# Sharp as a Tack

#### Measuring and Comparing Edge Sharpness in Motion Compensated Medical Image Reconstruction

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#### Introduction

- Motion during acquisition leads to blur unless compensated for.
- How to compare motion-compensated reconstructions?
- Non-linear, object-dependent reconstruction precludes MTF measurements.
- Typical approach: Estimate **edge sharpness** from line profile.

Figures

Figure 1. Schematic overview.

## Materials and Methods

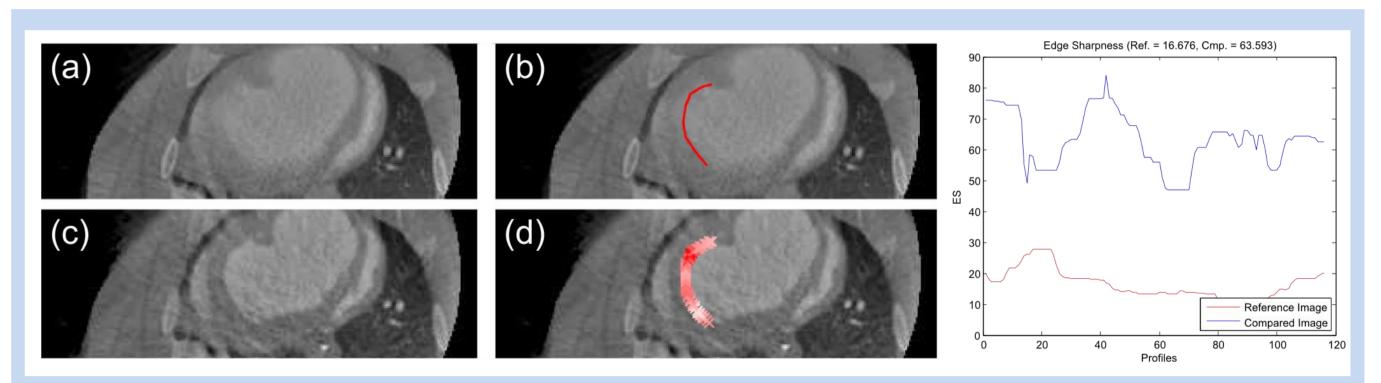
• **Problems with manual placement** of a single profile line:

Susceptibility to Noise	Susceptibility to Artifacts
Placement Bias	Mismatch Desired/Measured Entity

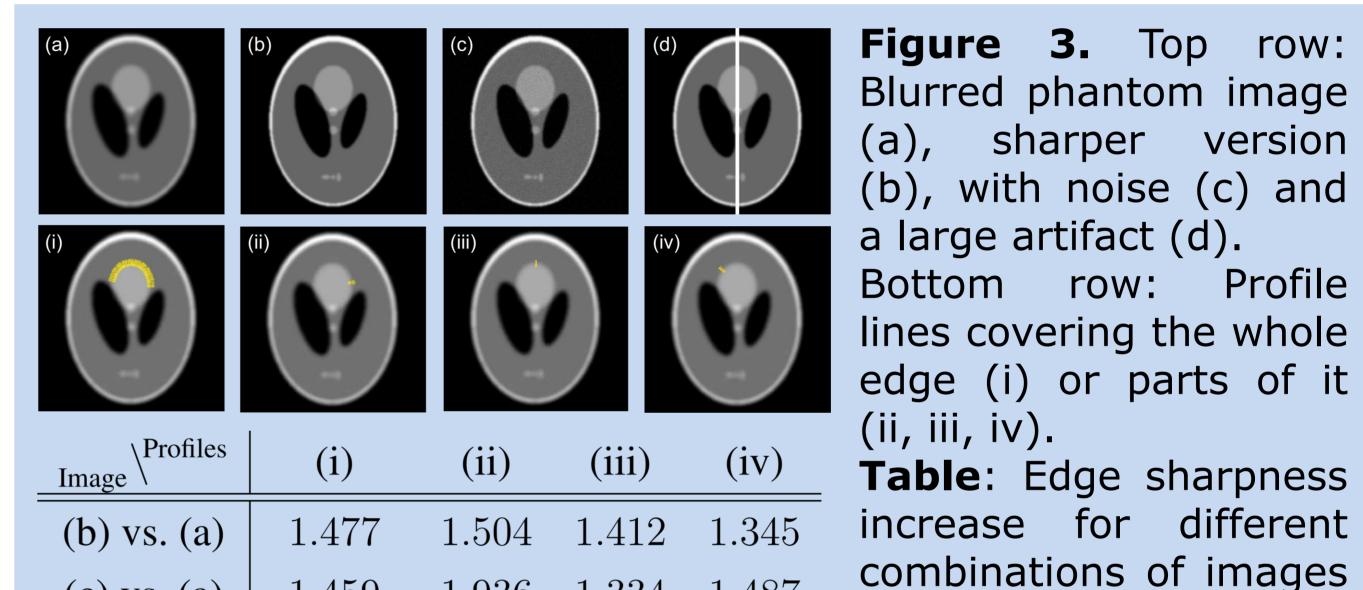
- Proposed: Semi-automatic evaluation of the whole edge using an ensemble of profile lines (Fig. 1).
  - Robust sharpness measure computed as median of profiles' least-square slope estimates:

$$\xi^{*} = \text{median}[\xi_{0}, \xi_{1}, \dots, \xi_{M-1}],$$
  
$$\xi_{\ell} = \frac{\text{cov}[\boldsymbol{s}_{\ell}, \boldsymbol{I}_{\ell}]}{\text{var}[\boldsymbol{s}_{\ell}]} = \frac{\sum_{i}(s_{\ell,i} - \frac{1}{N_{\ell}}\sum_{j}s_{\ell,j})(I_{\ell,i} - \frac{1}{N_{\ell}}\sum_{j}I_{\ell,j})}{\sum_{i}(s_{\ell,i} - \frac{1}{N_{\ell}}\sum_{j}s_{\ell,j})^{2}}$$

 $oldsymbol{s}_\ell, oldsymbol{I}_\ell$  are distances and intensities along profile line  $\ell$ .

