

# Patient Risk-Minimizing Tube Current Modulation in CT (riskTCM)

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DEUTSCHES  
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IN DER HELMHOLTZ-GEMEINSCHAFT

# Aim

- Today's tube current modulation minimizes the mAs-product (mAsTCM).
- We propose a patient risk minimizing TCM (riskTCM).
- We compare its potential dose reduction to mAsTCM.
  - mAsTCM = good for the x-ray tube
  - riskTCM = good for the patient

## MEDICAL PHYSICS

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RESEARCH ARTICLE |  Open Access | 

### Patient-specific radiation risk-based tube current modulation for diagnostic CT

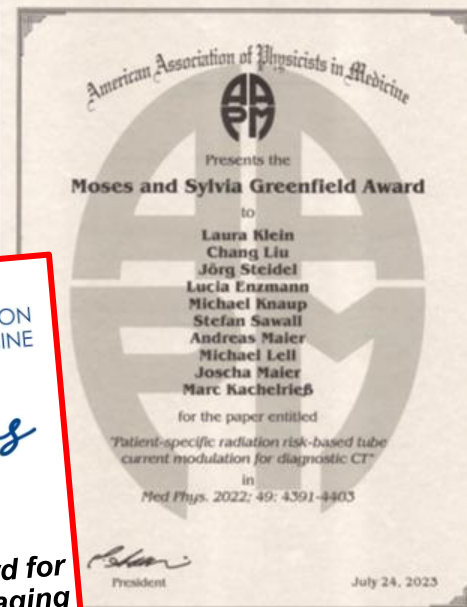
Laura Klein , Chang Liu, Jörg Steidel, Lucia Enzmann, Michael Knaup, Stefan Michael Lell, Joscha Maier, Marc Kachelrieß

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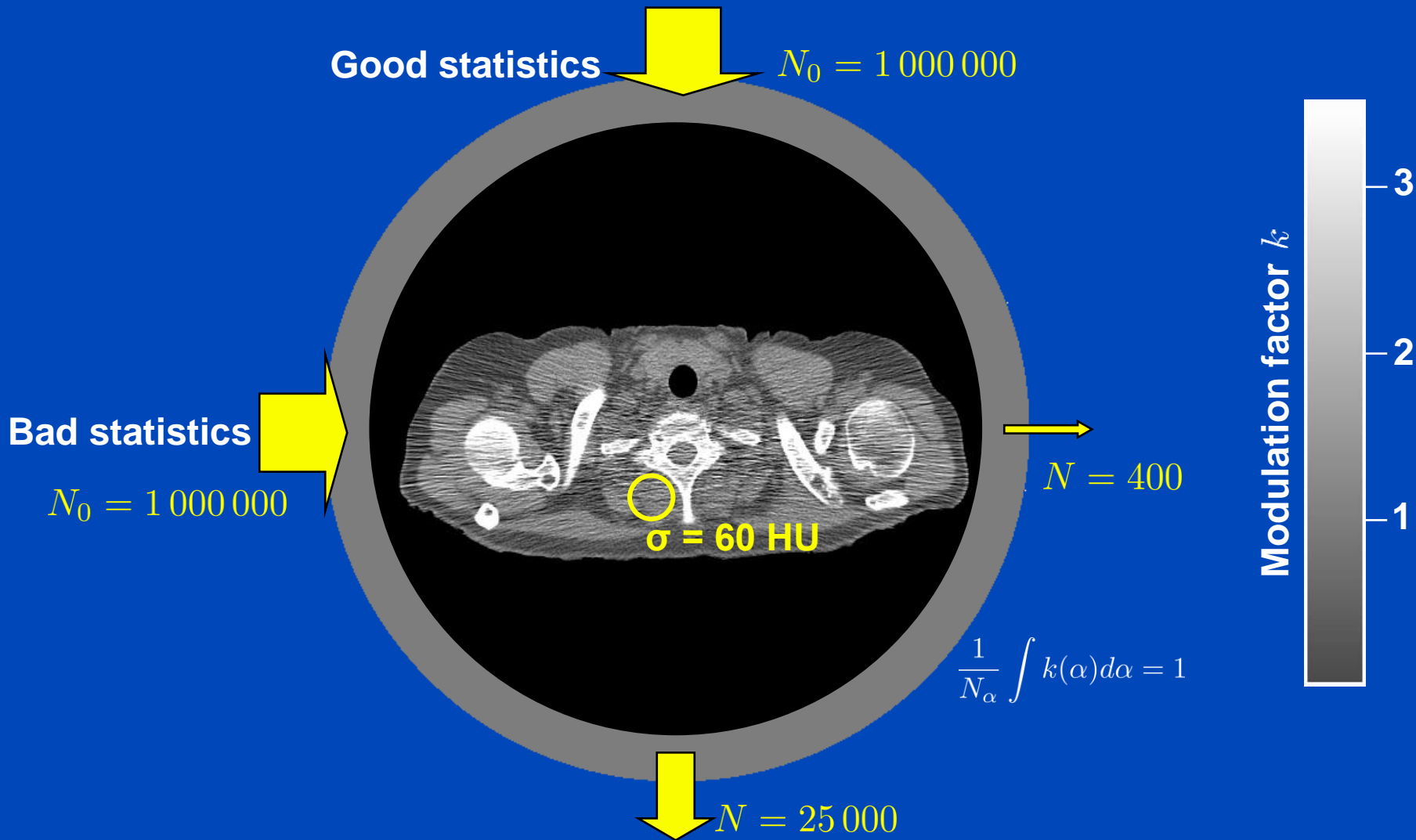
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*Congratulations*

