

# Volumetric Evaluation of 3D Multi-Gradient-Echo MRI Data to Assess Whole Liver Iron Distribution by Segmental $R_2^*$ Analysis: First Experience

## Volumetrische Auswertung von 3D-Multigradientenecho-MRT-Daten zur Beurteilung der Eisenverteilung in der gesamten Leber durch segmentale $R_2^*$ -Analyse: erste Erfahrungen

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### ZUSAMMENFASSUNG

**Ziel** Die transversale MR-Relaxationsrate  $R_2^*$  hat sich als nützlich für die Überwachung der Eisenüberladung der Leber erwiesen. Mittlerweile steht eine Sequenz zur Verfügung, die die Erfassung der gesamten Leber in einem einzigen Atemzug ermöglicht. Das erlaubt volumetrische Studien der hepatischen  $R_2^*$ -Verteilung. Unser Ziel war es, die Machbarkeit einer

computergestützten Segmentierung der gesamten Leber aus 3D-Multigradientenecho-MRT-Daten zu untersuchen. Darüber hinaus haben wir untersucht, ob die Bestimmung des  $R_2^*$ -Wertes der gesamten Leber mit der Analyse einer einzelnen Schicht vergleichbar ist. Schließlich wurden die segmentalen  $R_2^*$ -Unterschiede bewertet.

**Methoden** 44 Patienten wurden mittels Multi-Gradientenecho-MRT bei 1,5 T untersucht. Die Leber wurde segmentiert und in neun Segmente unterteilt. Die segmentalen  $R_2^*$ -Werte wurden für alle Patienten zusammen und unterteilt nach zwei Kriterien analysiert: durchschnittliche  $R_2^*$ -Werte und vorherrschender Grund für die Eisenüberladung. Die Korrelation von Einzelschicht- und volumetrischen Daten wurde mit dem Spearman-Rangtest geprüft, während Segment- und Gruppenunterschiede durch Varianzanalyse bewertet wurden.

**Ergebnisse** Die  $R_2^*$ -Werte der Gesamtleber korrelierten hervorragend mit den Einzelschichtdaten ( $p < 0,001$ ). Die niedrigsten  $R_2^*$ -Werte traten in Segment 1 (S1) auf, die Unterschiede zwischen S1 und anderen Segmenten waren in fünf Fällen signifikant und in zwei Fällen hochsignifikant. Patienten mit niedrigem  $R_2^*$  wiesen keine signifikanten Unterschiede auf, Patienten mit hohem  $R_2^*$  zeigten signifikante Unterschiede zwischen S1 und den Segmenten 2, 6 und 7. Krankheitsbedingte Unterschiede zu S1 waren in den Segmenten 3 bis 5 und 7 signifikant.

**Schlussfolgerungen** Die Ergebnisse dieser Studie deuten auf eine Inhomogenität der hepatischen Eisenverteilung hin. Während der niedrige  $R_2^*$ -Wert in S1 durch seine besondere Gefäßversorgung erklärt werden kann, sollte die Ursache für segmentale Unterschiede, möglicherweise bedingt durch spezifische Krankheitsbilder, weiter untersucht werden.

### Kernaussagen:

- Die  $R_2^*$ -Verteilung in der Leber ist nicht so homogen wie bisher angenommen.
- Dies deutet darauf, dass die Lebersegmente nicht nur eine anatomische, sondern auch eine funktionelle Bedeutung haben.
- Die beste Übereinstimmung des  $R_2^*$ -Werts eines einzelnen Segments mit dem der gesamten Leber fanden wir in Segment 8.

## ABSTRACT

**Purpose** MR transverse relaxation rate  $R_2^*$  has been shown to be useful for monitoring liver iron overload. A sequence enabling acquisition of the whole liver in a single breath hold is now available, thus allowing volumetric hepatic  $R_2^*$  distribution studies. We evaluated the feasibility of computer-assisted whole liver segmentation of 3D multi-gradient-echo MRI data, and compared whole liver  $R_2^*$  determination to analyzing only a single slice. Also, segmental  $R_2^*$  differences were studied.

**Materials and Methods** The liver of 44 patients, investigated by multi-gradient echo MRI at 1.5 T, was segmented and divided into nine segments. Segmental  $R_2^*$  values were examined for all patients together and with respect to two criteria: average  $R_2^*$  values, and reason for iron overload. Correlation of single-slice and volumetric data was tested with Spearman's rank test, segmental and group differences were evaluated by analysis of variance.

**Results** Whole-liver  $R_2^*$  values correlated excellent to single slice data ( $p < 0.001$ ). The lowest  $R_2^*$  occurred in segment 1 (S1), differences of S1 with regard to other segments were

significant in five cases and highly significant in two cases. Patients with high average  $R_2^*$  showed significant differences between S1 and segments 2, 6, and 7. Disease-related differences with respect to S1 were significant in segments 3 to 5 and 7.

**Conclusion** Our results suggest inhomogeneous hepatic iron distribution. Low  $R_2^*$  in S1 may be explained by its special vascularization.

### Key Points

- Hepatic  $R_2^*$  distribution is not as homogeneous as previously thought.
- Liver segments might have a functional relevance.
- Segmental and total liver  $R_2^*$  values coincide best in segment 8.

