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RESEARCH ARTICLE

Influence of scanning plane on Human Spinal Cord functional Magnetic Resonance echo planar imaging

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Abstract

Background

Functional Magnetic Resonance Imaging (fMRI) is based on the Blood Oxygenation Level Dependent contrast and has been exploited for the indirect study of the neuronal activity within both the brain and the spinal cord. However, the interpretation of spinal cord fMRI (scfMRI) is still controversial and its adoption is rather restricted because of technical limitations. Overcoming these limitations would have a beneficial effect for the assessment and follow-up of spinal injuries and neurodegenerative diseases.

Purpose

This study was aimed at systematically verifying whether sagittal scanning in scfMRI using EPI readout is a viable alternative to the more common axial scanning, and at optimizing a pipeline for EPI-based scfMRI data analysis, based on Spinal Cord Toolbox (SCT).

Methods

Forty-five healthy subjects underwent MRI acquisition in a Philips Achieva 3T MRI scanner. T₂*-weighted fMRI data were acquired using a GE-EPI sequence along

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Ethics Committee was approved in 2017 and did not consider any public sharing, anyway, to request access to data, researchers may contact the corresponding author and the Ethics Committee of Santa Lucia Foundation (Ethics Committee | Fondazione Santa Lucia (hsantalucia.it)).

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Abbreviations: DSC, Dice Similarity Coefficient; FDR, False Discovery Rate; MSF, maximum sustainable voluntary contraction force; OVS, Outer Volume Suppression; SC, spinal cord; scfMRI, spinal cord fMRI; SCT, Spinal Cord Toolbox.

sagittal and axial planes during an isometric motor task. Differences on benchmarks were assessed via paired two-sample t-test at p<0.05.

Results

We investigated the impact of the acquisition strategy by means of various metrics such as *Temporal Signal to Noise Ratio (tSNR)*, *Dice Coefficient to assess geometric distortions, Reproducibility* and *BOLD signal sensitivity to the stimulus*. tSNR was higher in axial than in sagittal scans, as well as reproducibility within the whole cord mask (t=7.4, p<0.01) and within the GM mask (t=4.2, p<0.01). The other benchmarks, associated with distortion and functional response, showed no difference between images obtained along the axial and sagittal planes.

Conclusions

Quantitative metrics of data quality suggest that axial scanning would be the optimal choice. We conclude that axial acquisition is advantageous specially to mitigate the effects of physiological noise and to minimize inter-subject variance.

Introduction

The spinal cord (SC) links the brain to the peripheral nervous system, via ascending and descending pathways, and it is involved in several complex functions [1]. Among different imaging methods, functional Magnetic Resonance Imaging (fMRI) represents the most promising tool for non-invasive investigation of the human spinal cord physiological function [2–7]. Spinal cord fMRI (scfMRI) can be also useful for the characterization of diseases, such as those involving traumatic injury, neuroinflammation, neurodegeneration or chronic pain [8–14], or conditions like pain and analgesia [15,16]. However, in spite of this potential, the use of scfMRI is fairly restricted in both research and clinical settings [17], due to challenges in data acquisition/ analysis [18–20]. Causes and possible mitigation approaches of these problems have been discussed in depth elsewhere [18,21,22]. Briefly, SC physical dimensions, inhomogeneity of surrounding tissues and motion negatively affect data quality and reproducibility.

Even the choice of the basic scanning sequence is not trivial, because of the involved compromises between contrast sensitivity and data quality. In this study, scfMRI acquisitions were performed via Gradient Echo recalled Echo planar Imaging (GE-EPI) with the application of the saturation bands located externally, anteriorly and posteriorly to the spinal cord. While being the standard approach for brain fMRI, GE-EPI in scfMRI is prone to quality issues, including severe distortion and signal cancellation caused by susceptibility changes associated with motion of surrounding tissue. To minimize this effect, various approaches have been proposed. Recently Kinany et al. compared three imaging protocols including either Outer Volume Suppression (OVS) via saturation bands, or inner FOV imaging for selective excitation



of the region of interest [23]. The investigated protocols offered similar overall performances, but with different profiles in terms of advantages and drawbacks, suggesting that the imaging protocol must be tailored to take into account the specific experimental aims and overall design. A different approach to cope with the influence of surrounding tissue is acquiring along the sagittal plane with anisotropic voxels to optimize the sampling matrix according to the natural geometry of the SC. However, sagittal scanning may potentially suffer from additional low-quality issues, because of more marked trough-slice inhomogeneity compared to axial scanning, and requires thin slices, generally 2 mm or below. Indeed, GE-EPI is routinely performed with para-axial orientation. However, scanning the SC in axial orientation requires a large number of slices to cover the region of interest along the rostral-caudal direction, thus partially losing the characteristic temporal advantage of the GE-EPI approach. This problem can be mitigated by alternatively using simultaneous multislice imaging (SMS) that allows substantial reduction of repetition time for a given number of slices, at the price of somewhat increased sensitivity to motion [24]. Acquisition of a substantial number of slices in rostrocaudal direction may additionally benefit from dynamic shimming [25].

For either orientation, the sampling matrix must be defined to accommodate the surrounding tissue and to avoid phase wrap-around, unless in-plane selective excitation or effective saturation is used.

Irrespective of the scanning strategy, the development of fMRI analysis methods and relevant software has been almost exclusively restricted to the brain, thus limiting standardization and diffusion of scfMRI. Recently, the Spinal Cord Toolbox (SCT) has been developed [26], and can be used to analyse structural and functional data. SCT provides a standard and common analysis platform suitable also for advanced processing tasks, e.g., by providing the possibility to perform voxel-based group analysis in the PAM50 standard space [27].

This study was aimed at systematically exploring the respective merits of axial and sagittal scanning in scfMRI using EPI readout in a large cohort of healthy subjects. Additionally, we implemented and optimized a pipeline for scfMRI EPI data analysis based on SCT.

Materials and methods

Subjects

Forty-five right-handed healthy subjects (median age 29 years, range 20–54 years) participated in this study. Exclusion criteria were diagnosis of neurological disease and contraindication to MRI examination, including psychological disorders like claustrophobia.

The study was carried out in accordance with a protocol approved by the Ethics Committee of IRCCS Santa Lucia Foundation in Rome. All enrolled subjects gave written <u>informed consent</u> in accordance with the Declaration of Helsinki and European Union regulations.

