

# MPnRAGE: A Technique to Simultaneously Acquire Hundreds of Differently Contrasted MPRAGE Images with Applications to Quantitative $T_1$ Mapping

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**Purpose:** To introduce a new technique called MPnRAGE, which produces hundreds of images with different  $T_1$  contrasts and a  $B_1$  corrected  $T_1$  map.

**Theory and Methods:** An interleaved three-dimensional radial k-space trajectory with a sliding window reconstruction is used in conjunction with magnetization preparation pulses. This work modifies the SNAPSHOT-FLASH  $T_1$  fitting equations for radial imaging with view-sharing and develops a new rapid  $B_1$  correction procedure. MPnRAGE is demonstrated in phantoms and volunteers, including two volunteers with eight scans each and eight volunteers with two scans each.  $T_1$  values from MPnRAGE were compared with those from fast spin echo inversion recovery (FSE-IR) in phantoms and a healthy human brain at 3 Tesla (T).

**Results:** The  $T_1$  fit for human white and gray matter was  $T_{1MPnRAGE} = 1.00 \cdot T_{1FSE-IR} + 24 \text{ ms}$ ,  $r^2 = 0.990$ . Voxel-wise coefficient of variation in  $T_1$  measurements across eight time points was between 0.02 and 0.08. Region of interest-based  $T_1$  values were reproducible to within 2% and agree well with literature values.

**Conclusion:** In the same amount of time as a traditional MPRAGE exam (7.5 min), MPnRAGE was shown to produce hundreds of images with alternate  $T_1$  contrasts as well as an accurate and reproducible  $T_1$  map that is robust to  $B_1$  errors.

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**Key words:** MPRAGE; inversion recovery;  $T_1$  mapping;  $T_1$  weighted imaging; Look-Locker; segmentation

## INTRODUCTION

Inversion-recovery prepared fast gradient echo methods such as magnetization-prepared rapid acquisition gradient echo (MPRAGE) (1) and similar implementations are widely used for high-resolution,  $T_1$ -weighted ( $T_1w$ ) neuroimaging applications. MPRAGE combines a spoiled-gradient echo (SPGR) readout with an inversion recovery (IR) preparation pulse to obtain high  $T_1w$  signal contrast between white matter (WM), gray matter (GM), and cerebrospinal fluid (CSF). In most MPRAGE acquisitions, the center of k-space is acquired shortly after the null point of CSF, providing good contrast between CSF and other tissues as well as moderate contrast between WM and GM. Contrast between WM and GM may be further improved using phase sensitive inversion recovery (PSIR) (2), a method that uses a separately acquired phase map to preserve the sign of the magnetization. In addition to  $T_1w$  contrast from the inversion preparation pulse, traditional and phase sensitive MPRAGE acquisitions have weighting from  $T_2^*$ , proton density, receiver sensitivity bias, and transmit  $B_1$  field bias, which act to create spatially varying signal and reduced contrast between brain tissues. These extraneous factors decrease the diagnostic confidence and present challenges to automatic tissue-segmentation algorithms commonly used in neuroscience studies. A recent development, MP2RAGE (3), is a variation of MPRAGE that acquires two images, each at a different inversion time (TI), approximately doubling the scan time. A regularized division of the two complex images removes  $T_2^*$ , proton density, and receiver sensitivity bias. When the appropriate TIs and other parameters are selected, the resulting images have reduced sensitivity to transmit  $B_1$  and have higher contrast between WM, GM, and CSF.

A limitation common to all the methods above is that each one obtains only a single  $T_1$  weighting with each acquisition (MP2RAGE acquires two images with different TIs; however, the technique is optimized to obtain high  $T_1w$  contrast in the combined image, and individual images tend to have low contrast). This may be problematic in certain situations, as  $T_1$  values in the brain are known to be highly dependent on myelination and change with age or disease status (4). Therefore, any condition that affects myelination can produce suboptimal imaging results if the effects are not properly anticipated and accounted for in the acquisitions. Such conditions include dysmyelinating (e.g., Pelizaeus-Merzbacher disease) and demyelinating (e.g., multiple sclerosis) diseases, brain development (pediatrics) (5,6), as well as the

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aging brain (geriatrics) (7–9). Some of these conditions have unpredictable signal behavior and are patient specific, thus adjusting acquisitions for the changes a priori is challenging. Furthermore, pathological and natural changes in the developing and aging brain are region specific (5–9), so a single contrast setting may not be optimal across the entire brain.

One potential solution is quantitative  $T_1$  mapping. Fast spin echo inversion recovery (FSE-IR) with a 3-parameter fit (10) to take into account inversion efficiency is considered by many to be a robust tool for  $T_1$  mapping because it provides high quality images with low sensitivity to  $B_1$  inhomogeneity. However, prohibitively long scan times prevent this method from being feasible for high resolution  $T_1$  mapping of the entire human brain. Two-dimensional SPGR IR methods (11–15), commonly referred to as SNAPSHOT FLASH-IR (14) or Look-Locker (LL) (16,17), acquire several points along the IR curve in a single acquisition and may be used for  $T_1$  mapping. The extension of these methods to 3D imaging (18) of large volumes with high spatial resolution is challenging, as spatial resolution and the number of images reconstructed along the relaxation curve are inversely related due to the Cartesian k-space sampling traditionally used. An alternative method for 3D  $T_1$  mapping is to use an SPGR acquisition with two or more flip angles, a technique known as the variable flip angle (VFA) approach (19–21). This method is highly sensitive to  $B_1$  errors, requires strong gradient spoiling (22,23), and requires simultaneous consideration of magnetization transfer effects for accurate mapping (24). Typically,  $B_1$  errors are corrected using a separately acquired map, although one recent work used an additional IR image to correct for these errors (25). With careful selection of the acquisition parameters, MP2RAGE images have little sensitivity to the  $B_1$  transmit field of the small alpha excitation pulses and the signal intensity will be bijective (have a one-to-one relationship) with  $T_1$  for brain tissue, allowing efficient  $T_1$  mapping using a lookup table (3). However, dependence of  $T_1$  on the efficiency of the inversion pulse remains, which may lead to  $T_1$  underestimation if inaccurately accounted for in the lookup table (26). One work collected a third image along the IR curve (an MP3RAGE technique) with a different flip angle and determined  $T_1$  with a nonlinear search method incorporating inversion efficiency into the model (26).

Recently, we developed a novel method that combines inversion recovery preparation and 3D radial k-space sampling with vastly undersampled isotropic projection reconstruction (VIPR) (27) for a rapid gradient echo acquisition after each inversion (28). By repeatedly sampling the center of k-space at each gradient echo repetition time (TR), the inversion recovery curve is finely sampled. Similar 2D techniques have been used for myocardial imaging (29), and another technique has used 2D steady state free precession (SSFP) inversion recovery for simultaneous  $T_1$  and  $T_2$  quantification in the brain (30). Weighted view sharing (27) of radial k-space lines with similar inversion times may generate images with high spatial resolution. This VIPR method with inversion recovery (VIPR-IR) enables the simultaneous acquisition and reconstruction of many 3D high-resolution, whole-

brain images with different inversion time contrasts. By using similar processing to MP2RAGE (3), which takes a regularized ratio of two images acquired at different inversion times, it is also possible to generate high contrast T1w images without proton density,  $T_2^*$  and receiver sensitivity bias and with reduced sensitivity to  $B_1$  transmit-bias. Because VIPR-IR produces a practically arbitrarily large number of images  $n$  along the IR curve, where  $n$  is determined by the number of TRs ( $\sim 300$ ) and the retrospectively determined radial view-sharing window  $\omega$ , our technique can be thought of as an MPnRAGE acquisition. Finally, the multiple inversion recovery images may be used to generate quantitative  $T_1$  maps using the theoretical signal model. In this study, we describe the MPnRAGE method and demonstrate several of its features including simultaneous acquisition of images with different inversion time contrast, T1w imaging with MP2RAGE processing, and quantitative  $T_1$  mapping. The technique is demonstrated in  $T_1$  phantoms, a healthy volunteer, and 10 volunteers who received multiple scans.

## THEORY

The original SNAPSHOT FLASH-IR experiment (14) was developed specifically for a Cartesian k-space acquisition. This model assumes that the image intensity is determined by the signal at the center of k-space. When radial imaging is used, every projection contributes to the center of k-space, violating the assumption of the SNAPSHOT FLASH-IR signal model. We, therefore, adapt the SNAPSHOT FLASH-IR signal model for radial imaging. Finally, we address challenges for accurate  $T_1$  mapping using inversion recovery, such as incomplete recovery of longitudinal magnetization between successive preparation pulses and the presence of  $B_1$  inhomogeneities of the radiofrequency (RF) pulses used for both the train of excitations in each SPGR block as well as the preparation pulse.