### Citation Format

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## 1. Introduction

Numerous studies have been performed to study the distribution of hepatic proton density fat fraction (PDFF) in nonalcoholic fatty liver disease (NAFLD) patients and healthy subjects (e. g., [1]). Differences between segments have been reported. For the monitoring of liver iron content (LIC), on the other hand, the usefulness of the transverse relaxation rate  $R_2^*$  determined by gradient echo for LIC quantification has been shown, which reflects total body iron [2, 3]. Volumetric multi-gradient-echo sequences are available now that allow the acquisition of the entire liver in a single breath hold [4]. Using the multi-echo technique, acquiring several signals with different echo times after one excitation, transverse relaxation rate  $R_2^*$  and PDFF can be determined simultaneously in the entire covered region. The suitability of one of these volumetric sequences for the determination of liver iron content has recently been proven by manually placed regions of interest (ROIs) in appropriate liver cross-sectional images [5]. Meanwhile, software solutions are available for automated or semi-automated segmentation of the liver, e. g. a user-corrected template method as described by Mory et al. [6]. This enables the determination of an average  $R_2^*$  value for the entire liver and additionally for individual liver segments [7].

The aim of this study was threefold: First, to evaluate whether semiautomatic liver segmentation is feasible on single-breath-hold MR volumetric images. Second, we aimed to determine  $R_2^*$  values segment by segment and to check for deviations between the  $R_2^*$  values of the individual segments. Third, segmental  $R_2^*$  values were studied also in patient groups, subdivided according to average hepatic  $R_2^*$  levels on the one hand and the main reasons for iron overload on the other.

## 2. Methods

The study was conducted according to the Declaration of Helsinki (last revision 2013, Fortaleza, Brazil). After approval by the University's Ethics Committee, patients examined by MRI in our clinic between May 2017 and April 2018 for noninvasive hepatic iron content quantification were included after written informed consent of patients or, in the case of minors, of the parents. MRI investigation was performed at 1.5 T (MAGNETOM Avanto, Siemens Healthcare, Erlangen, Germany) as published before [5]. Briefly, with a multi-echo 3D GRE sequence the entire liver was acquired in a single breath hold. Six echoes were acquired at echo times (TE) of 1.2, 2.4, 3.6, 4.8, 6, and 9 ms. The 3D volume consisted of 56 slices with a field of view (FoV) of  $400 \times 300 \times 224 \text{ mm}^3$  at a voxel size of  $2.5 \times 2.5 \times 4 \text{ mm}^3$ . The acquisition matrix was  $160 \times 84 \times 56$ . Immediately after data acquisition,  $R_2^*$  and PDFF values were determined voxel by voxel in a multi-step fitting process accounting for fat-water signal dephasing, and were displayed as parameter maps [8].

### 2.1 Single-slice analysis

A single slice was chosen best suited to place three circular ROIs in the liver parenchyma avoiding vessels. The size and  $R_2^*$  mean of the ROIs were documented and the weighted  $R_2^*$  mean was determined according to the equation:

$$\overline{R_2^*} = \frac{\sum_{i=1}^3 n_{pix\ i} * R_{2^*}^i}{\sum_{i=1}^3 n_{pix\ i}}$$

where  $R_{2^*}^i$  is the measured average  $R_2^*$  in a given ROI,  $n_{pix\ i}$  is its number of pixels, and  $\overline{R_2^*}$  is the calculated average  $R_2^*$  for the single-slice method.

## 2.2 Volumetric analysis

Image quality of the volumetric sequence was evaluated using a four-point Likert scale with 1 = excellent image quality, 2 = marginal artifacts not compromising liver diagnosis, 3 = image quality impaired by breathing and/or fat-water mismatch (so-called swaps) and 4 = severe image artifacts. Patients in whom the liver was not completely covered, e. g. due to a different breathing position compared to the survey slices or because the liver was not completely depicted in these, and patients with poor image quality (Likert score 3 or 4) of the volumetric sequence were excluded.

The liver was segmented using Liver Health, an additional software tool of the IntelliSpace Portal (ISP, Philips, Hamburg, Germany), by a medical student under the supervision of an experienced radiologist (more than 15 years of liver MRI experience). From the different contrasts offered by the multi-echo sequence, best suited images were chosen. After an initial automatic segmentation, the liver contour was checked on the axial slices as well as coronal and sagittal reconstructions and corrected if necessary. In cases with moderately to highly elevated  $R_2^*$  values, the  $R_2^*$  map was used to explicitly identify liver boundaries. The time required for user interaction was documented. After complete segmentation of the liver, it was divided into segments using manually placed anatomical landmarks. We used the division proposed by Couinaud/Bismuth with a total of 9 segments [9]. The landmarks for this subdivision were taken from the reference standard and were in detail: right portal vein bifurcation, Vena (V.) cava inferior, V. hepatica dextra, V. hepatica media, Fissura umbilicalis, bifurcation of left portal vein, left hepatic tip, ligamentum venosum, attachment of the ligamentum venosum at the portal vein, and attachment of the ligamentum venosum at the V. cava. Parts of segmented tissue could be selectively excluded by their  $R_2^*$  values, e. g. vessels due to their long  $T_2^*$  times, so that only the liver parenchyma relevant for iron overload was included. For this purpose, the software created a  $T_2^*$  map and set the threshold values for  $T_2^*$  to be considered to 1 and 50 ms. These could then be adjusted manually. After segmentation, the software determined the mean values and standard deviations of the  $R_2^*$  values of the whole liver and divided by segments. Also,  $R_2^*$  histograms could be created for the whole liver and each segment separately. The  $R_2^*$  mean value as well as the volume were documented for the entire liver and for each segment.

## 2.3 Statistics

Statistical analysis was performed with SPSS (V. 27, 2020, IBM, Armonk, NY). All variables were checked for normal distribution using the Shapiro-Wilk test. The  $R_2^*$  values determined by the two methods were checked for agreement using linear correlation. The significance of correlation was evaluated with Spearman's rank test.