MRI protocol

Acquisitions were performed on a Philips Achieva 3T MR scanner (Philips Medical Systems, Best, The Netherlands) using a neurovascular coil array. In order to determine the technical conditions that would provide the best NMR-image quality, we have carried out the preliminary experimental sessions on 10 control subjects. Acquisition protocol was planned modifying parameters reported in literature [7,28–30]. Geometrical properties (such as slice thikness/in plane voxel size, number of slices) were decided in a preliminary study taking into account SNR, minimal coverage needed for reliable processing and coverage of the investigated area, distortion and partial volume between adjacent tissues [31]. Further than different combinations of FOV, TE/TR, voxel size, these preliminary experimental sessions investigated spin echo (SE) and gradient echo (GE) sequences. In particular, we observed motor-related signal changes for gradient-echo EPI that were about double those of SE. The distinction between GE and SE methods has particular relevance in the spinal cord because the superficial draining veins are separated from the grey matter of the spinal cord by the white matter tracts.



This is given further support by a hypercapnia challenge study that showed the GE BOLD response to be dominated by signal changes at the SC surface [30].

For both acquisition plans, the largest temporal signal to noise ratio (tSNR) was obtained with the following condition. T2*-weighted fMRI data were acquired using a 2D GE-EPI sequence along sagittal and axial planes, with the following parameters: TE/TR=25/3000 ms, Flip angle=80°, bandwidth (3000 Hz x 64 pixels) about 1kHz. Sagittal scans had FOV=192 x 144 x 104 mm3 (IS x AP x RL), acquisition matrix=64 x 94 x 35 and were reconstructed by the scanner to a voxel size of 1.5 x 1.5 x 2 mm3. Axial scans had FOV=140 x 140 x 143 mm3 (AP x RL x IS), acquisition matrix 92 x 94 x 34 and reconstructed to a voxel size 1.5x1.5x3 mm3. For both acquisition planes 2 saturation bands were applied (anteriorly and posteriorly to the spinal cord) and a SENSE factor of 2 was used. The order of axial and sagittal scans was randomized between subjects and included 110 EPI volumes per run. Anatomical reference images were acquired using 3D T1-weighted gradient echo sequence (TE/TR=5.89/9.59 ms, flip angle=9°, FOV=240 x 240 x 192 mm3, resolution=0.75 x 0.75 x 1.5 mm3 interpolated). Heartbeat and respiration data were recorded using scanner integrated plethysmograph and respiratory belt during all functional runs. T2-weighted images were acquired as well and were assessed by an experienced radiologist to check for unknown pathological signs but were not directly used in this work. The imaging FOV included the cervical region of the spinal cord, from C1 to T2.

Stimulation paradigm

Immediately before the fMRI session, subjects underwent an assessment and training phase outside the MR scanner with the stimulation device (Grip force response device HHSC-1x1-GRFC-V2, CURDES, Philadelphia, US). In a first trial, the maximum sustainable voluntary contraction force (MSF) was determined: subjects were asked to press the device up to their maximum sustainable force with the right hand, and to keep the force for 30s. Then, subjects were trained to perform the task.

The task consisted in a block-designed isometric motor contraction performed with the right hand and guided by a visual feedback system. The stimulation protocol started and ended with a rest epoch, and overall included 11 epochs alternating task execution and rest. Epochs lasted 30s each, for a total duration of 5.5 minutes. During task epochs, subjects were requested to steadily apply a given level of force on the grip device, pseudo randomly selected among 20%, 40% or 50% of MSF of the subject. The subjects were previously notified that a different amount of force would be needed to reach the target during each epoch. All subjects were asked to perform 4 fMRI runs of the stimulation protocol, two for each acquisition plane.

The Grip force response device was interfaced to a Windows workstation running Presentation software (v. 20.2), allowing real time measurement of the applied force. The same workstation generated the visual feedback and recorded the sampled force, synchronously with the fMRI acquisition. Visual feedback was a red bar, whose length was proportional to the applied force. Following a countdown of 30s, cues about the beginning and end of each epoch were visually presented as well. The target force was always set at mid length of the bar (irrespectively of the actual required force) and identified by yellow marks. Visual feedback was shown on an LCD screen and seen by the subject via a mirror.

To minimize task-related motion, participants were mildly contained with the help of cushions and orthopaedic shoulder restraints. Subjects were instructed to relax the muscles not directly involved in the task, to direct their attention to the feedback bar, and not to move in response to the stimuli throughout both the training phase and the actual fMRI experiment. Subject compliance was continuously visually assessed.

Pre-processing pipeline

Data pre-processing and processing were performed combining existing software tools commonly employed for brain fMRI with SCT, including slight adaptations of the latter. In particular, we used a custom-made Matlab (The MathWorks, Inc.) implementation of RETROICOR, SPM12 (http://www.fil.ion.ucl.ac.uk/spm/), Analysis of Functional NeuroImages



(AFNI) [32], FMRIB Software Library (FSL- https://fsl.fmrib.ox.ac.uk/fsl/fslwiki) and SCT [33] (see Fig 1). SCT was used to perform all the spatial preprocessing tasks, while the other software was used for physiological noise mitigation, slice timing, statistical inference and pipeline integration. Specifically, we have considered the two different encoding directions in the set-up of the processing pipeline parameters involving adjustments in slice timing correction and reorientation that take into account the unique properties of sagittal data, such as differences in slice thickness and encoding direction effects on signal intensity.

Preliminarily, T_1 -weighted images of each subject were segmented in white matter (WM), grey matter (GM) and cerebrospinal fluid (CSF) using SCT, allowing automated vertebral level identification. A SC mask was obtained merging GM and WM masks. The mean functional image of each run was computed to be used as a reference for realignment after physiological noise correction.

RETROICOR noise correction was applied to each functional run, using recorded pulse and respiration data [34] and including two cardiac and two respiration terms and the relevant first derivatives. Motion correction was then performed with SCT estimating slice-by-slice translations while ensuring regularization constraints along the spine. To avoid metric of the cost function to be weighted towards surrounding structures, motion correction was limited to a region enclosing the spinal cord (about 50 mm x 50 mm in plane) derived from the mean functional image.

Realigned data were corrected for slice-timing using SPM. EPI images were then normalized to the PAM50 template with SCT. The transformation matched fMRI data to the template by automatically generating and registering to the centre-line appropriate labels along the SC. Then a multi-step nonlinear warping on the axial-plane was applied to the functional images that were finally registered in rostro-caudal direction using a regularized polynomial function [33].

After normalization, images in PAM50 space were smoothed with a 1D Gaussian Kernel (3mm) along the spinal cord centreline direction, to cope with natural spinal cord anatomy and minimize CSF contamination.

