for multiple comparisons). These are 3D rendered, with the original T1 template averaged across the healthy controls normalized to MNI templates. Irrespective of the presence of rapid progression, patients with ALS commonly show significant GM reduction in

1	the dorsomedial frontal cortex, including the anterior cingulate cortex, lateral part of
2	the orbitofrontal cortex (especially in the inferior frontal gyrus), dorsolateral prefrontal
3	cortex, and temporal pole compared with controls. In cortical regions (i.e., medial
4	prefrontal cortex, medial orbitofrontal cortex, and anterior insula) and in subcortical
5	regions (i.e., basal ganglia and head of the caudate nucleus), GM reductions are
6	observed in the rapid ALS progression group. More extensive reductions in the middle
7	and inferior frontal gyri, inferior and middle temporal cortices, head of the caudate
8	nucleus, and thalamus are clearly observed in direct comparisons between the slow and
9	rapid progression groups.
10	ALS, amyotrophic lateral sclerosis; FWE, family-wise error; R, right; L, left.
10 11	ALS, amyotrophic lateral sclerosis; FWE, family-wise error; R, right; L, left.
	ALS, amyotrophic lateral sclerosis; FWE, family-wise error; R, right; L, left. <b>Figure 3.</b> Decreased fractional anisotropy (FA) on tract-based spatial statistics (TBSS)
11	
11 12	Figure 3. Decreased fractional anisotropy (FA) on tract-based spatial statistics (TBSS)
11 12 13	<b>Figure 3.</b> Decreased fractional anisotropy (FA) on tract-based spatial statistics (TBSS) analysis at registration in the (A) slow, (B) intermediate, and (C) rapid ALS
11 12 13 14	<b>Figure 3.</b> Decreased fractional anisotropy (FA) on tract-based spatial statistics (TBSS) analysis at registration in the (A) slow, (B) intermediate, and (C) rapid ALS progression groups compared with controls, and (D) between the slow and rapid
<ol> <li>11</li> <li>12</li> <li>13</li> <li>14</li> <li>15</li> </ol>	Figure 3. Decreased fractional anisotropy (FA) on tract-based spatial statistics (TBSS) analysis at registration in the (A) slow, (B) intermediate, and (C) rapid ALS progression groups compared with controls, and (D) between the slow and rapid progression groups ( $p < 0.05$ , corrected for multiple comparisons using threshold-free

1	lateral ventricle. The decreases are larger and more widespread in subcortical regions
2	of the dorsomedial frontal cortex and the lateral part of the orbitofrontal cortex,
3	according to the patient's disease progression. Specifically, the rapid progression group
4	show more severe and widespread involvement than the slow progression group, with
5	decreases extending into the WM of the insula, pars opercularis, the posterior temporal
6	and occipital lobes, and regions around the basal ganglia, such as the nucleus head and
7	thalamus.
8	TFCE, threshold-free cluster enhancement; ALS, amyotrophic lateral sclerosis; R,

9 right; L, left.

2	at the initial MRI scan						
3		ALS (n = 73)	Controls (n = 38)	p values			
0	Age (year)	$60.9\pm7.9$	$59.2 \pm 8.4$	NS			
	Sex (male / female)	45 / 28	19 / 19	NS			
	Disease duration (year)	$1.6 \pm 1.0$	_	_			
	Education (year)	$13.1 \pm 2.2$	$14.6 \pm 1.4$	NS			
	ALSFRS-R	$40.2\pm3.3$	$48.0\pm0.0$	p < 0.001*			
	MMSE	$28.1 \pm 1.9$	$29.7\pm0.4$	p = 0.002*			
	FAB	$15.6 \pm 3.8$	$17.9 \pm 0.2$	p < 0.001*			

## 1 Table 1. All participant characteristics and cognitive test results

\*Mann-Whitney U test. ALS, amyotrophic lateral sclerosis; ALSFRS-R, revised amyotrophic lateral sclerosis functional rating scale; MMSE, mini-mental state examination; FAB, frontal assessment battery; NS, not significant.

	(A) ΔALSFRS•R ≤ 3 slow progression	(B) $\Delta$ ALSFRS-R = 4,5,6 intermediate progression	(C) $\Delta ALSFRS-R \ge 7$ rapid progression	Death	p values
Age (year)	$60.4 \pm 7.2$	$61.8 \pm 9.1$	$61.3 \pm 7.7$	$*68.5 \pm 8.5$	$\mathrm{p} < 0.001^{\dagger}$
Number (male / female)	19 (13 / 6)	36 (19 / 17)	12 (8 / 4)	6 (5 / 1)	_
Disease duration (year)	$1.7 \pm 0.7$	$1.6 \pm 1.0$	$1.2 \pm 0.4$	$1.3 \pm 0.8$	NS
Education (year)	$13.4 \pm 2.0$	$13.0 \pm 2.8$	$14.0 \pm 1.8$	$12.0\pm0.0$	NS
Limb-onset / Bulbar-onset	14 / 5	27/9	10 / 2	4 / 2	NS
ALSFRS-R	$41.4 \pm 3.0$	$40.6 \pm 3.2$	$41.1 \pm 2.1$	$39.5 \pm 1.8$	NS
(at registration of MRI scan)					
ALSFRS-R	$39.7 \pm 3.3$	$*35.4 \pm 4.0$	$*30.9 \pm 3.9$	Death	$\mathrm{p} < 0.001^{\dagger}$
(after 6 months of registration)					
Rate of ALSFRS-R changes per month	$*0.293 \pm 0.183$	$0.776 \pm 0.418$	$0.947 \pm 0.503$	$0.779 \pm 0.450$	$\mathrm{p} < 0.001^{\dagger}$
(from onset to registration)					
Rate of ALSFRS-R changes per month	$0.271 \pm 0.158$	$*0.898 \pm 0.159$	$*1.708 \pm 0.365$	-	$\mathrm{p} < 0.001^\dagger$
(from registration to 6 months after)					
MMSE	$28.5 \pm 2.0$	$28.2 \pm 1.6$	$28.7 \pm 1.0$	$28.4\pm5.8$	NS
(at the registration of MRI scan)					
FAB		$15.4 \pm 2.0$	$15.6 \pm 1.3$	$15.1 \pm 1.1$	NS
(at the registration of MRI scan)	$15.8 \pm 1.5$				

Table 2. Changes in the conditions of ALS patients over 6 months and their cognitive test results

<sup>†</sup>Kruskal-Wallis test. ALS, amyotrophic lateral sclerosis; ALSFRS-R, revised amyotrophic lateral sclerosis functional rating scale; ΔALSFRS-R, ALSFRS-R scores at the MRI scan - after 6 months of MRI scan; MMSE, mini-mental state examination; FAB, frontal assessment battery; NS, not significant.