A schematic depicting the general acquisition is shown in Figure 1. With all generality, the longitudinal magnetization is prepared with a  $\beta$  degree RF pulse. After a time  $TI$  from the center of the  $\beta$  preparation pulse, a series of  $N$  RF pulses with flip angle  $\alpha$  are applied as in a standard spoiled gradient echo sequence. The next  $\beta$  RF preparation pulse is delayed by an amount of time  $T_D$  (the delay time) after the last  $\alpha$  pulse to allow the longitudinal magnetization to freely recover. The expression for the measured signal  $M_n$  after the  $n^{\text{th}}$  ( $n = 0, 1, \dots, N-1$ ) alpha pulse is given by

$$M_n = M_\infty (1 - \tilde{M}_0 a^n). \quad [1]$$

Here  $M_\infty$  is the steady state signal in the limit of  $n \rightarrow \infty$  and is given by

$$M_\infty = \rho \frac{1 - E_1}{1 - a} \sin \alpha \quad [2]$$

where  $E_1 = \exp(-TR/T_1)$ ,  $a = E_1 \cos \alpha$ , and  $\rho$  is the product of the spin density, receiver sensitivities, and an exponential term  $\exp(-TE/T_2^*)$ . The term  $\tilde{M}_0$  is given by

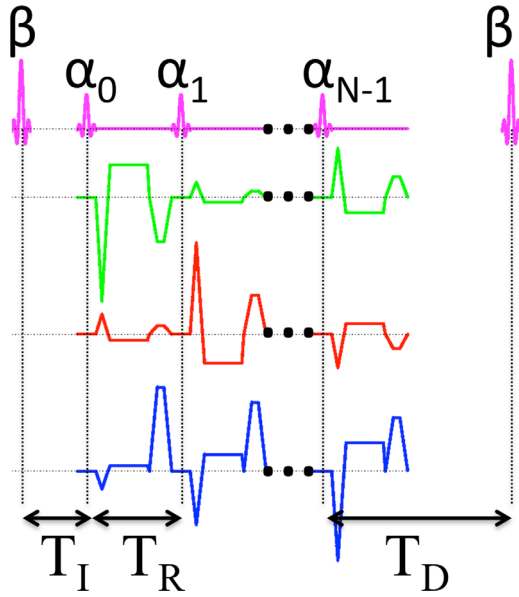


FIG. 1. Diagram of the MPnRAGE sequence. A train of  $N$  RF pulses of flip angle  $\alpha$  begins a time  $T_I$  after a preparation pulse of flip angle  $\beta$  prepares the magnetization. A delay time  $T_D$  allows the magnetization to freely regrow before the next preparation pulse is applied. Radial readout gradients are applied on all three axes, and a constant area spoiler is applied along the  $z$ -direction.

$$\tilde{M}_0 = 1 - \frac{(1 - a^{N-1})s}{1 - sa^{N-1}} - \frac{[(1 - E_D)E_I \cos \beta + (1 - E_I)]}{1 - sa^{N-1}} \frac{1 - a}{1 - E} \quad [3]$$

where  $E_D = \exp(-TR/T_D)$ ,  $E_I = \exp(-TR/T_I)$ , and  $s = E_D E_I \cos \alpha \cos \beta$ . The recovery curve is exponential with modified relaxation time  $T_1^*$  defined by the identity  $a = \exp(-TR/T_1) \cos \alpha = \exp(-TR/T_1^*)$ .

To reduce undersampling artifacts and increase the signal-to-noise ratio (SNR), a sliding window reconstruction of width  $\omega$  can be used that equally combines all projections starting at projection  $n$  ( $n=0, 1, \dots, N-\omega$ ) after the  $\beta$  pulse up to and including projection  $n+\omega-1$ . This results in signal averaging in the central parts of  $k$ -space. Because image contrast is primarily determined by the central parts of  $k$ -space (31), the resulting image intensity is described by

$$M_n = M_\infty (1 - \tilde{M}_0 A a^n) \quad [4]$$

where the view-sharing amplitude modulator  $A$  is defined by  $A = (1 - a^\omega)/\omega(1 - a)$ . It is a scale factor that takes into account the radial view-sharing and is determined by averaging Eq. [1] for all projections from  $n$  to  $n+\omega-1$ . The scale factor  $A$  reduces the initial value  $\tilde{M}_n = 0$ , thereby reducing the dynamic range  $M_{n=N-1} - M_{n=0}$ . Further reduction in artifacts as well as an increase in SNR may be achieved by gradually incorporating high spatial frequency components from projections that occur outside of the sliding window region (27). The effects of view-sharing radially interleaved  $k$ -space data across the IR curve was previously studied in Peters et al (29).

When Cartesian sampling is used, the inversion time of an image is defined as the time from the center of the

$\beta$  pulse to the time when the center of  $k$ -space is acquired. For an image formed using a radial  $k$ -space acquisition and a sliding window of width  $\omega$ , the effective inversion time is defined as the time from the center of the  $\beta$  preparation pulse to the time in the center of the sliding window. The effective inversion time for the  $n^{\text{th}}$  frame in the sliding window reconstruction is

$$T_{I,eff(n)} = T_I + \left[ n + \frac{\omega - 1}{2} \right]. \quad [5]$$

When the longitudinal magnetization is allowed to fully relax between successive preparation pulses in a LL experiment, i.e.,  $T_D \gg (1 \text{ to } 3)T_1$  and several other conditions, including  $TR \ll T_1$  and  $\beta$  known (i.e., no RF inhomogeneities for the preparation pulse),  $T_1$  can be efficiently estimated as in Deichmann and Haase (14). If the longitudinal magnetization is not allowed to recover fully between successive inversions or the condition that  $TR \ll T_1$  is not satisfied, the full signal equation must be used to fit for the three unknowns  $\rho$ ,  $T_1$ , and  $\alpha$  (12). Kingsley et al (32) recently reported that even an adiabatic inversion pulse has efficiencies as low as 85% for the brain in vivo. When a perfect inversion is assumed, but not achieved, the three-parameter fit tends to underestimate  $T_1$  (32). Simply fitting for the preparation angle  $\beta$  results in unstable approximation of  $T_1$  (see Figure 2). This is because an exponential recovery curve is defined entirely by three independent parameters (here, the starting position  $\tilde{M}_0 A$ , the asymptote at infinity  $M_\infty$ , and the rate  $1/T_1^*$ ). To account for the additional unknown  $\beta$ , we combine inversion recovery data with separately acquired SPGR images at one or more flip angles. This allows a unique solution for  $\rho$ ,  $T_1$ ,  $\kappa$  and  $\beta$  to be found through the least squares minimization of combined IR and SPGR images, i.e., minimization of:

$$f(\rho, T_1, \kappa, \beta) = \sum_n \frac{1}{\sigma_n} [M_n - S_{IR,n}]^2 + \lambda \sum_{j=1}^{N_\alpha} \frac{1}{\sigma_j} \left[ \rho \frac{1 - E_1}{1 - E_1 \cos \kappa \alpha_j} \sin \kappa \alpha_j - S_{SPGR,j} \right]^2 \quad [6]$$

where the index  $n$  runs of all or a subset of inversion recovery images described by Eq. [4] for flip angle  $\alpha = \alpha_{IR,\kappa}$ ,  $N_\alpha$  is the number of SPGR images,  $S_{IR}$  and  $S_{SPGR}$  are the measured signal intensities from the IR and SPGR acquisitions, and  $\kappa$  is a scaling factor between the actual and prescribed flip angle. The parameter  $\lambda$  controls the relative weighting between the IR and SPGR contributions. This is the extension of Eq. [7] of Deoni (25), generalized to account for the train of  $\alpha$  pulses used in the SPGR radial inversion recovery experiment as well as an imperfect preparation pulse of arbitrary flip angle.

Expanding the work of Deichmann (33) and references therein, we use a two-step procedure that improves  $T_1$  fitting by using prior knowledge that the variations in the  $B_1$  field and inversion efficiency should both be smooth. In the first pass, all four parameters ( $\rho$ ,  $T_1$ ,  $\kappa$ ,  $\beta$ ) are fitted to Eq. [6]. The resulting  $\kappa$  and  $\beta$  maps are smoothed and then used as known values for a two parameter fit for ( $\rho$ , and  $T_1$ ). Reducing the number of degrees of freedom in the fitting procedure was

