

# Bin-Combination-Based Noise Reduction for Metal Artifact Reduction in Photon Counting CT

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# Motivation

- When using a photon counting (PC) detector, energy thresholds allow for spectral separation of data.
- Combined images can be constructed out of energy bin images e.g. via linear combinations,  $\alpha$ -blending:

$$f_{\alpha}(\mathbf{r}) = \alpha f_{\text{Bin1}}(\mathbf{r}) + (1 - \alpha) f_{\text{Bin2}}(\mathbf{r})$$

$\alpha_1 < 0$ : Low level of artifacts, low contrast-to-noise ratio (CNR)

$0 < \alpha_2 < 1$ : High level of artifacts, high CNR

Bin 1 (25-90) keV



Bin 2 (90-140) keV



Artifact-reduced  
 $\alpha_1 = -0.21$



CNR-maximized  
 $\alpha_2 = 0.81$



$C = 0$  HU  
 $W = 300$  HU

# Aim

To obtain a high CNR image with least artifacts.

## Prior work:

- [1] Yang et al., *Dual-energy CT Reconstruction using Guided Image Filtering*, 2016 IEEE Nuclear Science Symposium
- [2] Manhart et al., *Guided Noise Reduction for Spectral CT with Energy-Selective Photon Counting Detectors*, Proc. CT Meeting 2014:91–94
- [3] Müller et al., *Towards Material Decomposition on Large Field-of-View Flat Panel Photon-Counting Detectors — First in-vivo Results*, Proc. CT Meeting 2016:479–482
- [4] Li et al., *An effective noise reduction method for multi-energy CT images that exploits spatio-spectral features*, Med. Phys. 44(5):1610–1623, 2017
- [5] Allner et al., *Bilateral filtering using the full noise covariance matrix applied to x-ray phase-contrast computed tomography*, Phys. Med. Biol. 61(10):3867-3884, 2016

# Method

- Proposed method: guided bilateral filter

$$f_{\text{filt}}(\mathbf{r}) \propto \sum_{\rho \in R} \underbrace{f_{\alpha_1}(\rho)}_{\text{original image}} \underbrace{R_1(|f_{\alpha_1}(\rho) - f_{\alpha_1}(\mathbf{r})|)}_{\text{range kernel 1 intensity-dependent kernel}} \underbrace{R_2(|f_{\alpha_2}(\rho) - f_{\alpha_2}(\mathbf{r})|)}_{\text{range kernel 2 intensity-dependent kernel (guide)}} \underbrace{D(|\rho - \mathbf{r}|)}_{\text{domain kernel spatially-dependent kernel}}$$

filtered image

- The filter kernels  $R_1$ ,  $R_2$ , and  $D$  are chosen to be of truncated Gaussian shape with filter parameters  $\sigma_{r1}$ ,  $\sigma_{r2}$ , and  $\sigma_d$ .

