

# DirECT Complex signAl Fitting (DECAF) for multi-compartment analysis in white matter

Yoonho Nam<sup>1</sup>, Dong-Hyun Kim<sup>2</sup>, and Jongho Lee<sup>1</sup>

<sup>1</sup>Department of Electrical and Computer Engineering, Seoul National University, Seoul, Korea, <sup>2</sup>Department of Electrical and Electronic Engineering, Yonsei University, Seoul, Korea

**Target audience:** Researchers interested in multi-compartment analysis in white matter or quantitative myelin imaging.

**Purpose:** Recent studies have demonstrated that signals from three water compartments-myelin, axonal, and extracellular water-in white matter have different  $B_0$  orientation dependent frequency offsets<sup>1-4</sup>. This observation improved data fitting results in GRE-based MWI by using complex signal fitting as compared to magnitude signal fitting<sup>2,5</sup>. However, the complex signal fitting approaches applied in the previous studies<sup>1,3,4</sup> required several pre-processing steps including a nonlocal background field removal step. Therefore, the results were strongly influenced by them. In this study, we propose a new fitting method that does not require a prior background field removal step. This method shows improvement in parameter estimation.

**Methods:** The three pool complex signal is modeled as follow:

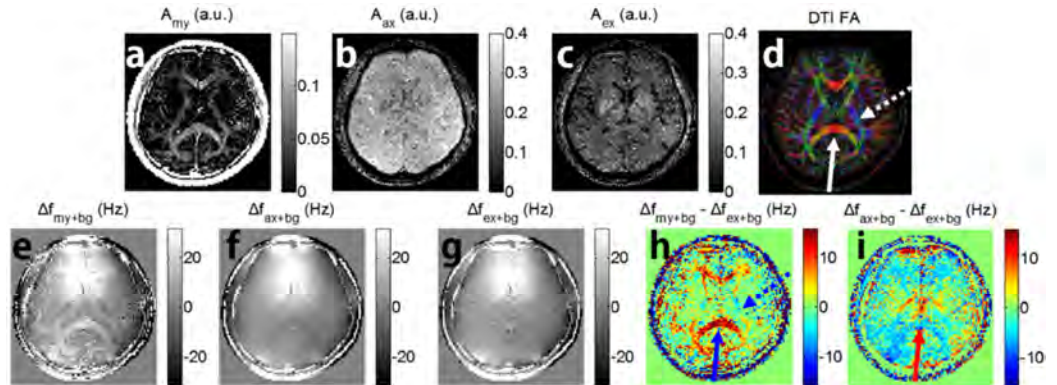
$$S(t) = (A_{my}e^{-(1/T_{2,my}^* + i2\pi\Delta f_{my})t} + A_{ax}e^{-(1/T_{2,ax}^* + i2\pi\Delta f_{ax})t} + A_{ex}e^{-(1/T_{2,ex}^* + i2\pi\Delta f_{ex})t})e^{-(i2\pi\Delta f_{bg})t}e^{-i\phi_0},$$

where  $A_i$ ,  $T_{2,i}^*$ ,  $\Delta f_i$ : relative amplitude, relaxation time, and frequency offset of each compartment ( $i = my$ : myelin,  $ax$ : axonal, and  $ex$ : extracellular water),  $\Delta f_{bg}$ : nonlocal background frequency offset,  $\phi_0$ : a phase offset from transmit  $B_1$ . In the previous studies<sup>1,3,4</sup>, the background frequency and phase offset terms ( $\Delta f_{bg}$  and  $\phi_0$ ) were estimated and removed before data fitting. In our method, these terms were estimated during the fitting as follows: First,  $\Delta f_{bg}$  was merged into the frequency offset terms of each pool ( $S(t) = (A_{my}e^{-(1/T_{2,my}^* + i2\pi\Delta f_{my+bg})t} + A_{ax}e^{-(1/T_{2,ax}^* + i2\pi\Delta f_{ax+bg})t} + A_{ex}e^{-(1/T_{2,ex}^* + i2\pi\Delta f_{ex+bg})t})e^{-i\phi_0}$  where  $\Delta f_{my+bg} = \Delta f_{my} + \Delta f_{bg}$ ,  $\Delta f_{ax+bg} = \Delta f_{ax} + \Delta f_{bg}$ , and  $\Delta f_{ex+bg} = \Delta f_{ex} + \Delta f_{bg}$ ). Then, this new model

