

Noise estimation for diffusion weighted MR image

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Aims and objectives

Diffusion weighted (Dw) magnetic resonance image (MRI) is used for analysis of tissue characterization, i.e., intravoxel incoherent motion [1]. Some reports have been published being demonstrated the analysis method, e.g., q -space-analyzed Dw MRI [2], diffusional kurtosis imaging [3], and modified tri-exponential analysis [4]. These most analysis methods have been required high- b -values data of Dw MRI. On the other hand, the signal intensity (SI) tends to become progressively lower as the b -value increases since long Stejskal-Tanner diffusion gradients prolong echo time (TE) [5].

MR images are visualized as magnitude images after applying a pulse sequences. The pulse sequences have reported various methods to improve image quality, e.g., signal-to-noise ratio (SNR), contrast, and imaging artifacts. Particularly, SNR assessment is important for image analysis not to occur systematic error. The noisy MRI data is indicated by Rician statistical distribution [6]. The correction scheme based on the Rician distribution were applied in low signal image analysis, R^{2*} estimation [7], and diffusion tensor imaging [8].

Thus, there might a possibility of evaluation of signal of high- b -value Dw MRI between some pulse sequences. To improve SNR on high- b -value Dw MR images, we developed to signal correction method of noise estimation using Rician probably distribution function (PDF).

Methods and materials

Correction method

Fig. 1 on page 5 shows an outline of signal correction methodology in our study. The probability density function (PDF) for the Rician distribution for the measured pixel intensity M is given by

$$P_M(M) = \frac{M}{\sigma^2} e^{-\frac{M^2 + A^2}{2\sigma^2}} I_0\left(\frac{A \cdot M}{\sigma^2}\right)$$

Fig. 8: Equation (1), Rician probability distribution function.

References: Health Biosciences, Tokushima University - Tokushima/JP

where A is the true pixel intensity, I_0 is the modified zeroth order Bessel function, μ is mean, and σ is the standard deviation (S.D.). When the SNR is high, the Rician distribution is approximated by Eq. (1) [6]:

$$P_M(M) \approx \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{(M - \sqrt{A^2 + \sigma^2})^2}{2\sigma^2}}$$

Fig. 9: Equation (2), Assumption of Rician probability distribution function as Gaussian distribution.

References: Health Biosciences, Tokushima University - Tokushima/JP Then, it was possible to reduce noise by using the following relationship [6]:

$$\tilde{A} = \sqrt{|M^2 - \sigma^2|}$$

Fig. 10: Equation (3), correction signal.

References: Health Biosciences, Tokushima University - Tokushima/JP

where \tilde{A} is the corrected SI. We applied equation (3) as correction scheme in Dw MR images.

Fig. 2 on page 5 shows schematic procedure for estimation of noise signal. True signal values were calculated using curve fitting of Rician distribution function from each Dw MR data. Then, we evaluated the correction factor μ between measured and estimation values of different imaging sequences. The correction factor μ were described as follows:

$$A = \mu \tilde{A}$$

Fig. 11: Equation (4), correction factor.

References: Health Biosciences, Tokushima University - Tokushima/JP

Then, we compared between phantom signal and background (BG) signal.

MR imaging

On a 1.5 T MR scanner system (Signa HDxt, GE Healthcare, Waukesha, WI, USA), Dw MR imaging data of sucrose (Suc) samples (10, 30, and 50 wt%) were acquired. Different imaging sequences of single shot echo-planer imaging (SS-EPI) and dual spin-echo EPI (DSE-EPI) were performed with multi b -values (0 - 7000 s/mm²). Table 1 shows detailed imaging parameters. All imaging analysis were applied by using an in-house program from MATLAB (MathWorks, Natick, MA, USA).