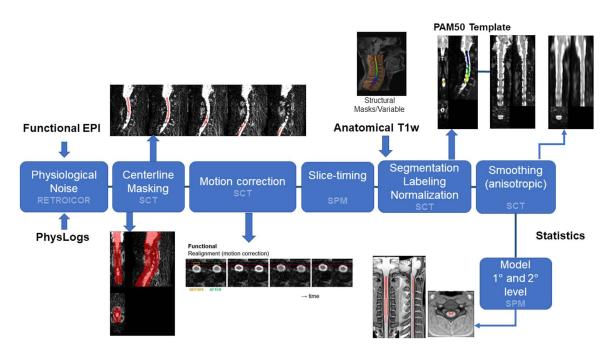


Fig 1. Pictorial view of the of the data processing pipeline. Schematics of the data processing pipeline illustrating the main steps and related toolbox used (SCT or SPM). PhysLogs: physiological log files.



We investigated the performance of the de-noising strategy on both acquisition plans by evaluating the tSNR in comparison with another preprocessing pipeline exploiting AFNI 3dWarpDrive instead of SCT MoCo for motion correction, that is the source of noise that affects SC functional MRI at most. The variability of tSNR increase was assessed by computing the relative Coefficient of Variation (CV). We found that the SCT MoCo algorithm led to an increase in image tSNR of about 16% and 41% for sagittal and axial images, respectively, thus significantly outperforming available computational tools such as AFNI 3dWarpDrive (S1 Fig). In addition, compared with AFNI SCT MoCo substantially reduced the variability of the relative tSNR change among subjects (by 15% and 7% for sagittal and axial images, respectively). The spatial distribution map of the tSNR gain indicates that the increase is restricted to the cord and it is rather uniform across it for both axial and sagittal plans.

Data analysis

Functional response. Analysis of fMRI time series was carried out voxel-wise in the time domain by means of a general linear model of the functional response, built by convolving the spinal cord haemodynamic response [35] with the task paradigm.

Quality metrics. We investigated the impact of acquisition strategy by means of various metrics.

Temporal Signal to Noise Ratio (tSNR [36]). Maps of the mean tSNR, calculated across subjects and for both axial and sagittal acquisition planes, are reported in Fig 2a. In general, the average tSNR is greater for images acquired along the axial than the sagittal plane. Moreover, tSNR inside the cord tends to be greater than tSNR within the CSF for the axial plane, whereas tSNR values inside and outside the cord are more comparable in sagittal scans. Analysis at vertebral levels showed that tSNR, averaged within the SC, of images acquired along both planes was comparable in high cervical regions (C1-C3), while axial acquisition plan resulted in significantly higher tSNR in lower cervical to upper thoracic levels, thus at level 4 (t=2.4, p<0.02), level 5 (t=6.0, p<0.001), level 6 (t=5.6, p<0.001), level 7 (t=5.4, p<0.001), level 8 (t=3.6, p<0.001), level 9 (t=2.0, p<0.05, Fig 2b).

Dice Similarity Coefficient (DSC). Degree of geometrical fidelity (i.e., a reciprocal measure of distortion) was evaluated for each subject by calculating the DSC [37] between the spinal cord mask derived from the anatomical image (used as undistorted reference) and spinal cord masks derived with SCT from axial or sagittal functional images. DSC provided a measure of the spatial overlap between the two masks.

Reproducibility of results across subjects was computed as the Pearson's correlation coefficients between subjects' unthresholded functional t maps within either the GM mask, or the whole cord, thus including both GM and surrounding WM. Significant difference in reproducibility between images was assessed on Fisher-transformed correlation coefficients.

Bold signal sensitivity to the stimulus was evaluated voxel-wise as the amplitude of functional contrast (BOLD relative change over the baseline) within the GM.

To assess False Discovery Rate (FDR) we assumed that functional response should be confined to GM. Activation masks were derived from second level group analysis (two-tail, one sample t-test) in function of different thresholds, and voxel count in GM and WM was weighted with the relevant probabilistic tissue maps.

Assuming that functional response should be confined to GM, the number of false positives in GM was estimated by weighting the number of positively active voxels in WM with the relative volume of GM/WM. FDR was finally assessed by computing the ratio between the number of false positives and the number of positively active in GM.

Statistics. Differences on benchmarks were assessed via paired two-sample t-test, significance p < 0.05.

Results

Maps of the mean tSNR, calculated across subjects and for both axial and sagittal acquisition planes, are reported in Fig 2a. In general, the average tSNR is greater for images acquired along the axial than the sagittal plane. Moreover, tSNR inside the cord tends to be greater than tSNR within the CSF for the axial plane, whereas tSNR values inside and



outside the cord are more comparable in sagittal scans. Analysis in relation to vertebral level showed that tSNR of images acquired along both planes was comparable in high cervical regions (C1-C3), while axial acquisition plane resulted in significantly higher tSNR in lower cervical to upper thoracic levels, thus at level 4 (t=2.4, p<0.02), level 5 (t=6.0, p<0.001), level 6 (t=5.6, t=5.6, t

The degree of overlap between spinal cord masks obtained from T1-weighted and EPI scans is shown for a representative subject in Fig 3. Qualitatively, the higher levels are less affected by distortion, that impacts especially the lower cervical to upper thoracic levels. The spatial fidelity was comparable between strategies: average DSC was 0.43 ± 0.08 for acquisition on the axial plane and 0.44 ± 0.06 for acquisition on the sagittal plane. DSC difference was not significant (t=0.8, p>0.4).

The inter-subject reproducibility matrices (cross-correlation between GM and WM t-maps of each pair of subjects) are shown in the supplementary $\underline{S2}$ Fig. Acquisition on the axial plane was more reproducible than acquisition along the sagittal plane within the whole cord mask (t=7.4, p<0.01) and within the GM mask (t=4.2 p<0.01). The histograms of correlation coefficients (displayed in $\underline{\text{Fig 4}}$) show a displacement towards more positive values for axial scanning for both masks. Indeed, the bins for more positive correlations showed systematically higher frequency for axial strategy, while sagittal scanning prevailed in bins for negative correlation (i.e., opposite results between subjects) or small positive correlation.

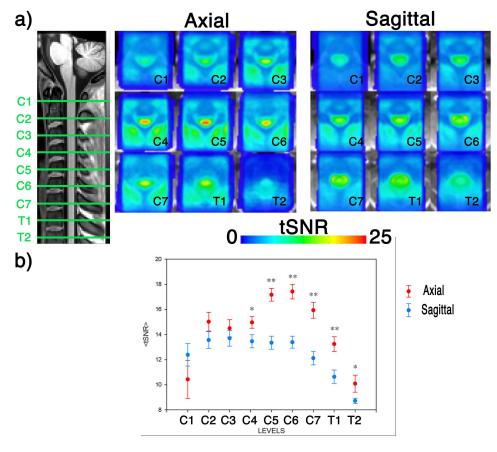


Fig 2. tSNR. a) Maps of the tSNR averaged across subjects in the PAM50 space, at levels from C1 to T2. The maps are overlaid on a standard anatomical template. b) tSNR averaged within the spinal cord at vertebral levels from C1 to T2 for images acquired on axial (red) or sagittal (blue) planes. Data are mean and standard error of the mean across subjects. Significant differences are calculated via two-sample paired t-test and shown as * if $p \le 0.05$, and ** if p < 0.001.



