#### **ORIGINAL ARTICLE**



# **Semi‑automated methodology for determination of contrast agent relaxivity using MRI**

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### **Abstract**

**Introduction** Knowledge of the longitudinal and transverse relaxivities (r1 and r2) of a contrast agent (CA) is essential for its magnetic characterization. These parameters can be measured using Magnetic Resonance Imaging (MRI) clinical scanners with the advantage of characterizing the CA under the same experimental conditions where it will be employed. Nevertheless, when using MRI, there are several limitations to consider, and we provide ways to compensate for them to obtain accurate results. **Materials and Methods** We present a fast and robust methodology to determine the relaxivity of CA solutions using a 3 T MRI clinical scanner with a single-channel transmit-receive birdcage coil. We performed relaxivity measurements on a phantom consisting of fve samples of copper sulfate at diferent concentrations.

**Results** We optimized image acquisition for total scan time using three diferent pulse sequences. Post-processing steps following image acquisition were implemented in a semiautomatic MATLAB toolbox. Relaxation times were estimated using the three-parameter model with the Levenberg-Marquardt algorithm. Statistical comparisons demonstrate good reproducibility and robustness in the relaxivity estimation by each method.

**Conclusions** This paper presented a methodology and a systematic discussion of experimental factors associated with relaxivity determination.

**Keywords** Contrast agent · Relaxivity · Magnetic Resonance Imaging

### **Introduction**

Magnetic Resonance Imaging has become a powerful method in biomedical research because of its noninvasiveness, high spatial resolution and contrast, and the possibility to obtain quantitative information regarding dynamic processes. However, it has a relatively low sensitivity. One way to overcome this disadvantage is by using exogenous contrast agents (CA) (paramagnetic and superparamagnetic). The efficiency of the CA can be characterized by a parameter called relaxivity (longitudinal  $r_1$  and transverse  $r_2$ ) (Rohrer et al. [2005](#page-8-0); Henoumont et al. [2009;](#page-8-1) Szomolanyi et al. [2019](#page-8-2)). Higher relaxivity allows a greater contrast enhancement in the image. Furthermore, higher relaxivity permits a lower dose for the same contrast enhancement, lowering CA toxicity (White et al. [2006](#page-8-3); McDonald et al. [2015](#page-8-4); McDonald et al. [2017\)](#page-8-5).

The observed relaxation rate depends linearly on CA concentration. For a fast exchange regime between the inner sphere of the paramagnetic or superparamagnetic center (P/S-magnetic) and free water state, we get:

<span id="page-0-0"></span>
$$
\left(\frac{1}{T_{1,2}}\right)_{obs} = \left(\frac{1}{T_{1,2}}\right)_{dia} + r_{1,2}[CA].
$$
\n(1)

Here, the frst term of the right member corresponds to the relaxation rate of the diamagnetic state. The second member corresponds to the P/S-magnetic contribution being [CA] the concentration and  $r_{1,2}$  the relaxivity. Relaxivities  $r_{1,2}$  depends on field strength, temperature and correlation times of the magnetic interactions. The linear relationship expressed by the Eq. ([1](#page-0-0)) becomes more complex in vivo (Modo and Bulte [2007](#page-8-6)).

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Although relaxivity is generally measured by NMR relaxometry (Rohrer et al. [2005;](#page-8-0) Henoumont et al. [2009](#page-8-1); Haën et al. [2003;](#page-7-0) Jacques et al. [2010](#page-8-7)), there is an increasing trend to use MRI scanners for this purpose (Chen et al. [2020](#page-7-1); Thangavel and Saritaş [2017](#page-8-8); Knobloch et al. [2018](#page-8-9)). This approach has the advantage of characterizing the CA under the same experimental conditions (feld strength, RF coil confguration, pulse sequences) where it is employed. However, we need to consider various sources of errors and inaccuracies like the proper selection of pulse sequence parameters to separate the different relaxation rates  $(1/T_{1,2})$ contribution to the MR signal, the infuence of signal-tonoise ratio (SNR) on the precision of the relaxation time measurement; RF field inhomogeneity's, susceptibility efects and temperature stability of the sample among others.