Segmental  $R_2^*$  values were tested for statistically significant differences as described below. Furthermore, they were normalized with the  $R_2^*$  of the total liver according to the equation:

$$rR_2^*_{\text{seg}} = \frac{R_2^*_{\text{seg}}}{R_2^*_{\text{liv}}}$$

where  $rR_2^*_{\text{seg}}$  denotes the relative or normalized segmental  $R_2^*$  value,  $R_2^*_{\text{seg}}$  the measured  $R_2^*$  mean value of the individual segments and  $R_2^*_{\text{liv}}$  the mean  $R_2^*$  value of the whole liver. Both the actual  $R_2^*$  and  $rR_2^*$  values were checked for differences between liver segments by analysis of variance (ANOVA) with repeated measures. For this purpose, sphericity was analyzed in advance using Mauchly's test. Furthermore, an additional Bonferroni correction was performed because of multiple groups. The effect size was calculated according to Cohen.

In addition, we studied whether nonuniform  $R_2^*$  distribution depended on  $R_2^*$  levels by dividing our participants into two groups according to their average hepatic  $R_2^*$  value, group A with  $R_2^* < 140 \text{ s}^{-1}$ , group B with  $R_2^* > 140 \text{ s}^{-1}$ , a threshold which corresponds to the LIC threshold for therapy indication of 4.5 mg/g and a recently published  $R_2^*$  calibration for the sequence used [5, 10]. The significance of differences between the two groups was calculated using the Mann-Whitney-U-Test.

Finally, relative segmental  $R_2^*$  values were evaluated to determine if there were any differences due to disease. Of particular interest was the reason for iron overload. We divided diseases of study participants into three groups: solely increased iron absorption, but no transfusion (mainly hemochromatosis, group 1) versus transfusion-dependent anemias without markedly increased iron absorption (group 2) and diseases where iron overload was caused by both increased iron absorption and transfusions (group 3). Significance of differences due to diseases was addressed using a Kruskal-Wallis test. Differences between liver segments within the groups were again tested by ANOVA. Analogous to the entire cohort, Mauchly's test was performed in advance, as well as a Bonferroni correction. Again, effect size was calculated according to Cohen.

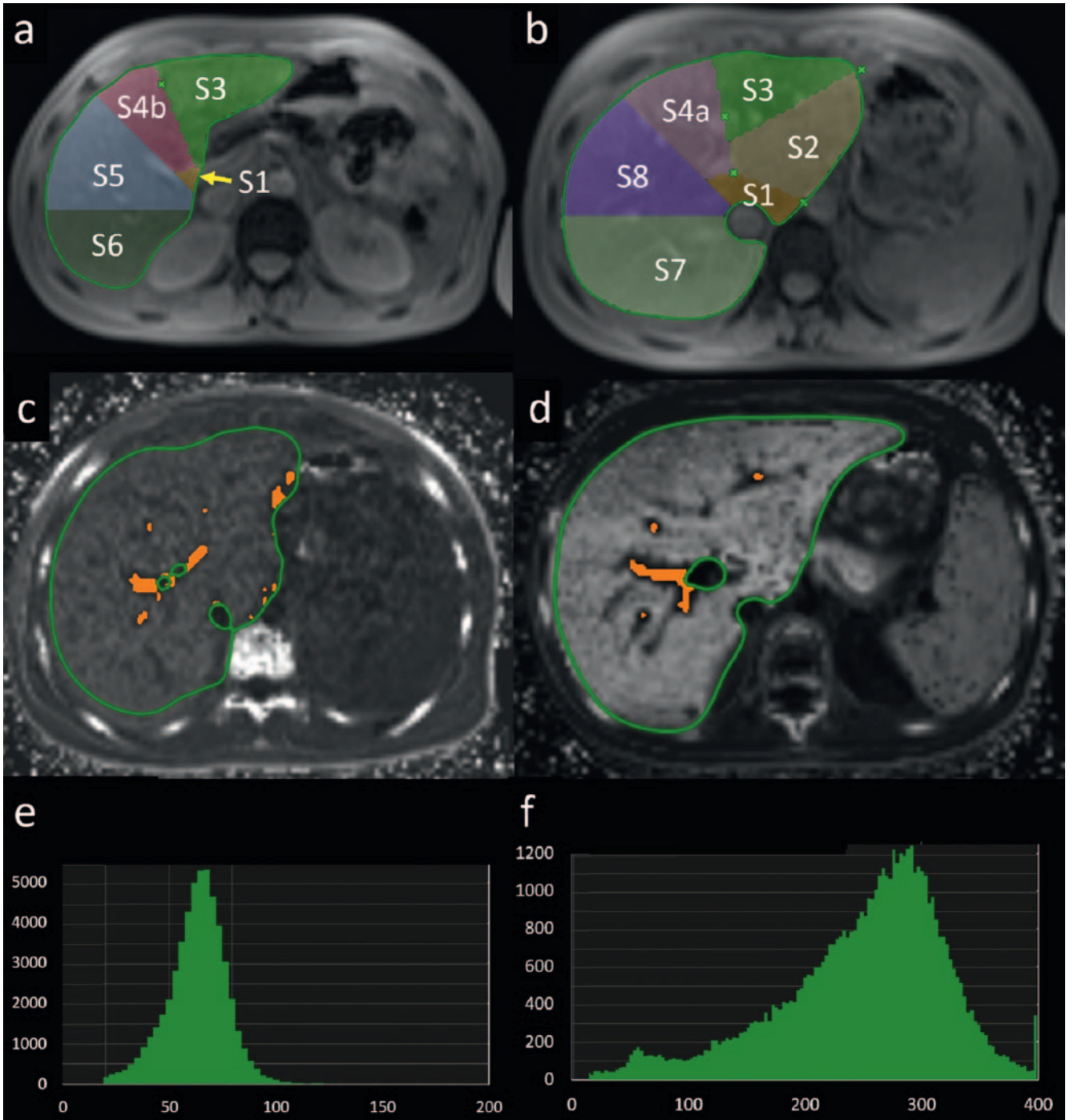
In all cases, p-values  $< 0.05$  were assumed significant,  $p < 0.01$  highly significant.