Mean, variance and skewness were computed for both axial (mean_{ax}; var_{ax}; sk_{ax}) and sagittal plane (mean_{sag}; var_{sag}; sk_{sag}) acquisition from the histogram distribution within the whole cord as well as GM mask. Specifically, it was found that mean, variance and skewness were 0.18, 0.047, 0.25 (mean_{sag}, var_{sag}, sk_{sag}) and 0.059, 0.026, 0.36 (mean_{ax}, var_{ax}, sk_{ax}) when computed across the whole cord while 0.071, 0.065, 0.17 (mean_{sag}, var_{sag}, sk_{sag}) and -0.003, 0.053, 0.42 (mean_{ax}, var_{ax}, sk_{ax}) in the case of GM mask. These results are concordant with what we can observe in Fig 4 being the Sagittal scan distributions more asymmetric than the Axial one and the skewness values higher for the Sagittal scan with respect to Axial one. This trend is present in the case of Whole cord mask (sk_{sag} = 0.36, sk_{ax} = 0.25) as well as in the case of GM mask

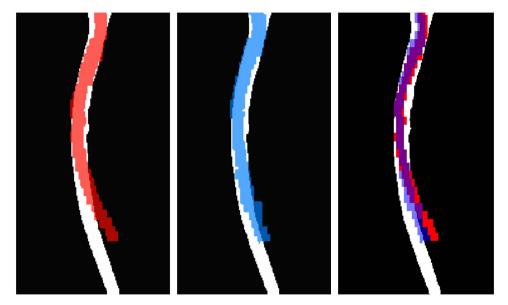


Fig 3. The degree of overlap between spinal cord masks obtained from T1-weighted and EPI scans in a representative subject. Masks of the spinal cord of a representative subject for axial (red, left) and sagittal planes (blue, center). Overlap (right) is highlighted in purple. The relevant T1 mask, assumed as undistorted reference, is white. Average DSC was 0.43 ± 0.08 for acquisition on the axial plane and 0.44 ± 0.06 for acquisition on the sagittal plane. DSC difference was not significant (t=0.8, p>0.4) between scan planes. Beyond distortion, EPI masks have a generally smaller cross-sectional area because EPI masking was performed aggressively to minimize contamination by CSF.

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REPRODUCIBILITY

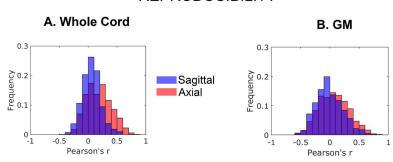


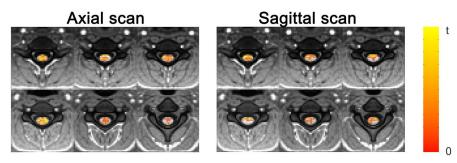
Fig 4. Reproducibility assessment using inter-subject correlation of unthresholded t maps in spinal cord and central gray matter. Reproducibility assessed as inter-subject correlation matrices of unthresholded t maps in spinal cord cord (A), including gray matter (GM) and surrounding white matter, and in central gray matter (B). From the inter-subject correlation matrices, the frequency of Pearson's correlation coefficient values was calculated and displayed in the figure (red: axial, blue: sagittal).



 $(sk_{sag} = 0.42, sk_{ax} = 0.17)$. In addition, mean values are closer to zero for the Sagittal scan than the Axial one while variance has higher values for axial scan than for sagittal one distribution for both masks.

Maps of the mean BOLD signal sensitivity to the stimulus across subjects are reported in <u>Fig 5a</u>. Functional contrast is comparable in the axial and sagittal plane. Two-sample paired t-tests performed within the cord at each vertebral level from C3 to C7, the activated region for the force grip task [38], showed no differences between positive BOLD contrast between axial and sagittal strategies (p>0.01 at each level). <u>Fig 5b</u> shows slice by slice (in PAM50 space) the average BOLD response of the most responding voxels (top 33%). Finally, assuming WM activations as a proxy for the number of false positives in GM, since large BOLD response is not expected in WM [39], the FDR was inferior for axial slices at the most relevant thresholds (p=0.01 and 0.001, in particular), while tended to equalize at permissive thresholds, indicating that when false positives increase, their number becomes independent of experimental strategy (Fig 6).

A. BOLD response maps



B. Average BOLD response

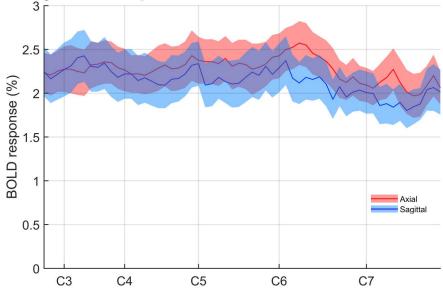


Fig 5. BOLD response maps and rostrocaudal distribution across axial and sagittal acquisitions in the spinal cord. A) Maps of the positive functional contrast (BOLD response) at levels C3-C7 in axial (left) and sagittal (right) acquisition (t=2.4, p>0.01). B) BOLD response (top 33% most responding voxels) averaged at different rostrocaudal levels, in PAM50 space. The response is expressed as percent of the baseline. The approximate position of the center of each spinal segment is marked on the horizontal axis. The amplitude of BOLD in most responding voxels in axial and sagittal acquisition is mostly overlapped at each spinal level.



Discussion

Spinal cord fMRI is affected by many quality issues associated with physiology and technical reasons [18,19,21,40,41]. Spinal cord has small cross-sectional area and variable curvature. Both require the voxel size to be small, and the SNR is consequently affected. The signal may be contaminated by signals from surrounding tissue because of motion, off-resonance effects, imperfect excitation or saturation [21]. The proximity of vertebral columns and air-filled organs increases field inhomogeneity and thus distortion. Indeed, the spinal cord is difficult to image with high quality even with anatomical modalities [42], because of the inherent difficulty of MRI technology in coping with the peculiarities of the district. For example, high order shimming is not always performed at 3T, but even when performed it cannot fully compensate for localised field variations [19], a problem exacerbated if the field is variable because of motion of the cord itself or of nearby organs, such as lungs, throat and heart, during cardiac and respiratory cycles. Functional MRI, relying on image intensity time series, is naturally more prone to artefacts associated with signal stability. It has been observed that physiological cyclic movements have a span that may be comparable to the voxel size, especially in the cervical region [18]. Lastly, also CSF flow pulses synchronously with heartbeat, representing another confounding effect when the tissue signal is contaminated by signal from CSF [40].