This paper received the  
Sylvia&Moses Greenfield Award for  
the best scientific paper on imaging  
in Medical Physics in 2022.

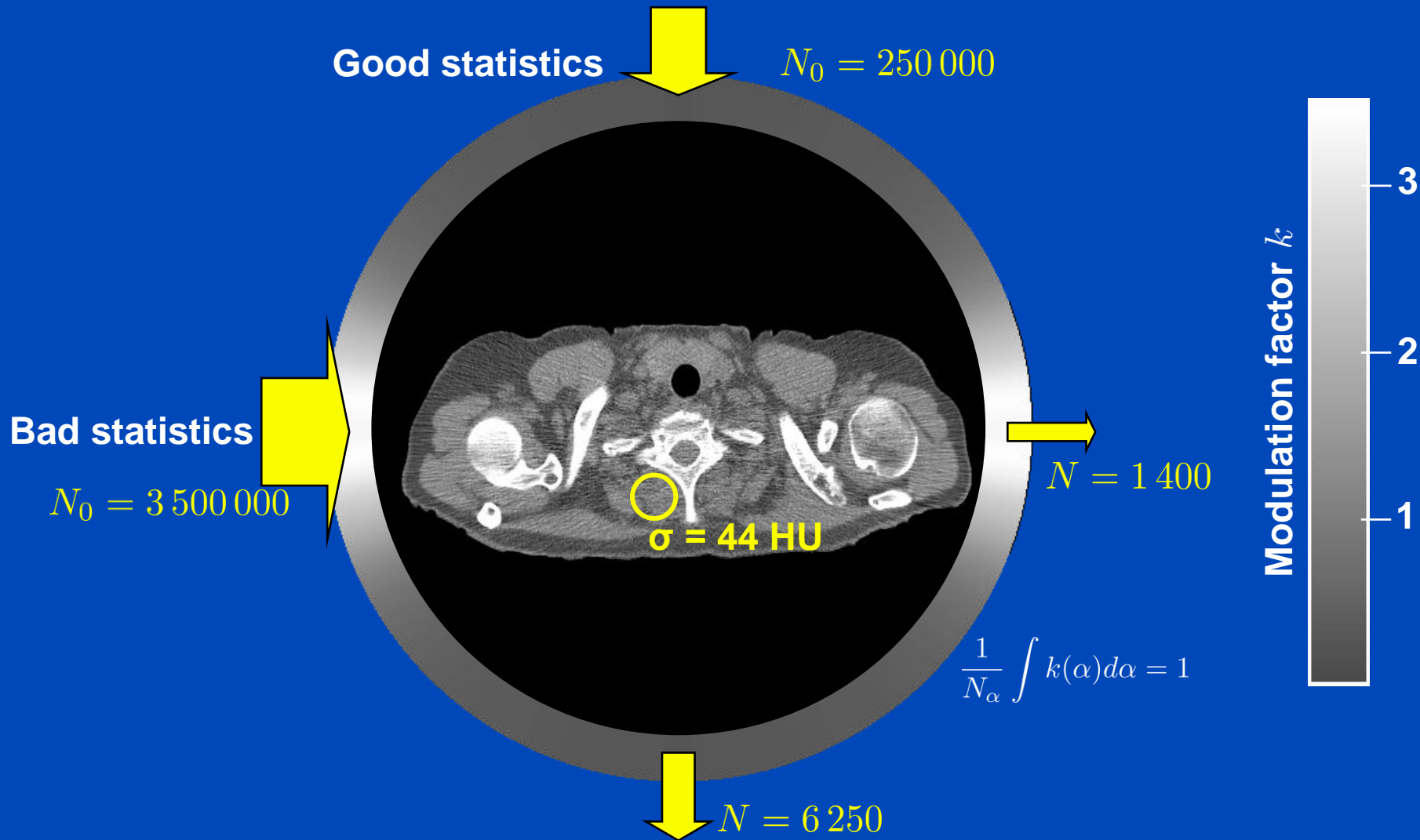


# Tube Current Modulation



**Constant tube current: High, inhomogeneous noise.**

# Tube Current Modulation

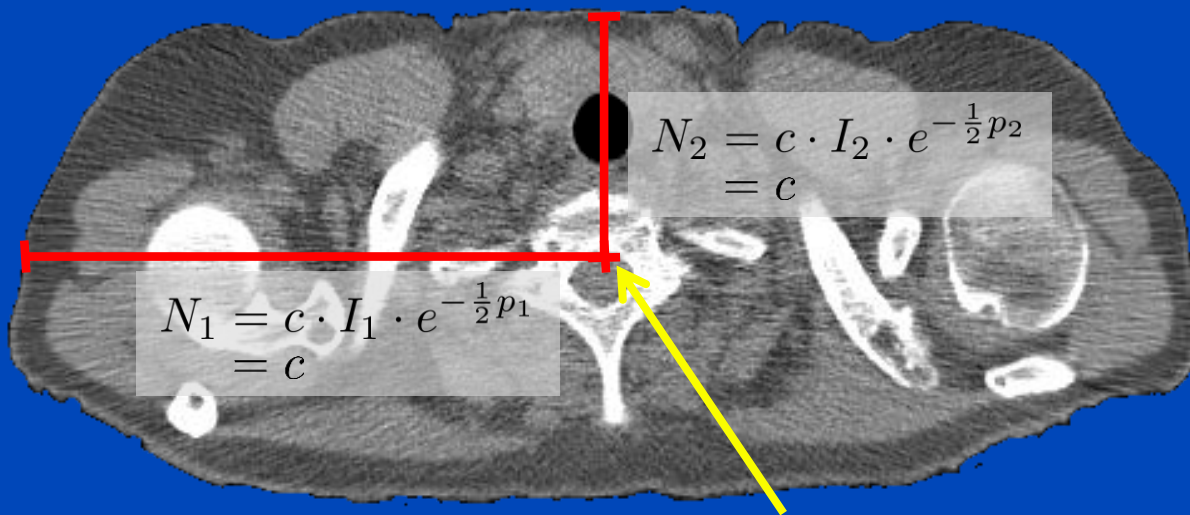


**Modulated tube current: Lower, more homogeneous noise.**

# Tube Current Modulation

## Interpretation

- **Tube current:**  $I(\alpha) \propto e^{\frac{1}{2} \cdot p(\alpha)}$
- **Photon numbers:**  $N(\alpha) = c \cdot I(\alpha) \cdot e^{-p(\alpha)}$



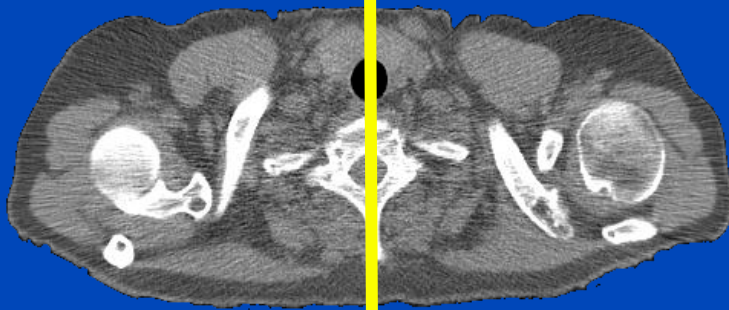
**Rule of thumb:**  
The number of quanta reaching the center of the patient should be constant for all view angles.