Given the increasing importance of relaxivity determination for CA characterization in MRI studies and the absence of a standardized procedure to this end, we present a systematic and brief evaluation of the factors that infuence its determination using MRI clinical scanners. We suggest ways to prevent experimental errors and methods to compensate for them, developing a methodology and a semi-automated toolbox to determine the relaxivity of CA samples by MRI.

#### **MRI experimental setup**

### **Phantom characteristics**

The methodology employs a phantom consisting of two sets of samples. The samples are contained in fat-bottomed polypropylene cylindrical vials with a volume of 2 mL and diameter of 10 mm, to facilitate the selection of homogeneous slices. The reference set consists of samples with known relaxation times while the second set contains CA samples whose relaxivities are to be determined. The CA sample concentration should not exceed the maximum dose allowed for the corresponding organ or tissue in which they will be employed. The sets will be prepared to obtain the same relaxation time range.

In all cases, sample volume should be enough to guarantee an adequate SNR and to permit the acquisition of at least two slices in a homogeneous region. Consequently, relaxation time estimation can be performed for each slice to compare and ensure that the sample is stable and homogeneous.

Another factor to consider is the sample's relative position within the phantom. To prevent the mutual infuence of the sample's macroscopic susceptibility, which can produce artifacts, a distance of at least one diameter between any two samples is necessary, especially for superparamagnetic iron oxide nanoparticles at high magnetic felds. This distance was determined through a trial and error procedure considering previous studies on geometric distortions (Gonzalez [2006\)](#page-7-2). The samples must be fxed with their vertical axes parallel to each other so that the excited slice plane is orthogonal to all samples.

In MRI, coil volume is usually larger than NMR relaxometers, which facilitates the characterization of several samples simultaneously, thus reducing the required time.

#### **Pulse sequences**

Relaxation times can be determined using spin-echo sequences (SE) for  $T_1$  and  $T_2$  and inversion-recovery spinecho sequences (IR-SE) for  $T_1$ .

For SE, the equation describing pixel intensity can be expressed as:

<span id="page-1-0"></span>
$$
S(x, y) = S_0(x, y) \left( 1 - A(x, y) e^{-\frac{T R}{T_1(x, y)}} \right) e^{-\frac{T E}{T_2(x, y)}} e^{-\overrightarrow{b} \overrightarrow{D}}.
$$
 (2)

Since no difusion sensitizing gradients are applied, the last exponential factor in Eq. ([2](#page-1-0)) can be discarded. The parameter  $A(x, y) = 1 - \cos\theta(x, y)$  accounts for RF inhomogeneity, which is discussed in more detail below. Repetition time TR and echo time TE are adjusted to separate, as much as possible, the contribution from each relaxation time.

In SE  $T_1$  estimation, TR is varied while keeping TE minimum, to minimize  $T_2$  weighting. Equation [\(2](#page-1-0)) is simplified to:

<span id="page-1-2"></span>
$$
S(x, y) = S_0(x, y)(1 - A(x, y)e^{-\frac{TR}{T_1(x, y)}})
$$
\n(3)

The minimum TR attainable afects the T1 measurement error by the MRI equipment. The error is higher in cases of short  $T_1$  values.

For SE  $T_2$  measurement, TE is varied and TR is chosen to fulfill TR≈5T<sub>1</sub>, minimizing T<sub>1</sub> weighting. Equation ([2\)](#page-1-0) now becomes:

<span id="page-1-3"></span>
$$
S(x, y) = S_0(x, y)e^{-\frac{TE}{T_2(x, y)}}
$$
\n(4)

The minimum TE attainable affects the  $T_2$  measurement error. The error is higher for short  $T_2$  values.

In the case of IR-SE sequence, the signal equation can be expressed as:

<span id="page-1-1"></span>
$$
S(x, y) = S_0[(1 - A(x, y)e^{-\frac{T}{T_1(x, y)}}) + e^{-\frac{T R}{T_1(x, y)}}]e^{-\frac{T E}{T_2(x, y)}}
$$
(5)

where TI is the inversion time. By choosing  $TR \geq 5T_1$  and setting minimum TE, Eq. ([5](#page-1-1)) is simplifed to:

<span id="page-1-4"></span>
$$
S(x, y) = S_0(x, y)[1 - A(x, y)e^{-\frac{T}{T_1(x, y)}}]
$$
\n(6)

When using IR-SE, the  $T_1$  estimate standard deviation is proportional to Brown et al. ([2014](#page-7-3)):

$$
\sigma_{T_1} \propto \frac{\sigma}{DR}.\tag{7}
$$

Here  $\sigma$  refers to image noise standard deviation and DR to signal dynamic range. Hence the IR-SE has a two-fold advantage over the SE because its dynamic range is twice that of the SE. However, the IR-SE method is slower than SE.