One of the problems that prevents the diffusion of scfMRI techniques is the lack of standardised protocols for acquisition and processing, especially if EPI based readout is used. Indeed, fast spin-echo based imaging has been extensively and systematically characterized, and the relevant merits have been sufficiently clarified, both in healthy subjects and in patients that may represent additional challenges, including implants [18], and references therein). Similar efforts have not been devoted to EPI scanning, resulting in the extreme variability of experimental approaches. The need of standardized approaches for structural spinal cord imaging, in the interest of repeatability and multicentric efforts, has been recently stressed [43]. Similar efforts are needed for the systematic optimization of EPI-based scfMRI protocols in functional imaging. This work focused on a specific, but important issue: the effect of the imaging plane. We applied an optimised

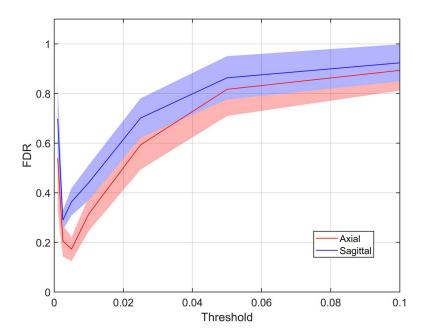


Fig 6. False Discovery Rate estimation as a function of threshold p-value for axial and sagittal acquisitions. False Discovery Rate was estimated assuming that the fraction of active voxels in WM is repetitive of the fraction of False Positives in gray matter (GM) and displayed as a function of threshold p-value, for images acquired on axial (red) and sagittal (blue) planes.



processing protocol to assess across-subject reproducibility and quality metrics of scfMRI acquired along sagittal and axial planes during a typical block-designed motor task.

Acquisition protocol

We implemented a GE-EPI approach for this study. In general, Spin Echo methods produce images of higher quality, especially if using fast spin echo and not EPI readout [19], and are currently used in the majority of published studies [18]. In spite of severe quality shortcomings, there are several reasons to try to extend EPI to spinal cord functional studies. GE-EPI has better temporal resolution than fast spin echo, an important feature when disentangling physiological noise from signal [44], whose relevance is expected to increase with the diffusion of functional connectivity studies in the spinal cord [45,46]. Moreover, GE images produce a T2* contrast, and are thus maximally sensitive to dephasing associated to both BOLD effect and magnetic field inhomogeneity. T2-weighting is in principle less sensitive to BOLD effect, especially at 3T, even if it has been proposed that in the specific conditions of the spinal cord the BOLD sensitivity is overall matched [18]. Finally, the use of EPI readout would allow to easily exploit the high number of features optimized for functional imaging that are currently implemented only in EPI sequences. Spin echo imaging, resulting in T2-weighting, has been shown to be less contaminated by signal from superficial draining veins [47–50], however in the spinal cord most large vessels are separated from grey matter by white matter, and thus the relevance of this advantage is questionable. Masking GE-EPI images inside the spine provided a good strategy to avoid the BOLD signal to be dominated by spurious signals coming from the spinal cord surface. The advantage of shorter TR in EPI could be dramatically increased by using multislice excitation, however the increased sensitivity to motion of accelerated techniques makes unclear if the advantages of more acquired data and more effective physiological noise treatment overcome the penalization of more motion artefacts.

The selection of an imaging plane is a crucial step for an fMRI study, with potentially deep impact on data quality. Indeed, homogeneity of the magnetic field, tissue anatomy and sources of physiological noise are deeply anisotropic when dealing with the spinal cord [51,52]. Axial and Sagittal slices are the two natural candidates for EPI each coping with some of the anatomic peculiarities of the spinal cord. Coronal slices are less suited to follow the anterior-posterior curvature of the spinal cord and require more slices to accommodate single subject specific features), Surprisingly, this study did not evidence an indisputable advantage of either of the two approaches. This result can be probably associated with the fact that both strategies have advantages and drawbacks. For example, in thoracic areas R-L phase encoding in axial slices allows avoiding the spreading of noise from lungs to the spinal cord, but requires either a larger matrix or an effective suppression of the signal from the body outside FOV, because of the larger extension of the body in R-L than A-P direction. On the other hand, sagittal slices are intrinsically best suited to avoid aliasing, because of the smaller chest dimension along the A-P direction, but noise associated with lungs or throat motion must be dealt with. Similarly, the low curvature of the spinal cord in the R-L direction allows the use of a reduced number of slices in sagittal scanning, but slices must be comparatively thinner than with axial orientation, the latter offering a trough-slice averaging that has an inherent physiological meaning.

Data processing: Quality benchmarks

Motion correction is a problematic step in the analysis of functional images of spinal cord, because of the challenging size, flexibility, location among organs whose signals interfere in metric computation, and lack of easily recognizable features in the cranio-caudal direction [53]. Ad-hoc pipelines optimised for spinal cord investigation have been developed to address these issues [19,26,54–56]. We combined spinal cord-optimised motion correction with RETROICOR to cope with the most intense sources of signal variance associated with physiological noise.

After denoising, the tSNR spatial distribution was qualitatively different between acquisition planes. Axial orientation was characterised by higher tSNR in GM, especially at lower cervical levels. Sagittal slices showed instead a relatively uniform distribution of tSNR in the spinal canal, or even a prevalence of peripheral areas, likely biased by the higher local



intensity (Fig 2a). The fluctuations of CSF signal are likely to be heavily influenced by partial saturation in axial vs sagittal scans. In addition, temporal SNR averaged within the spinal cord shows differential spatial patterns. Indeed, it was comparable between planes in the upper cervical levels, while axial slices had a significantly higher tSNR from C4 to T1, levels that encompass the areas expected to respond to the stimulation [57]. Notably, in the protocols used for this study, voxel size is smaller in axial than sagittal slices (6.75 mm³ and 9 mm³, respectively), strongly suggesting that the advantage of axial slices is associated with reduced variance of physiological noise, potentially associated to different partial volume with CSF. This observation is further supported by the anatomically relevant disposition of the effect (relevant in lower areas, likely more impacted by throat and lung motion). Moreover, tSNR tends to be higher on the whole slice in axial scans, including muscular tissue surrounding the cord. This feature suggests overall lower sensitivity to motion for the axial plan encoding.

The degree of overlap, i.e., DSC, between anatomic reference and functional images indicates that functional images are affected by distortion. In comparison with brain studies, the DSC is substantially smaller, e.g., see [58], an expected feature given the larger magnetic field inhomogeneity and different anatomical properties in spinal cord compared to brain fMRI. The geometric fidelity as quantified by DSC was comparable between acquisition planes both in statistical (p>0.4) and numerical terms (0.43±0.08 and 0.44±0.06, axial and sagittal planes, respectively). Qualitative observation suggests that distortion is unevenly distributed in the craniocaudal direction of axial slices, with lower slices more distorted, while distortion appears more homogeneous across spinal cord levels in the sagittal acquisition.