# Tube Current Modulation

From a mathematical perspective

- The tube current modulation curve  $I(\alpha)$  is chosen such that the variance in the CT reconstruction is minimal

$$N_0(\alpha) = c \cdot I(\alpha)$$



$$N(\alpha) = c \cdot I(\alpha) \cdot e^{-p(\alpha)}$$

- X-rays reaching the detector follow Poisson statistics:

$$\sigma_{N(\alpha)}^2 = N(\alpha) = c \cdot I(\alpha) \cdot e^{-p(\alpha)}$$

- Variance propagation to projection domain yields:

$$\sigma_{p(\alpha)}^2 = \frac{1}{c \cdot I(\alpha) \cdot e^{-p(\alpha)}}$$

- Variance propagation to image domain yields:

$$\sigma_f^2 = \sum_{\alpha} \frac{1}{c \cdot I(\alpha) \cdot e^{-p(\alpha)}}$$

- Cost function:

$$C = \sum_{\alpha} \frac{1}{c \cdot I(\alpha) \cdot e^{-p(\alpha)}} + \lambda \left( \sum_{\alpha} I(\alpha) - \text{const} \right)$$

← For riskTCM, we also account for the effective dose  $D_{\text{eff}}(\alpha)$  here.

- Minimization yields:  $I(\alpha) \propto e^{\frac{1}{2} \cdot p(\alpha)}$

# Cost Function

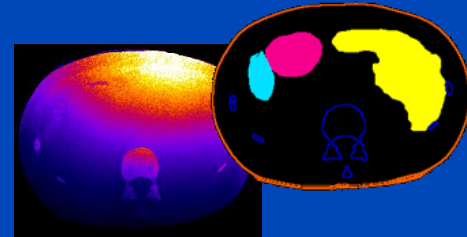


Table 3. Recommended tissue weighting factors.

Tissue	$w_T$	$\sum w_T$
Bone-marrow (red), Colon, Lung, Stomach,	0.12	0.72
Breast, Remainder tissues*		
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

- For mAsTCM, the cost function is

$$C = \underbrace{\sum_{\alpha} \frac{1}{c \cdot I(\alpha) \cdot e^{-p(\alpha)}}}_{\text{Image variance}} + \lambda \left( \sum_{\alpha} I(\alpha) - \text{const} \right)$$

- For riskTCM, the equation is of the form

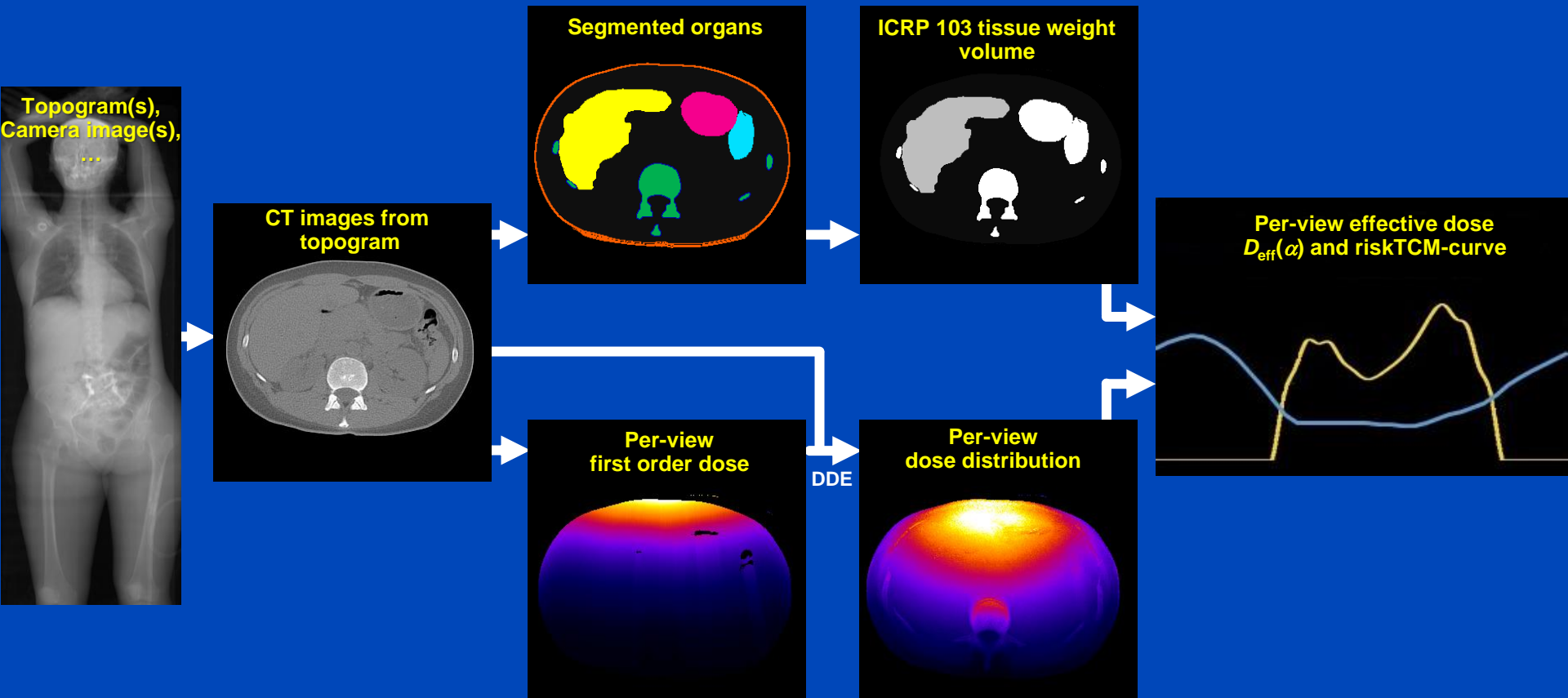
$$C = \sum_{\alpha} \text{Image variance}(\alpha) + \lambda \left( \sum_{\alpha} I(\alpha) \cdot D_{\text{eff}}(\alpha) - \text{const} \right)$$