Artifact-reduced  
 $\alpha_1 = -0.21$



CNR-maximized  
 $\alpha_2 = 0.81$



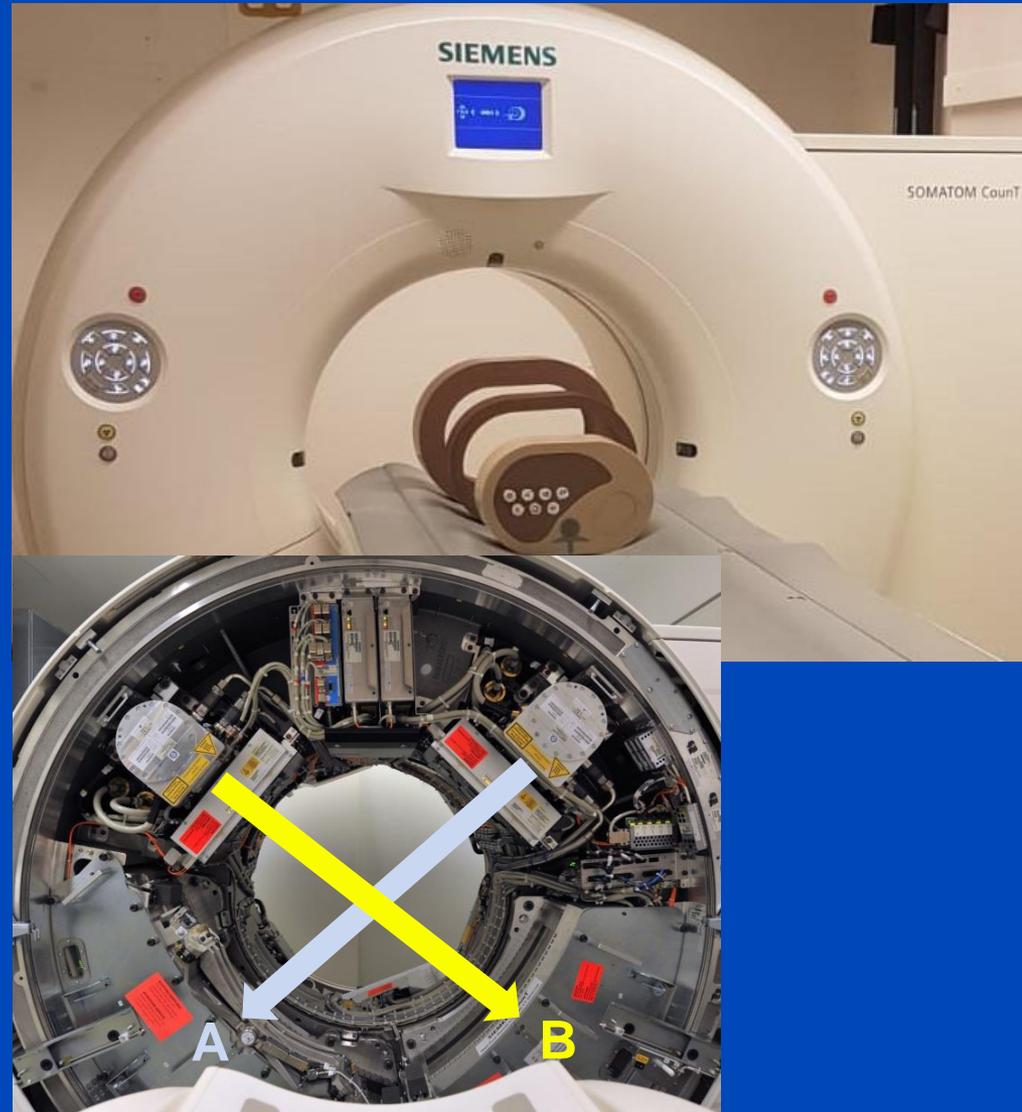
# CounT CT System at the DKFZ

Gantry from a clinical dual source scanner

- Ultra-high-resolution (UHR) mode with two energy thresholds (25 and 90 keV)
- Head scan of a human corpse with dental implants (140 kV, 150 mAs)
- Torso scan of a pig cadaver with manually inserted hip total endoprostheses (TEPs) (140 kV, 225 mAs)

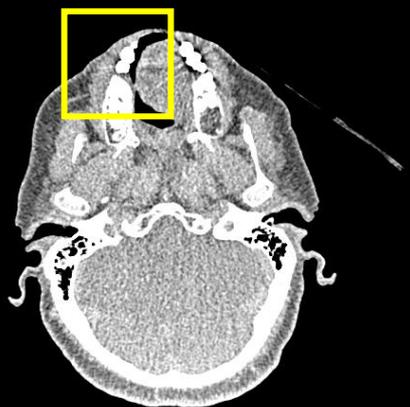
**A:** conventional CT detector (500 mm FOV)