This work was not aimed at identifying the areas responding to the task or at studying the physiology of the response to a multiple level task, but rather at assessing the effects of acquisition plan on the reliability of functional analysis. Cross-correlation between all subjects unthresholded t-maps is expected to be roughly centred on zero, reflecting the number of non-responding voxels, with a tail towards positive correlations associated to reproducible positives. The tail was better delineated in axial images, but the difference was larger in the whole spinal cord cross section compared to grey matter, suggesting the spreading to WM of time-locked oscillations This is probably due to the intrinsic blurring of the images associated with EPI readout and, potentially, with motion associated to task. The width of the cross-correlations distribution suggests that the pattern of responses show a marked variability between subjects.

The average BOLD amplitude in the most responding voxels (top 33% computed at each level in PAM50 space) is comparable between axial and sagittal acquisition (Fig 5a, 5b), in spite of the different tSNR and reproducibility. However, FDR is lower for axial scanning at the most relevant thresholds (Fig 6), while tends to be comparable at permissive thresholds, in agreement with the hypothesis that axial slices are potentially less influenced by physiological correlated noise (or, alternatively, RETROICOR denoising, is more efficient in axial slices). However, the metrics built upon activation analysis depend on the model itself and on the underlying assumptions. In particular, FDR assessment leverages on the assumption that all the activations in WM are false positives. This assumption is questionable according to several previous studies finding activations in WM [45] and to the results of this study, which suggest coherent activity in the WM (see above). The presence of true positives in WM would imply that FDR is overestimated in the present study.

The recent work of Kinany et al indicated that the experimental focus might drive the protocol selection to mitigate efficiently the effects of susceptibility changes in surrounding tissue [23]. While we tested only one of the strategies investigated by Kinany et al, our study highlighted a definite advantage for a specific slice orientation, namely axial scanning. We limited our investigation to standard scanning techniques that are reasonably uniform across vendors, thus we expect that our results are generalizable to other 3T scanners. It should be noted that we tested only a set of parameters for each orientation. Other combinations of geometrical parameters may potentially influence our results, directly affecting SNR, the degree of partial volume contamination, the sampling time, and indirectly influencing important factors like the efficacy of physiological noise suppression and the degree of susceptibility related distortion. However, we don't expect that significantly different geometrical prescriptions are used, because of the anatomical constraints associated to functional imaging of cervical and thoracic spinal cord. The use of advanced strategies (in particular simultaneous multislice excitation or



dynamic z-shimming) is not expected to specifically advantage sagittal acquisition, or may not even be possible in sagittal orientation.

Limitations

Many quality-related scanning options can be finely tuned, and extensive exploration of the complete QA-related parameters space is not possible in vivo. Moreover, many strategical choices interact. For instance, sagittal scanning lends itself toward a bigger voxel because of sampling and anatomical constraints, and the largest dimension is bound to be in the slice selection direction for axial slices, and in the readout direction for sagittal slices. Each of these features has consequences on SNR, partial volume, blurring direction. In principle, it is possible to acquire two datasets with identical parameters, except the imaging plane, however these datasets would be suboptimal for at least one, if not both planes, making at least one of the protocols not representative of the actual scanning practice and thus rendering pointless the comparison. For these reasons, it is difficult to generalize the results of this work beyond the set of parameters here explored. However, this work clearly points out that the imaging plane has consequences on data quality, that affects not only the low-level features of the images, but also the features of the functional contrast, including reproducibility and BOLD signal sensitivity to the stimulus.

Conclusions

We applied preprocessing tailored to EPI-based fMRI of the spinal cord to systematically investigate the optimal scanning plane. Objective quality metrics indicated a definitive advantage for the acquisition in axial orientation. Reproducibility between subjects, a critical feature in scfMRI, is influenced by the imaging plane and is better in axial images with our protocols, suggesting that axial slices may be the preferred choice in studies on healthy humans as well as in clinical studies.

Supporting information

S1 Fig. Increase in tSNR after motion correction in both sagittal and axial images. Representative tSNR maps from a healthy subject before and after SCT fMRI MoCo (left). Group statistics for tSNR after motion correction performed either with AFNI or SCT (right). (TIF)

S2 Fig. Inter-subject correlation matrices of unthresholded t maps. Inter-subject correlation matrices of unthresholded t map in spinal cord cord (A), including gray matter (GM) and surrounding white matter, and in central gray matter (B) are used to assess reproducibility and are shown for axial and sagittal planes. (TIF)

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References

- Ludwig PE, Reddy V, Varacallo M. Neuroanatomy, Central Nervous System (CNS). In: StatPearls [Internet]. Treasure Island (FL): StatPearls Publishing. 2021 [cited 2021 Sep 19]. Available from: http://www.ncbi.nlm.nih.gov/books/NBK442010/
- 2. Lawrence JM, Stroman PW, Kollias SS. Functional magnetic resonance imaging of the human spinal cord during vibration stimulation of different dermatomes. Neuroradiology. 2008;50(3):273–80. https://doi.org/10.1007/s00234-007-0338-6 PMID: 18026942
- 3. Stroman PW. Spinal fMRI investigation of human spinal cord function over a range of innocuous thermal sensory stimuli and study-related emotional influences. Magn Reson Imaging. 2009;27(10):1333–46. https://doi.org/10.1016/j.mri.2009.05.038 PMID: 19570637
- 4. Stroman PW, Coe BC, Munoz DP. Influence of attention focus on neural activity in the human spinal cord during thermal sensory stimulation. Magn Reson Imaging. 2011;29(1):9–18. https://doi.org/10.1016/j.mri.2010.07.012 PMID: 20850240
- 5. Weber KA, Chen Y, Wang X, Kahnt T, Parrish TB. Lateralization of cervical spinal cord activity during an isometric upper extremity motor task with functional magnetic resonance imaging. Neuroimage. 2016; 125:233–43. https://doi.org/10.1016/j.neuroimage.2015.10.014 PMID: 26488256
- 6. Martucci KT, Weber KA, Mackey SC. Altered Cervical Spinal Cord Resting-State Activity in Fibromyalgia. Arthritis Rheumatol. 2019;71(3):441–50.
- 7. Maieron M, Iannetti GD, Bodurka J, Tracey I, Bandettini PA, Porro CA. Functional responses in the human spinal cord during willed motor actions: evidence for side- and rate-dependent activity. J Neurosci. 2007;27(15):4182–90.
- 8. Agosta F, Valsasina P, Caputo D, Stroman PW, Filippi M. Tactile-associated recruitment of the cervical cord is altered in patients with multiple sclerosis. Neuroimage. 2008;39(4):1542–8.
- Agosta F, Valsasina P, Rocca MA, Caputo D, Sala S, Judica E, et al. Evidence for enhanced functional activity of cervical cord in relapsing multiple sclerosis. Magn Reson Med. 2008;59(5):1035

