

Repeatability of Magnetic Resonance Fingerprinting T_1 and T_2 Estimates Assessed Using the ISMRM/NIST MRI System Phantom

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Purpose: The purpose of this study was to evaluate accuracy and repeatability of T_1 and T_2 estimates of a MR fingerprinting (MRF) method using the ISMRM/NIST MRI system phantom.

Methods: The ISMRM/NIST MRI system phantom contains multiple compartments with standardized T_1 , T_2 , and proton density values. Conventional inversion-recovery spin echo and spin echo methods were used to characterize the T_1 and T_2 values in the phantom. The phantom was scanned using the MRF-FISP method over 34 consecutive days. The mean T_1 and T_2 values were compared with the values from the spin echo methods. The repeatability was characterized as the coefficient of variation of the measurements over 34 days.

Results: T_1 and T_2 values from MRF-FISP over 34 days showed a strong linear correlation with the measurements from the spin echo methods ($R^2 = 0.999$ for T_1 ; $R^2 = 0.996$ for T_2). The MRF estimates over the wide ranges of T_1 and T_2 values have less than 5% variation, except for the shortest T_2 relaxation times where the method still maintains less than 8% variation.

Conclusion: MRF measurements of T_1 and T_2 are highly repeatable over time and across wide ranges of T_1 and T_2 values. **Magn Reson Med 78:1452–1457, 2017. © 2016 International Society for Magnetic Resonance in Medicine.**

Key words: MR fingerprinting; quantitative imaging; relaxation time; repeatability; NIST system phantom

INTRODUCTION

Quantitative relaxometry shows promise for characterization and follow-up of disease in multiple clinical settings, such as neoplasm (1,2), multiple sclerosis (3,4), stroke (5), characterizing iron overload in liver (6), myocardial infarction (7), as well as monitoring treatment responses

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(8,9). However, the differences in T_1 and T_2 values between healthy and diseased tissues or between disease stages could be very small. To use quantitative relaxometry clinically, any variation in T_1 and T_2 measurement must be smaller than the differences between healthy and diseased tissues. Ideally the acquisition for measuring T_1 and T_2 values should be fast and accurate. It is also critical that measurements are highly repeatable, an important issue for tissue classification based on T_1 or T_2 values (10).

While many advances have been made to accelerate relaxometry (11–14), there are few studies (15,16) that assessed the repeatability of relaxometry methods. One reason is that these studies require phantoms with appropriate ranges of accurately known T_1 and T_2 values. These values should be stable over extended periods. An MRI system phantom was recently developed through the collaboration between the ISMRM Ad Hoc Committee on Standards for Quantitative Magnetic Resonance and the National Institute of Standards and Technology (NIST). The phantom has compartments containing solutions with a wide range of T_1 and T_2 values, and the solutions are well-characterized by NIST (17).

MR fingerprinting (MRF) is accurate and efficient in the simultaneous quantification of T_1 and T_2 by acquiring the transient-state signal with pseudorandom acquisition parameters (18–21). However, for these metrics to have clinical utility, the T_1 and T_2 values must be repeatable so that any observed difference in measured relaxivity between tissues or temporal change in measurement within a tissue can be assumed to be due to differences in physiology rather than scanner instability or methodological error. In this study, the repeatability of MRF derived T_1 and T_2 measurements in the ISMRM/NIST MRI system phantom is assessed over a period of 34 days.

METHODS

ISMRM/NIST MRI System Phantom

The ISMRM/NIST MRI system phantom has multiple layers of sphere arrays that are designed to have a range of specific T_1 , T_2 and proton density values. The spheres in the T_1 array are filled with NiCl_2 doped water, while the T_2 spheres are filled with MnCl_2 doped water. All solutions in the various compartments of the phantom are well-characterized and monitored by NIST for stability and accuracy (<http://collaborate.nist.gov/mriphantoms/bin/view/MriPhantoms/MRISystemPhantom>).