$$D_{\text{eff}}(\alpha) = \sum_T w_T \cdot D_T(\alpha)$$

- The cost function for riskTCM also takes into account that the effective dose is dependent on the direction and is therefore not the same for two complementary (180°) rays, i.e.,  $D_{\text{eff}}(\alpha_D) \neq D_{\text{eff}}(\alpha_C)$ .

# TCM Minimizing the Radiation Risk

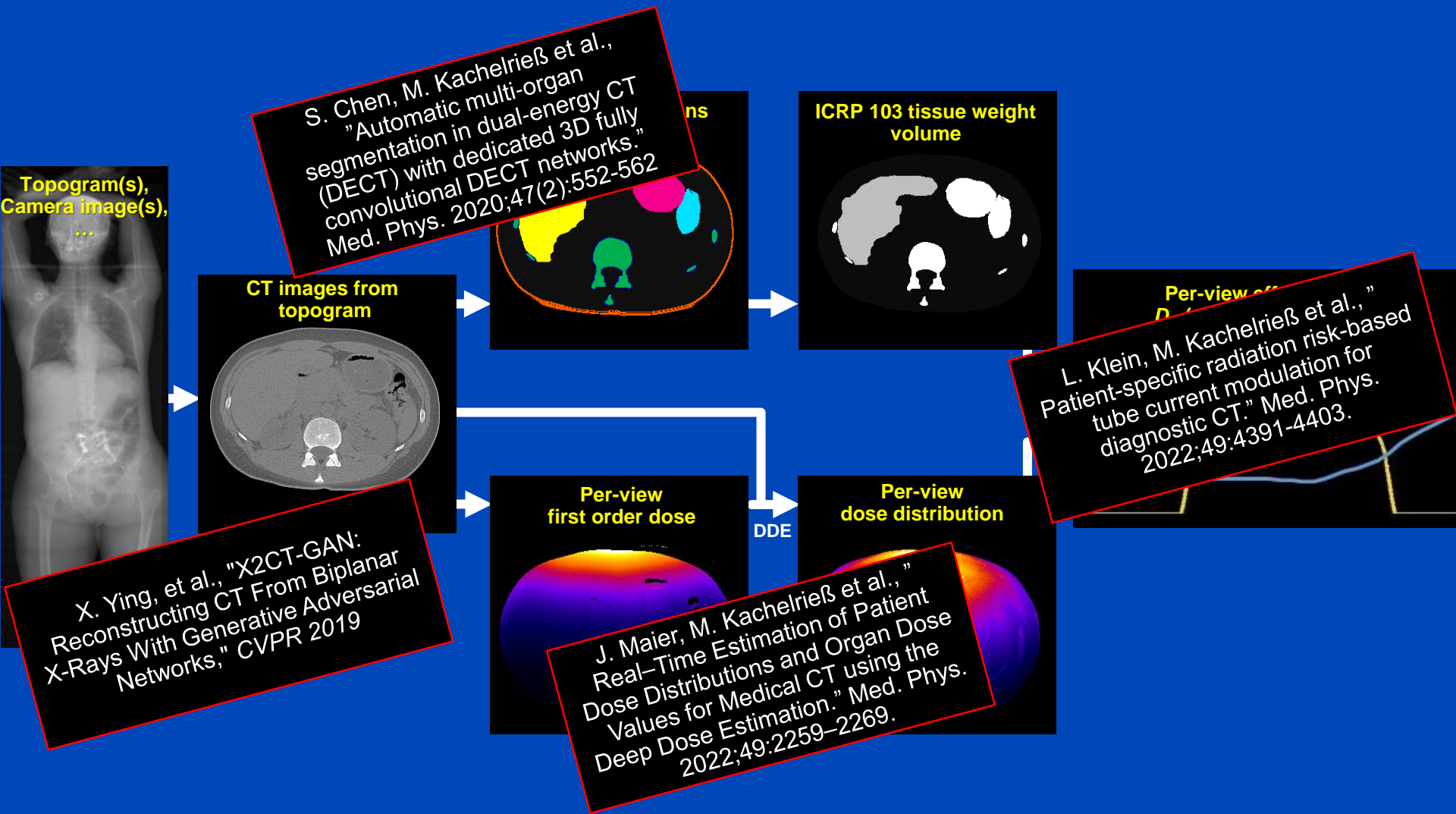
## Basic workflow





# TCM Minimizing the Radiation Risk

## Basic workflow



S. Chen, M. Kachelrieß et al.,  
 "Automatic multi-energy CT segmentation in dual-energy CT (DECT) with dedicated 3D fully convolutional DECT networks." *Med. Phys.* 2020;47(2):552-562