## 3. Results

In the chosen time interval, 58 participants were scanned. In all cases, the liver was imaged completely. 30/58 (52%) of the studies received a Likert score 1 for excellent image quality, 14/58 (24%) were scored 2. A total of 14/58 participants (24%) had to be excluded, 10 were scored 3, and 4 received a score of 4. Thus, 44 participants were evaluated (24 m, 20 f, age  $23.7 \pm 13$  years (mean  $\pm$  SD), age range 4.1 to 60.6 years).

The segmentation procedure was completed successfully in all cases. The total time for segmentation varied between 7 and 14 minutes, on average 9 minutes and 26 seconds. **Fig. 1** shows examples of liver contours and whole-liver histograms for two participants with different average liver  $R_2^*$ . Histograms show a positively skewed  $R_2^*$  distribution for both participants. For the participant with a higher  $R_2^*$ , distribution was broader compared to the other, indicating a relevant number of voxels with  $R_2^*$  above the average value for this participant.

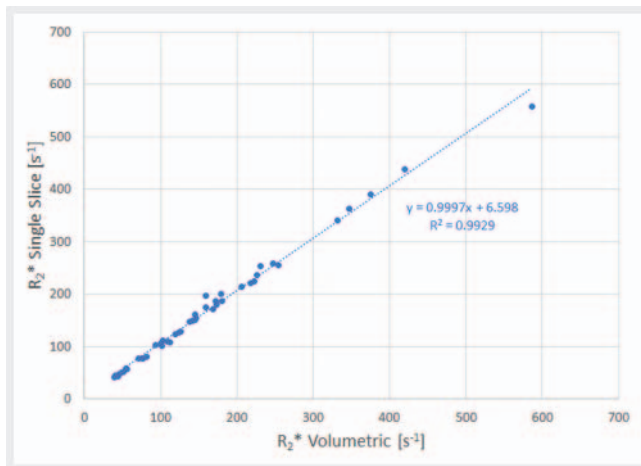
The total liver volume for all patients was  $1428 \pm 483$  ml (mean  $\pm$  SD), and the range of volumes was 329 to 2788 ml. The mean  $R_2^*$  value of all patients was  $170.2 \pm 112.1 \text{ s}^{-1}$  (mean  $\pm$  SD) determined with the ROI-based method and  $163.7 \pm 112.2 \text{ s}^{-1}$



► **Fig. 1** Examples of liver segments (**a, b**) overlaid on the image with the shortest TE in one representative patient. Subfigures **c** to **f** show two participants, one with low average liver  $R_2^*$  (**c, e**), the other with a markedly higher average liver  $R_2^*$  (**d, f**). The figure shows the liver contour overlaid on the  $R_2^*$  map (panels **c** and **d**, where voxels excluded due to their  $T_2^*$  exceeding the given threshold are marked in orange) and whole liver histograms (**e, f**). Note that both histograms are positively skewed, a characteristic which is more pronounced in the participant with a larger average  $R_2^*$  (**f**).

► **Abb. 1** Beispiele von Lebersegmenten bei einem repräsentativen Patienten (**a, b**), überlagert auf das Bild mit der kürzesten TE. Die Abbildungen **c** bis **f** zeigen 2 Patienten, einen mit niedrigem durchschnittlichen Leber- $R_2^*$  (**c, e**), den anderen mit deutlich höherem durchschnittlichen Leber- $R_2^*$  (**d, f**). Dargestellt sind die Leberkontur, die der  $R_2^*$ -Karte überlagert ist (Teilabb. **c** und **d**, wobei die aufgrund einer Überschreitung des vorgegebenen  $T_2^*$ -Schwellenwerts ausgeschlossenen Voxel orange markiert sind), sowie die Histogramme der gesamten Leber (**e, f**). Es fällt auf, dass beide Histogramme eine linksschiefe Verteilung zeigen, eine Eigenschaft, die bei dem Patienten mit dem größeren durchschnittlichen  $R_2^*$  stärker ausgeprägt ist (**f**).





► **Fig. 2** Scatterplot of  $R_2^*$  values determined with both methods. The dashed line is the regression line. Its equation and coefficient of determination are given. For single-slice analysis, ROIs were placed in the right liver lobe, mostly in segment 8.

► **Abb. 2** Streudiagramm der mit beiden Methoden ermittelten  $R_2^*$ -Werte. Die gestrichelte Linie ist die Regressionsgerade, ihre Gleichung und ihr Bestimmtheitsmaß sind angegeben. Die ROIs für die Einzelschichtanalyse wurden im rechten Leberlappen platziert, vorwiegend im Segment 8.

(mean  $\pm$  SD) for the volumetric analysis. The correlation was highly significant with  $r = 0.995$ ,  $p < 0.001$ . A scatter diagram of the  $R_2^*$  values of the different procedures with regression lines is given in ► **Fig. 2**. The coefficient of determination  $R^2 = 0.993$  indicates a nearly ideal correlation. The regression line was close to identity which indicates congruence of the  $R_2^*$  values between the two methods.

The volume averages of the segments are listed in ► **Table 1**, as well as the mean actual and normalized  $R_2^*$  values. A significantly lower  $R_2^*$  in liver segment 1 is noticeable. In contrast,  $rR_2^*$  was slightly greater than 1 in other segments, especially in segment 7. In segment 8, the relative  $R_2^*$  value was closest to 1, i. e. the actual  $R_2^*$  was closest to average hepatic  $R_2^*$ .