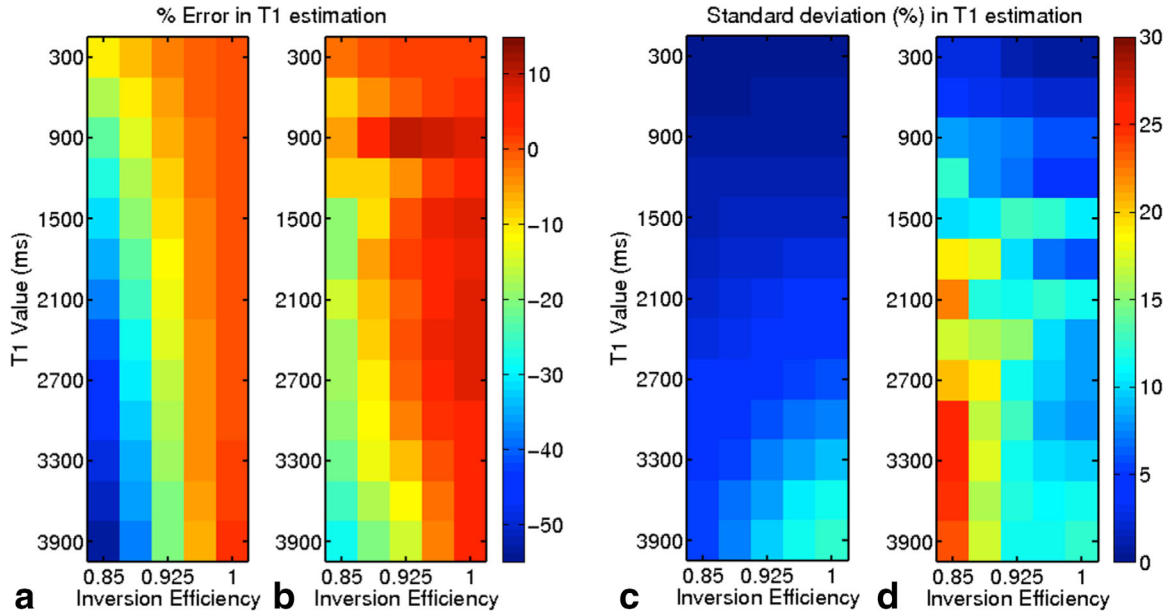


FIG. 2. A three-parameter fit that assumes a perfect inversion even though one is not achieved largely underestimates  $T_1$  (a) but produces stable estimates (c). A four-parameter fit that includes a term for inversion efficiency reduces some error in  $T_1$  estimation (b), but produces an unstable fit (d).

previously shown to improve accuracy and precision (34) as long as sufficient prior information is available. Smoothing the  $\kappa$  maps is consistent with many other works (35–38), while smoothing the  $\beta$  is consistent with the success of (39).

$T_1$  quantification using Eq. [6] requires a parameter  $\lambda$  that controls the contribution of SPGR images relative to IR images. Because the IR curve is fully defined by three parameters, fitting for the four unknowns should in principle only require three points along the IR curve and one extra SPGR image with different flip angle. An SPGR image at the same flip angle is insufficient because it is one of the three parameters determining the fit of the IR curve. The inclusion of a large number of inversion time points ( $\sim 200$ ) from an MPnRAGE acquisition has the potential to make the error contribution from a much fewer number (1 or 2) SPGR images in Eq. [6] negligible. One way to adjust for this is to compare the sum of squared signals (energy) of the IR and SPGR theoretical signals, derived using matching scan parameters and a range of expected  $T_1$  values (i.e., the two terms of Eq. [6] with  $S_{IR}$  and  $S_{SPGR}$  both set to zero). To account for noise in the IR images, especially present in inversion times where WM and GM have very low signal, many previous IR methods report the use of additional points ( $\sim 6$  to 10 total) beyond the minimum three required for  $T_1$  fitting. Analogously, this work selects  $\lambda$  so that the SPGR contribution in Eq. [6] is approximately  $1/7$  of the total contribution. For completeness, we have included a sensitivity map of  $\lambda$  performed using Monte Carlo noise simulations.

## METHODS

This section begins by providing details about the MPnRAGE acquisition and reconstruction that were not described in the background and theory section. Next it

describes the phantom and in vivo experiments that were performed to demonstrate features of the MPnRAGE method and to compare the  $T_1$  values obtained with it with those from existing techniques.

## Acquisition and Reconstruction

The acquisition order of radial projections is determined so that (i) Each point  $n$  along the recovery curve Eq. [1] contains samples located roughly angularly uniform across k-space. (ii) Each point  $P=0, 1, \dots, N-\omega+1$  along the recovery curve Eq. [4] contains samples distributed approximately angularly uniform across k-space for arbitrary  $\omega < N$ . (iii) Each subset of data consisting of projections acquired after two or more consecutive  $\beta$  pulses satisfies conditions (i) and (ii) above.

The first condition allows each point along the recovery curve Eq. [1] to be reconstructed when a sufficient number of preparation pulses have been acquired. When an insufficient number of samples are acquired and if condition (ii) is satisfied, view-sharing may be used to satisfy (i) and to improve image quality by reducing undersampling artifacts and increasing SNR. Allowing  $\omega$  to be arbitrary is advantageous in the event that some subset of the data becomes corrupt or unusable (as in the event of motion, see below). This would allow the user to select the minimal  $\omega$  needed to offer acceptable image quality while maximizing the dynamic range  $M_{n=N-1} - M_{n=0}$ .

Although we will not address this issue here, condition (iii) will allow subsets of consecutive and motion free data from larger, motion-corrupt datasets, to form lower resolution navigator images that could later be co-registered to produce higher quality images as proposed in Anderson et al (40) and Kecskesti and Alexander (41). Furthermore, if the scan occurs after administration of gadolinium (Gd), the  $T_1$  will change during the exam.



Condition (iii) will produce k-space datasets with low spatial frequency weighting reflecting the average  $T_1$  value (average Gd concentration) during the scan. This was used in our original implementation for cardiac imaging (28). When condition (iii) is not satisfied, unequal weights occur across the low spatial frequency components of k-space producing  $T_1$  blurred images. Effects of interleaving projections with inconsistent data are discussed in Peters et al (29).

General MPnRAGE acquisition parameters for all simulations, phantom, and in vivo experiments are as follows: spatial resolution = 1.0 mm  $\times$  1.0 mm  $\times$  1.0 mm, whole head coverage (axial scans had slab thickness 160 mm and sagittal scans used nonselective RF excitation), TR = 4.6 to 5.0 ms, echo time (TE) = 1.7 to 1.8 ms, nominal flip angle  $\alpha_n = 4^\circ$ . Data acquisition begin between 10 and 42 ms after the center of the preparation pulse and occurred for approximately 1500 ms. The delay time  $T_D$  between the last RF excitation of each readout block and the next preparation pulse was approximately 500 ms. All exams took place on a 3T scanner (Discovery MR 750, GE Healthcare, Waukesha, WI). Axial acquisitions used the 8-channel GE receive-only head coil and sagittal acquisitions used the Nova 32-channel receive-only head coil (Nova Medical, Wilmington, MA). Scan time for the main IR component was fixed at 7.5 min.

Coil sensitivity maps are extracted directly from the radial imaging data (42) and used to combine the complex-coil images according to Roemer et al (43). This improves SNR and reduces undersampling artifact by reducing the effective field of view (FOV) that determines the Nyquist sampling criterion to that of each coil's sensitivity region. Furthermore, this process removes unwanted image phase, allowing restoration of the inverted signal (2). To reduce phase errors associated with the regrowth of the inverted longitudinal magnetization, only the views from the final MPnRAGE frame are used to create the sensitivity maps. When available, the SPGR image acquired at the end of an MPnRAGE quantitative  $T_1$  exam can be used to extract the sensitivity maps.

MPnRAGE images were reconstructed with a 300 ms temporal window ( $\omega \sim 60$  frames).  $T_1$  estimation is performed on a voxel-by-voxel basis using a two-pass procedure. In the first pass, the data were fitted on a voxel-by-voxel basis to Eq. [4] assuming  $\rho$ ,  $T_1$ ,  $\kappa$ , and  $\beta$  as unknown variables. The  $\kappa$  and  $\beta$  flip angle maps were then smoothed with uniform kernels of size  $4 \times 4 \times 4$  and  $8 \times 8 \times 8$ , respectively. The second pass used the smoothed values for  $\kappa$  and  $\beta$  maps as known parameters.

Parameters for the 2D FSE-IR sequence used for the in vivo and phantom comparisons were: FOV = 256 mm  $\times$  192 mm, spatial resolution 2.0 mm  $\times$  2.0 mm, interpolated to 1.0 mm  $\times$  1.0 mm, slice thickness 5 mm, TR = 15 s, TE = 7.34 ms, echo train length = 4, bandwidth = 31.25 kHz, number of excitations = 0.5, 10 inversion times of  $T_I$  = [50 100 200 300 500 800 1000 1500 3000 4000] ms.  $T_1$  fitting was performed on a voxel-by-voxel basis using a three parameter signal model that takes into account inversion efficiency.

