

The use of imaging information in Monte Carlo simulations

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“Monte Carlo is perfect”

● But MC patient dose calculations require imperfect images as input

⇒ errors/artifacts in images propagate in the dose calculation

MC is more prone to this than other dose calculation methods

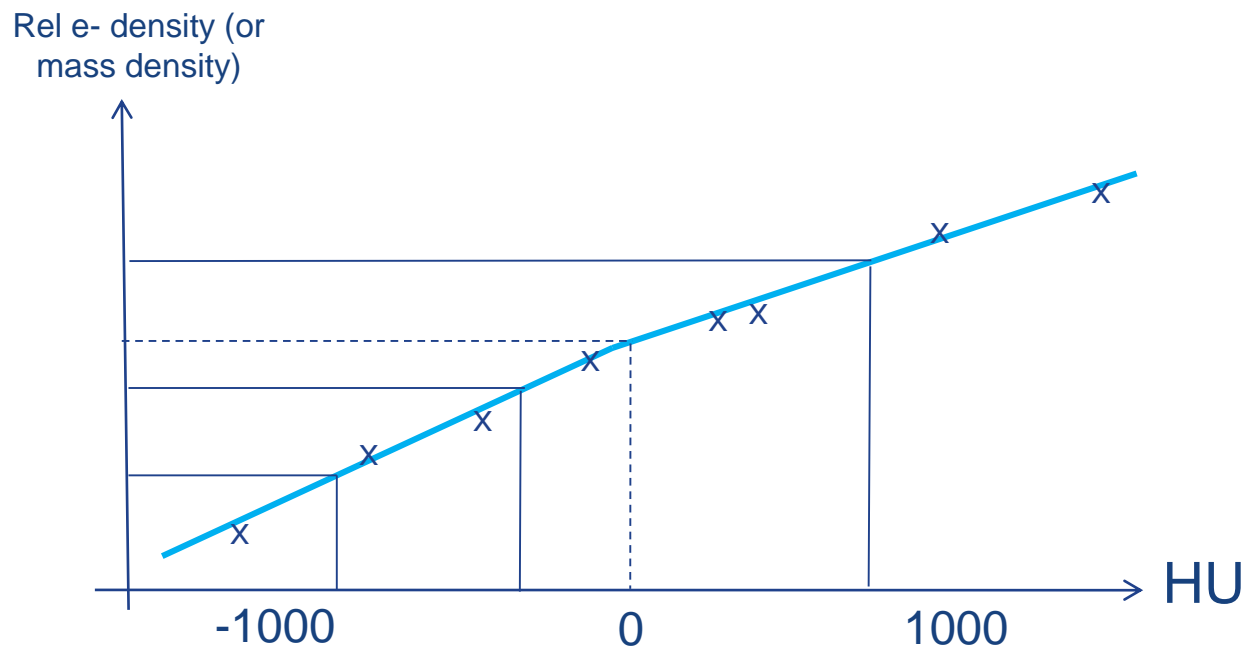
In many MC papers hardly any mention is made of the tissue segmentation procedure

⇒ including those that show few % difference between MC and other methods



How does (nearly) everyone do MC dose calculations? Patient geometry segmentation

bone
'soft tissue'
lung
air



- Material segmentation (number, tissue types) somewhat arbitrary
- May influence dose calculation



Gammex electron density phantom

What can possibly go wrong?

- Pick wrong phantom for calibration
- Pick wrong kV of the CT scanner
- Pick wrong intervals for material assignment