**B:** Photon counting detector (275 mm FOV)

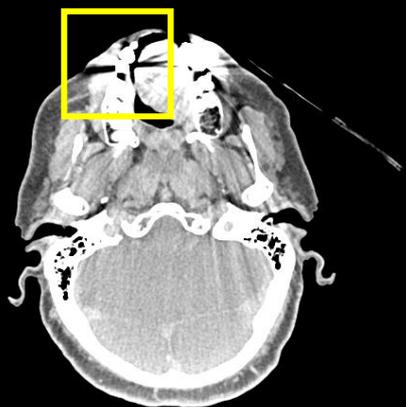


# Results: Reduced Artifacts with Improved CNR

**A)** Artifact-reduced  
 $\alpha_1 = -0.21$



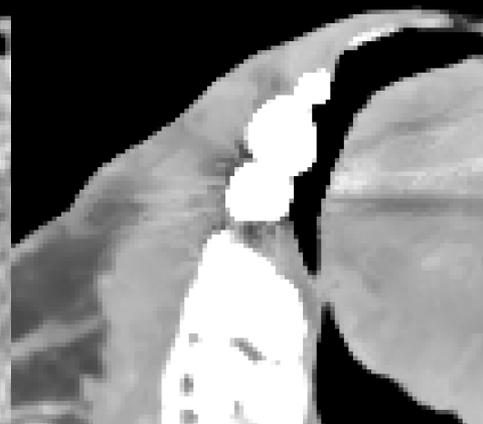
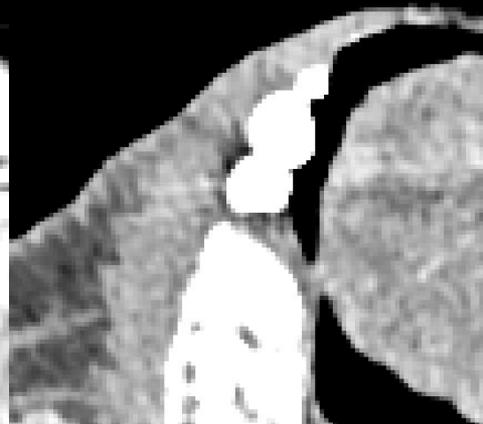
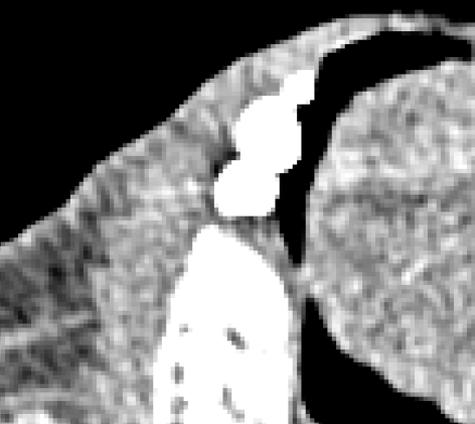
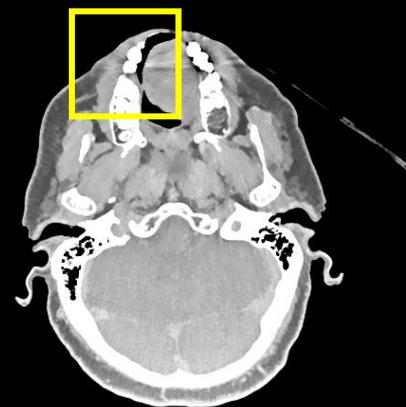
**B)** CNR-maximized  
 $\alpha_2 = 0.81$



Bilateral filtered **A)**  
(self-guided)



Proposed method  
on **A)** (guide: **B)**)