Table 1 Imaging parameters of Dw MRI in our study

Imaging parameters	Setting values
Sequences	SS-EPI & DSE-EPI
b -values [s/mm ²]	0#20#200#500#1000#2000#3000#4000#4500#5000#5500#6000#6500#7000
TR/TE [ms]	5000/129
Slice thickness [mm]	10
FOV [cm ²]	12.8 × 6.4
Band width [Hz/ pixel]	166.7

Images for this section:

Signal correction method

Rician distribution

H.Gudbjartsson, S.Patz. *Magn Reson Med*, 1995

$$P_M(M) = \frac{M}{\sigma^2} e^{-\frac{M^2+A^2}{2\sigma^2}} I_0\left(\frac{A \cdot M}{\sigma^2}\right) \dots(1)$$

A: true signal intensity
M: measured signal intensity
 σ : standard deviation
 I_0 : zeroth order Bessel function

if SNR \gg ,

$$P_M(M) \approx \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{(M-\sqrt{A^2+\sigma^2})^2}{2\sigma^2}} \dots(2)$$

Assumption:
Gaussian distribution

$$\therefore \tilde{A} = \sqrt{|M^2 - \sigma^2|} \dots(3)$$

\tilde{A} : correction signal intensity

Fig. 1: Outline of signal correction methodology with Rician distribution in our study.

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Noise estimation procedure

1. Region of interest (ROI) settings SI measurement in Dw MRI, i.e., signal M and S.D. σ .
2. True signal A calculated from curve fitting of Rician distribution function.

$$P_M(M) = \frac{M}{\sigma^2} e^{-\frac{M^2+A^2}{2\sigma^2}} I_0\left(\frac{A \cdot M}{\sigma^2}\right)$$

3. Correction signal \tilde{A} calculated from

$$\tilde{A} = \sqrt{|M^2 - \sigma^2|}.$$

4. Correction factor μ were evaluated.

$$A = \mu \tilde{A}$$

5. Comparison of relation between phantom signal and background (BG) signal.

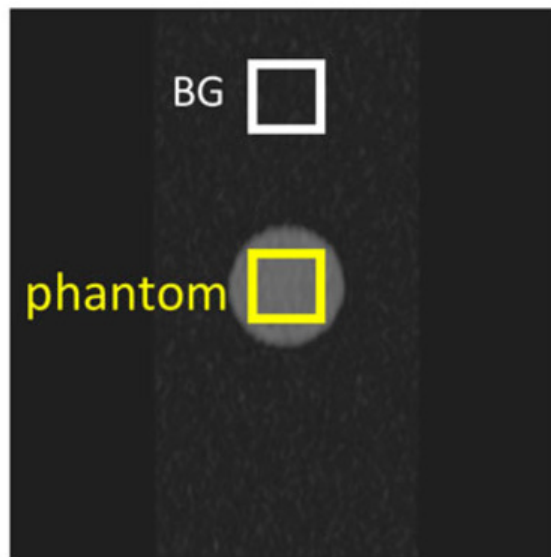


Fig. 2: Schematic noise estimation procedure.

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Results

Fig. 3 on page 8 shows relation between b -value and correction factor in Dw MRI of SS-EPI. Mean correction factors of SS-EPI data were Suc 10 wt%, 0.99; Suc 30 wt%, 1.00; and Suc 50 wt%, 1.00.

Fig. 4 on page 9 shows relation between b -value and correction factor in Dw MRI of DSE-EPI. Mean correction factor of DSE-EPI data were Suc 10 wt%, 0.99; Suc 30 wt%, 0.98; and Suc 50 wt%, 1.00. At these high values, the ratio of mean signal value to standard deviation value, i.e., SNR were all less than 3.

Fig. 5 on page 9 shows poor correction case of 10 wt % sucrose SS-EPI Dwi MRI. Fig. 6 on page 10 shows poor correction case of 10 wt % sucrose DSE-EPI Dwi MRI. Fig. 7 on page 11 shows poor correction case of 30 wt % sucrose DSE-EPI Dwi MRI. In all poor correction case, these indicated that SNRs of phantom were lower value than BG.

Images for this section:

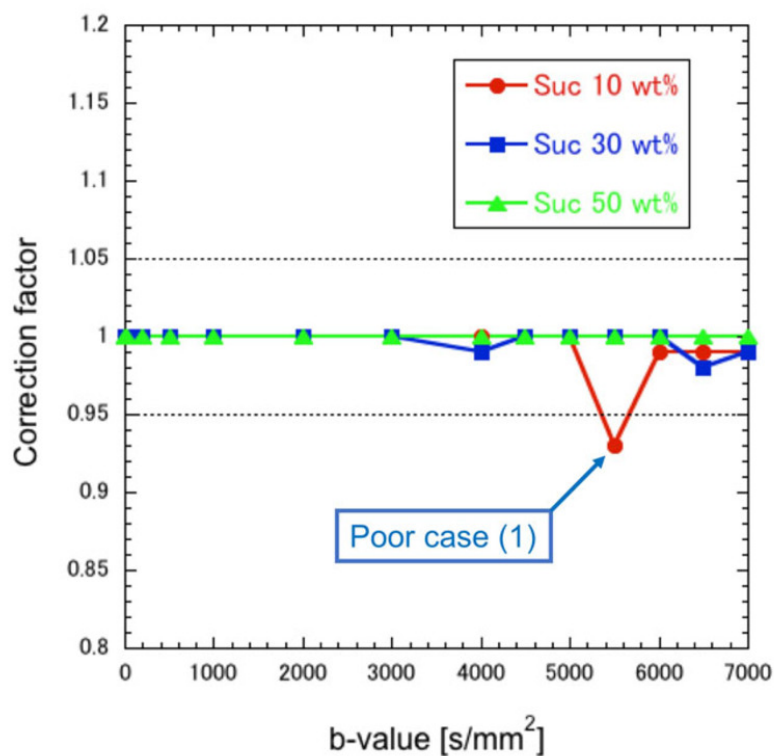


Fig. 3: Scatter Plots shows relation between each b -value and correction factor in Dw MRI of SS-EPI.

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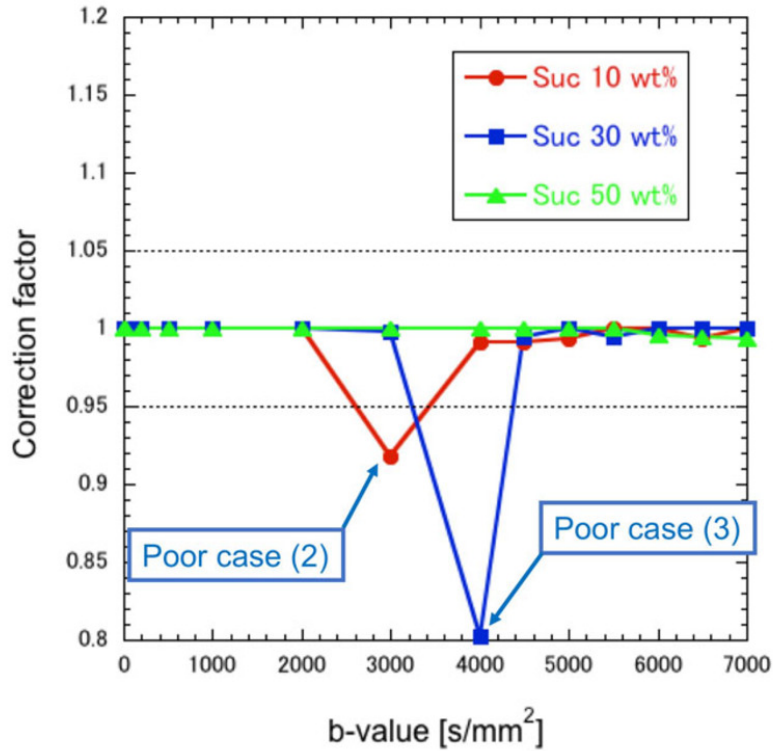


Fig. 4: Scatter Plots shows relation between b -value and correction factor in Dw MRI of DSE-EPI.

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Poor case (1): 10wt% Suc SS-EPI Dw MR image

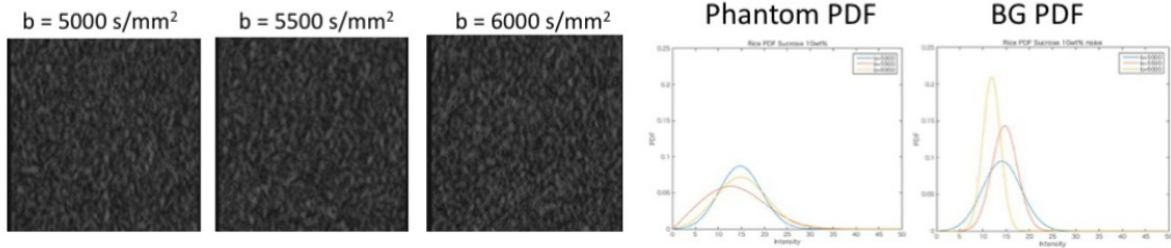


Table. Signal to σ ratio

b-values [s/mm ²]	Phantom			BG		
	M/σ	A/σ	\hat{A}/σ	M/σ	A/σ	\hat{A}/σ
5000	3.1	3.0	3.0	3.3	3.1	3.1
5500	1.8	1.4	1.5	5.3	5.1	3.0
6000	2.6	2.4	2.4	6.3	6.2	6.7