Table 1
Means and Standard Deviations (SD) of T_1 Values Estimated from Inversion Recovery Spin Echo Measurements and T_2 Values Estimated from Multiple Single-Echo Spin Echo Measurements^a

		1	2	3	4	5	6	7	8	9	10	11	12	13	14
T_1 (ms)	Mean	2038	1482	996	717	505	358	253	181	127	90	64	45	32	21
	SD	126	41	23	20	8	6	4	8	3	2	1	2	4	7
T_2 (ms)	Mean	581	406	292	203	143	97	71	51	37	26	20	14	13	11
	SD	22	15	16	10	9	3	7	5	5	3	5	2	10	6

^aThe mean and SD of each sphere were calculated from 50 pixels within a circular ROI that was manually drawn on the T_1 or T_2 map.

Gold Standard T_1 and T_2 Measurements by Spin Echo Methods

To characterize the T_1 and T_2 values in the system phantom, an inversion recovery spin echo (IR-SE) method and a multiple single-echo spin echo method were used on a Siemens 3 Tesla (T) Skyra scanner (Siemens AG Healthcare, Erlangen, Germany).

T_1 measurements from the T_1 array were acquired by the IR-SE method with seven inversion times (TIs) of 21 ms, 100 ms, 200 ms, 400 ms, 800 ms, 1600 ms, and 3200 ms with a repetition time (TR) of 10,000 ms, an echo time (TE) of 12 ms, a matrix size of 128×128 , a field of view (FOV) of 17 cm, and a slice thickness of 5 mm. The scan time for each TI measurement was 21.3 minutes. The total scan time for the gold standard T_1 measurement was near 2.5 hours.

T_2 measurements from the T_2 array were obtained using a multiple single-echo spin echo method with seven TEs of 12 ms, 22 ms, 42 ms, 62 ms, 102 ms, 152 ms, and 202 ms, a TR of 10,000 ms, a matrix size of 128×128 , a FOV of 21 cm, and a slice thickness of 5 mm. The scan time of each TE measurement was 21.3 minutes. The total scan time the gold standard T_2 measurement was near 2.5 hours.

To calculate T_1 values, a pixel-based nonlinear least-squares curve fitting was used to fit the magnitude of the IR-SE images to $S(TI) = a - be^{-TI/T_1}$. To calculate T_2 values, the magnitude values from the multiple single-echo spin echo images were fit to $S(TE) = ae^{-TE/T_2}$.

MR Fingerprinting Repeatability Measurements

The phantom was scanned with a 20-channel head-neck receiver array for 34 consecutive days to evaluate the repeatability of T_1 and T_2 estimates from the MRF method. For the daily measurement, the phantom was placed in the magnet for 30 minutes before the acquisition, to decrease the effects of motion on the measurements. The default global system adjustment was performed to adjust the B_0 shims and calibrate the RF power before MRF scans. No extra B_0 and B_1 mapping methods were performed in this study. A FISP-based MRF acquisition (19) was used to scan two slices, one through each of the T_1 and T_2 arrays, with an in-plane spatial resolution of $1.2 \times 1.2 \text{ mm}^2$ and a slice thickness of 5 mm. Flip angles were varied between 5° and 75° and repetition times ranged from 12 to 15 ms (19). A total of 3000 frames were acquired for each slice, resulting in a scan time of 45 seconds per slice.

To compare the MRF method with the gold standard methods, the T_1 IR-SE method, the T_2 spin echo method, and MRF acquisitions through the T_1 and T_2 arrays were each repeated five times. The scan parameters were the same as described in the previous sections. The long acquisition time prohibited performing this measurement every day. The five repeated measurements were performed continuously, and the total acquisition time was approximately 25 hours.

MRF Reconstruction and Pattern Recognition

A dictionary containing a set of signal evolutions was generated by Bloch simulations. The dictionary resolution, denoted as min:step:max was (10:10:90, 100:20:1000, 1040:40:2000, 2050:100:3000) ms for T_1 and (2:2:8, 10:5:100, 110:10:300, 350:50:800) ms for T_2 . The dictionary had a total of 4141 entries that excluded unrealistic $T_2 > T_1$ combinations.

