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Compressed sensing based ultrafast ultrasound imaging

UltrasoundToGo

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Introduction & Motivation

- The main objective of ultrafast ultrasound imaging techniques is to reach sufficiently high frame rate while keeping high image quality

Study of Contrast to Noise Ratio

RTD 2013

- Contrast to Noise Ratio (CNR) measured on synthetic phantoms.
 - Phantom generated using Field II software

- State-of-the art techniques:
 - Plane Wave imaging: Space based and Fourier based methods
 - Techniques based on focused beams at different depths



- Our approach explores reconstruction method based on the **Compressed** Sensing framework.
 - Plane wave imaging with Fourier based beamforming
 - \succ Sparse reconstruction algorithm to retrieve the image

Fourier beamforming poses an inverse problem

General scheme (Bernard et al., 2014)

 $s(x_i,t)$ \geq \geq \geq \geq \geq \geq \geq

 \succ Non-echogenic object at several depths (20 to 60 mm) CNR Comparison against state of the art methods





Figure 1. CNR comparison between the proposed method (magenta) and state-of-the-art methods.

CNR comparison on the synthetic phantom

Our method overcomes all the existing methods in terms of CNR

Reconstruction of carotid images

Ultrasound device:

Sonix MDP: sampling frequency 40 MHz ➢ Probe L14-5W: emission at 12 MHz, 128 transducers



We exploit the property that the images are sparse in a given basis Ψ . Using the I1 norm as the sparsity measure, we can reconstruct our signal using :

Acquisition: one plane wave parse Reconstruction method trasound Fourier Slice Beamforming -20 -15 -10 -5 0 5 -25 -20 -15 -10 -5 0 5 10 15 20 2 Lateral position [mm] Lateral position [mm] Carotid image – Our method Carotid image - Bernard method Conclusions **Fourier based** approach of the measurement model is presented **Sparse reconstruction** is used to solve the ill posed problem induced by the measurement model Yield a **Higher contrast** as all the state of the art existing methods by exploiting image sparsity in the wavelet domain Perform a **compressed acquisition**: Reaches same image quality as current method with only 3 insonifications (compression ratio of 28)

On-going work

 $\hat{\mathbf{r}} = \arg\min_{\overline{\mathbf{r}} \in \mathbb{C}^N} \|\Psi^{\mathsf{H}}\overline{\mathbf{r}}\|_1$ subject to $\|\mathbf{y} - \Phi\overline{\mathbf{r}}\|_2 \leq \epsilon$

- The selected basis Ψ is the undecimated wavelet basis
 - Best sparsity property

- Improve the measurement model (use of NUFFT)
- Lp regularization instead of L1 regularization
- Investigate new sensing schemes to reduce data rate
- Extension to sectorial and 3D imaging