 –42.
- Cadotte DW, Bosma R, Mikulis D, Nugaeva N, Smith K, Pokrupa R, et al. Plasticity of the injured human spinal cord: insights revealed by spinal cord functional MRI. PLoS One. 2012;7(9):e45560. https://doi.org/10.1371/journal.pone.0045560 PMID: 23029097
- 11. Filippi M, Rovaris M, Rocca MA. Imaging primary progressive multiple sclerosis: the contribution of structural, metabolic, and functional MRI techniques. Mult Scler. 2004;10 (Suppl 1) S36–44; discussion S44–45.
- Kornelsen J, Stroman PW. Detection of the neuronal activity occurring caudal to the site of spinal cord injury that is elicited during lower limb movement tasks. Spinal Cord. 2007;45(7):485–90. https://doi.org/10.1038/sj.sc.3102019 PMID: 17245349
- 13. Stroman PW, Kornelsen J, Bergman A, Krause V, Ethans K, Malisza KL, et al. Noninvasive assessment of the injured human spinal cord by means of functional magnetic resonance imaging. Spinal Cord. 2004;42(2):59–66. https://doi.org/10.1038/sj.sc.3101559 PMID: 14765137
- 14. Zhong X-P, Chen Y-X, Li Z-Y, Shen Z-W, Kong K-M, Wu R-H. Cervical spinal functional magnetic resonance imaging of the spinal cord injured patient during electrical stimulation. Eur Spine J. 2017;26(1):71–7. https://doi.org/10.1007/s00586-016-4646-6 PMID: 27311305
- 15. loachim G, Warren HJM, Powers JM, Staud R, Pukall CF, Stroman PW. Altered pain in the brainstem and spinal cord of fibromyalgia patients during the anticipation and experience of experimental pain. Front Neurol. 2022;13:862976.
- 16. Stroman PW, Powers JM, Ioachim G, Warren HJM, McNeil K. Investigation of the neural basis of expectation-based analgesia in the human brainstem and spinal cord by means of functional magnetic resonance imaging. Neurobiol Pain. 2021;10:100068. https://doi.org/10.1016/j.ynpai.2021.100068 PMID: 34381928
- Martin AR, Aleksanderek I, Cohen-Adad J, Tarmohamed Z, Tetreault L, Smith N, et al. Translating state-of-the-art spinal cord MRI techniques to clinical use: A systematic review of clinical studies utilizing DTI, MT, MWF, MRS, and fMRI. Neuroimage Clin. 2016;10:192–238. https://doi.org/10.1016/j.nicl.2015.11.019 PMID: 26862478
- 18. Powers JM, loachim G, Stroman PW. Ten Key Insights into the Use of Spinal Cord fMRI. Brain Sci. 2018;8(9):E173.
- **19.** Stroman PW, Wheeler-Kingshott C, Bacon M, Schwab JM, Bosma R, Brooks J, et al. The current state-of-the-art of spinal cord imaging: methods. Neuroimage. 2014;84:1070–81.