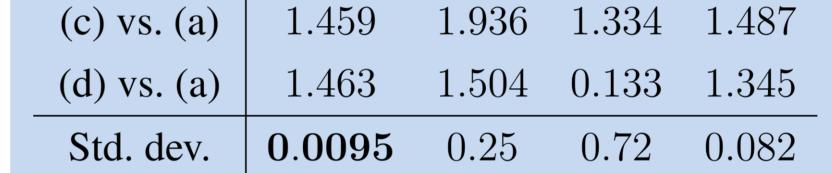


**Figure 2.** Top row: Motion-blurred image (a) and edge selected for comparison (b). Bottom row: Motion-compensated reconstruction (c) and edge sharpness increase (d).



- Alternatively, compare improvement visually (Fig. 2).
- Experiments:
  - Simple validation on a synthetic phantom (Fig. 3).
  - Cardiac motion-compensated C-arm CT of porcine models [1, 6] (Fig. 4).
  - **Respiratory motion-compensated** whole-heart coronary **MRI** of volunteers [2] (Fig. 5).
- Implementation available on our website:

http://www5.cs.fau.de/research/software/



and profie lines used to measure the sharpness.

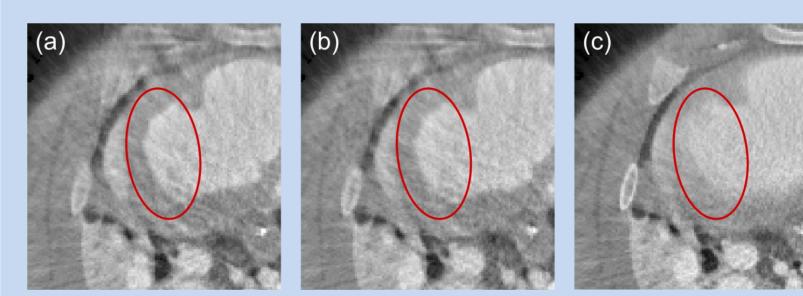


Image	Edge Sharpness	Expert Score
(a)	0.0402	$3.43 \pm 0.53$
(b)	0.0296	$2.14 \pm 0.69$
(c)	0.0114	$0.00 \pm 0.00$

**Figure 4.** Two motioncompensated C-arm CT images (a, b), uncompensated reconstruction (c). B-Spline based motion

estimation [7] performed with control point spacing of 8 mm (a) / 16 mm (b).

### **Results and Discussion**

 Phantom study results (table in Fig. 3): Influence of noise and artifacts reduced considerably.

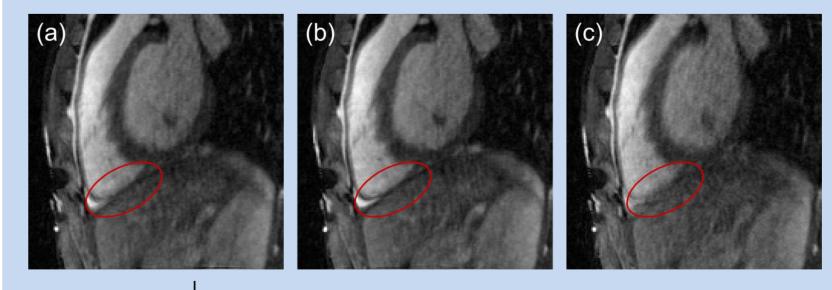


Image | Edge Sharpness Expert Score

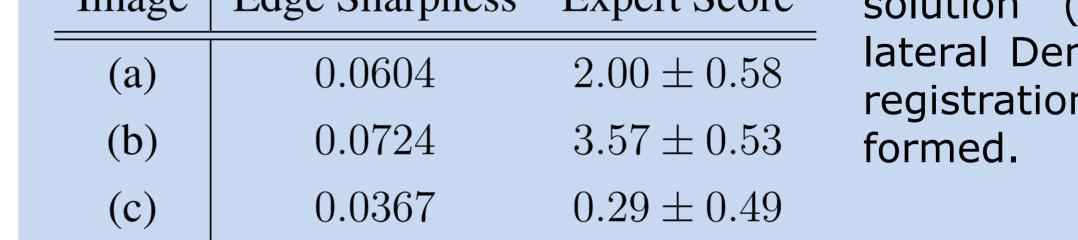
**Figure 5.** Two motioncompensated coronary MR images (a, b), uncompensated reconstruction (c). Demons at half re-

- Comparison with expert scores (N=7, scale from 0 to 4) for CT and MRI data (tables in Figs. 4 and 5): Agreement with visual impression.
- Limitation: Reconstruction methods enforcing sharp edges.
- Potential for improvement: Spline representation of edges, automatic edge pre-selection, different per-profile estimators.

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#### solution (a) and Bilateral Demons [8] (b) registrations were performed.

## References

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