$\sigma_{r1} = 25$  HU  
 $\sigma_d = 4$  px

$\sigma_{r1} = 200$  HU  
 $\sigma_{r2} = 10$  HU  
 $\sigma_d = 4$  px

$C = 0$  HU,  $W = 300$  HU

# Results: Conservation of Spatial Resolution

**A)** Artifact-reduced  
 $\alpha_1 = -0.21$



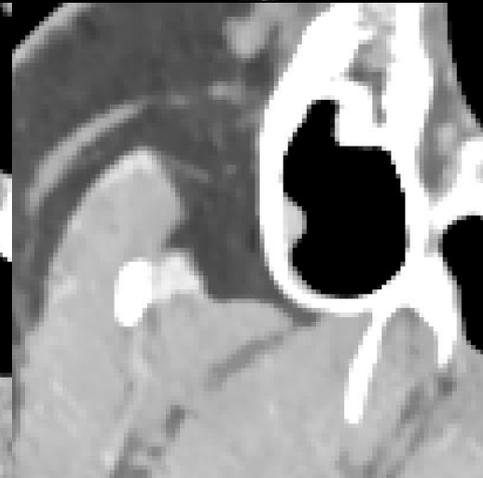
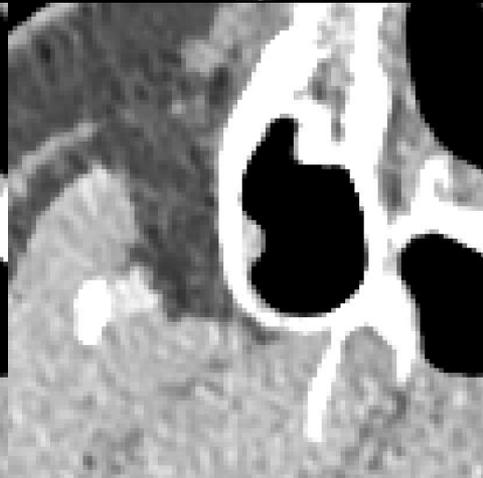
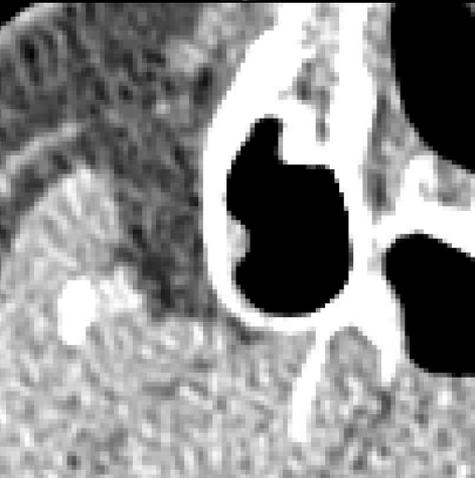
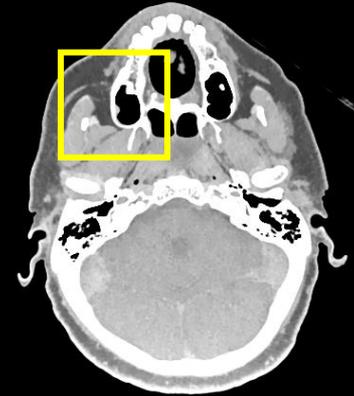
**B)** CNR-maximized  
 $\alpha_2 = 0.81$



Bilateral filtered **A)**  
(self-guided)



Proposed method  
on **A)** (guide: **B)**)



