

Radiation Risk Minimizing Tube Current Modulation (rmTCM) for X-Ray Computed Tomography

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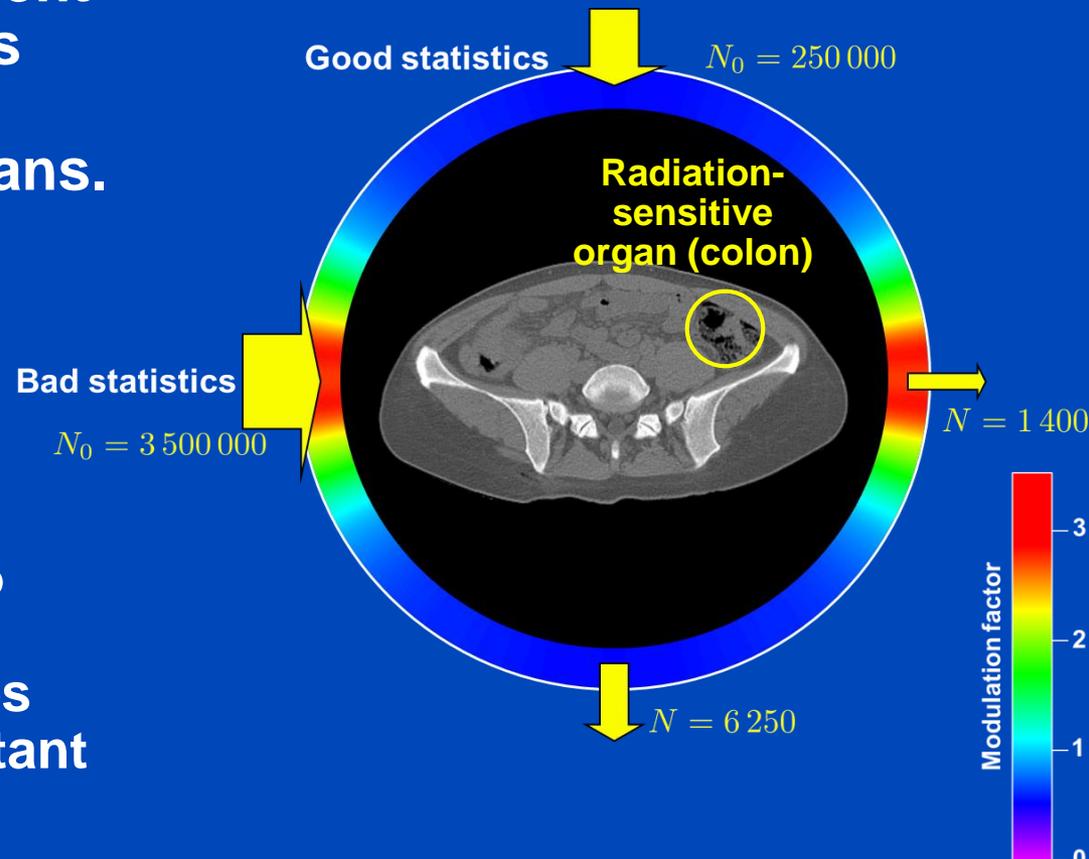
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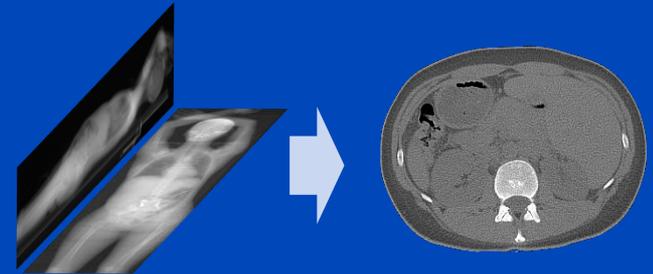
Motivation

- Tube current modulation (TCM) is a well-established tool to minimize x-ray dose while maintaining image quality.
- Conventional tube current modulation approaches do not account for (all) radiation-sensitive organs.
- Additional prior knowledge may enable more sophisticated approaches.
- Here: Use deep learning-based prior knowledge to perform a tube current modulation that minimizes the radiation risk at constant image quality.