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

J. Maier, M. Kachelrieß et al.,  
 "Real-Time Estimation of Patient Dose Distributions and Organ Dose Values for Medical CT using the Deep Dose Estimation." *Med. Phys.* 2022;49:2259-2269.

L. Klein, M. Kachelrieß et al.,  
 "Patient-specific radiation risk-based tube current modulation for diagnostic CT." *Med. Phys.* 2022;49:4391-4403.

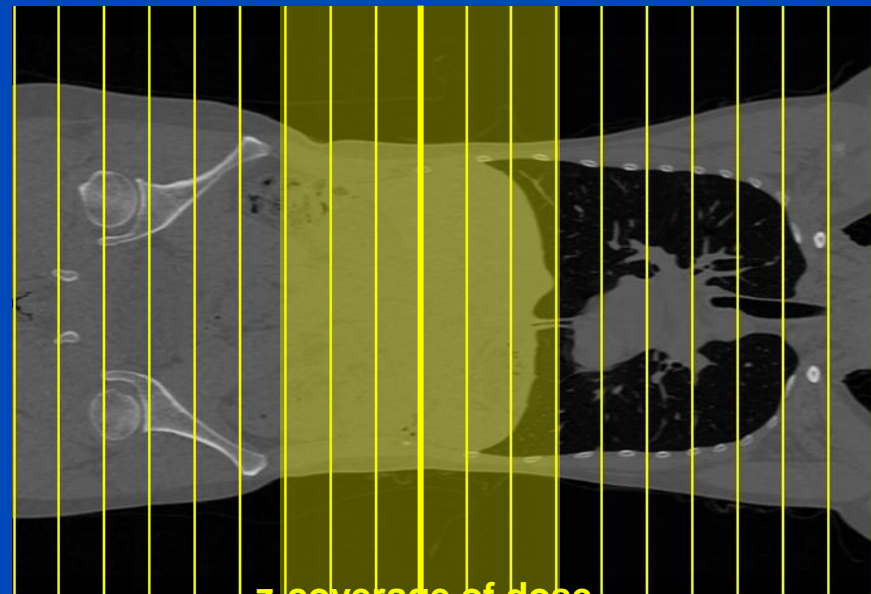
# Retrospective Study

- Simulation of CT scans covering different anatomies from 70 kV to 150 kV (6 mm Al prefiltration).
- Simulation of consecutive circle scans each with a z-collimation of 40 mm.