### Numerical Simulations

The accuracy and stability of  $T_1$  fitting in the presence of RF inhomogeneity was investigated using numerical sim-

ulations. The first experiment tested what happens when an imperfect inversion pulse is applied and  $T_1$  was estimated using (i) a 3-parameter fit assuming a perfect inversion and (i) a 4-parameter fit that takes into account inversion efficiency. Note that case (i) used

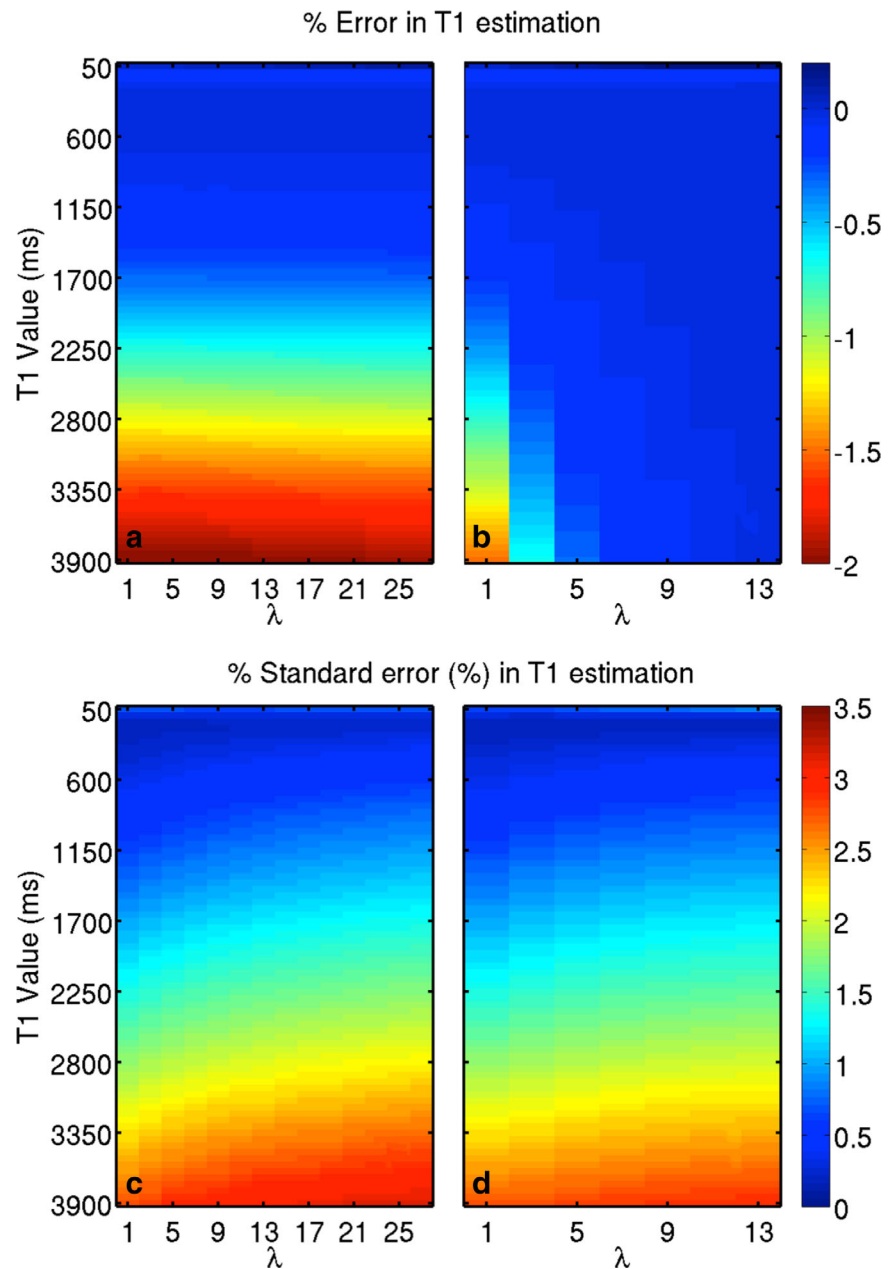
$$f(\rho, T_1, \kappa) = \sum_n [M_n - S_{IR,n}]$$

as the objective function, while case (ii) used Eq. [6] with  $\lambda = 0$ . Input IR curves were generated using Eq. [4] for  $T_1$  values ranging from 300 ms to 3900 ms in increments of 300 ms. Additional parameters include a nominal value of  $\alpha_n = 4^\circ$ , actual value  $\alpha_t = 0.95\alpha_n$ ,  $T_I = 20$  ms,  $T_D = 508$  ms,  $TR = 4.89$  ms,  $N = 302$ , and  $\omega = 62$ . The input IR curves for each  $T_1$  value were generated with 5 evenly spaced inversion efficiencies from  $\varepsilon = [0.85$  to  $1.00]$ . Gaussian noise was added so that an equivalent SPGR image with otherwise identical parameters would have an SNR of 125. A Monte Carlo noise simulation was then performed with 1024 independent noise realizations.

To test the accuracy and stability of  $T_1$  estimations using Eq. [6] with additional SPGR images, a modified Monte Carlo noise simulation was performed. In this simulation, a flip angle ( $\kappa$ ) map of the brain was first acquired in vivo using the actual flip angle imaging (AFI) method (44). The flip angle map was then used to create a numerical phantom with homogeneous (16,663 pixels)  $T_1$  value, but with a wide variety of representative  $\kappa$  values experienced in a human brain. This method was necessary because performing a Monte Carlo noise simulation for a wide range of  $T_1$ ,  $\lambda$ ,  $\kappa$ , and  $\beta$  values would be computationally demanding for a large number of independent noise realizations of each parameter pairing. Furthermore, without having variations in  $\kappa$ , our two-pass fitting procedure would perform artificially well. Input IR curves were generated using Eq. [4] for  $T_1$  values ranging from 50 ms to 600 ms in increments of 50 ms and from 900 ms to 3900 ms in increments of 300 ms. The input IR curves for each  $T_1$  value were generated with 5 evenly spaced inversion efficiencies from  $\varepsilon = [0.85$  to  $1.00]$ .  $T_1$  fitting was performed using the IR data along with either a single SPGR image (nominal flip angle of  $8^\circ$ ) and or two SPGR images (nominal flip angles of  $6^\circ$  and  $10^\circ$ ). Gaussian noise was added so that an equivalent SPGR image with  $\alpha_n = 4^\circ$  and otherwise identical parameters would have an SNR of 125. Each  $T_1$  phantom contained 16,663 voxels with independent noise realizations. The maximum value of the regularization parameter  $\lambda$  was determined so that sum-of-squares energy of the SPGR term was 1/3 the sum-of-squares energy of the IR term in Eq. [6].

The effect of the low spatial frequency k-space averaging on the ability to accurately estimate  $T_1$  values was likewise investigated in a similar Monte Carlo experiment as above, this time changing  $\omega$ , the amount of view-sharing, instead of  $\lambda$ . In this experiment, the regularization parameter  $\lambda$  was fixed based on the results of the previous experiment. The amount of view-sharing was varied from 50 ms to 600 ms in steps of 50 ms. All other parameters remained identical to the previously described experiment.

FIG. 3. Including one (a,c) and two (b,d) SPGR images with different flip angles in a 4 parameter fit of IR data results in accurate  $T_1$  estimations with stable estimates. Using two SPGR images produces less error than using a single SPGR image. Both sets have little sensitivity to  $\lambda$ , which controls the relative weighting of SPGR to IR.



### Phantom Studies

Phantom imaging studies were performed using three small tubes (60 mm diameter) containing water doped with  $\text{CuSO}_4$  in concentrations of [37, 75, 225]  $\mu\text{mol/L}$  and 5 tubes containing water doped with Gd-BOPTA in concentrations of [0.00, 0.10, 0.25, 0.50, 1.0, and 2.0] mM. The phantoms with  $\text{CuSO}_4$  concentration were designed to have  $T_1$  values approximately that of WM and GM in a normal adult brain as well as an additional value well below the minimal  $T_1$  value expected in a normal brain without contrast agent present. Quantitative  $T_1$  mapping was performed using both MPnRAGE and 2D FSE-IR sequences. Two undersampled SPGR

images were immediately acquired after the MPnRAGE exam with flip angles  $6^\circ$  and  $10^\circ$  and used for  $T_1$  fitting in Eq. [6]. Each SPGR image contained 16,046 projections and took approximately 75 s to acquire. The center slice of the MPnRAGE image was then imaged with the 2D FSE-IR acquisition described earlier.

### Human Studies

Informed consent was obtained on all subjects and performed in compliance with protocols approved through the UW Institutional Review Board. All human studies used a 3T scanner (Discovery MR750, GE Healthcare, Waukesha, WI) and used the general MPnRAGE protocol described