The undersampled spiral data were reconstructed using NUFFT (22) with a separately measured spiral trajectory (23,24). The coil sensitivity map was estimated using the Walsh method (25) and derived from the average of the first 1000 coil-uncombined images. Pattern matching was performed by taking a complex dot product between the measured signal time course of each pixel and all entries of the dictionary. T_1 and T_2 values were derived from the entry that was maximally correlated against the acquired signal, and thus represented the closest dictionary entry to the acquired signal time course. NUFFT and pattern matching were implemented in the Siemens Image Calculation Environment (ICE, Siemens AG Healthcare, Erlangen, Germany). Twenty-five seconds were needed to reconstruct 3000 frames, estimate the coil sensitivity map, and combine the multiple coil images. The pattern matching process required 15 seconds using the current dictionary, for a 256×256 matrix acquisition.

RESULTS

T_1 values estimated from IR-SE and T_2 values from the multiple single-echo spin echo technique are reported in Table 1. The mean and the standard deviation (SD) of each sphere were calculated from 50 pixels in a circular region of interest (ROI) that was manually drawn on the T_1 or T_2 map to exclude edge pixels.

Figure 1 shows T_1 (a) and T_2 (b) values of each sphere over 34 consecutive days of measurement. The T_1 and T_2 values were averaged over 70 pixels in a circular ROI drawn on T_1 or T_2 map. Maps from MRF have higher spatial resolution compared with those from spin echo