#### **RF feld inhomogeneity**

The aforementioned spatial inhomogeneity of the  $B_1$  excitation feld results in fip angle deviations depending on the spatial position according to:

$$
\theta(x, y) = \gamma \int_{0}^{t_p} B_1(x, y) d\tau
$$
\n(8)

For any RF coil configuration, the  $B_1$  inhomogeneities depends on several factors like RF pulse shape, RF penetration depth, standing-wave efects, among others. In general, all these factors must be considered but their contribution depends on the specifc RF coil transmission and reception confguration. These inhomogeneities reduce the magnetization vector dynamic range, thus reducing the estimated  $T_1$ .

This spatial distribution of flip angles due to  $B_1$  inhomogeneity can be mapped with the dual-angle method using a homogeneous phantom. This method acquires two images,  $S_1$  and  $S_2$ , with flip angles related by  $\theta_2 = 2\theta_1$ , and the flip angle distribution is obtained by Cunningham et al. ([2006\)](#page-7-4):

$$
\theta(x, y) = \arccos\left(\frac{S_2(x, y)}{2S_1(x, y)}\right)
$$
\n(9)

Another point related to the  $B_1$  excitation to be taken into account in MRI is that the duration of the selective pulse is several times longer than the non-selective used in the relaxometry. Then, during excitation, fip angle is more afected for those spin systems having very short  $T_1$ , which is equivalent to the  $B_1$  inhomogeneity.

In addition, to minimize the influence of  $B_1$  inhomogeneity, the phantom must be always placed in the more homogeneous region of the coils.

#### **Signal to Noise Ratio**

The image SNR is another factor infuencing the relaxation time estimation. We estimated SNR for each sample by region of interest (ROI) measurements. Let  $S_{\text{sample}}$  be the ROI image intensity in a sample and  $S<sub>background</sub>$  be the ROI image intensity on the image background (air surrounding the samples), then SNR can be calculated as (National Electrical Manufacturers Association [2021\)](#page-8-10):

$$
SNR = 0.665 \frac{mean(S_{sample})}{std(S_{background})}
$$
\n(10)

The factor 0.665 accounts for the Rayleigh distribution of the noise in the magnitude image. If a real image is evaluated no correction factor is needed.

#### **Susceptibility efects**

Susceptibilities efects result from variations in the local magnetic feld occurring near the interfaces of substances with diferent magnetic susceptibilities, in this case, the sample-air interface. These variations produce signal loss from T2\*-dephasing and spatial missmapping of the MR signal, which is more noticeable at high magnetic feld strength. To prevent these efects, the region of interest (ROI) in the samples should be selected away from its boundaries.

#### **Temperature**

The behavior of relaxation rates with temperature is diferent for each paramagnetic species (Kraft et al. [1987](#page-8-11)), therefore, the temperature of the samples should be kept constant throughout the experiment, to avoid any infuence on the determination of the relaxivity.

#### **MRI acquisition**

MRI acquisition was performed in a 3 T Siemens MAG-NETOM Allegra clinical scanner with a single-channel transmit-receive birdcage coil. We optimized pulse sequence parameters to reduce total scan time while preserving an adequate SNR. Reducing scan time is essential for samples with poor solubility or aggregation problems. A fast way to reduce overall scan time and increase SNR simultaneously is to degrade base resolution. Additionally, slice thickness was also increased to further improve SNR.

Slice plane positioning should be perpendicular to the vertical axis of the vials so that all selected regions are at the same height to the bottom of the vial to minimize signal differences caused by  $B_1$  inhomogeneities.

The choice of TR will depend on the  $T_1$  relaxation times of the unknown samples. When characterizing for the frst time, we set TR to the maximum available in the scanner to study the relaxation process of long- $T_1$  samples. If the estimated  $T_1$  values are short compared to this maximum TR, we can progressively reduce TR until TR≈5T<sub>1</sub> for every sample.