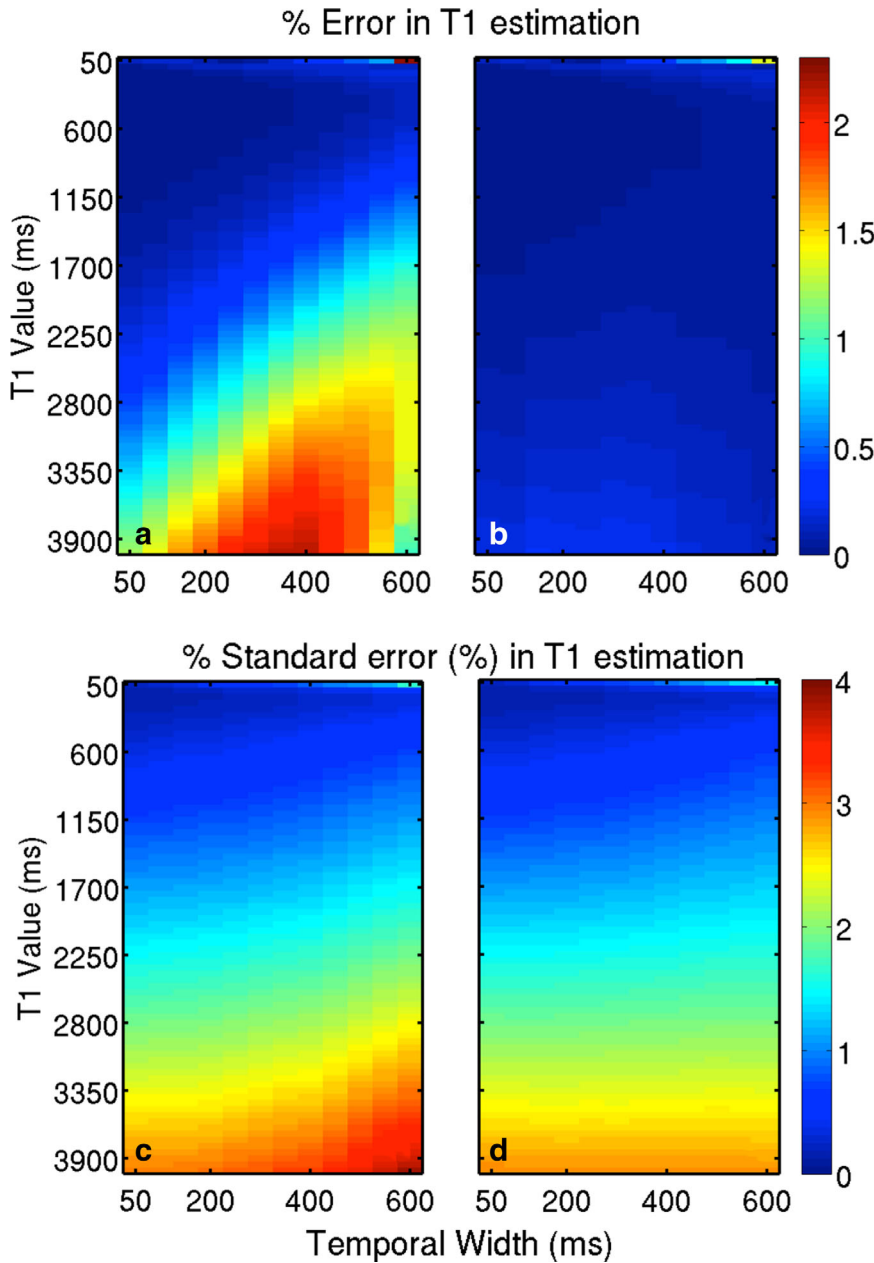


FIG. 4. The effects of view-sharing (i.e.,  $\omega$ ) on the error and standard error in T1 fits when one (a) and two (b) SPGR images are used in addition to the IR images.

under the “Acquisition and Reconstruction” section. All  $T_1$  fitting was performed on a voxel-by-voxel basis.

*In Vivo Experiment 1: Qualitative comparison to Cartesian based MPnRAGE and quantitative comparison to FSE-IR in a healthy adult male (27 years).*

Scans included a sagittal MPnRAGE acquisition that included two 75-s SPGR images with nominal flip angles of  $6^\circ$  and  $10^\circ$ , a 2D FSE-IR exam of a single axial slice, and a vendor supplied Cartesian based MPnRAGE acquisition of the whole brain. The Cartesian based MPnRAGE acquisition had the following parameters: FOV = 256 mm  $\times$  256 mm, pFOV = 0.91, slab thickness = 180 mm, acquired resolution = 1.00 mm  $\times$  1.00 mm  $\times$  1.00 mm, TR = 8.2 ms, TE = 3.2 ms,  $T_1$  = 450 ms,  $\alpha$  =  $15^\circ$ , acquisition time 7.5 min.

The MPnRAGE  $T_1$  map was co-registered to the FSE-IR  $T_1$  map using a rigid body transformation using the software package FSL (45). Mean and standard deviations of  $T_1$  were computed in several regions of interest (ROIs) (shown in Figure 6a and listed in Table 2). Linear regression using the mean  $T_1$  values in each ROI was used to relate and compare the  $T_1$  values of MPnRAGE with those from FSE-IR.

*In Vivo Experiment 2: Reproducibility of  $T_1$  estimates on a voxel-by-voxel bases across eight time points in two subjects (M 44 years, F 46 years) with relapsing remitting multiple sclerosis.*

Each subject received eight axial MPnRAGE scans at 1-month intervals. Each MPnRAGE scan also acquired a 90-s SPGR image with nominal flip angle of  $8^\circ$  used for



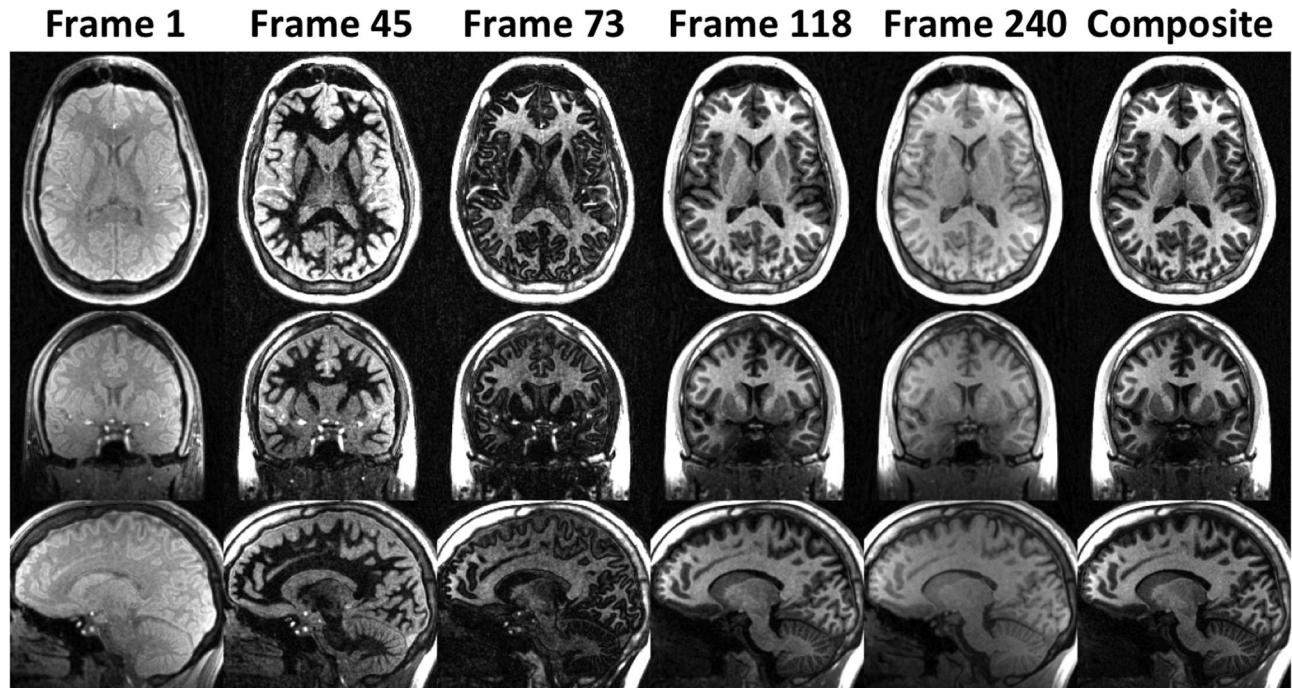


FIG. 5. Example images from MPnRAGE displaying a variety of  $T_1$ w contrasts. Frame 1: The earliest inversion time possible. Frame 45: Image with nulled white matter. Frame 73: Image with nulled gray matter. Frame 118: Image with nulled cerebral spinal fluid. Frame 240: The longest possible inversion time. Composite: image formed by summation of all the data.

$T_1$  estimation in Eq. [6]. The coefficient of variation of the  $T_1$  maps were computed on a voxel-by-voxel basis after aligning all  $T_1$  maps to the initial  $T_1$  map using the software package FSL (45). Spatial mean and standard deviations of the co-registered temporal  $T_1$  mean image were computed in several hand-drawn ROIs. Only ROIs with normal appearing white or gray matter were used to test reproducibility.

*In Vivo Experiment 3: Reproducibility of mean  $T_1$  estimates of major WM and GM ROIs across two time points in eight adolescent (ages  $12.9 \pm 0.6$  years, 4F, 4M) subjects.*

Each subject received two MPnRAGE acquisitions spaced approximately 4 weeks apart. Each MPnRAGE scan also acquired a 90s SPGR image with a nominal flip angle of  $9^\circ$  used for  $T_1$  estimation in Eq. [6].

Subject-specific templates were produced by registering a  $T_1$ w image from the second time point to the corresponding first time point of each subject using FSL (45). A study-specific template was then created from the subject-specific templates using the Advanced Normalization Tools (ANTs) software package (46). A final rigid transformation between this study-specific template and MNI template was determined using FSL. White and gray matter region-of-interest masks were defined using the MNI-atlas and warped back to the individual space of all subjects and time points. Mean  $T_1$  values were calculated within all ROIs for each subject and time point. To decrease likelihood that neighboring tissues outside the ROIs (i.e. CSF) were included, histograms of all measurements were manually inspected for unexpected  $T_1$  values and further erosion was performed as needed.