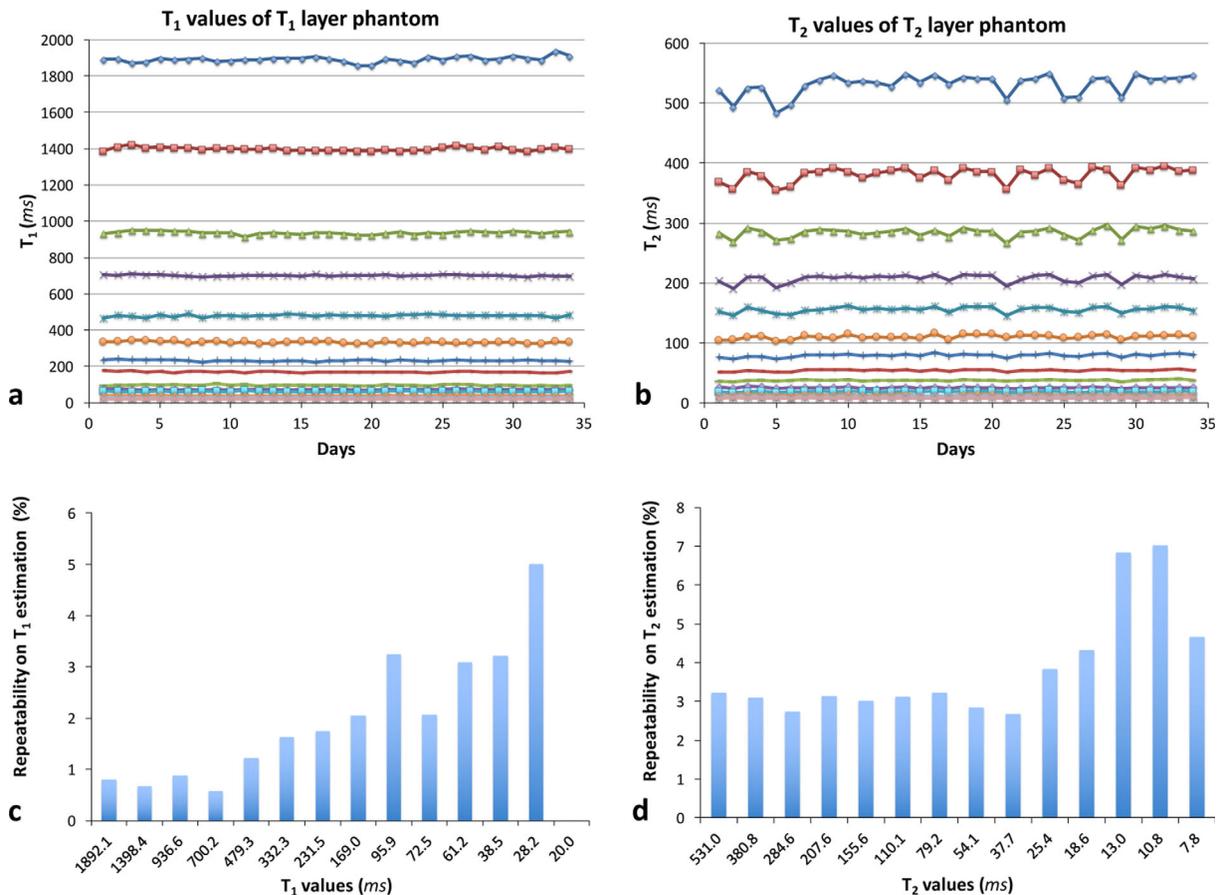


FIG. 1. T₁ (a) and T₂ (b) values of each sphere over 34 consecutive days. The repeatability of MRF-FISP T₁ (c) and T₂ (d) estimates is the standard deviation normalized by the mean T₁ and T₂ values of 34 days.

methods, allowing more pixels to be included in the ROI. The repeatability of T₁ (c) and T₂ (d) estimates from the MRF-FISP method is characterized as the coefficient of variation, defined as the ratio of the standard deviation to the mean T₁ and T₂ values over 34 days. Over the wide ranges of T₁ and T₂ values, MRF estimates have less than 5% variation, with the exception of T₂ relaxation times shorter than 13 ms, which shows a variation of 4.3–7.0% (Fig. 1c,d). The short T₂ relaxation times are on the order of the TR used for the MRF measurement.

Figure 2a shows the mean T₁ values obtained from MRF over 34 consecutive days plotted against those obtained from the gold standard IR-SE method. Figure 2b shows the mean T₂ values from MRF plotted against the values from the multiple single-echo spin echo method. The results show a strong linear correlation ($R^2 = 0.999$ for T₁; $R^2 = 0.996$ for T₂). The linear fits have slopes of 0.94 for T₁ values, 0.92 for T₂, and y-intercepts of -1.88 ms for T₁, and 7.28 ms for T₂.

Bland-Altman analysis was performed to assess the agreement between T₁ and T₂ values calculated from the MRF method and the values calculated from the spin echo methods. Figure 2c shows the Bland-Altman plot of T₁ values acquired with the IR-SE and the mean T₁ values obtained from MRF over 34 days. The mean bias for T₁ was 32.27 ms, and the 95% limits of agreement ranged from -46.13 ms to 110.68 ms. One data point with

the longest T₁ value was outside of the limits of agreement. Figure 2d shows the Bland-Altman plot of T₂ values calculated from the multiple single-echo spin echo method and the mean T₂ values obtained from MRF over 34 days. The mean bias for T₂ was 3.66 ms, and the 95% limits of agreement ranged from -28.54 ms to 35.87 ms. Similarly, one data point with the longest T₂ value was outside of the limits of agreement.

The repeatabilities of the IR-SE method, spin echo method, and MRF method are shown in Figure 3. Over five repetitions, the IR-SE for T₁ estimation varied less than 0.2% for T₁ values larger than 30 ms and less than 1.3% for smaller T₁ values. The MRF results for T₁ estimation varied less than 1.3% for T₁ values larger than 40 ms and less than 2.3% for smaller T₁ values. For T₂ values larger than 20 ms, the variation of the spin echo method was less than 1.2%, and the variation of MRF was less than 2.1%.

DISCUSSION

MRF estimates of the wide range of T₁ and T₂ values in the ISMRM/NIST MRI system phantom varied less than 5% over 34 consecutive days. The mean T₁ and T₂ values over 34 days also showed strong linear correlation with the results from the gold standard T₁ and T₂ measurements. The longest relaxation times (both T₁ and T₂)

