

# A population-specific framework for the morphological analysis of Motor Neuron Disease using ultra-high field MRI

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## Synopsis

Imaging biomarkers for Motor Neuron Disease (MND) using MRI presents challenges due to neurodegeneration leading to heterogeneous brain morphology, low SNR, and movement artefacts. Here, we present optimised methods for imaging and processing MND patient data using UHF MRI with submillimetre resolution, and compare hippocampal subfields between patients and healthy controls. We used automatic measures to examine the shape, volume, and morphology of hippocampal subfields and showed specific changes in MND patients that are more sensitive than previous research. This work may serve as a framework for more sensitive computational models for biological characterisation of MND *in vivo*.

## Introduction

Motor Neuron Disease (MND) is a fatal neurodegenerative disease affecting the motor system with wide ranging effects on brain structure and function<sup>1</sup>. The hippocampal formation has been linked to MND through ubiquitin-immunoreactive inclusions in dentate granule cells<sup>2</sup> including TDP-43 proteinopathy<sup>3</sup>. Further, hippocampus volume and subfield shape changes have been found at 1.5T<sup>4</sup>, and alterations to perforant path white matter have been reported<sup>5</sup> *ex vivo*. Here, we present optimised imaging and post-processing strategies using ultra-high field MRI to assess hippocampus subfield characteristics that are only measurable at higher field strengths, and that could serve as a framework for imaging biomarkers in MND.

Segmenting and analysing shape changes in hippocampus subfields in MND patients using *in vivo* MRI presents novel imaging challenges due to contrast changes between images<sup>6</sup>, decreased signal-to-noise-ratio due to increased movement of patients in the scanner<sup>7</sup>, and heterogeneity of morphometry leading to decreased registration performance and atlas convergence<sup>8</sup>.

Methods for automatic post-processing<sup>9</sup> that utilize the submillimetre resolution and enhanced tissue contrast enabled by UHF MRI for heterogeneous brain morphology are not currently possible without manual examination/segmentation of MR scans and optimisation of analysis parameters.

We here detail automated methods for extracting precise measures describing hippocampal subfield morphology and compare these features in MND patients and healthy controls (HCs). We first used optimised MR scan parameters<sup>13</sup> to measure hippocampus subfields as an archetype of complex neuroanatomy to be modelled. We utilised inverse consistent deformable registration methods<sup>14</sup> to characterise hippocampus subfield volumes, replicate and extend findings of shape changes of hippocampus in MND automatically<sup>12</sup>, and confirm our findings using statistical parametric mapping between HCs and MND patients.

## Methods

11 patients diagnosed with MND (Age, M=59.36, SD=7.65) and 11 age-matched HCs (M=60.23, SD=7.65) were imaged on a 7T Siemens MAGNETOM using a 2D TSE sequence (0.4x0.4x0.8mm<sup>3</sup>) over a slab placed orthogonally to the hippocampus. A whole-brain T1w MP2RAGE image (0.9mm isotropic voxel size) was also acquired (TR/TE/TIs=4300ms/2.5ms/840,2370ms).

The T1w and T2w images were jointly registered to group-specific multi-contrast templates for only MND patients (Fig. 1, left), only HCs (Fig. 1, centre), and also collectively registered to a template comprising all participants ('All' Fig. 1) using ANTs<sup>15</sup>. The three multi-contrast templates were segmented using the 'Automatic Segmentation of Hippocampus Subfields' (ASHS<sup>16</sup>) package, and individual labels (Cornu Ammonis [CA]1-3, dentate gyrus [DG], and subiculum [SUB]) for each template were projected to the individual's scan by the inverse transformation. Analysis of outliers for the harmonic energy of the subject-to-template transformations were computed, and a comparison of log Jacobians, which represent the local distribution of tissue expansion or compression between groups were computed using statistical parametric mapping via ANTs and FSL's randomise<sup>17</sup>.

Labels from the 'Group' template building process were converted to geometric shape images using SPHARM-PD<sup>14</sup>, and shape differences between MND and HCs were compared for each subfield.

## Results

Figure 2 shows greater divergence of subfield volumes between HCs and MND patients when a group specific template was used compared to the 'All' template or in a standard approach using ASHS (Cross-sectional; Figure 2), which indicates labels fit homogeneously to priors using the standard method. Ultimately, both reverse normalisation segmentation strategies show a reduction in all individual hippocampus subfields for MND patients compared to HCs. However, this difference was much more pronounced using group-specific templates.

We used statistical parametric mapping to evaluate the log jacobian determinant differences between HCs and MND patients (Figure 3). This test shows expansions and shrinkages in tissue comparing between groups. Permutation testing revealed significant clusters of decreased hippocampus size in MND patients compared to HCs in the left head of the hippocampus.

A shape analysis (Figure 4) of differences between HCs and MND patients revealed significant differences in shape for left, but not right CA1 regions, in line with previous manual segmentation work<sup>4</sup>.

## Discussion and conclusion

We evaluated different segmentation strategies for hippocampus subfields based on deformable image registration in patients with heterogeneous brain morphology. Group specific templates showed greater differences in hippocampus subfield volumes in MND patients compared to HCs. The template transformations encode the variability of the population under study<sup>14</sup>, and creating population based templates with large samples reduce bias towards any individual. However, it may also be useful to use deformable registration-based segmentation that captures the average morphology of individual sub-groups.