The relative  $R_2^*$  values of the segments are shown in ► **Fig. 3**. Significant differences were found for segment 1 compared to the other segments except S4b, with highly significant differences for segments 2 and 7. No significant differences occurred between the other segments 2 to 8.

After dividing patients according to their mean  $R_2^*$  value, we got 21 patients (12 m, age  $21.8 \pm 8.9y$  [mean  $\pm$  SD], age range 4.9 to 38.6y) in group A with a mean hepatic  $R_2^* < 140 s^{-1}$  and 23 patients (12 m, age  $25.4 \pm 15.9$  [mean  $\pm$  SD], age range 4.1 to 60.6y) in group B. Segmental  $R_2^*$  distribution was comparable in both groups, as seen from relative  $R_2^*$  values shown in ► **Table 2**. There were no significant differences in  $rR_2^*$  values between the groups for each segment, but significant segmental differences

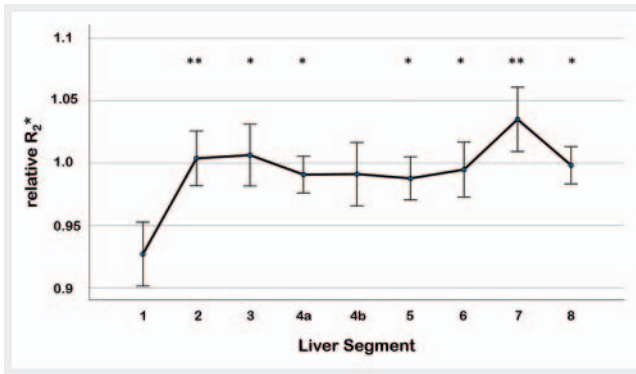
► **Table 1** Various values found for individual segments.

► **Tab. 1** Verschiedene Werte der einzelnen Segmente.

	S1	S2	S3	S4a	S4b	S5	S6	S7	S8
Volume [ml]	37.8	191.0	134.5	122.0	83.8	267.6	123.0	210.7	257.7
StdDev Volume	21	88	73	46	36	117	57	87	96
Mean $R_2^*$ [ $s^{-1}$ ]	151	164	163	164	161	163	165	169	165
SD $R_2^*$	102	109	109	116	106	111	117	117	116
Significance for $R_2^*$ differences with respect to segment 1 (p)	–	0.0015**	0.039*	0.082	0.2	0.036*	0.031*	0.0006**	0.083
Mean relative $R_2^*$ ( $rR_2^*$ )	0.927	1.002	1.006	0.991	0.990	0.987	0.994	1.035	0.999
StdDev relative $R_2^*$	0.084	0.072	0.081	0.048	0.083	0.057	0.072	0.085	0.049
Significance for $rR_2^*$ differences with respect to segment 1 (p)	–	0.001**	0.004*	0.006*	0.056	0.023*	0.026*	0.0003**	0.001*

Values of the individual segments, averaged over all patients. Significant differences for  $R_2^*$  and relative  $R_2^*$  values with respect to segment 1 are marked with an asterisk (\*), highly significant differences with two asterisks (\*\*).

Werte der einzelnen Segmente, gemittelt über alle Patienten. Signifikante Differenzen der  $R_2^*$ - und relativen  $R_2^*$ -Werte gegenüber Segment 1 sind mit einem Stern (\*) markiert, hochsignifikante Differenzen mit 2 Sternen (\*\*).



► **Fig. 3** Mean values (dots) and 95% confidence interval (whiskers) for relative segmental  $R_2^*$  values. Significant differences with respect to segment 1 are marked by asterisks (\* = significant –  $p < 0.05$ , \*\* = highly significant –  $p < 0.01$ ). No significant differences of  $rR_2^*$  values between other liver segments were found.

► **Abb. 3** Mittelwert (Punkte) und 95% Konfidenzintervall (Balken) für die relativen  $R_2^*$ -Werte der Segmente. Signifikante Unterschiede zu Segment 1 sind durch Sternchen gekennzeichnet (\* = signifikant –  $p < 0,05$ , \*\* = hoch signifikant –  $p < 0,01$ ). Es wurden keine signifikanten Unterschiede der  $rR_2^*$ -Werte zwischen anderen Lebersegmenten festgestellt.

within each group only occurred in group B, and only in three segments S2, S6 and S7. Note that, as above, relative  $R_2^*$  values were closest to 1 in segment 8 for both groups.

The number of patients in different disease groups and their diseases are given in ► **Table 3**.

Considering the different reasons for iron overload, there were seven patients in group 1, cf. ► **Table 3**. This group showed the lowest mean relative  $R_2^*$  ( $rR_2^*$ ) in segment 1 with 0.92. This means that for this group of patients in segment 1 the  $R_2^*$  value was on average 8% lower than in the other segments. Eleven patients had transfusion-dependent anemia without inadequately increased iron resorption (Group 2, see ► **Table 3**). This group contained the participant with the highest  $rR_2^*$  of segment 1 (1.13) in our collective. The mean value of  $rR_2^*$  in segment 1 was 0.93, the same value as observed in group 3 ( $n = 26$  participants, mostly thalassemia).

Significant differences between patient groups, however, with small effect sizes, were found in segments 3 to 5 and 7. Details are given in ► **Table 4**.

► **Table 2** Segmental  $R_2^*$  values in groups with different mean hepatic  $R_2^*$ .

► **Tab. 2** Segmentweise  $R_2^*$ -Werte der Gruppen mit verschiedenen mittleren  $R_2^*$ -Werten der gesamten Leber.

