



# Detection of synchronous brain activity in white matter tracts at rest and under functional loading

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**Functional MRI based on blood oxygenation level-dependent (BOLD) contrast is well established as a neuroimaging technique for detecting neural activity in the cortex of the human brain. While detection and characterization of BOLD signals, as well as their electrophysiological and hemodynamic/metabolic origins, have been extensively studied in gray matter (GM), the detection and interpretation of BOLD signals in white matter (WM) remain controversial. We have previously observed that BOLD signals in a resting state reveal structure-specific anisotropic temporal correlations in WM and that external stimuli alter these correlations and permit visualization of task-specific fiber pathways, suggesting variations in WM BOLD signals are related to neural activity. In this study, we provide further strong evidence that BOLD signals in WM reflect neural activities both in a resting state and under functional loading. We demonstrate that BOLD signal waveforms in stimulus-relevant WM pathways are synchronous with the applied stimuli but with various degrees of time delay and that signals in WM pathways exhibit clear task specificity. Furthermore, resting-state signal fluctuations in WM tracts show significant correlations with specific parcellated GM volumes. These observations support the notion that neural activities are encoded in WM circuits similarly to cortical responses.**

fMRI | BOLD | functional connectivity | functional activity | white matter

**B**lood oxygenation level-dependent (BOLD) contrast has for several years been the established basis for detecting localized neural activity in the human brain using functional magnetic resonance imaging (fMRI) (1, 2). While BOLD signals have been robustly detected in brain gray matter (GM) in a large number of studies, whether such signals reliably arise in white matter (WM) remains controversial (3). Fundamentally, the biophysical origins of BOLD signals in WM are not clear, along with whether neural signaling in WM triggers changes in BOLD signals similar to GM. Heeger and Ress (4) demonstrated that BOLD signals are correlated mostly with postsynaptic spiking activity, supporting the idea that neural events within WM may also produce BOLD signals. However, Logothetis et al. (5) observed that BOLD signals from cortex are primarily correlated with local field potentials (LFPs), and the equivalent processes are not obvious in WM. Mukamel et al. (6) found that BOLD signals are correlated with both postsynaptic spiking activity and LFPs, thus harmonizing these dichotomous arguments. Moreover, it is clear that BOLD effects are robustly detectable in WM following vasodilation from hypercapnia and vary with different levels of neural activity induced by anesthesia (7, 8). Whether BOLD changes couple directly to changes in WM activity within tracts is unclear.

There thus remains a need for clear evidence that BOLD effects in WM are directly related to neural activity. However, reports of successful demonstrations to date are quite sparse. This may be partly attributable to the much reduced vascular density in WM (9), so that much lower BOLD signal changes are expected. However, despite the large differences in vascular density between GM and WM, the oxygen extraction fraction has been shown to be relatively

uniform throughout the parenchyma of a resting brain (10). In addition, cerebral blood flow-normalized BOLD signal changes in response to hypercapnia are found to be largely comparable in WM and GM (7). Furthermore, it has been observed that BOLD signals in a resting state exhibit similar temporal and spectral profiles in both GM and WM of the human brain (11) and that their relative low-frequency (0.01–0.08 Hz) signal powers are comparable (12). These findings together suggest that BOLD signals in WM may also reflect neural activity and may be detectable using appropriately sensitive imaging and analysis techniques.

By using appropriate techniques that take into account the unique characteristics of BOLD signals in WM, a number of studies have reported reliable observations of WM activations (13). For instance, Mazerolle et al. (14) detected robust BOLD activations in the posterior limb of internal capsule imaged with a high field of 4 T; and by incorporating 4-T imaging with an asymmetric spin echo spiral sequence, Gawryluk et al. (15) observed BOLD signals in the anterior corpus callosum. Detection of BOLD signals in WM has also been enhanced by using specialized task paradigms (16) or improved data analysis methods (17).