To perform a more accurate estimation, the number of time points should be higher at the beginning of the relaxation curves (for low TI, TR, and TE) when the magnetization vector, and so the signal, changes more rapidly.

The pulse sequence parameters for each method are detailed in Table [1](#page-3-0)

# **Software pipeline**

We implemented the following semiautomatic post-processing steps as a MATLAB toolbox:

- *Automatic handling of DICOM files*: The first postprocessing step after image acquisition is to rename and organize the raw DICOM images in a specifc folder (Slices) the toolbox automatically creates. Images are sorted in ascending order of TRs, TEs, or TIs according to the corresponding measurement
- *Automatic noise segmentation and ROI selection:* Automatic noise segmentation is done based on the Rician distribution of pixel intensity in the MR image (Gudbjartsson and Patz [1995](#page-8-12)). We applied a thresholding method based on the image histogram to suppress pixels corresponding to background noise (Barbará Morales and Sánchez-Bao [2012](#page-7-5)). Upon completing this step, each sample ROI is identifed, eroded, and low pass fltered to remove its boundaries. Alternatively, the user can select the ROI manually, avoiding susceptibility efects at the edges of the ROIs.
- *Calculation of mean and standard deviation from each ROI:* We calculated the mean (*Im*) and standard deviation of pixel intensity from each previously selected ROI along the diferent time points (diferent TRs, TEs, or TIs) in the relaxation curve.

• *Estimation of relaxation times:* We employed a nonlinear ft with Levenberg-Marquardt (L-M) algorithm (Gavin [2019\)](#page-7-6) to estimate relaxation times from Eqs. [\(3](#page-1-2)), ([4\)](#page-1-3) and ([6\)](#page-1-4). The L-M is a robust and fexible algorithm that combines two numerical minimization algorithms: the gradient descent method and the Gauss-Newton method.

 The objective equation to minimize is the sum of square errors for each signal equation:

$$
\widehat{\beta} \in \operatorname{argmin}_{\beta} F(\beta) = \sum_{i=1}^{n} \left[ I_{m_i} - S(T_i, \beta) \right]^2.
$$
 (11)

where  $I_{mi}$  are the mean intensities computed for each ROI in the images and  $T_i$  are the timing parameters TR, TE, and TI. The estimated parameter  $β$  is a vector consisting of the relaxation times  $T_1$  or  $T_2$ , the parameter A and the equilibrium signal  $S_0$ 

• *Calculation of relaxivities:* The relaxivities (expressed in  $mM/s^{-1}$ ) are calculated via a linear fit of Eq. [\(1](#page-0-0)) once the user inputs each sample concentration in mM.

Figure [1](#page-4-0) shows the graphical user interface (GUI) of the toolbox. The upper left part of the GUI comprises the buttons for DICOM fle handling alongside image axes where the user can scroll through the diferent slices. The DICOM header info and the type of measurement are shown below these axes. At the bottom center, the user can fnd the buttons to extract information (mean and standard deviation of signal intensity) from each sample and visualize its signal evolution.

The signal evolution for each sample can be visualized in the upper right corner axes. Below this axis is a table

Parameters	$T_1$ IR-SE	$T_1$ SE	$T2$ SE
FOV $(mm2)$	$150 \times 100$	$150 \times 100$	$130\times89$
Slice Thickness (mm)	6.0	6.0	6.0
In-Plane Resolution $\text{(mm}^2)$	$0.8\times0.8$	$0.8\times0.8$	$1.0 \times 1.0$
<b>Slices</b>			
<b>Acquisition Matrix</b>	$192 \times 128$	$192 \times 128$	$128\times88$
$TI$ (ms)	[23, 37, 60, 75, 100, 150, 250, 650, 800, 1100, 1700, 2500, 4200, 68001	$\overline{\phantom{0}}$	
$TR$ (ms)	8500	[57, 180, 280, 380, 480, 680, 1000, 1200, 1400, 1600, 10 000 2000, 2400, 3000, 3500, 4000, 5000, 8000, 10 000]	
$TE$ (ms)	13	11	[11, 18, 25, 30, 35, 40, 50, 80, 110, 2001
Total Time (h:min)	1:19	1:30	1:43

<span id="page-3-0"></span>**Table 1** Pulse sequence parameters for each method



<span id="page-4-0"></span>**Fig. 1** Toolbox graphical user interface

flled with sample coordinates, relaxation times, and concentrations. There are also two buttons: one on the left to estimate the relaxation times and one on the right to calculate the relaxivity.