	Whole liver	S1	S2	S3	S4a	S4b	S5	S6	S7	S8
<b>Group A</b>										
Mean $R_2^*$ [ $s^{-1}$ ]	84.1	79.2	84.4	86.0	83.4	84.9	82.6	82.4	86.0	83.5
StdDev $R_2^*$	31.5	30.1	32.3	33.4	32.3	34.1	35.6	33.2	30.5	30.4
Mean relative $R_2^*$ ( $rR_2^*$ )	–	0.944	1.008	1.025	0.991	1.007	0.971	0.975	1.035	0.993
StdDev relative $R_2^*$	–	0.072	0.058	0.072	0.045	0.090	0.056	0.075	0.098	0.053
<b>Group B</b>										
Mean $R_2^*$ [ $s^{-1}$ ]	236.6	216.5	236.1	234.1	236.9	230.4	235.7	240.3	244.6	238.5
StdDev $R_2^*$	109.8	102.0	103.5	106.5	116.1	102.1	107.3	115.1	115.2	116.1
Significance for $R_2^*$ differences with respect to segment 1 (p)	–	–	0.017*	0.44	0.30	1.00	0.12	0.06	0.005**	0.28
Mean relative $R_2^*$ ( $rR_2^*$ )	–	0.909	1.000	0.986	0.993	0.973	1.006	1.016	1.035	1.006
StdDev relative $R_2^*$	–	0.094	0.086	0.088	0.053	0.074	0.053	0.063	0.070	0.045
Significance for $rR_2^*$ differences with respect to segment 1 (p)	–	–	0.032*	0.302	0.125	1.00	0.055	0.004*	0.0004**	0.072

Mean  $R_2^*$  and mean relative  $R_2^*$  values for all segments in groups split by mean hepatic  $R_2^*$  values. Patients in group A had a mean  $R_2^* < 140 s^{-1}$ , patients in group B  $R_2^* > 140 s^{-1}$ . For the whole liver, the volumetric  $R_2^*$  values are given. The  $R_2^*$  values determined by ROIs were  $94.7 \pm 40.4 s^{-1}$  (mean  $\pm$  SD) for group A and  $252.9 \pm 107.3 s^{-1}$  (mean  $\pm$  SD) for group B. There were no significant differences in relative segmental  $R_2^*$  values between group A and B. However, significant differences with respect to segment 1 occurred only in group B (marked with \* for significant differences, \*\* for highly significant differences), whereas in group A there were no significant differences between segments at all.

Mittlere  $R_2^*$ - und mittlere relative  $R_2^*$ -Werte für alle Segmente in den Gruppen, aufgeteilt nach mittleren hepatischen  $R_2^*$ -Werten. Die Patienten der Gruppe A hatten einen mittleren  $R_2^*$ -Wert  $< 140 s^{-1}$ , die Patienten der Gruppe B einen  $R_2^*$ -Wert  $> 140 s^{-1}$ . Für die gesamte Leber sind die volumetrischen  $R_2^*$ -Werte angegeben. Die durch ROIs ermittelten  $R_2^*$ -Werte betragen  $94,7 \pm 40,4 s^{-1}$  (Mittelwert  $\pm$  SD) für Gruppe A und  $252,9 \pm 107,3 s^{-1}$  (Mittelwert  $\pm$  SD) für Gruppe B. Es gab keine signifikanten Unterschiede bei den relativen segmentalen  $R_2^*$ -Werten zwischen Gruppe A und B. Signifikante Unterschiede zu Segment 1 traten jedoch nur in Gruppe B auf (gekennzeichnet mit \* für signifikante Unterschiede, \*\* für hochsignifikante Unterschiede), während es in Gruppe A keine signifikanten Unterschiede zwischen den Segmenten gab.

► **Table 3** Groups of study participants split by disease.

► **Tab. 3** Gruppen der Studienteilnehmer unterteilt nach Krankheitsbildern.

Disease	Male	Female	Sum
Group 1			
Primary Hemochromatosis	4	0	4
Pyruvate Kinase Deficiency	1	0	1
Congenital Dyserythropoietic Anemia	1	0	1
Hemolytic Anemia due to Hb Youngstown	1	0	1
<b>Sum group 1</b>	<b>7</b>	<b>0</b>	<b>7</b>
Group 2			
Diamond Blackfan Anemia	3	2	5
Sickle Cell Disease	0	1	1
Congenital Hemolytic Anemia	0	1	1
Severe Aplastic Anemia	0	1	1
Leukemia after Bone Marrow Transplant	1	1	2
Osteopetrosis	1	0	1
<b>Sum group 2</b>	<b>5</b>	<b>6</b>	<b>11</b>
Group 3			
Thalassemia	11	13	24
MDS after Bone Marrow Transplant	1	1	2
<b>Sum group 3</b>	<b>12</b>	<b>14</b>	<b>26</b>
<b>Overall Sum</b>	<b>24</b>	<b>20</b>	<b>44</b>

Disease patterns and number of participants in different groups, split by the reason for iron overload. Group 1: diseases with increased gastrointestinal iron resorption, but not receiving blood transfusions; group 2: transfusion-dependent anemias with only marginally increased iron resorption; and group 3: diseases requiring transfusion, but also cause increased iron resorption.

Krankheitsbilder und Anzahl der Teilnehmer in verschiedenen Gruppen, aufgeteilt nach dem Grund der Eisenüberladung. Gruppe 1: Erkrankungen mit erhöhter gastrointestinaler Eisenresorption, die jedoch keine Bluttransfusionen erfordern; Gruppe 2: transfusionsabhängige Anämien mit nur geringfügig erhöhter Eisenresorption; und Gruppe 3: Erkrankungen, die eine Transfusion erfordern, aber ebenfalls eine erhöhte Eisenresorption zur Folge haben.