was fitted to complex data using an iterative non-linear curve fitting algorithm (*lsqnonlin* in MATLAB). The initial values and ranges for the fitting parameters are listed in Table 1. After estimating all parameters,  $\Delta f_{my}$  and  $\Delta f_{ax}$  were approximated by  $\Delta f_{my+bg} - \Delta f_{ex+bg}$  and  $\Delta f_{ax+bg} - \Delta f_{ex+bg}$ , respectively. These approximations were supported by a recent observation that the frequency offset of the extracellular water pool is close to zero<sup>4</sup>. Eleven volunteers (IRB-approved) were scanned at 3T (Siemens). A 3D GRE was acquired with following parameters: TR = 120 ms, # echoes = 32, TE<sub>1</sub> = 2.1 ms, ΔTE = 1.9 ms, flip angle = 30°, BW = 1502 Hz/px, 2 mm isotropic voxel, and 72 slices. DTI was acquired. For comparison, the fitting was also performed for complex data with high-pass filtered phase with different kernel sizes (Gaussian;  $\sigma = 2, 4, 8$  mm).

	Myelin water (my)			Axonal water (ax)			Extracellular water (ex)			Offset
	$A_{my}$ (a.u.)	$T_{2,my}^*$ (ms)	$\Delta f_{my+bg}$ (Hz)	$A_{ax}$ (a.u.)	$T_{2,ax}^*$ (ms)	$\Delta f_{ax+bg}$ (Hz)	$A_{ex}$ (a.u.)	$T_{2,ex}^*$ (ms)	$\Delta f_{ex+bg}$ (Hz)	$\phi_0$ (rad)
Initial value	$0.1 \times  S_I $	10	$\Delta f_{bg,init}$	$0.6 \times  S_I $	64	$\Delta f_{bg,init}$	$0.3 \times  S_I $	48	$\Delta f_{bg,init}$	$\angle S_I$
Lower bound	0	3	$\Delta f_{bg,init} - 75$	0	24	$\Delta f_{bg,init} - 25$	0	24	$\Delta f_{bg,init} - 25$	$-\pi$
Upper bound	$2 \times  S_I $	24	$\Delta f_{bg,init} + 75$	$2 \times  S_I $	150	$\Delta f_{bg,init} + 25$	$2 \times  S_I $	150	$\Delta f_{bg,init} + 25$	$\pi$

**Table 1.** Initial values and search boundary.  $S_I = S(TE_1)$ .  $\Delta f_{bg,init} = \angle \{ \sum_{n=1}^{17} S_n^* S_{n+1} \} / (2\pi\Delta TE)$ : initial  $\Delta f_{bg}$ .

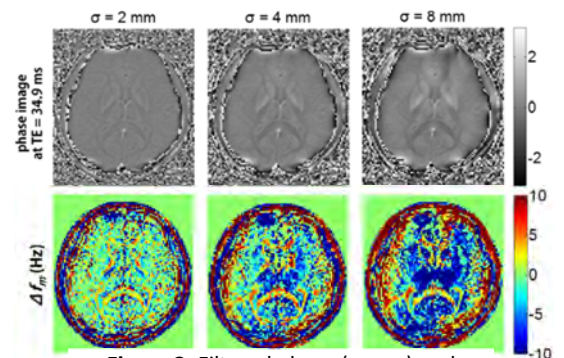


**Figure 1.** Estimated parameters using the proposed method

**Results:** Figure 1 shows the estimated parameters from the proposed complex signal model. Despite  $\Delta f_{bg}$  terms merged in each frequency offset maps (Fig. 1e, f, g), microstructural frequency contrasts are observable for the myelin and axonal water compartments. The approximated  $\Delta f_{my}$  map (Fig. 1h) indicates large positive values in the perpendicular fibers (solid blue arrow) and relatively small values in the parallel fibers (dashed blue arrow). In the approximated  $\Delta f_{ax}$  map (Fig. 1i), negative values are observed in the perpendicular fibers (solid red arrow). These contrasts are in accordance with those from the previous studies<sup>3,4</sup>. The results from the high-pass filtered phase data (Fig. 2) demonstrates that the background field estimation process has significant effects on the parameter estimation, which confirms the advantage of our new method.

**Discussion & Conclusion:** We demonstrated that the proposed method is effective in the multi-compartment analysis of complex GRE data. As shown in Figure 2, imperfect filtering before the model fitting leads to incorrect parameter estimation. Although more sophisticated processing may reduce these errors<sup>1,3,4</sup>, it still pertains residual errors that could be significant during the sensitive data fitting process.

**References:** 1. Schweser, ISMRM 2011, p4527; 2. Van Gelderen, MRM 67, 2012; 3. Wharton PNAS, 2012; 4. Sati, Neuroimage, 2013; 5. Nam, ISMRM 2014, p337



**Figure 2.** Filtered phase (upper) and  $\Delta f_{my}$  (lower) images