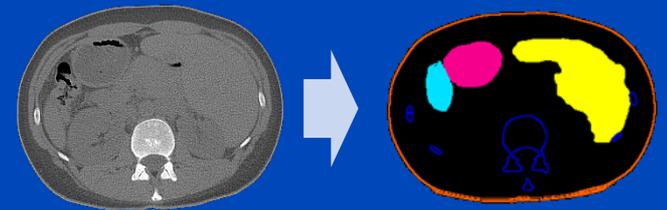


Radiation Risk Minimizing Tube Current Modulation (rmTCM) – Basic Workflow

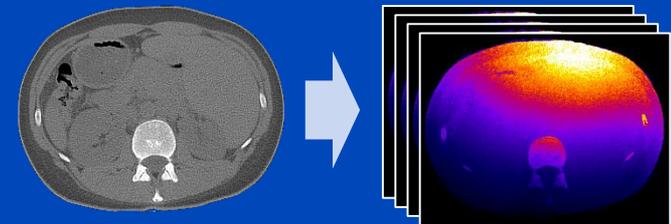
1. Coarse reconstruction from two scout views



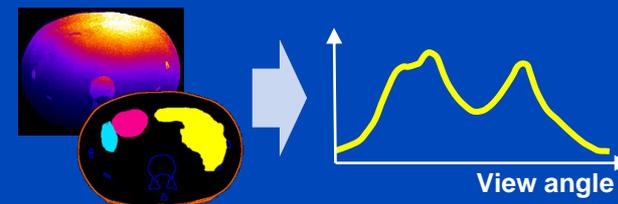
2. Segmentation of radiation-sensitive organs



3. Calculation of the effective dose per view using the deep dose estimation (DDE)



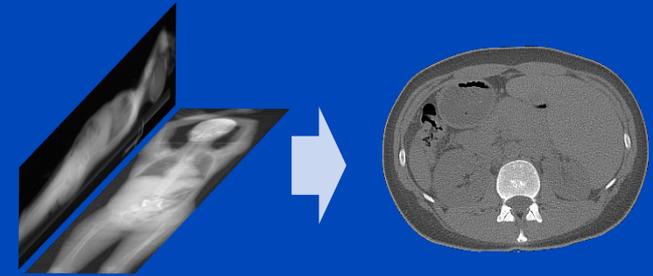
4. Determination of the tube current modulation curve that minimizes the radiation risk



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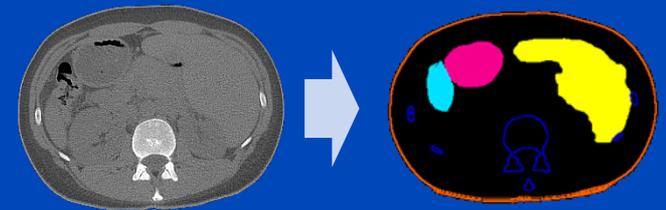
1. Coarse reconstruction from two scout views

X. Ying, et al., "X2CT-GAN: Reconstructing CT From Biplanar X-Rays With Generative Adversarial Networks," *CVPR 2019*

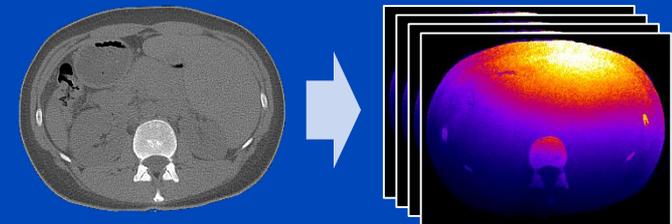


2. Segmentation of radiation-sensitive organs

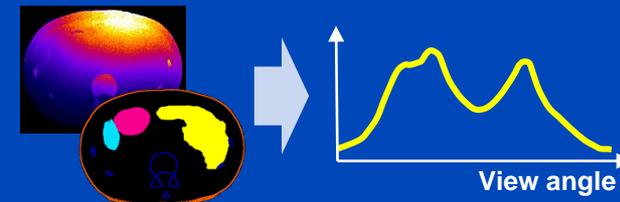
S. Chen, M. Kachelrieß et al., "Automatic multi-organ segmentation in dual-energy CT (DECT) with dedicated 3D fully convolutional DECT networks." *Med. Phys.* 2019