- 20. Wheeler-Kingshott CA, Stroman PW, Schwab JM, Bacon M, Bosma R, Brooks J, et al. The current state-of-the-art of spinal cord imaging: applications. Neuroimage. 2014;84:1082–93.
- 21. Fratini M, Moraschi M, Maraviglia B, Giove F. On the impact of physiological noise in spinal cord functional MRI. J Magn Reson Imaging. 2014;40(4):770–7. https://doi.org/10.1002/jmri.24467 PMID: 24925698
- 22. Cadotte DW, Akbar MA, Fehlings MG, Stroman PW, Cohen-Adad J. What has been learned from magnetic resonance imaging examination of the injured human spinal cord: A Canadian perspective. J Neurotrauma. 2018;35(16):1942–57. https://doi.org/10.1089/neu.2018.5903 PMID: 30074873
- 23. Kinany N, Pirondini E, Mattera L, Martuzzi R, Micera S, Van De Ville D. Towards reliable spinal cord fMRI: Assessment of common imaging protocols. Neuroimage. 2022;250:118964.
- 24. Barth M, Breuer F, Koopmans PJ, Norris DG, Poser BA. Simultaneous multislice (SMS) imaging techniques. Magn Reson Med. 2016;75(1):63–81. https://doi.org/10.1002/mrm.25897 PMID: 26308571
- 25. Vahdat S, Khatibi A, Lungu O, Finsterbusch J, Büchel C, Cohen-Adad J, et al. Resting-state brain and spinal cord networks in humans are functionally integrated. PLOS Biology. 2020;18(7):e3000789. https://doi.org/10.1371/journal.pbio.3000789 PMID: 32614823
- 26. De Leener B, Taso M, Cohen-Adad J, Callot V. Segmentation of the human spinal cord. MAGMA. 2016;29(2):125–53. https://doi.org/10.1007/s10334-015-0507-2 PMID: 26724926
- 27. De Leener B, Fonov VS, Collins DL, Callot V, Stikov N, Cohen-Adad J. PAM50: Unbiased multimodal template of the brainstem and spinal cord aligned with the ICBM152 space. Neuroimage. 2018;165:170–9.
- 28. Kinany N, Pirondini E, Micera S, Van De Ville D. Spinal cord fMRI: A new window into the central nervous system. Neuroscientist. 2023;29(6):715–31. https://doi.org/10.1177/10738584221101827 PMID: 35822665
- 29. Eippert F, Kong Y, Jenkinson M, Tracey I, Brooks JCW. Denoising spinal cord fMRI data: Approaches to acquisition and analysis. Neuroimage. 2017:154:255–66.
- 30. Cohen-Adad J, Gauthier CJ, Brooks JCW, Slessarev M, Han J, Fisher JA, et al. BOLD signal responses to controlled hypercapnia in human spinal cord. Neuroimage. 2010;50(3):1074–84. https://doi.org/10.1016/j.neuroimage.2009.12.122 PMID: 20060914
- 31. Functional magnetic resonance imaging on spinal cord. Il Nuovo Cimento C. 2021;44(405):1-4.
- 32. Cox RW, Hyde JS. Software tools for analysis and visualization of fMRI data. NMR Biomed. 1997;10(4–5):171–8.
- 33. De Leener B, Lévy S, Dupont SM, Fonov VS, Stikov N, Louis Collins D, et al. SCT: Spinal Cord Toolbox, an open-source software for processing spinal cord MRI data. Neuroimage. 2017;145(Pt A):24–43. https://doi.org/10.1016/j.neuroimage.2016.10.009 PMID: 27720818
- **34.** Glover GH, Li TQ, Ress D. Image-based method for retrospective correction of physiological motion effects in fMRI: RETROICOR. Magn Reson Med. 2000;44(1):162–7.
- **35.** Giulietti G, Giove F, Garreffa G, Colonnese C, Mangia S, Maraviglia B. Characterization of the functional response in the human spinal cord: Impulse-response function and linearity. Neuroimage. 2008;42(2):626–34.
- 36. Welvaert M, Rosseel Y. On the definition of signal-to-noise ratio and contrast-to-noise ratio for FMRI data. PLoS One. 2013;8(11):e77089. https://doi.org/10.1371/journal.pone.0077089 PMID: 24223118
- 37. Dice LR. Measures of the amount of ecologic association between species. Ecology. 1945;26(3):297-302. https://doi.org/10.2307/1932409
- **38.** Summers PE, lannetti GD, Porro CA. Functional exploration of the human spinal cord during voluntary movement and somatosensory stimulation. Magn Reson Imaging. 2010;28(8):1216–24.
- 39. Schilling KG, Li M, Rheault F, Ding Z, Anderson AW, Kang H, et al. Anomalous and heterogeneous characteristics of the BOLD hemodynamic response function in white matter. Cereb Cortex Commun. 2022;3(3):tgac035. https://doi.org/10.1093/texcom/tgac035 PMID: 36196360
- **40.** Figley CR, Stroman PW. Investigation of human cervical and upper thoracic spinal cord motion: Implications for imaging spinal cord structure and function. Magn Reson Med. 2007;58(1):185–9. https://doi.org/10.1002/mrm.21260 PMID: 17659610
- **41.** Weber KA, Chen Y, Paliwal M, Law CS, Hopkins BS, Mackey S, et al. Assessing the spatial distribution of cervical spinal cord activity during tactile stimulation of the upper extremity in humans with functional magnetic resonance imaging. Neuroimage. 2020;217:116905.
- 42. Cohen-Adad J, Alonso-Ortiz E, Abramovic M, Arneitz C, Atcheson N, Barlow L, et al. Open-access quantitative MRI data of the spinal cord and reproducibility across participants, sites and manufacturers. Sci Data. 2021;8(1):219. https://doi.org/10.1038/s41597-021-00941-8 PMID: 34400655
- 43. Cohen-Adad J, Alonso-Ortiz E, Abramovic M, Arneitz C, Atcheson N, Barlow L, et al. Generic acquisition protocol for quantitative MRI of the spinal cord. Nat Protoc. 2021;16(10):4611–32. https://doi.org/10.1038/s41596-021-00588-0 PMID: 34400839
- **44.** Eippert F, Kong Y, Jenkinson M, Tracey I, Brooks JCW. Denoising spinal cord fMRI data: Approaches to acquisition and analysis. Neuroimage. 2017;154:255–66.
- 45. Barry RL, Conrad BN, Smith SA, Gore JC. A practical protocol for measurements of spinal cord functional connectivity. Sci Rep. 2018;8(1):16512.
- **46.** Staud R, Boissoneault J, Lai S, Mejia MS, Ramanlal R, Godfrey MM, et al. Spinal cord neural activity of patients with fibromyalgia and healthy controls during temporal summation of pain: an fMRI study. J Neurophysiol. 2021;126(3):946–56. https://doi.org/10.1152/jn.00276.2021 PMID: 34406893
- **47.** Bandettini PA, Wong EC, Jesmanowicz A, Hinks RS, Hyde JS. Spin-echo and gradient-echo EPI of human brain activation using BOLD contrast: a comparative study at 1.5 T. NMR Biomed. 1994;7(1–2):12–20. PMID: 8068520



- **48.** Duong TQ, Yacoub E, Adriany G, Hu X, Ugurbil K, Kim S-G. Microvascular BOLD contribution at 4 and 7 T in the human brain: gradient-echo and spin-echo fMRI with suppression of blood effects. Magn Reson Med. 2003;49(6):1019–27. https://doi.org/10.1002/mrm.10472 PMID: 12768579
- **49.** Gati JS, Menon RS, Ugurbil K, Rutt BK. Experimental determination of the BOLD field strength dependence in vessels and tissue. Magn Reson Med. 1997;38(2):296–302. https://doi.org/10.1002/mrm.1910380220 PMID: 9256111
- **50.** Zhao F, Williams M, Meng X, Welsh DC, Grachev ID, Hargreaves R, et al. Pain fMRI in rat cervical spinal cord: an echo planar imaging evaluation of sensitivity of BOLD and blood volume-weighted fMRI. Neuroimage. 2009;44(2):349–62.
- 51. Stroman PW. Magnetic resonance imaging of neuronal function in the spinal cord: spinal FMRI. Clin Med Res. 2005;3(3):146–56. https://doi.org/10.3121/cmr.3.3.146 PMID: 16160069
- 52. Stroman PW, Ryner LN. Functional MRI of motor and sensory activation in the human spinal cord. Magn Reson Imaging. 2001;19(1):27–32. https://doi.org/10.1016/s0730-725x(01)00226-0 PMID: 11295343
- 53. Dehghani H, Weber KA, Batouli SAH, Oghabian MA, Khatibi A. Evaluation and Optimization of Motion Correction in Spinal Cord fMRI Preprocessing [Internet]. 2020 [cited 2021 Sep 20];103986. Available from: https://www.biorxiv.org/content/10.1101/2020.05.20.103986v1
- 54. Figley CR, Stroman PW. Development and validation of retrospective spinal cord motion time-course estimates (RESPITE) for spin-echo spinal fMRI: Improved sensitivity and specificity by means of a motion-compensating general linear model analysis. Neuroimage. 2009;44(2):421–7.
- **55.** Figley CR, Yau D, Stroman PW. Attenuation of lower-thoracic, lumbar, and sacral spinal cord motion: implications for imaging human spinal cord structure and function. AJNR Am J Neuroradiol. 2008;29(8):1450–4.
- 56. Harita S, Stroman PW. Confirmation of resting-state BOLD fluctuations in the human brainstem and spinal cord after identification and removal of physiological noise. Magn Reson Med. 2017;78(6):2149–56. https://doi.org/10.1002/mrm.26606 PMID: 28074492
- 57. Summers PE, Ferraro D, Duzzi D, Lui F, Iannetti GD, Porro CA. A quantitative comparison of BOLD fMRI responses to noxious and innocuous stimuli in the human spinal cord. Neuroimage. 2010;50(4):1408–15.
- 58. Agrawal R, Sharma M. Review of segmentation methods for brain tissue with magnetic resonance images. IJCNIS. 2014;6(4):55–62.