### HARDI reconstruction workshop'12 Time: 09.04 - 09.16 (2<sup>nd</sup> May) **Propagator denoising in sparse** domains: is SWT a viable solution?

Team: NIPG 256 samples  $320 \le b \le 8000$ 

Ying-Chia Lin, Gloria Menegaz Department of Computer Science, University of Verona, Italy





## Multiscale Representations for ODF denoising in Diffusion Spectrum MRI



# **3D-wavelet & Thresholding**

- Wavelet: "shift, multiply and sum" technique ٠
- Using 3D-wavelet: decomposition/ reconstruction ٠
- Orthogonal /bi-orthogonal wavelet ٠
  - Daubechies, D4, D8
  - Cohen-Daubechies-Feauveau, CDF5/3
- Thresholding ٠

\*Hard Thresholding: is cruder, sets any coefficient less than or equal to the threshold to zero.

а.

$$S(x) = \begin{cases} x, |x| > T\\ 0, |x| \le T \end{cases}$$

\*Soft Thresholding: is wavelet shrinkage, subtracted from any coefficient that is greater than the threshold. This moves the time series toward zero.

$$S(x) = x \cdot max(1 - \frac{T}{|x|}, 0)$$

\*D95 (Donoho and Johnstone, 1995)



HARDI reconstruction workshop

\*Training data (Training\_IV.mat)

>>910 voxel, random angle (0-90 degree), FA (0.75-0.90), 10 different repetition (?)

\*Structure field (Training\_SF.mat) --> see figure 1.

>10x10, 2D-matrix, 4 fiber bundle,

\*additional structure field (Training\_3D\_SF.mat) --> see figure 2.

>16x16x5, 3D-matrix,



#### Training\_SF

**A.** SNR = 10



**C.** SNR = 30



**B.** SNR = 20



**D.** SNR = 40



SNR = 10

Training\_SF



3D-SWT

#### Mean value of KLD

	SNR 10	SNR 20	SNR 30	SNR 40
DSI	0.125	0.089	0.078	0.073
3D-SWT	0.103	0.061	0.051	0.047

#### % percentage of coefficient (3D-SWT)

%percentage				
of coefficient	SNR10	SNR20	SNR30	SNR40
Max	47.0902	18.4072	18.2714	17.8020
Min	18.4214	18.2714	17.8020	17.6114





HARDI reconstruction workshop :

\*Testing data (Testing\_3D\_SF.mat) --> see figure >16x16x5, 3D-matrix,



Testing\_SF

Slice (z=0)

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Testing\_SF

Slice (z=0)



Testing\_SF (SNR = 10) Slice (z=0)

DSI

3D-SWT

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Testing\_SF (SNR = 10) Slice (z=0)

DSI

3D-SWT

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### Propagator denoising in sparse domains: is SWT a viable solution?

- Optimal denoising solution:
  - D4:Daubechies family
  - L1: Single level decomposition
  - K10: 10 percentage of threshold
- For more info, please don't hesitate give me suggestion!!!
  - Time: Wednesday, 2 May , 15:30 17:00
  - Session: Image Acquisition and Reconstruction: Applications
  - Paper Code: WE-PO.PG.2
  - Paper Number: 2049
  - Title: MULTISCALE REPRESENTATIONS FOR ODF DENOISING IN DIFFUSION SPECTRUM IMAGING

## Thanks for your attention!!