3. Calculation of the effective dose per view using the deep dose estimation (DDE)



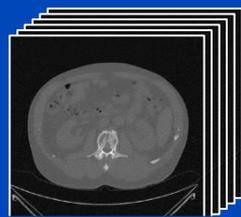
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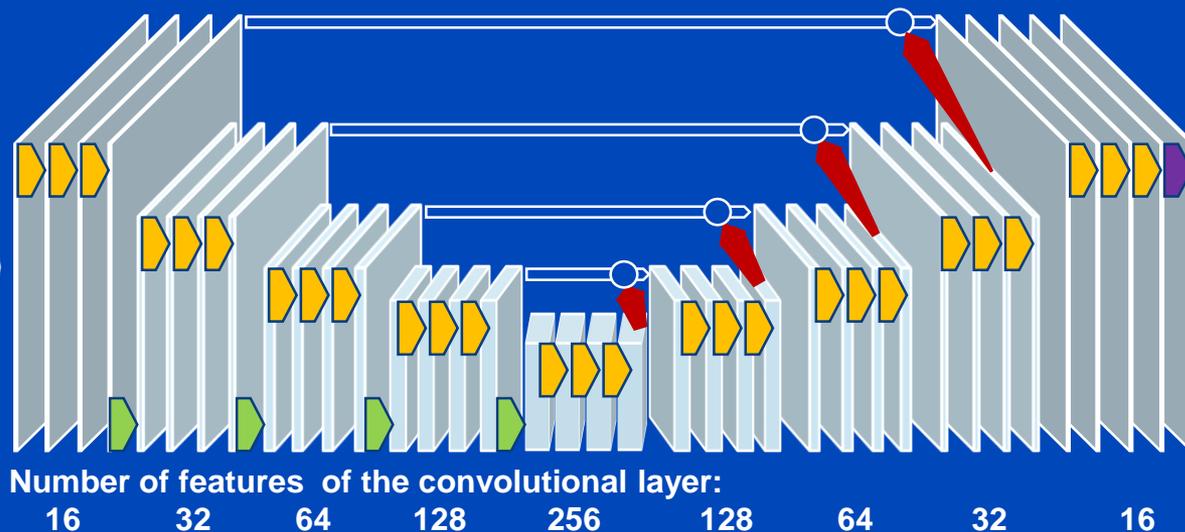
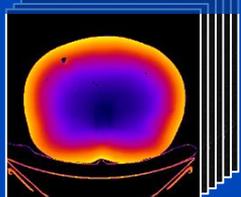
Deep Dose Estimation (DDE)

- Monte Carlo (MC) simulation is the gold standard for patient-specific dose estimation, but too slow to be applied routinely.
- ➔ Training of a deep convolution to reproduce MC simulations given only the CT image and a 1st order dose estimate as input.

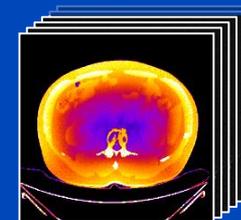
Prior volume



1st order dose estimate



Trained to match Monte Carlo dose estimate



- ▶ $3 \times 3 \times 3$ Convolution (stride = 1), ReLU
- ▶ $3 \times 3 \times 3$ Convolution (stride = 2), ReLU
- Depth concatenate
- ▶ 1×1 Convolution (stride = 1), ReLU
- ▶ $2 \times 2 \times 2$ Upsampling

TCM Minimizing the Radiation Risk

Determination of the modulation curve

- Calculation of dose estimates $D_T(\alpha)$ for every view angle α using the deep dose estimation.
- Calculation of the effective dose according to the ICRP weighting factors w_T .

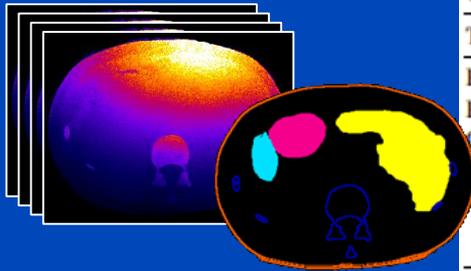


Table 3. Recommended tissue weighting factors.

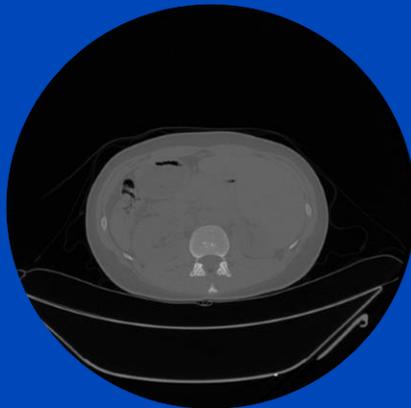
Tissue	w_T	$\sum w_T$
Bone-marrow (red), Colon, Lung, Stomach, Breast, Remainder tissues*	0.12	0.72
Gonads	0.08	0.08
Bladder, Oesophagus, Liver, Thyroid	0.04	0.16
Bone surface, Brain, Salivary glands, Skin	0.01	0.04
Total		1.00

- Total effective dose: $D_{\text{eff}}(I(\alpha)) \propto \sum_{\alpha} I(\alpha) \cdot \left(\sum_T w_T \cdot D_T(\alpha) \right)$
- Choose tube current modulation curve $I(\alpha)$ such that effective dose is minimal at constant image quality.