Figure [2](#page-5-0) represents three fundamental steps in the determination of relaxivity. The first step is image acquisition, schematically represented in graphs (a) and (d). From each detected sample, we calculate the mean intensity of its corresponding ROI for each TE or TI. Using these intensities, we constructed the relaxation curves as shown in graphs (b) and (e). Subsequently, we estimated using the Levenberg-Marquardt algorithm the relaxation times for each sample. Finally, we obtained the relaxivity through a least squares fitting procedure using the known concentration as displayed in graphs (c) and (d).

To summarize the whole methodology Fig. [3,](#page-5-1) shows a general fowchart, comprising all the proposed steps.

The toolbox code is available to download at ([https://](https://github.com/isra-RM/KRelax) [github.com/isra-RM/KRelax](https://github.com/isra-RM/KRelax)) as a public repository.

### **Comparison among methods**

As the frst step in data analysis, we tested for normality in the relaxivity values for each method using the Shapiro-Wilks test  $(p > 0.05)$ . To demonstrate the robustness of the methodology, we analyzed the effect of the highest concentrated sample and the solvent in the relaxivity estimation. In addition, we compared the agreement in the equilibrium signal estimation across methods. If the relaxivity values comply with a normal



<span id="page-5-0"></span>**Fig. 2** Graphical scheme of three fundamental steps in the determination of relaxivity using MRI. Graphs (**a**) and (**d**) represent image acquisition for diferent TI (TE). Graphs (**b**) and (**e**) show the relaxa-

tion curves for each sample in a  $T_1$  ( $T_2$ ) calculation. Graphs (**c**) and (**f**) display the least square fit to determine the  $r_1$  ( $r_2$ ) relaxivity

<span id="page-5-1"></span>

distribution, a two-sample t-test  $(p > 0.05)$  will be used to analyze the abovementioned effects, otherwise its non-parametric equivalent Mann-Whitney U-test is employed.

The agreement and reproducibility of the estimated parameters are quantifed using the percentage deviation to the mean (PDM) and the coefficient of variation  $(CV)$ . The

 $r_1$  and  $r_2$ 

<span id="page-6-0"></span>

<b>Table 2</b> Shapiro Wilks normality test for the relaxivity		Shapiro-Wilks Test		
values obtained from each		Statistic df Sig		
method	$r_1$ (IR-SE) 0.875 7 0.203			
	$r_1$ (SE)	0.839		0.096
	r2(SE)	0.834		0.088

<span id="page-6-1"></span>**Table 3** Relativities obtained using the IR-SE and SE methods



percentage deviation to the mean quantifying the agreement between any two variables  $S_1$  and  $S_2$  is defined as:

$$
PDM = \frac{|S_1 - S_2|}{mean(S_1, S_2)} \cdot 100
$$
 (12)

To assess the reproducibility of the estimates of a variable S, we calculated the coefficient of variation defined as:

$$
CV = \frac{std(S)}{mean(S)} \cdot 100\tag{13}
$$

#### **Validation using copper sulfate solutions**

For the validation of the methodology, several measurements of relaxation times, equilibrium signals, and relaxivities were performed on a phantom containing samples of copper

sulfate solutions at five different concentrations  $(0.97 \text{ mM})$ . 2.00 mM, 3.90 mM, 7.8 mM, and 15.7 mM). The frst step in data analysis was to verify the normality of relaxivity values obtained for each method (Table [2](#page-6-0)).

The Shapiro Wilks normality test suggests that relaxivity measurements follow a normal distribution. In order to test the reproducibility of the methodology, the CV was calculated for the three methods (Table [3\)](#page-6-1).

The CV values indicates a very low variability of all methods. As expected, the most stable method is the IR-SE.