Noise level was lower SNR of phantom than BG.

Fig. 5: Poor correction case of 10 wt% sucrose SS-EPI Dwi MRI. The correction factor indicated 0.93 at b -value = 5500 s/mm².

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Poor case (2): 10wt% Suc DSE-EPI Dw MR image

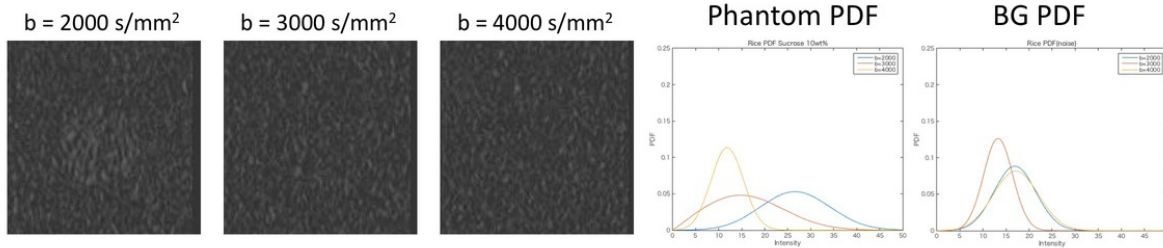


Table. Signal to σ ratio

b-values [s/mm ²]	Phantom			BG		
	M/σ	A/σ	\hat{A}/σ	M/σ	A/σ	\hat{A}/σ
2000	3.5	3.3	3.3	3.5	3.6	5.3
3000	1.7	1.3	1.4	4.0	3.9	2.9
4000	3.3	3.1	3.2	3.3	3.1	2.2



Noise level was lower SNR of phantom than BG.

Fig. 6: Poor correction case of 10 wt% sucrose DSE-EPI Dwi MRI. The correction factor indicated 0.92 at b -value = 3000 s/mm².

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Poor case (3): 30wt% Suc DSE-EPI Dw MR image

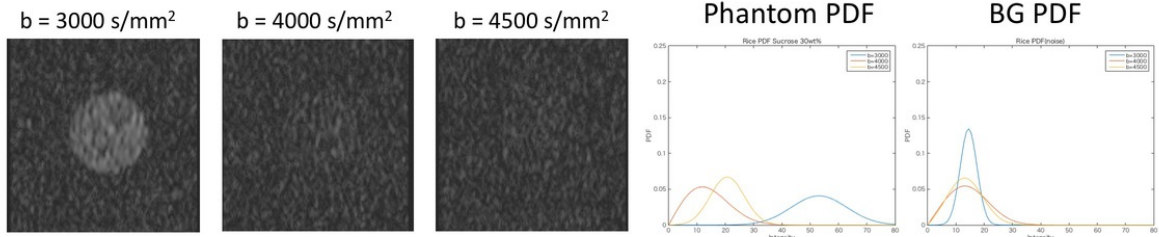


Table. Signal to σ ratio

b-values [s/mm ²]	Phantom			BG		
	M/σ	A/σ	\hat{A}/σ	M/σ	A/σ	\hat{A}/σ
3000	5.4	5.3	5.3	4.8	4.7	17.1
4000	1.5	0.9	1.1	1.7	1.3	0.5
4500	3.4	3.2	3.3	2.1	1.8	2.9



Noise level was lower SNR of phantom than BG.

Fig. 7: Poor correction case of 30 wt% sucrose DSE-EPI Dwi MRI. The correction factor indicated 0.80 at b -value = 4000 s/mm².

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Conclusion

Signal correction method of noise estimation with Rician PDF makes it possible to obtain more detailed information on DW MR image having high- b -values.

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