The absolute variability (absolute value of percent difference) between mean ROI measurements of the two time-points was calculated for each subject. Each brain region was then analyzed separately by taking the mean, standard deviation, absolute variability, and standard deviation of absolute variability across subjects.

## RESULTS

### Phantom Studies

The accuracy and precision of  $T_1$  fitting using a 3-parameter fit and an assumed inversion efficiency of 1.0 are shown in Figures 2a,c), while the results of a 4-parameter fit of IR data to account for inversion efficiency are shown in Figures 2b,d). Accuracy of the 3-parameter fit dramatically decreases as the inversion efficiency decreases, with errors of  $-2\%$ ,  $-8\%$ , and  $-17\%$  when fitting for  $T_1$  of 1200 ms and inversion efficiencies of 96.25%, 92.50%, and 88.75%, respectively. For a given inversion efficiency, the error increases with increasing  $T_1$ . The standard deviation of  $T_1$  errors remains less than 5% across all inversion efficiencies for  $T_1$  values below 2400 ms. While the magnitude percent error in  $T_1$  estimation for a 4-parameter fit is similar to the three parameter fit, the 4-parameter fit is less stable as demonstrated by increased standard deviations across all  $T_1$  values and inversion efficiencies. The minimum standard deviation for  $T_1$  values 900 ms and larger is 6% and occurs at  $T_1 = 900$  ms and a perfection inversion efficiency.

Figure 3 shows the results from the modified Monte Carlo simulation for the two-step  $T_1$  fitting procedure of Eq. [6] that incorporates one (Figs. 3a,c) and two (Figs.



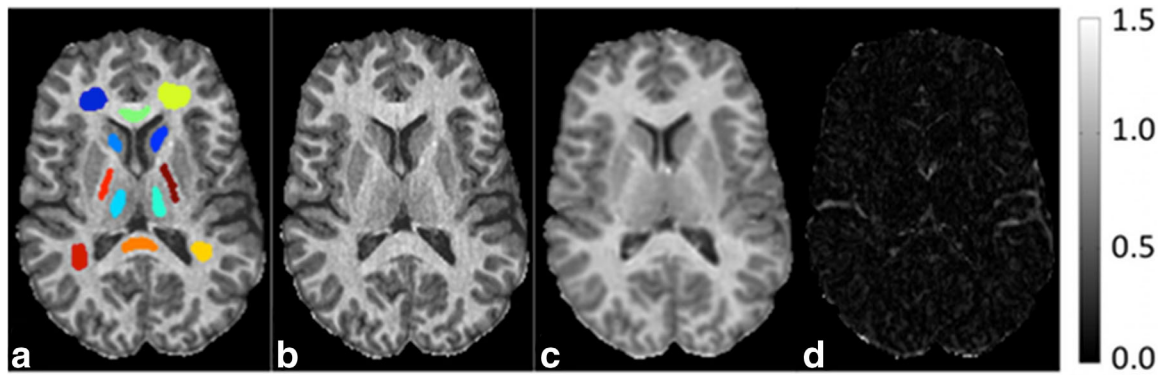


FIG. 6. **a**: The ROIs for the  $R_1$  maps in Table 1 (In Vivo Experiment 1). Quantitative  $R_1$  maps in units of 1/s from MPnRAGE and 2D FSE-IR (**b,c**) as well as difference image (**d**).

3b,d) SPGR images with alternate flip angles. For clarity, we only present the case with average inversion efficiency of 92.5%. However, the same general trends were observed across all inversion efficiencies, and the method showed little dependence on inversion efficiency. Increasing lambda tends to decrease percent error but increases variation. It should be noted that both effects are minimal (changes of order 1 to 2%), demonstrating the robustness of the technique to choice of lambda. Increasing  $T_1$  tends to increase both error and variation. Again, both effects are minimal, especially for  $T_1$  values of typical white matter and gray matter (changes on order of 1 to 2%).

The effect of view-sharing on accuracy and stability of  $T_1$  estimates is demonstrated in Figure 4. In general, the error and standard error increased as view-sharing increased for  $T_1 > 1700$  ms when a single SPGR image was used. However, there was little variation ( $< 0.1\%$ ) for shorter  $T_1$  values and for the case when two SPGR images were used, except for the case where  $T_1 = 50$  ms. When  $T_1$  was 50 ms, error and standard error both increased with the amount of view-sharing and peaked

at 2.2% and 1.3% (error) and 1.5% and 1.7% (standard error) for the case of 1 and 2 SPGR images, respectively.

The  $T_1$  estimates from the phantom experiment are shown in Supporting Table S1, which is available online. The calibration curve between  $T_1$  values estimates with MPnRAGE and FSE-IR is  $T_{1,MPnRAGE} = 0.91 T_{1,FSE-IR} + 50$  ms,  $r^2 = 0.998$  over the range of  $T_1$  values from 91 ms to 2597 ms. The smallest and largest  $T_1$  phantoms had the largest percent difference between the methods at  $-12\%$  and  $9\%$ . When excluded from the calibration curve, the relation is  $T_{1,MPnRAGE} = 0.96 T_{1,FSE-IR} + 22$  ms,  $r^2 = 0.995$  over the range of  $T_1$  values from 172 ms to 1261 ms.

## Human Studies

### In Vivo Experiment 1

Select images representing the variety of different  $T_1$ w contrasts achievable from a single 7.5 min MPnRAGE acquisition are shown in Figure 5. The minimum ( $T_{1,eff} = 167$  ms) and maximum ( $T_{1,eff} = 1336$  ms) effective inversion times produce little  $T_1$ w contrast. Intermediate frames can

Table 1

$T_1$  Measurements for Select ROIs for In Vivo Experiment 1 (Comparison to FSE-IR) and In Vivo Experiment 2 (Reproducibility Experiment 1)<sup>a</sup>

	Comparison to FSE-IR		Reproducibility experiment 1			
	Volunteer 1		Volunteer 2		Volunteer 3	
	MPnRAGE	FSE-IR	MPnRAGE			
	T <sub>1</sub> (ms)	T <sub>1</sub> (ms)	T <sub>1</sub> (ms)	C <sub>v</sub>	T <sub>1</sub> (ms)	C <sub>v</sub>
WM CC genu	861 ± 64	862 ± 68	811 ± 18	0.02	798 ± 25	0.05
WM CC splenium	881 ± 55	876 ± 32	825 ± 24	0.05	818 ± 28	0.06
WM ant left	909 ± 44	867 ± 20	912 ± 14	0.05	892 ± 47	0.05
WM ant right	892 ± 46	854 ± 19	880 ± 27	0.04	898 ± 56	0.06
WM post left	915 ± 50	886 ± 35	874 ± 21	0.05	906 ± 40	0.05
WM post right	924 ± 53	880 ± 30	845 ± 34	0.05	864 ± 28	0.05
WM internal cap left	923 ± 52	920 ± 36	864 ± 21	0.06	856 ± 31	0.07
WM internal cap right	927 ± 63	915 ± 30	870 ± 25	0.06	851 ± 44	0.07
GM caudate left	1301 ± 100	1293 ± 59	1276 ± 72	0.08	1238 ± 78	0.07
GM caudate right	1304 ± 139	1277 ± 84	1347 ± 66	0.08	1345 ± 68	0.08
GM thalamus left	1146 ± 90	1123 ± 47	1092 ± 36	0.06	1030 ± 38	0.07
GM thalamus right	1165 ± 109	1119 ± 54	1153 ± 72	0.07	1052 ± 80	0.08

<sup>a</sup>Measurements are made over a single time point for volunteer 1 and across 8 time points for volunteer 2 and 3. The reported coefficient of variation  $C_v$  in the reproducibility experiment was calculated first on a voxel-by-voxel basis, then averaged across each ROI. The  $T_1$  measurements for volunteer 1 provide the following calibration curve:  $T_{1,MPnRAGE} = 1.00 T_{1,FSE-IR} + 24$  ms,  $r^2 = 0.990$ .

Table 2

$T_1$  measurements for select ROIs for In Vivo Experiment 3 (reproducibility experiment 2) Involving Eight Volunteers with Two Measurements Each<sup>a</sup>

	Scan 1	Scan 2	Absolute variability	Literature
	$T_1$ (ms)	$T_1$ (ms)	%	$T_1$ (ms)
WM CC genu	$873 \pm 35$	$875 \pm 32$	$1.2 \pm 1.1$	919
WM CC splenium	$906 \pm 38$	$902 \pm 47$	$1.7 \pm 2.0$	966
WM frontal	$1025 \pm 31$	$1025 \pm 30$	$0.7 \pm 0.6$	1004
WM internal cap	$943 \pm 32$	$941 \pm 41$	$1.0 \pm 0.5$	963
GM caudate	$1502 \pm 27$	$1491 \pm 28$	$1.6 \pm 1.2$	1535
GM thalamus	$1238 \pm 31$	$1235 \pm 44$	$2.8 \pm 1.9$	1344
GM putamen	$1411 \pm 23$	$1405 \pm 21$	$1.1 \pm 0.9$	1372

<sup>a</sup>The reported values in columns 2–3 reflect the mean  $\pm$  standard deviation of ROI measurements across all eight subjects.  $T_1$  ROI measurements were determined from  $T_1$  maps calculated on a voxel-by-voxel basis. The reported absolute variability in column 4 reflects the mean  $\pm$  standard deviation of the absolute variability across all eight subjects. Absolute variability for each subject was calculated using  $T_1$  ROI measurements.

selectively null white matter (frame 45), gray matter (frame 73), and cerebrospinal fluid (frame 118). Summing data across the entire inversion recovery curve produces a composite image with excellent T1w contrast and high SNR.