$\sigma_{r1} = 25$  HU  
 $\sigma_d = 4$  px

$\sigma_{r1} = 200$  HU  
 $\sigma_{r2} = 10$  HU  
 $\sigma_d = 4$  px

$C = 0$  HU,  $W = 300$  HU

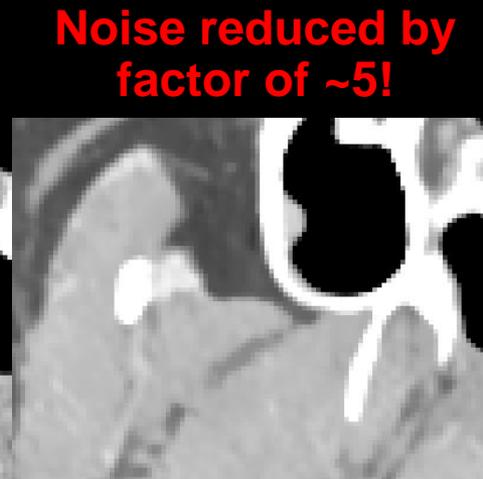
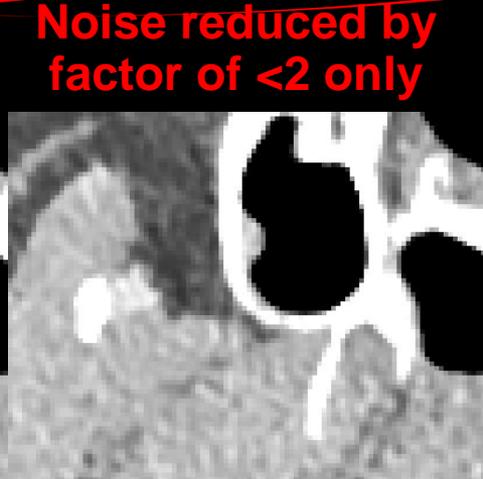
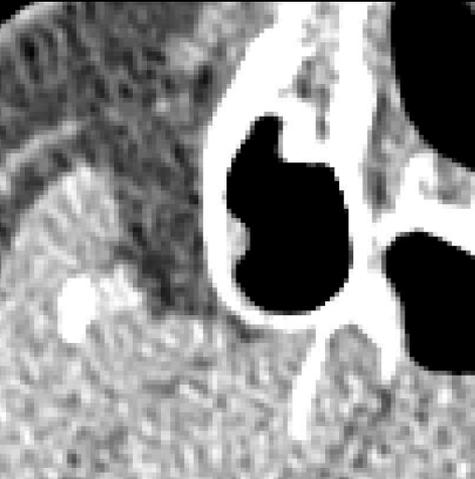
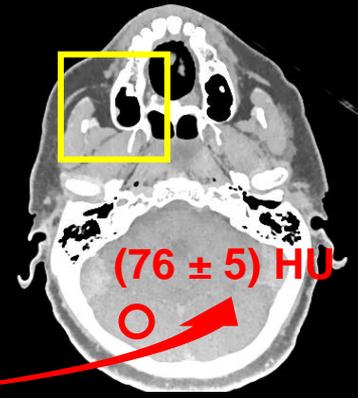
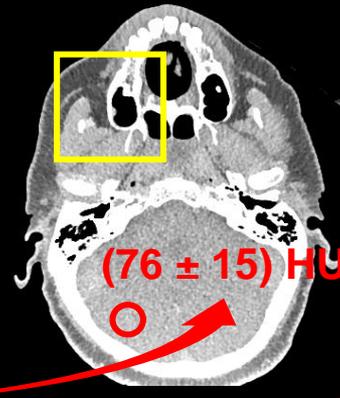
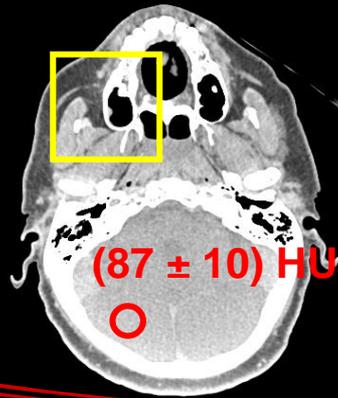
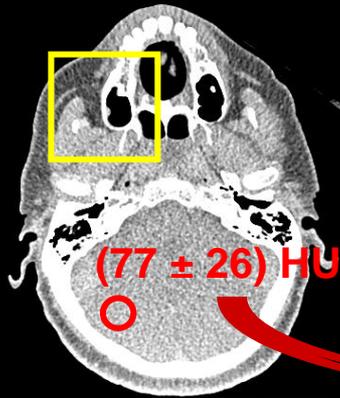
# Results: Comparison of Image Noise

**A) Artifact-reduced**  
 $\alpha_1 = -0.21$

**B) CNR-maximized**  
 $\alpha_2 = 0.81$

**Bilateral filtered A)**  
(self-guided)

**Proposed method on A)**  
(guide: B)



Noise reduced by factor of <2 only

Noise reduced by factor of ~5!

