

## Blind Compressed Sensing-based Ultrafast Chemical Exchange Saturation Transfer (CEST) Imaging

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### Synopsis

**CEST imaging, such as amide proton transfer (APT) imaging, is a novel, clinically valuable molecular MRI technique that can give contrast due to a change in water signal caused by chemical exchange with saturated solute protons. However, its clinical translation is still limited by its relatively long scan time because a series of RF saturation frequencies are unavoidably acquired. Here, we present a highly accelerated CEST imaging technique (up to 10-fold) using a novel blind compressed sensing framework.**

### Introduction

Chemical exchange saturation transfer (CEST) imaging is a promising molecular MRI technique in which the contrast is caused by a change in water signal intensity due to chemical exchange with saturated solute protons (1). CEST imaging can detect many low-concentration biomolecules in tissue, such as proteins with amide proton transfer (APT) imaging (2), glycosaminoglycan using GagCEST (3), and glutamate using GluCEST (4), and has much potential in the clinic, such as detecting cancer (5-7), stroke (8,9), and Parkinson's disease (10). However, CEST MRI typically requires relatively long scan times, due to the use of multiple RF saturation frequencies, possible multiple acquisitions to increase SNRs, and a long RF saturation pulse (or multi-pulse train), thus limiting its clinical translation. Herein, as proof of principle, we demonstrated the feasibility of an ultrafast APT imaging (up to 10-fold) based on blind compressed sensing (BCS), which models the dynamic CEST signal as a weighted linear combination of temporal basis functions from a dictionary learned from the undersampled measurements (Fig. 1).

### Methods

Dynamic CEST signal recovery,  $y(x, w) = \sum U^*(x)V^*(w)$  was formulated as a constrained optimization problem (11):

$$[U^*, V^*] = \underset{U, V}{\operatorname{argmin}} [\|A(UV - b)\|_F^2 + \lambda_1 \|U\|_1], \text{ s. t. } \|V\|_F^2 < 1$$

where the criterion is a linear combination of data consistency term ( $b$ =undersampled data,  $A$ =undersampled Fourier encoding matrix with coil sensitivity) and sparsity-promoting  $l_1$  norm prior on spatial coefficient matrix  $U$ , subject to the Frobenius norm constraint on the dictionary  $V$ . The BCS model simultaneously estimates the sparse spatial coefficients  $U$  and the dictionary basis functions  $V$  from the undersampled k-space measurement  $b$ . To demonstrate the ability of the BCS algorithm, the computer model was implemented to mimic the APT experiment. The simulated phantom contains 9 compartments with different APT-pool concentrations, exchange rates, and semi-solid MT concentrations (water:  $w$ , APT:  $s$ , MT:  $m$ ,  $B_0/B_1=3T/2\mu T$ ,  $T_{\text{sat}}=5s$ ,  $T_{1w}/T_{2w}=1.4/0.1s$ ,  $T_{1s}/T_{2s}=1.4/0.05s$ ,  $T_{1m}/T_{2m}=1.4s/20\mu s$ ). For the in-vivo study, all healthy volunteers ( $N=2$ ) and patients ( $N=5$ ) were scanned on a Philips 3 T MRI scanner after informed consent was obtained in accordance with the IRB requirement. A fully sampled 2D CEST saturated images were acquired using a TSE sequence with an RF saturation time of 800ms, RF saturation frequency offsets (14 to -8 ppm at intervals of 0.5 ppm), and varied RF saturation power levels (0.5, 1, 1.5, 2  $\mu T$  for healthy volunteers and 2  $\mu T$  for tumor patients). The dynamic CEST data was retrospectively undersampled by the golden-angle ordering pattern along RF saturation frequency direction at acceleration  $R=2, 4, 10, 20$ , and 50. Water saturation shift-referencing (WASSR) data (26 frequency offsets

from 1.2 to -1.2 ppm at intervals of 0.125 ppm and a saturation power of 0.5 $\mu$ T) was acquired for  $B_0$  corrections (12). As previously used in (2), APT-weighted (APT<sub>w</sub>) images were quantified by  $MTR_{asym}(3.5\text{ppm})$ .