To demonstrate the stability of the methodology, we considered the effect of removing the highest concentrated sample from the relaxivity estimation (Table [4\)](#page-6-2). We compared the estimation using all samples with the estimation without the highest concentrated sample, using a two-sample t-test.

We obtained p-values of  $p=0.123$  for T<sub>1</sub> IR-SE,  $p=0.108$ for T<sub>1</sub> SE, and p=0.506 for T<sub>2</sub> SE, indicating that the highest concentrated sample does not signifcantly afect the relaxivity estimation. The reason to consider the efect of the highest concentrated sample is the high variance in its relaxation time estimation. Testing the efect of high-concentration samples allows fnding an upper threshold in concentration, and hence a lower threshold in relaxation time, that can be estimated without afecting relaxivity.

Table [5](#page-7-7) shows the effect of discarding the solvent (setting its relaxation rate to zero) from the relaxivity estimation.

We obtained, using a two-sample t-test, p-values of  $p=0.143$  for T<sub>1</sub> IR-SE,  $p=0.702$  for T<sub>1</sub> SE, and  $p=0.077$ for  $T_2$  SE, indicating that the presence of the solvent does not modify the relaxivity estimation.

Table [6](#page-7-8) shows a comparison of the equilibrium signals estimated by each method with the experimental value. This value represents the highest intensity signal point in the relaxation curves.

As expected, the  $T_1$  IR-SE method shows the smallest PMD compared to the experimental value obtained from the  $T_1$  relaxation curve. As shown, PMD decreases as the concentration increases, refecting that less concentrated samples (longer relaxation times) might not fully relax for the maximum TI available in the scanner. The PMD of

<span id="page-6-2"></span>**Table 4** Comparison of the relaxivity estimation using all points (r) and estimation without the highest concentrated point (r\*) for each method



<span id="page-7-7"></span>**Table 5** Comparison of the relaxivity estimation using all points (r) with the estimation discarding the solvent effect  $(r)$ for the three methods

Measure- ment Number	$T_1$ IR-SE			$T_1$ SE		T <sub>2</sub> SE			
	r	$r^{\prime}$	Dev $(\%)$	$\mathbf{r}$	$r^{\prime}$	Dev $(\%)$	r	$r^{\prime}$	Dev $(\%)$
1	0.635	0.648	2.073	0.592	0.597	0.841	0.760	0.776	2.031
$\overline{c}$	0.634	0.646	1.876	0.591	0.594	0.624	0.755	0.772	2.202
3	0.649	0.662	1.968	0.564	0.569	0.830	0.757	0.775	2.454
$\overline{4}$	0.611	0.623	2.091	0.562	0.568	1.044	0.716	0.734	2.484
5	0.610	0.621	1.885	0.603	0.605	0.281	0.721	0.741	2.640
6	0.637	0.649	1.819	0.591	0.596	0.758	0.754	0.775	2.668
7	0.632	0.644	1.818	0.605	0.603	0.248	0.738	0.758	2.675
<i>p</i> -value	0.143			0.702			0.077		

<span id="page-7-8"></span>**Table 6** Comparison of equilibrium signals (mean and standard deviation) obtained from seven measurements for each sample. L-M ft results are shown in columns 2 and 3, while columns 4 and 5 show

the experimental determination by measuring the highest intensity point in the relaxation curve. Columns 6 to 8 show the PMD of the estimates between each method



the  $T<sub>2</sub>$  SE method shows the opposite trend; the higher the concentration, the higher the PMD. The equilibrium signal in the  $T<sub>2</sub>$  SE method is determined experimentally as the intensity of the frst point in the decay curve, hence, the diference between this value and the L-M estimate becomes higher for samples with high concentrations (short  $T_2$  times).

# **Conclusions**

In this paper, we presented a brief and systematic analysis of the relaxivity determination in clinical scanners identifying the sources of error and their respective compensation methods. We developed a fast and robust methodology, including a MATLAB toolbox, to determine the relaxivities of contrast agent samples using MRI clinical scanners. We optimized image acquisition using IR-SE and SE pulse sequences to minimize total scan time, which prevents problems derived from poor sample stability. Post-processing steps following image acquisition were implemented in a semiautomatic MATLAB toolbox to speed up relaxivity determination. Statistical comparisons of the estimated parameters demonstrate the reproducibility and accuracy of the toolbox.

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