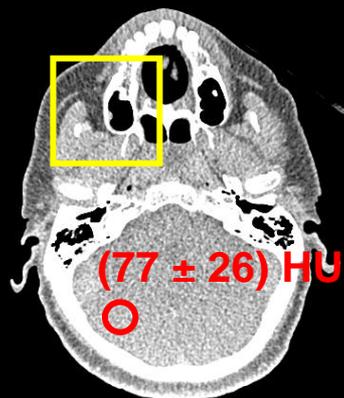
$\sigma_{r1} = 25$  HU  
 $\sigma_d = 4$  px

$\sigma_{r1} = 200$  HU  
 $\sigma_{r2} = 10$  HU  
 $\sigma_d = 4$  px

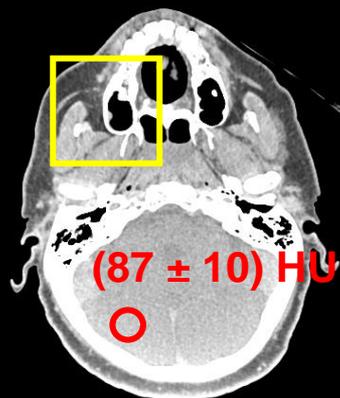
C = 0 HU, W = 300 HU

# Results: Self-Guided Filter at Same Noise Level

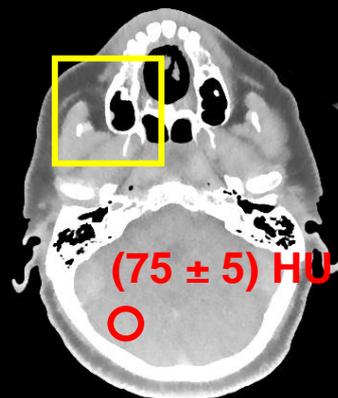
**A) Artifact-reduced**  
 $\alpha_1 = -0.21$