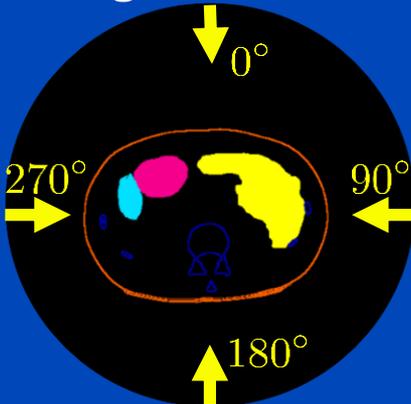
Results – TCM at 70 kV

Angular modulation, abdomen

CT image



Segmentation



Organ / weight

Remainder 0.12

Bone surface 0.01

Brain 0.01

Breast 0.12

Colon 0.12

Esophagus 0.04

Liver 0.04

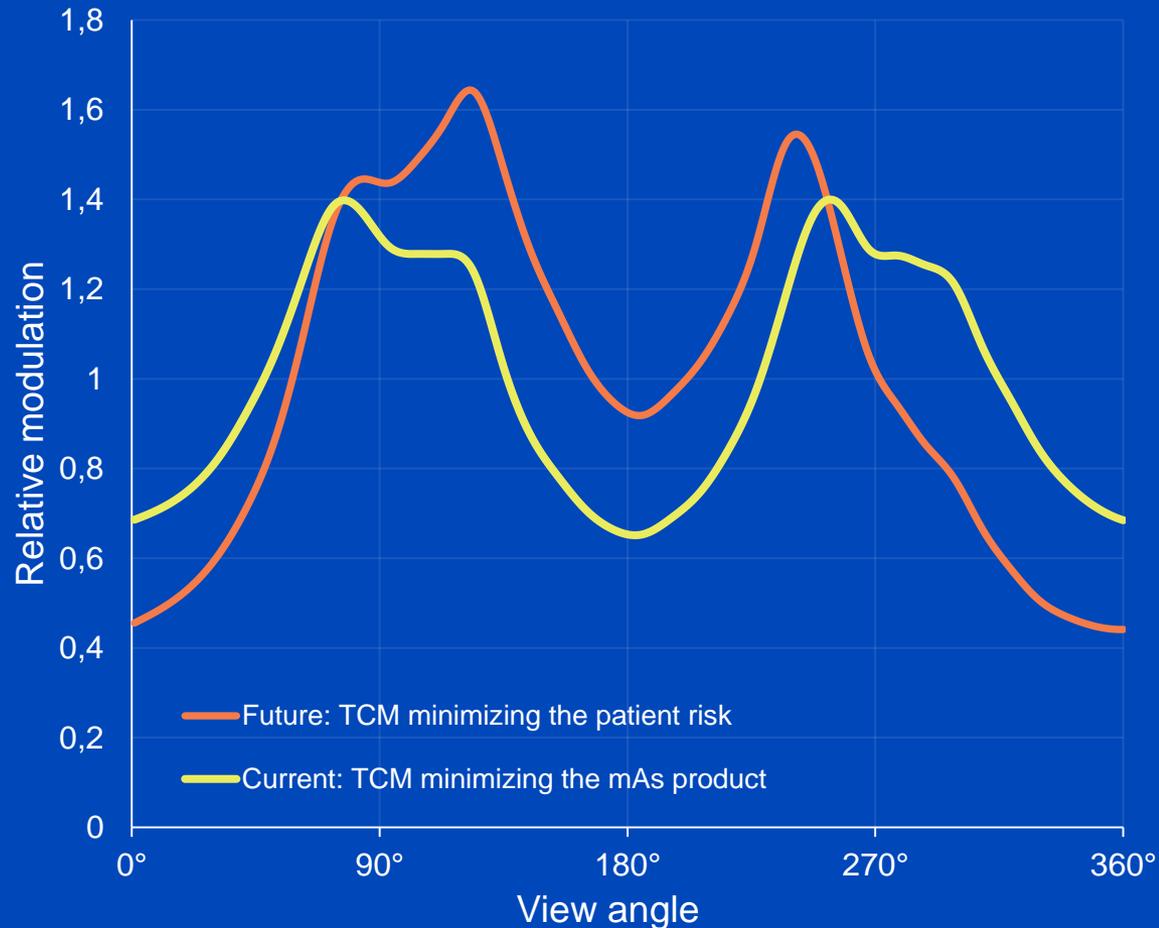
Lung 0.12

Skin 0.01

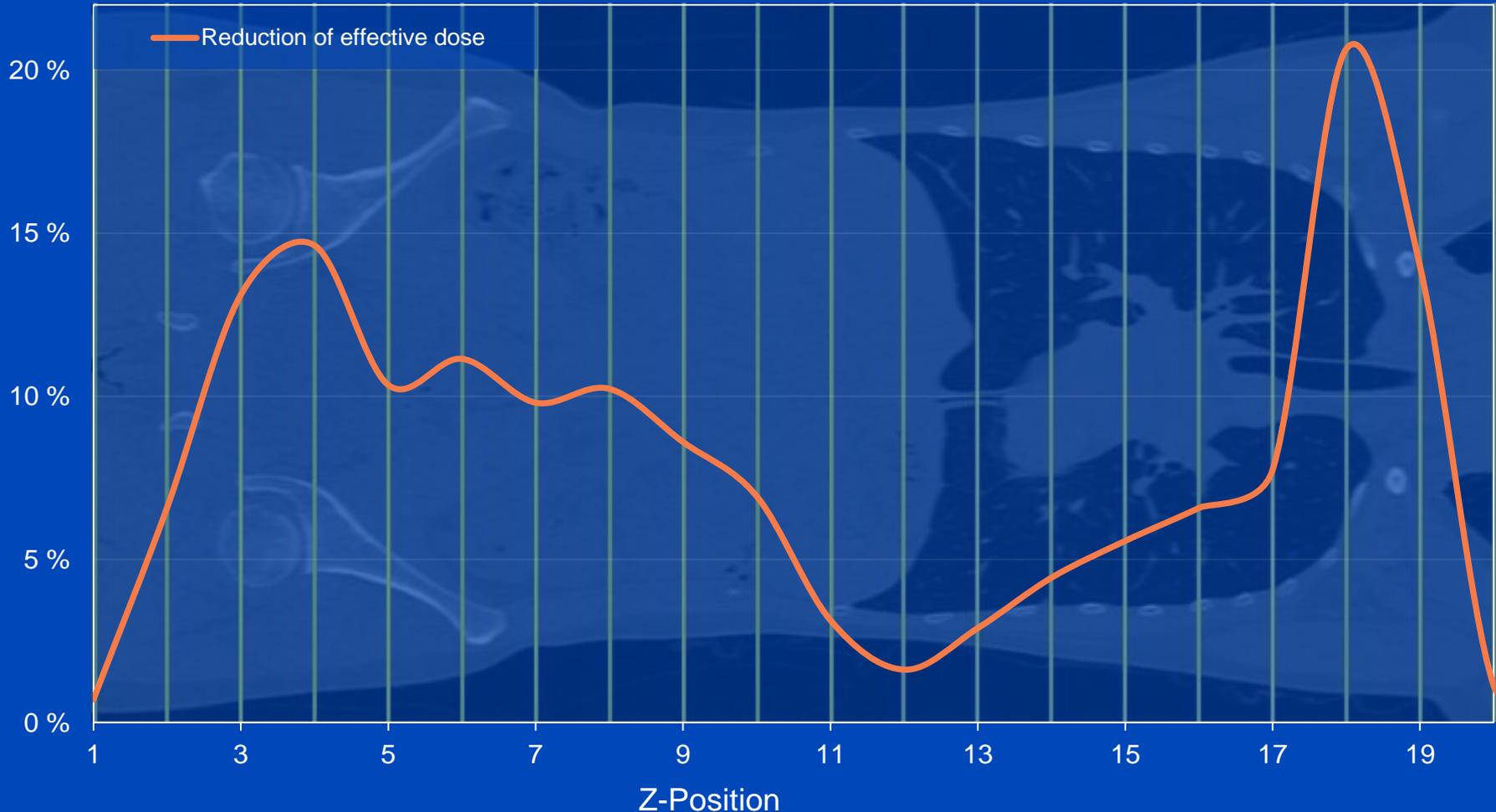
Stomach 0.12

Thyroid 0.04

Bladder 0.04



Results – Reduction of Effective Dose at 70 kV



→ Reduction of the effective dose for the complete scan: 12 %

Conclusions

- Deep learning-based approaches may open new options for more sophisticated tube current modulation strategies.
- Here, the potential of a tube current modulation that minimizes the radiation risk instead of the mAs product was investigated.
- Compared to a conventional tube current modulation, the effective dose could be further reduced by about 12 %, 8 %, and 7 % for 70 kV, 120 kV and 150 kV, respectively.

Thank You!

This presentation is available at www.dkfz.de/ct

Job opportunities through DKFZ's international PhD or Postdoctoral Fellowship programs (www.dkfz.de), or directly through Prof. Dr. Marc Kachelrieß (marc.kachelriess@dkfz.de).

Parts of the reconstruction software were provided by RayConStruct® GmbH, Nürnberg, Germany.