#### Results

Fig. 2 showed the BCS reconstructed APT images of the simulated phantom and the Z-spectrum comparison to the Nyquist sampled, low-resolution acquisition scheme. Accurate APT imaging was successfully achieved using the BCS reconstruction with acceleration factors up to 10. Fig. 3a compared brain APT<sub>w</sub> images of a typical healthy volunteer (with four different RF saturation powers) under full k-space and BCS acceleration factors of 10. Importantly, accurate BCS reconstructed APT<sub>w</sub> images without compromising image quality were achieved. The correlation and Bland-Altman analysis were performed to assess the bias and limit of agreement between the full k-space and BCS reconstructed APT<sub>w</sub> images (Fig. 3b). The BCS reconstructed APT<sub>w</sub> image had a high correlation with the full k-space reference image ( $r^2=0.95$  for  $R=10$ ), and the Bland-Altman analysis showed that the bias was significantly small (mean difference of 0.0019% and absolute values for the limits of agreement ( $\pm 1.96$  SD) of +0.69% ~ -0.72%). In the tumor patient study, the Gd-enhancing area (tumor core) on the  $T_1$ -weighted post-Gd image was hyperintense on the APT<sub>w</sub> image (Fig. 4). Again, the accurate APT<sub>w</sub> image was successfully reconstructed using the BCS algorithm with acceleration factors of up to 10-fold. The mean difference of APT<sub>w</sub> signals between the full k-space reference and BCS reconstructed images was only 0.15% and 0.09% for the normal (normal appearing white matter) and tumor region (Gd-enhanced tumor core), respectively.

#### Discussion and Conclusions

We have proposed and valuated a novel BCS-based, dynamic CEST MRI technique for clinical applications. Simulation and in-vivo experiments demonstrated the feasibility of such ultrafast CEST imaging with an acceleration factor up to 10. BCS-based APT imaging acquisition can significantly reduce the scan time and potentially has a wide range of clinical applications, particularly for pediatric patients.

#### Acknowledgements

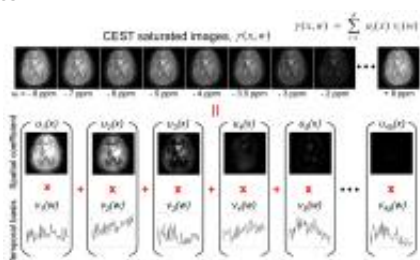
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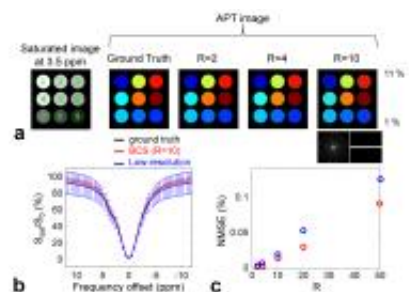
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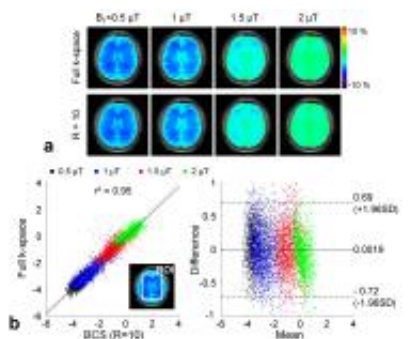
Figures



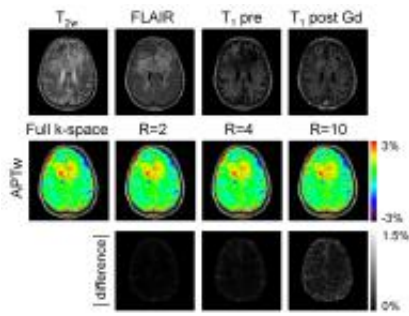
BCS model representation. CEST saturated images are decomposed as a linear combination of spatial weights  $u_i(x)$  and temporal basis functions in  $v_i(w)$ .  $x$  is the spatial locations (pixels) and  $w$  is saturation frequency measurements.



BCS reconstruction of the simulated phantom images. (a) BCS reconstructed APT maps with fully sampled (ground truth) and radial undersampled dataset. (b) corresponding Z-spectrum within the ROI (#3). (c) normalized mean square errors of the BCS and Nyquist sampled linear reconstruction with low-resolution sampling (centeric-ordered).



BCS reconstruction of healthy volunteer brain. (a) APTw images with four different RF saturation powers under full k-space and R of 10. (b) correlation plot and Bland-Altman plot to assess the bias and limit of agreement between full k-space and BCS reconstructed APTw images.



Conventional anatomical images, APTw images, and corresponding difference images with varied BCS acceleration factors for a representative patient with a glioblastoma. The APTw images show clear APTw hyper-intensity in the area of post-Gd enhancement (tumor core).

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