We have previously observed that BOLD signals in a resting state exhibit structure-specific anisotropic temporal correlations in WM (11, 12). On the basis of these findings, we proposed a concept of spatiotemporal correlation tensors that characterize correlational anisotropy in WM BOLD signals. We found that, along many WM tracts, the directional preferences of spatio-temporal correlation tensors in a resting state are grossly consistent with those revealed by diffusion tensors and that external

## Significance

**Functional MRI has been widely used to assess the functional architecture of the brain based on detecting changes in neural activity in gray matter via blood oxygenation level-dependent (BOLD) effects. However, the existence and possible relevance of BOLD signals in white matter remain controversial. We demonstrate that BOLD signals in functional cortical volumes are strongly correlated with signals in specific, segmented white matter tracts in a resting state, and the correlations can be modulated by specific functional loadings. We therefore show that current concepts of functional connectivity based on synchronous BOLD correlations may be extended to include white matter and that changes in neural activity are encoded in BOLD variations throughout the brain.**

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sensory and motor activity were primarily parts of, or associated with, the known sensorimotor pathways of established functional neuroanatomy; and compared with the right hand, WM BOLD responses tended to be stronger for left-hand stimulations and tasks. Previously, it was reported that it takes greater efforts for the nonpreferred hand to perform the same task than the preferred hand (29). This is in keeping well with our findings since all of the subjects in this study are right-handed. It was also documented that right-handed males have less pain sensitivity in the preferred hand than the nonpreferred hand (30). Thus, it is reasonable that the left hand is more sensitive to tactile stimulations as well and elicits stronger neural activity in the brain when stimulated.

It should be noted that increased activity in WM is necessarily accompanied by increases in its metabolic demands. Although this work did not examine the metabolism, a recent study found evidence of different metabolic rates in WM under different functional states (31), which is similar to GM. The findings from our study, along with that in ref. 31, suggest that regressing out WM signals should be cautious since these signals also encode neural activities (32, 33).

**Limitations.** A limitation of this study is that the time series was sampled at relatively low temporal resolution of 3 s, which was interpolated to 0.2 s for computing TDs in WM signals. A similar interpolation approach was adopted by Mitra et al. (34), who derived a highly reproducible TD of the order of 1 s. Nonetheless, we recognize that the temporal resolution of our data acquisition, as well as the quantification method used, may impose some upper bound on the accuracy of the TDs computed, and thus caution that the reported TDs not be overinterpreted.

Another potential limitation is the effect of partial volume averaging. A widely held concern on WM BOLD studies is that the reported activations are due to the confounding effects from

adjacent GM and vasculature. We have been fully aware of this potential confound and have tried to meticulously address it in our earlier studies (8, 12). In this work, to avoid potential influences from adjacent structures, we used a WM mask that was tightly thresholded ( $>0.95$ ). Our further experiments with visual stimulations demonstrate that the signal profiles of WM bundles of various thickness were highly comparable and that the waveform in the SCC was  $\sim 180^\circ$  out of phase with GM, indicating that the partial volume effect was quite minimal if it existed.

In conclusion, this study demonstrates that BOLD signals in specific WM tracts exhibit patterns of correlations to specific cortical volumes and that the waveforms in stimulus-relevant WM pathways are synchronous with the applied stimuli but with various degrees of TD. Signals in WM pathways exhibit clear task specificity. Our statistical analysis shows that these observations were not driven by artifacts from the imaging or processing procedures, and the correlation of WM-GM is positively correlated with fALFF. These findings provide strong evidence that BOLD signals in WM reflect neural activities both in a resting state and under functional loading.

## Methods

Full-brain MRI data were acquired from 16 healthy and right-handed adult volunteers (eight males; age,  $28.1 \pm 4.6$  y). No subjects had a history of neurological, psychiatric, or medical conditions as determined by interview. Before imaging, each subject gave informed consent according to protocols approved by the Vanderbilt University Institutional Review Board. Detailed image acquisition, processing, and analysis procedures are provided in [Supporting Information](#).

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