## 4. Discussion

Liver iron content determination by MRI is widely used today [2, 5, 11–19]. The volumetric acquisition of the liver in a single breath hold and the inline generation of  $R_2^*$  maps represent a decisive progress. We used contiguous imaging of the whole liver to analyze segmental  $R_2^*$  distribution.

Volumetric evaluation offers an innovative view on the mechanism of hepatic iron accumulation by segmental analysis. It worked well despite limited specific software features for MRI data analysis. Iron overload was studied segment by segment pre-

viously, but based on MRI data acquired only in a few slices, with one ROI placed in each segment [20]. The lower relative  $R_2^*$  value of segment 1, also called the caudate lobe, compared to the total liver found here is most likely caused by its special vascular supply.  $R_2^*$  differences in the other segments may also be caused by different blood flow in various portal vein segments, originating from vessel curvature and diameter, causing some segmental  $R_2^*$  differences to be significant, while others are not. Also, outliers, which have a high influence due to small patient numbers, may influence the significance of differences.

The caudate lobe represents a physiologically distinct liver segment that has its own arterial and venous vessel system unlike the rest of the liver parenchyma. Physiologists, therefore, often consider it to be an independent lobe, which is supplied arterially via both the right and left hepatic artery. The venous drainage of the caudate lobe occurs via separate veins (Spiegelheins) directly into the vena cava caudal to the venous star [21]. For this reason, the increased gastrointestinal iron absorption in the majority of diseases in our patient population could have less impact on this segment which may explain the lower  $R_2^*$  in the caudate lobe observed in all disease patterns, as well as the smaller differences between S1 and other segments in the group with a lower average  $R_2^*$ . It may be of interest that a special vessel situation has previously served as explanation for the aberrant fat content of S4 [22].

To account for the variety of average hepatic  $R_2^*$  values, we introduced the relative segmental values. Surprisingly, significant segmental  $R_2^*$  differences with respect to the caudate lobe were also found for actual  $R_2^*$  values. On the other hand, deviations of segmental  $R_2^*$  values from average whole-liver  $R_2^*$  values were lowest in segment 8.

Hernando et al. made sure to cover all segments in their recent ROI-based  $R_2^*$  analysis of volumetric data but did not address segmental differences [23].

Ghugre et al. found inhomogeneous hepatic iron deposition on different microscopic length scales [24]. Our results indicate non-uniform  $R_2^*$  distribution even on a larger scale, pointing to segmental differences in iron concentration. However, we were not able to judge whether there are compartments different from liver segments, but rather restricted our analysis to anatomical liver segments. Probably, a more sophisticated analysis approach like independent component analysis might reveal other functional hepatic subunits than anatomic segments.

$R_2^*$  differences between participant groups were significant in segments 3 to 5 and 7, but not in segment 1. Therefore, the special vascular supply and drainage of S1 did not play a role when comparing disease effects. The group with predominant resorption showed higher  $rR_2^*$  than the other groups in S3 to S4b. In S5 and S7, the opposite was observed, while not all differences were significant, c.f. ► **Table 3**. These deviations related to underlying diseases possibly point to previously unknown functional disparity of hepatic segments.

It has to be stated that  $R_2^*$  differences do not necessarily mean deviations in iron content since GRE sequences are more sensitive to aggregated than to dispersed iron [25]. Also, iron relaxivity was shown to depend on its oxygenation state, namely ferric vs. ferrous ions [26]. However,  $R_2^*$  deviations point to metabolic effects differing between segments and disease patterns whether they

► **Table 4** Relative and actual  $R_2^*$  values for disease groups in selected liver segments.

► **Tab. 4** Relative und tatsächlich gemessene  $R_2^*$ -Werte der Krankheits-Gruppen in einzelnen Leber-Segmenten.

	Whole liver	Segment 3	Segment 4a	Segment 4b	Segment 5	Segment 7
Relative $R_2^*$ (mean $\pm$ SD)						
Group 1	–	1.049 $\pm$ 0.055	1.056 $\pm$ 0.044	1.023 $\pm$ 0.068	0.970 $\pm$ 0.028	0.983 $\pm$ 0.052
Group 2	–	0.959 $\pm$ 0.11	0.982 $\pm$ 0.054	0.945 $\pm$ 0.091	1.006 $\pm$ 0.037	1.032 $\pm$ 0.0849
Group 3	–	1.015 $\pm$ 0.065	0.978 $\pm$ 0.033	1.002 $\pm$ 0.079	0.985 $\pm$ 0.067	1.050 $\pm$ 0.089
Significance for $rR_2^*$ differences (p)						
Group 1 vs. 2	–	0.033 *	0.0098 **	0.042 *	0.026 *	0.113
Group 1 vs. 3	–	0.252	0.002 **	0.66	0.113	0.035 *
Actual $R_2^*$ (mean $\pm$ SD)						
Group 1	168.6 $\pm$ 113	175.7 $\pm$ 114	178.2 $\pm$ 122	168.1 $\pm$ 103	162.8 $\pm$ 109	168.7 $\pm$ 121
Group 2	208.5 $\pm$ 149	199.9 $\pm$ 146	207.3 $\pm$ 156	196.3 $\pm$ 142	210.2 $\pm$ 149	213.3 $\pm$ 150
Group 3	143.4 $\pm$ 90	144.7 $\pm$ 89	141.2 $\pm$ 91	144.1 $\pm$ 89	142.5 $\pm$ 90	149.7 $\pm$ 97

Relative and actual  $R_2^*$  values in participant groups divided by disease for selected liver segments and significance of relative  $R_2^*$  values for differences between groups. Significant differences are marked by an asterisk. No significant differences were found between groups 2 and 3, and there were no significant differences between segments not mentioned here. There were no significant differences for actual  $R_2^*$  values, neither for the whole liver nor for segments.