Axial view



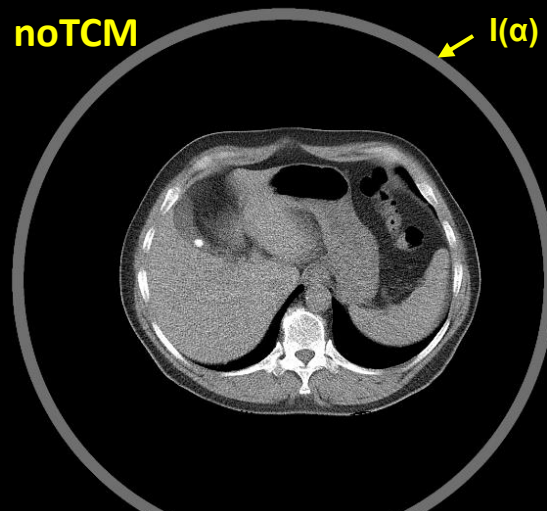
Coronal view



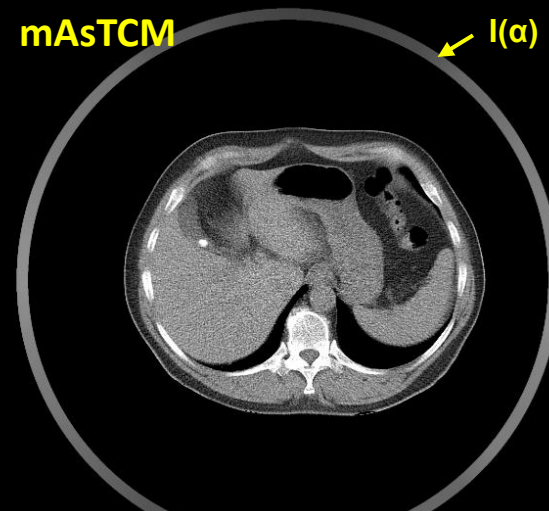
$nz = 1$

z-coverage of dose  
estimate at  $nz = 10$

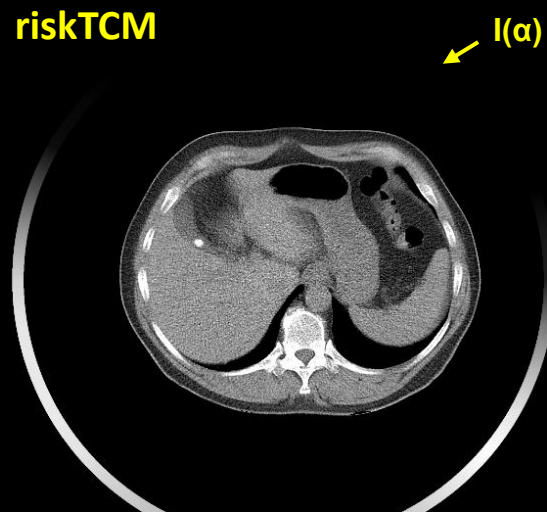
# Modulation Curves for 70 kV



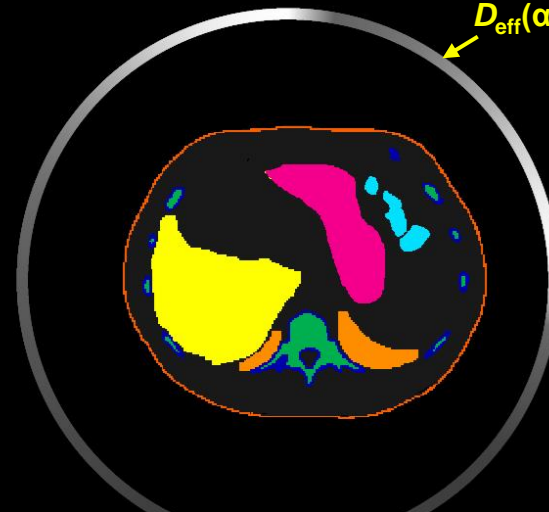
21 HU, 104% mAs, 109%  $D_{\text{eff}}$



21 HU, 100% mAs, 100%  $D_{\text{eff}}$



21 HU, 102% mAs, 63%  $D_{\text{eff}}$



$C = 25 \text{ HU}$ ,  $W = 400 \text{ HU}$

# Effective Dose at Same Image Noise Relative to mAsTCM

Average over all patients

Abdomen

Tube Voltage	noTCM	mAsTCM	riskTCM
70 kV	113% from 105% to 135%	100%	69% from 57% to 76%
100 kV	113% from 103% to 137%	100%	71% from 62% to 79%
120 kV	114% from 106% to 135%	100%	72% from 64% to 79%
150 kV	115% from 106% to 136%	100%	73% from 66% to 80%