A comparison of images obtained using the Cartesian based MPnRAGE method and the approximately matched T1w contrast images from MPnRAGE are shown in Supporting Figure S1. The middle row are MPnRAGE images reconstructed by averaging the low spatial frequency contributions of the last half of the IR recovery curve, and result in similar T1w contrast to the Cartesian MPnRAGE images (Supporting Figure S1, top row). In the bottom row, the MPnRAGE images have been intensity corrected by using the regularized division of a later inversion time by an earlier inversion time, as in Eq. [3] of Marques et al (3).

Figure 6 shows the quantitative  $R_1$  maps from the comparison between MPnRAGE and 2D FSE-IR. The greatest differences occur at the boundaries of CSF and regions that suffer from inflow artifact. Results from the ROI analysis are shown in Table 1. The calibration curve had a slope of 1.00 (essentially identical), intercept of 24 ms, and  $r^2 = 0.990$ .

#### In Vivo Experiment 2

The ability to visualize a small lesion in the cortical gray matter of a patient with MS is shown in Figure 7. For frames that occur after normal gray matter has reached the signal null (Figs. 7a–f), the hypointense cortical lesion (yellow arrow) indicates an increase of  $T_1$  at the lesion. For a magnitude image taken shortly after the null point of WM but before that of GM (Figs. 7g–i), the hypointense GM adjacent to the lesion (Figure 7i, blue arrow) indicates  $T_1$  shortening. Figures 7j–l are quantitative  $R_1$  ( $1/T_1$ ) maps.  $T_1$  values inside the lesion range were  $2200 \pm 200$  ms (min/max is 1800 ms/2800 ms), while the normal appearing GM adjacent and left of the lesion has  $T_1$  of  $1226 \pm 35$  ms. The GM adjacent and right of the lesion (blue arrow in Figure 7i) has  $T_1$  of  $1140 \pm 10$  ms, while gray matter to the right of the blue arrow in Figure 7i has  $T_1 = 1224 \pm 35$  ms.

Samples images, including the time-averaged  $T_1$  maps and coefficient of variation maps are shown in

Figure 8 for slices with normal appearing white and gray matter. The spatial mean and standard deviations of selected ROIs of the time-averaged  $T_1$  map are shown in Table 1, along with the average coefficient of variation for  $T_1$  of all pixels within each ROI. The coefficients of variation of  $T_1$  maps across the eight measurements range from 0.02 to 0.08 for white and gray matter voxels.

#### In Vivo Experiment 3

The mean and standard deviation of the overall absolute variability calculated across all ROIs and volunteers was  $1.4 \pm 1.4\%$ . The percent difference between the mean  $T_1$  values of this experiment and published values (22) are within 2 to 8%. Detailed results of the region-of-interest reproducibility experiment are presented in Table 2 (volunteers 2 and 3) and Supporting Table S2.

## DISCUSSION AND CONCLUSIONS

In traditional implementations of MPnRAGE using Cartesian k-space readouts, there exists a three-way tradeoff between spatial resolution, acquisition time, and the number of different T1w contrasts obtained in a single exam, where improvement in any two features results in worsening of the third. While more images along the relaxation recovery curve may be reconstructed by sampling the center of k-space more often, this means that either fewer high spatial frequency phase encoded lines will be acquired (decreased spatial resolution) or scan time will increase. Our proposed MPnRAGE method breaks the link between the number of T1w contrasts and acquisition time by using a radial k-space trajectory to acquire both low and high spatial frequency information with each TR. Instead of acquiring a single image with T1w contrast determined from a priori selection of the inversion time, a spectrum of 200+ images with different T1w contrasts may be acquired in a single exam. The large spectrum of images, which covers a wide range of T1w contrasts and enables subject-specific, optimized T1w contrast by allowing retrospective selection of the image or images that best depict anatomy and pathology on an individual basis. Additional uses for MPnRAGE have recently been proposed to provide tissue specific

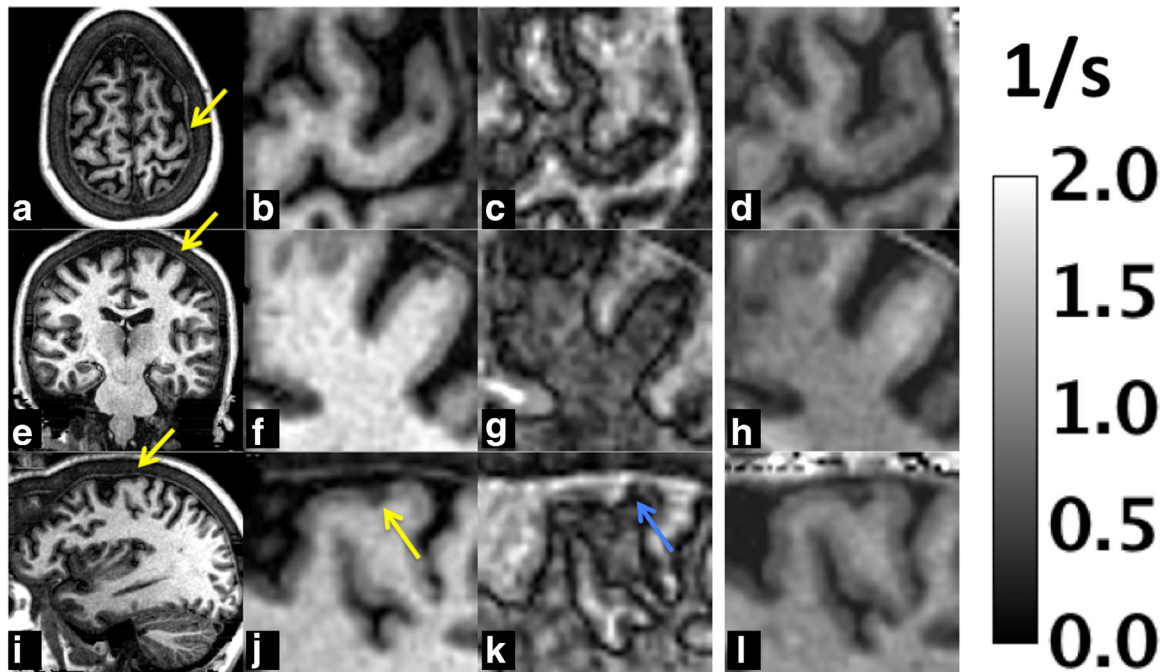


FIG. 7. Example magnitude images from MPnRAGE for a patient with MS. Three cropped orthogonal views from the composite images are shown (a–c) and for a zoomed region to depict a cortical gray matter lesion (d–f, yellow arrow in f). Zoomed images are also shown for an alternative contrast (g–i) that depicts a magnitude image when WM and GM have nearly equal magnitudes but opposite signs (WM > 0 and GM < 0) as well as quantitative R1 maps (j–l) in units of 1/s. The alternative contrast shows a region (blue arrow) just adjacent to the lesion that appears darker than both the lesion and surrounding normal GM.

(i.e., WM- or GM- only) imaging (47), automatic GM/WM/CSF image segmentation (48), and retrospective motion correction (41), although these works are beyond the scope of this study.

We explicitly reconstructed all possible images with a fixed sliding window width as a proof of principle. We have also produced additional images by combining an image with a late inversion time with an image from an

earlier inversion time as in Eq. [3] of Marques et al (3). This technique removes weighting from spin density, T2\*, and receiver sensitivity bias, reduces transmit B1 bias, and produces a high contrast T1w image (see Supporting Figures S1g–i). With 300 images with different inversion times, there are approximately 45,000 (300 choose 2) different T1w contrasts (with 180 slices each) that could be produced with Eq. [3] of Marques et al (3).