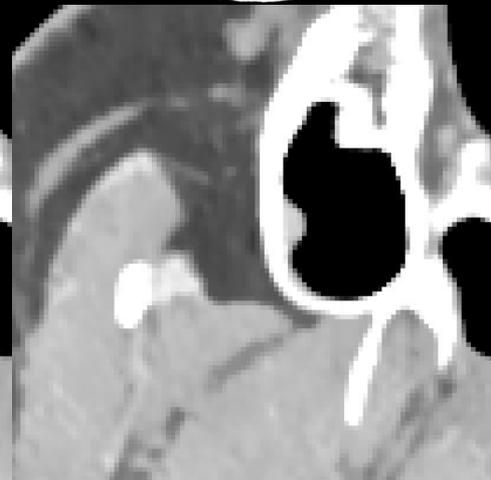
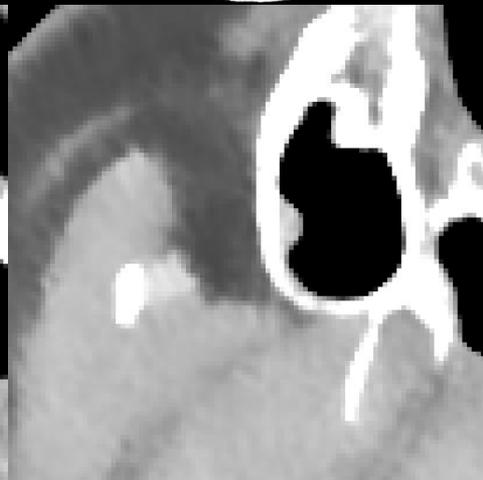
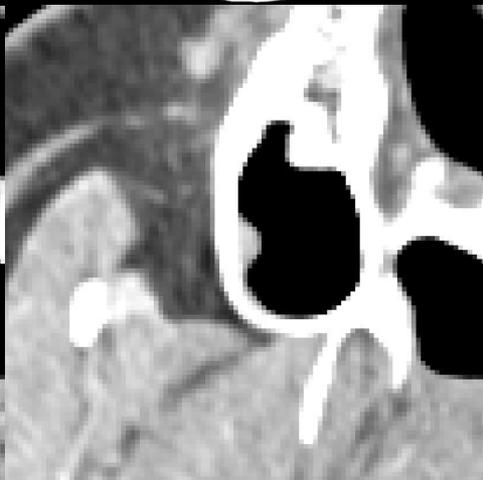
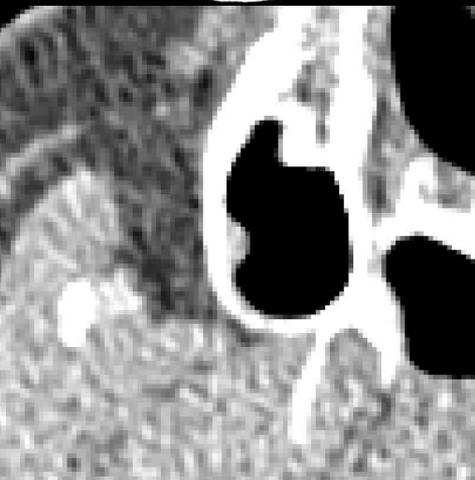
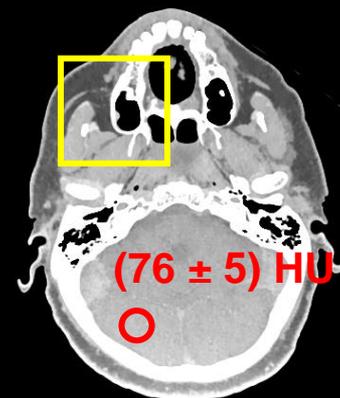
**B) CNR-maximized**  
 $\alpha_2 = 0.81$



**Bilateral filtered A)**  
(self-guided)



**Proposed method on A)**  
(guide: B)



$\sigma_{r1} = 75$  HU  
 $\sigma_d = 4$  px

$\sigma_{r1} = 200$  HU  
 $\sigma_{r2} = 10$  HU  
 $\sigma_d = 4$  px

C = 0 HU, W = 300 HU

# Results: Increasing Artifact and Noise Levels in the Pig Measurement

**A)** Artifact-reduced  
 $\alpha_1 = -0.20$

**B)** CNR-maximized  
 $\alpha_2 = 0.81$

Bilateral filtered **A)**  
(self-guided)

Proposed method  
on **A)** (guide: **B)**)

axial

coronal

sagittal

**Not shown due to time restriction.**

$\sigma_{r1} = 65$  HU  
 $\sigma_d = 4$  px

$\sigma_{r1} = 200$  HU  
 $\sigma_{r2} = 25$  HU  
 $\sigma_d = 4$  px

$C = 0$  HU,  $W = 300$  HU

# Conclusions

- A guided bilateral filter is a useful tool to combine the possible benefits of spectral data (high CNR, low amount of artifacts).
- Image noise could be reduced by a factor of 5 while a low level of metal artifacts and a high spectral resolution is maintained.
- This improvement of image noise can be traded for a reduction of patient dose.
- The method of is not limited to PC CT but can be used whenever aligned spectral data is available (e.g. dual energy CT).

# Thank You!

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This presentation is available at [www.dkfz.de/ct](http://www.dkfz.de/ct)

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