We confirmed our results with both statistical parametric mapping and a shape-based analyses, which uniquely show differences between the HCs and MND patients in terms of hippocampal morphology. The general nature of the analysis framework presented here allows its straightforward extensions towards other brain regions, such as upper motor neuron tracts, hypothalamus<sup>18</sup>, and related regions involved in MND disease progression. Note that especially longitudinal studies involving different dementia or MND subgroups would benefit from the increased sensitivity towards small volume changes. In conclusion, template-based hippocampus subfield segmentation allowed for assessment of volume loss in MND. This may provide insight into reported CA1 shape changes in MND patients and the overlapping diagnosis of frontotemporal dementia and MND<sup>1</sup> and may provide a useful imaging biomarker for improved diagnosis of MND. Further, this work is a step in the direction of more sensitive computational models for biological characterisation of MND *in vivo*.

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## Figures

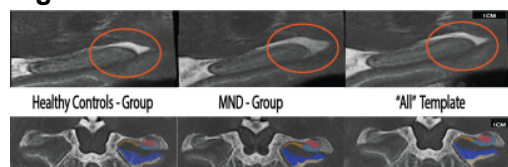


Figure 1. (Top) sagittal and (Bottom) coronal views of hippocampus in the HC, MND and 'All' templates. Labelling of hippocampus subfields (coloured) are superimposed over the left hippocampus (CA1: aqua; DG: red; SUB: orange). Orange ellipsis show differences in subfield and CSF volume between template building techniques.

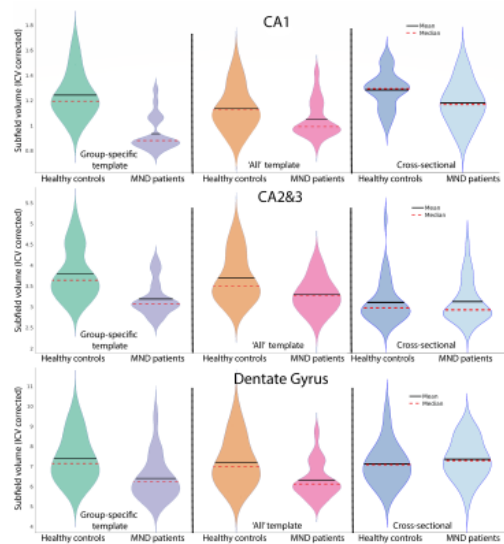


Figure 2. Violin plots of ICV corrected volumes for each hippocampus subfield (Top: CA1, Middle: CA2&CA3, bottom: Dentate gyrus) for each method (left: group specific template, middle: 'All' template, right: standard 'out of the box' cross-sectional approach. Differences between HCs and MND patients can be seen between the left and right sides of each method.

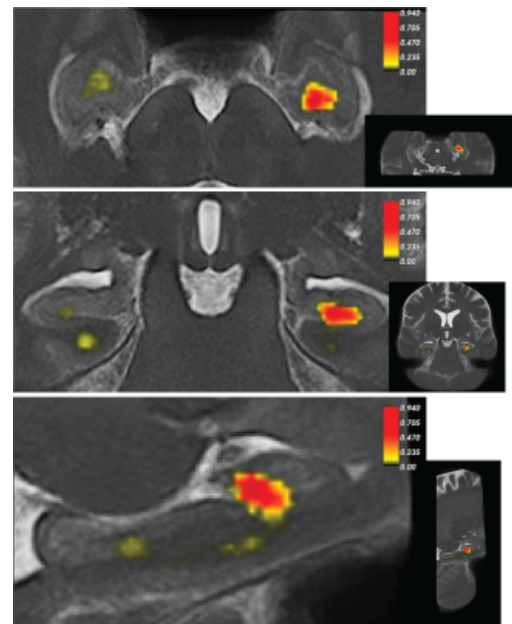


Figure 3. Areas of significantly changed morphology in hippocampus subfields between healthy controls and MND patients. Overlaid 1-*p* maps show of significantly decreased hippocampus subfield morphology for MND compared to healthy controlled (cluster-based thresholding corrected for multiple comparisons by using the null distribution of the max across the image). Zoomed (left) images of axial (top), coronal (middle), and sagittal (bottom) sections.

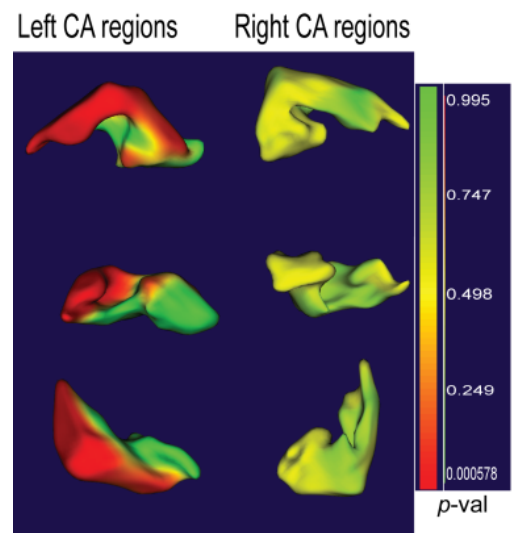


Figure 4. Shape analysis of left (left) and right (right) CA regions between Motor Neuron Disease patients and healthy controls from three different angles. Shapes were created using SPHARM-PD, and differences were analysed in Slicer3D. Significant shape differences ( $p$ -values) between groups (FWE corrected) are shown in red.