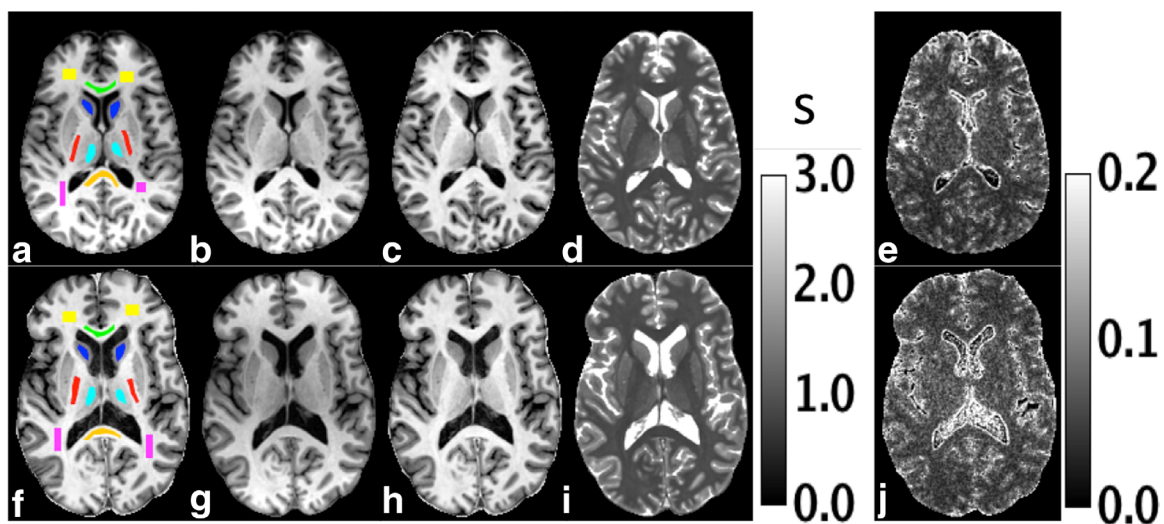


FIG. 8. Select axial images for two volunteers (a–e, f–j) with clinically definite multiple sclerosis who were scanned once a month for 8 months. a: The ROIs used for data analysis. The time-averaged composite images from MPnRAGE are shown in (b,c). Figures (c,h) are the time-averaged, intensity corrected images from MPnRAGE formed using a combination of high and low inversion time images. The time-averaged T<sub>1</sub> map is shown in (d,i), while the coefficient of variation of T<sub>1</sub> is shown in Figure (e,j).



It is unreasonable to send each volume for radiological examination or to store such a large dataset. A more thorough study will be needed to address the clinical utility of the extra information in the MPnRAGE images and will be presented in a future work. However, even in this preliminary study, we have demonstrated the ability of MPnRAGE to detect subtle changes in  $T_1$ . For example, in Figure 6i, the lesion that has decreased  $T_1$  values was visible at only nine effective inversion times (between  $T_{1,\text{eff}}=419$  ms and  $T_{1,\text{eff}}=459$  ms). Note that the addition of T1w phase-sensitive inversion recovery images to T2w double inversion recovery images has been reported to improve the detection of cortical demyelinating lesions, which is currently a critical unmet need in MS imaging (49,50).

Although we have already begun to apply the method to detect subtle pathological changes from some of the “nontraditional” T1w images, such as  $T_1$ -shortening adjacent to the MS lesion (Fig. 7), a more comprehensive clinical evaluation is needed to determine the utility of the nonstandard contrasts. Indeed, some groups have already begun investigating individually acquired alternative frames (TIs). Recently, groups have recently adjusting MPRAGE for WM nulling for improved cortical lesion detection (51,52) and delineation of the thalamic subnuclei (52). Other groups have begun investigating the GM/WM interface null frame to improve contrast between GM and intracortical GM lesions and to improve boundary identification between GM and juxtacortical lesions (53) and to simplify tissue segmentation process in the brain (54). We believe that the tissue-specific nulling properties and computed images from multiple MPnRAGE frames provides a comprehensive new framework for diagnostic imaging and applications such as image segmentation and quantitative brain morphometry that will be significantly better than existing methods.

The protocols used in this study were empirically designed to efficiently provide a large dynamic range (Fig. 5) for moderate  $T_1$  signals such as white and gray matter signals, but not for large  $T_1$  values such as cerebrospinal fluid. With a reduced dynamic range of signal, we do not expect the accuracy of such large  $T_1$  values to be the same as small or moderate  $T_1$  values. This was observed in the phantom results shown in Supporting Table S1 where the percent difference between  $T_1$  estimates for MPnRAGE and FSE-IR was 9% for the phantom with mean  $T_1$  value of 2597 ms. This difference is not surprising as neither the MPnRAGE or FSE-IR protocols were optimized for fitting of such large  $T_1$  values. We found that the signal curves from the large  $T_1$  phantom had such a small dynamic range that the signal curves nearly appear linear for both methods. The MPnRAGE protocol was also designed so that the main IR component was the same amount of time as a fully sampled MPRAGE exam (7.5 min). To reconstruct the individual inversion-time images with acceptable levels of undersampling artifact, 300 ms of view-sharing was used. As demonstrated in Eq. [4], view-sharing reduces the dynamic range of the magnetization recovery curve by increasing the signal at the first point (smallest  $T_1$ ). While it may be somewhat surprising that 300 ms of

view-sharing still produces accurate  $T_1$  estimation at  $T_1=172$  ms (3% difference compared with FSE-IR), the view-sharing effectively turned the inversion-recovery experiment into a saturation recovery experiment with the first point starting at 16% of the fully relaxed signal. Saturation recovery is widely used for rapid estimation of short  $T_1$  value experiments (55). Meanwhile, the smallest phantom, which had mean  $T_1$  of 92 ms had the first point start at over 50% of maximum signal. We expect that protocols for estimation of large  $T_1$  values could be designed by increasing the amount of the relaxation curve that is sampled, and that protocols for estimation of smaller  $T_1$  values could be designed by decreasing the amount of view-sharing used in the reconstruction. The design of such protocols is beyond the scope of this study.

Like almost all methods using a nonlinear search over multiple variables, the initial estimates and stopping criterion are important for robust fitting. A nice advantage of the multiple inversion frames provided by MPnRAGE is the ability to convert the null-frame index (i.e. the frame at which the signal nulls) to  $T_1$  using a lookup table created using assumed  $B_1$  errors ( $\kappa=1$  and  $\beta=150$ ). This in turns produces reasonable estimates for the spin-density factor  $\rho$ . We found that the objective function used for  $T_1$  estimation can be rather flat, especially at large  $T_1$  values. Thus, fitting may be sensitive to search methods and stopping criterion, especially for large  $T_1$  values like those found in CSF.

While we have used radial k-space trajectories to collect both low and high spatial frequency information with each TR, there are several alternative trajectories that could be used such as the cones trajectory (56), rotated spiral readout (57), or the radial cones trajectory (58). In this work, we have relied on angular undersampling and a complex combination of individual coil images using coil sensitivity maps (43) to provide the necessary acceleration. However, the serial set of images along the magnetization relaxation recovery curve generated by our MPnRAGE technique are well suited for compressed sensing methods using a parametric dimension to perform model-based reconstruction (59,60) and sparsity promoting regularization (61). We suspect that these methods would improve existing image quality by reducing artifacts due to undersampling and sliding window combination, and could reduce acquisition time and/or increase spatial resolution. However, the implementation of these methods is beyond the scope of this initial work.

In conclusion, in this work we introduced a new 3D method that simultaneously acquires a standard  $T_1$  weighted MPRAGE-like image in addition to a serial set of automatically co-registered images with multiple IR contrasts in approximately the same amount of time as a fully sampled traditional MPRAGE with Cartesian k-space readout. Modifications to the analytical expression describing the MR signal along the IR curve were made to account for radial view-sharing used in the reconstruction process. A rapid new  $B_1$  calibration approach was presented that combined IR images with steady state SPGR images with different flip angles to correct for inhomogeneities of both the excitation and



preparation pulses.  $T_1$  values obtained both in phantom and in vivo agreed well with FSE-IR. One reproducibility experiment involving two individuals who each received eight monthly scans showed the coefficient of variation of  $T_1$  for normal appearing white and gray matter was measured is between 0.02 and 0.08. A second reproducibility study involving 8 volunteers with two times points showed that the absolute variability (in %) of ROI based  $T_1$  measurements is  $1.4 \pm 1.4$  when averaged across all ROIs of all subjects. Both reproducibility studies suggest that MPnRAGE provides a highly reproducible measure of  $T_1$ .  $T_1$  measurements of 7 major WM and GM areas averaged across eight subjects (with  $2 \times$  time points) were within 2 to 8% of published literature. In at least one case, a nontraditional contrast from MPnRAGE was used to detect subtle differences between tissues with similar  $T_1$  values as well as for  $T_1$  quantification. The availability of high resolution multi-dimensional data (3 spatial and one  $T_1$ -w dimensions) as well as quantitative  $T_1$  maps from the same scan may prove useful in providing additional reference images for radiologists to detect pathology and for morphometric applications.

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## Supporting Information

Additional Supporting Information may be found in the online version of this article.

**Figure S1.** Example  $T_1$ -weighted images from Cartesian MPnRAGE (a–c), and radial MPnRAGE (d–i) for a normal volunteer. The images in the middle row (d–f), are produced using low spatial frequency information from only the last half of the inversion recovery curve and have similar contrast as in the Cartesian technique. The images in the bottom row have been intensity corrected by taking the regularized ratio of an early inversion time by a late inversion time and have had a background mask applied.

**Table S1.**  $T_1$  measurements in Phantom.

**Table S2.** Percent Differences (Scan 1 – Scan 2) for  $T_1$  Measurements for Each Subject from In Vivo Experiment 3<sup>a</sup> <sup>a</sup>The values reported in column 2 reflect the percent differences averaged across all ROIs within each subject.