Relative und tatsächliche  $R_2^*$ -Werte für ausgewählte Lebersegmente in den Patientengruppen unterteilt nach Krankheit sowie Signifikanz der Unterschiede der relativen  $R_2^*$ -Werte zwischen den Gruppen. Signifikante Unterschiede sind durch ein Sternchen gekennzeichnet. Zwischen den Gruppen 2 und 3 wurden keine signifikanten Unterschiede festgestellt, und auch zwischen den hier nicht aufgeführten Segmenten gab es keine signifikanten Unterschiede. Ebenfalls wurden bei den tatsächlichen  $R_2^*$ -Werten keine signifikanten Unterschiede gefunden, weder für die gesamte Leber noch für einzelne Segmente.

are caused by different iron concentrations or a different form or oxygenation state of the iron.

Liver segmentation, which is mandatory for whole-liver volumetric analysis, required time-consuming user interaction in our study. Supported by artificial intelligence, fully automatic segmentation already works reliably enough to enable quick whole-liver volumetric  $R_2^*$  analysis [27, 28]. Segmental analysis, however, might still be a challenge at the moment, whereas automated volumetric  $R_2^*$  determination has already been introduced.

The exclusion of datasets with insufficient image quality (Likert scores 3 and 4) does not mean that they were unsuitable for volumetric analysis. In order to evaluate feasibility, we wanted to minimize any factors probably affecting preliminary results. Since  $R_2^*$  maps were less influenced by sequence limitations than PDFF maps,  $R_2^*$  values could have been obtained in all patients with the volumetric approach, but probably while impairing consistency with respect to the ROI-based results.

The sequence used also provided MR-PDFF maps. A detailed presentation of results is beyond the scope of this paper. However, we would like to state that there are PDFF differences between segments which are not congruent to  $R_2^*$  differences (manuscript in preparation for submission).

#### 4.1 Limitations

The Liver Health software tool is intended for the evaluation of liver computed tomography data. For MRI liver investigations, a contrast-enhanced  $T_1$ -weighted sequence in the hepatobiliary phase is

recommended. Since contrast agent is not indicated for liver iron quantification, segmentation was performed on the native data.

Due to its small volume and the difficult definition of the lig. venosum, the segmentation of S1 was most critical. An intra-observer analysis (data not shown) yielded an  $r$  value of 0.75 for S1 (and S4b), whereas all other segments were more reliably segmented with  $r > 0.8$  for their volume. Regarding segmental  $R_2^*$ , however, the  $r$  values were  $> 0.9$  for all segments.

To determine the mean parenchymal  $R_2^*$ ,  $T_2^*$  values outside manually defined thresholds were systematically excluded in our approach. A maximum  $T_2^*$  value of 50 ms was helpful for the elimination of large vessels, but small vessels could not be handled with this approach because of partial volume effects. Therefore, our results might be influenced by vessel density differing between hepatic segments. An adaptive threshold might be helpful in the future to improve the validity of results.

The inline fitting of the volumetric sequence that was used was a prototype version. In the meantime, the fitting procedure has been optimized to minimize errors like fat-water swaps [29]. First experiences with a new scanner (Magnetom SOLA, Siemens Healthcare GmbH) let us expect that fewer patients will be found to be unsuitable for analysis in the future.

$R_2^*$  analysis was performed in this study solely on patients suspected of having liver iron overload, but not on healthy subjects. It would be of interest to study  $R_2^*$  distribution also in healthy subjects and diseases different from conditions causing iron overload. Too few patients in our cohort had normal liver iron content, but



we were able to demonstrate that  $R_2^*$  distribution was similar in patients with an LIC below the therapy threshold compared to patients for whom therapy was required. The lack of significance for differences of  $rR_2^*$  values observed in S2–8 to S1 for subgroups A and B is probably caused by the small number of participants in these groups. Accordingly, we observed significant  $rR_2^*$  differences between segments only in the largest disease subgroup 3 containing 26 participants. Larger studies in healthy subjects might clarify whether relative  $R_2^*$  deviations have physiologic reasons or are caused by hematologic diseases.

Dividing patients according to deviating reasons for iron overload led to small subgroups except group 3. Probably due to the small number of patients, segmental relative  $R_2^*$  differences were not significant within these subgroups, while a consistent tendency was observed since S1 showed the lowest  $rR_2^*$  in all subgroups, whereas the largest  $rR_2^*$  value was observed in S7 for all subgroups except group 1 (increased iron absorption).

## 5. Conclusion

Despite all limitations, the suitability of the tested software for semi-automatic liver segmentation and division into segments based on volumetric MRI data was demonstrated.  $R_2^*$  values determined for the whole liver have the advantage of higher reliability and better statistic power due to the larger number of voxels compared to data from individual ROIs drawn on a single slice. Moreover, the volumetric GRE sequence has significant potential beyond single-slice acquisition, e. g. less susceptibility to magnetic field inhomogeneities. Probable benefits of segmental  $R_2^*$  determination for the clinical routine should be evaluated with larger patient numbers.

### CLINICAL RELEVANCE

- In a volumetric analysis covering the whole liver, we were able to demonstrate that hepatic  $R_2^*$  values deviate between segments.
- Segment 7 shows the highest  $R_2^*$  except for disease group 1 (increased iron resorption) and should be avoided for LIC determination.
- To minimize sampling errors, segment 8 should be used for noninvasive hepatic iron quantification, since segment 8 shows the least deviations with respect to average whole-liver  $R_2^*$ .

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## Conflict of Interest

The Department of Diagnostic and Interventional Radiology has a master research agreement with Siemens Healthcare GmbH. This includes a research grant which gave us access to prototype (works-in-progress) sequences used in this study. Stephan Kannengießner is employee of Siemens Healthcare GmbH.

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