Thorax

Tube Voltage	noTCM	mAsTCM	riskTCM
70 kV	113% from 108% to 118%	100%	77% from 67% to 82%
100 kV	113% from 107% to 117%	100%	81% from 74% to 85%
120 kV	113% from 107% to 118%	100%	82% from 75% to 86%
150 kV	113% from 108% to 118%	100%	83% from 76% to 87%

# Extensions of riskTCM

- **Comparison with organ-specific TCM (osTCM)**

L. Klein, L. Enzmann, A. Byl, C. Liu, S. Sawall, A. Maier, J. Maier, M. Lell, and M. Kachelrieß. “Organ-specific vs. patient risk-specific tube current modulation in thorax CT scans covering the female breast.” CT Meeting 2022.

- **Additional modulation of the tube voltage (riskTCTVM) and of the prefilter (riskXSM)**

E. Baader, L. Klein, S. Sawall, J. Maier, and M. Kachelrieß. “CT tube current and tube voltage modulation to minimize the patient's radiation risk.” ECR 2023.

- **Performance of real measurements**

Cooperation with Siemens Healthineers (Forchheim, Germany)

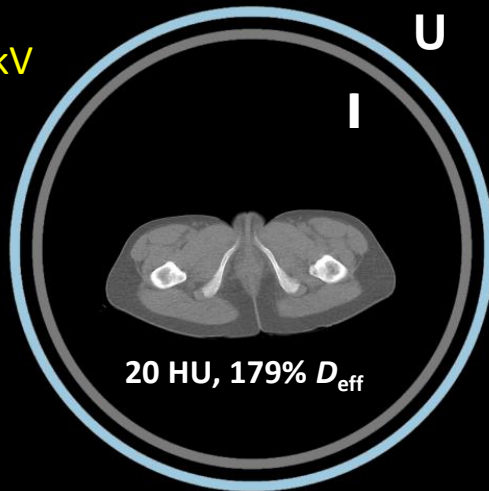
- **Risk models (upcoming)**

S. Klubertz

# Risk Minimizing Tube Current & Tube Voltage Modulation (riskTCTVM)

noTCM

$U = 120 \text{ kV}$



mAsTCM

$U = 120 \text{ kV}$



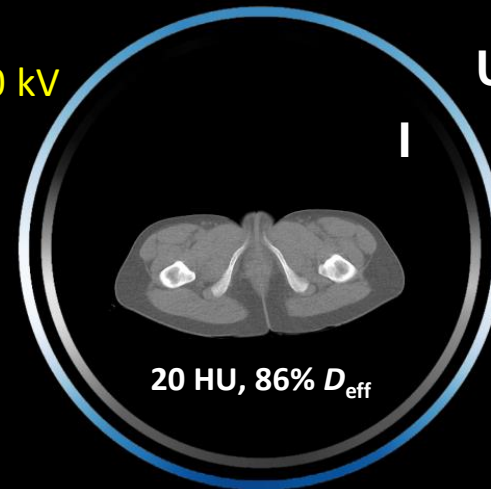
riskTCM

$U = 120 \text{ kV}$



riskTCTVM

$U = 70 \dots 150 \text{ kV}$



# Conclusions

- All anatomical regions benefit from riskTCM.
- The highest  $D_{\text{eff}}$  reduction compared to mAsTCM is seen for the abdomen (31%) and for the pelvis (25%).
- The implementation of riskTCM on a clinical CT only requires software updates.
- A further  $D_{\text{eff}}$  reduction might be possible with riskTCTVM or riskXSM, in particular when contrast agents are used.

This work received the  
**Behnken-Berger Award**  
at the DGMP annual meeting 2023



# Thank You!



## The 8<sup>th</sup> International Conference on Image Formation in X-Ray Computed Tomography

August 5 – August 9, 2024, Bamberg, Germany  
[www.ct-meeting.org](http://www.ct-meeting.org)



Conference Chair

**Marc Kachelrieß**, German Cancer Research Center (DKFZ), Heidelberg, Germany

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

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Job opportunities through DKFZ's international PhD programs or through [marc.kachelriess@dkfz.de](mailto:marc.kachelriess@dkfz.de).  
Parts of the reconstruction software were provided by RayConStruct<sup>®</sup> GmbH, Nürnberg, Germany.