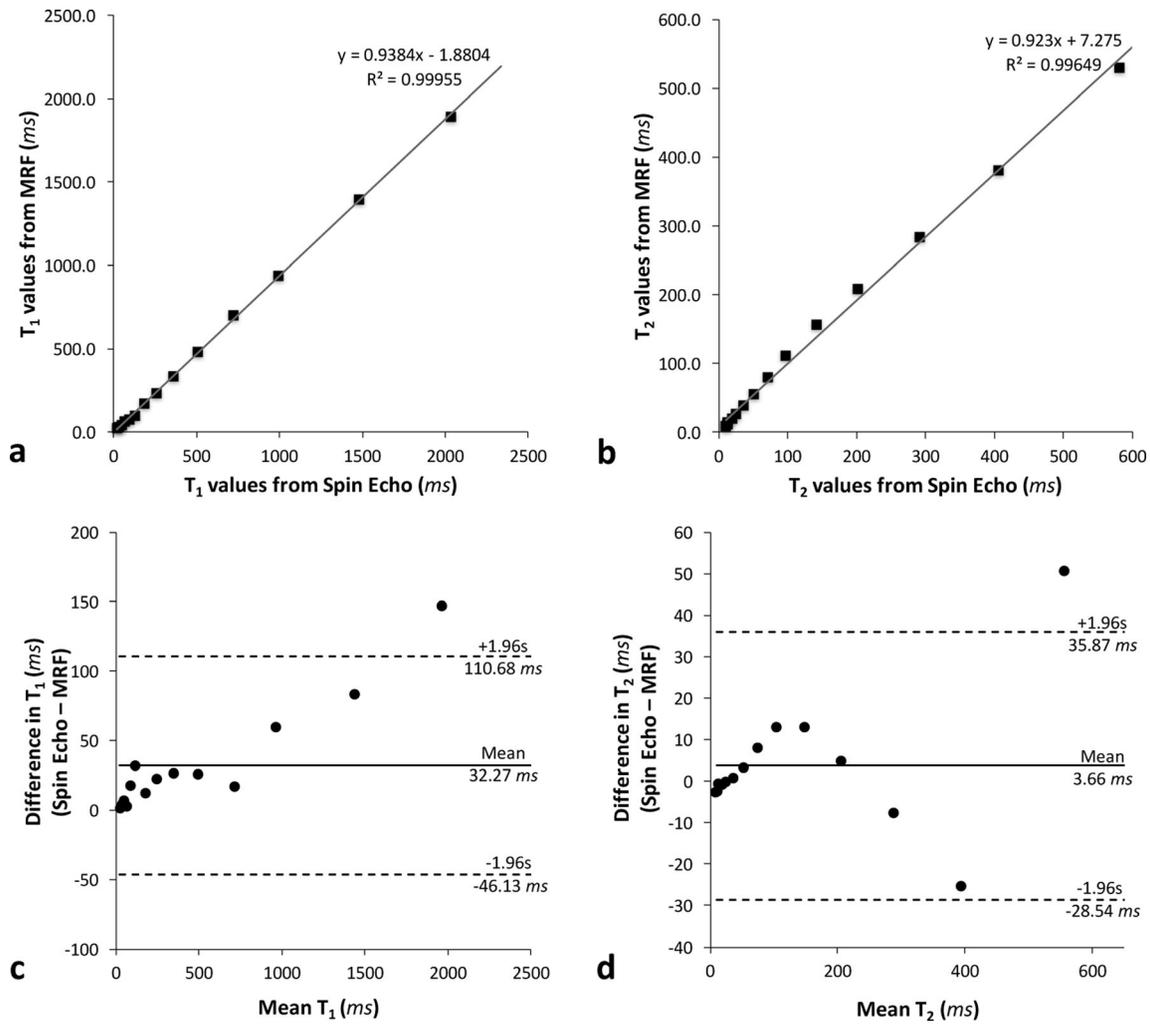


FIG. 2. Correlation plots (a,b) and Bland-Altman plots (c,d) comparing T_1 and T_2 values averaged over 34 consecutive days of MRF measurements to the T_1 and T_2 values obtained from the inversion recovery spin echo and spin echo methods, respectively.

were outside the Bland-Altman limits of agreement. This could be due to very long T_2 values in these spheres (> 500 ms) (17). Measurements of solutions with such

long T_2 values are more susceptible to any system imperfections, such as inaccurate flip angles and the eddy current, etc.

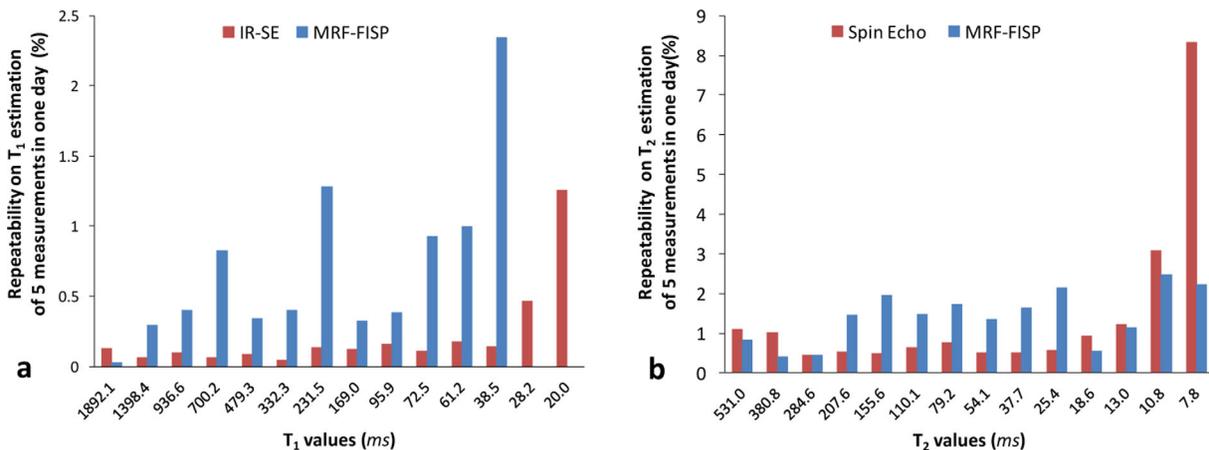


FIG. 3. The repeatability of T_1 (a) and T_2 (b) estimates from MRF-FISP method and the gold standard spin echo methods for each sphere (five repeated measurements).

While the gold standard spin echo methods showed better repeatability than the MRF method, the prohibitively long acquisition time of the spin echo method precludes its use in almost all clinical situations.

All methods showed greater variation in the shortest T_1 and T_2 values due to the choice of acquisition parameters in current experiment. The minimum TI in the IR-SE and the MRF method was 21 ms, which limited the ability to quantify T_1 values less than 21 ms accurately. The minimum TE used in the spin echo method was 12 ms, which limited the quantification of T_2 values that are on the order of the minimum TE. T_2 values on the order of the minimum TR used in the MRF method are the lower bound of accurate T_2 estimation.

The T_2 measurements had greater variation than the T_1 measurements, which could be a result of the B_1 variation from day to day. For the current study, the system default adjustment for the global B_0 and transmit radiofrequency power setting were used in the daily scan. No additional B_1 mapping was used to correct B_1 variation within the field-of-view. A previous MRF study (26) showed that B_1 variation affects the measured T_2 values more than T_1 values. Additional B_1 measurement and correction can improve the accuracy of the T_1 and T_2 estimates and should be included in cases where less than 5% variation is required. These variations could also be a result of small temperature fluctuations from day to day: the $MnCl_2$ solutions in the T_2 array are more sensitive to temperature changes than the $NiCl_2$ solutions in the T_1 array (27). A thorough study to examine the temperature dependence of the ISMRM/NIST MRI system phantom will be needed to address this issue.

The observed variations in T_1 and T_2 values could be affected by the dictionary resolution. In the current study, the shortest T_1 values, 21 ms and 32 ms, showed no variations. This was due to the T_1 value step size (10 ms) in the current dictionary. The dictionary resolution is a trade-off between the calculation time and the expected precision. A previous study (reported in the supplementary information of Ma et al.) (18) showed that the accuracy of the T_1 and T_2 estimates was not affected by the different dictionary resolutions, but the standard deviations of the estimated T_1 and T_2 values were reduced when finer dictionary step sizes were used. This is a common result of almost any digital system in the presence of quantization noise; a higher precision in the quantization leads to higher precision in the final result. The repeatability observed in the current study could potentially be improved using a dictionary with a finer step size, although previous studies (18,20) have shown only minor improvements. In the current implementation of MRF, a straightforward template matching algorithm was used. This simple approach was used to rule out complications from the use of faster, but more complex algorithms. Higher repeatability could potentially be achieved without increasing the computation time by using a compressed dictionary or other advanced processing algorithms (28,29).

CONCLUSIONS

Using the ISMRM/NIST MRI system phantom, MRF has high repeatability and accuracy over a period of 34 days across a wide range of T_1 and T_2 values.

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