Pick the wrong phantom

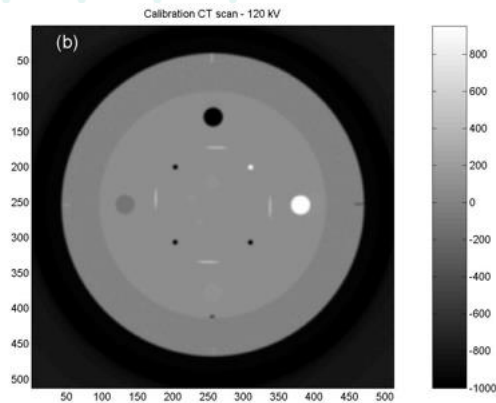
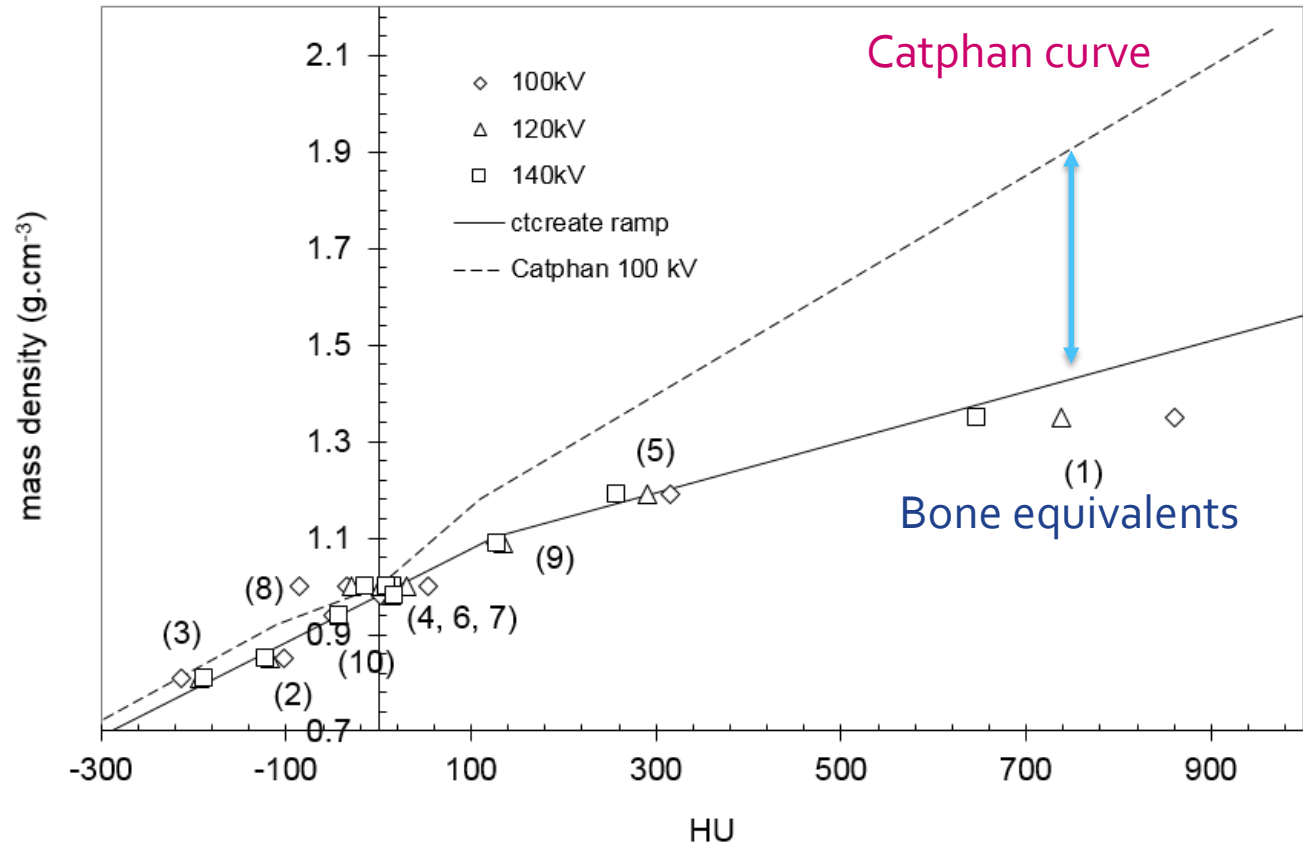


Table 3. Composition by fractional weight of the materials used in the *Catphan* calibration phantom and their mass densities.

#	Material	Fraction by weight						ρ (g cm ⁻³)
		H	C	O	N	F	Ar	
1	Air			23.18	75.53		1.29	0.0012
2	C ₂ H ₄	14.37	85.63					0.92
3	C ₅ H ₈ O ₇	8.054	59.98	31.96				1.18
4	C ₂ F ₄ (Teflon)		24.02			75.98		2.16

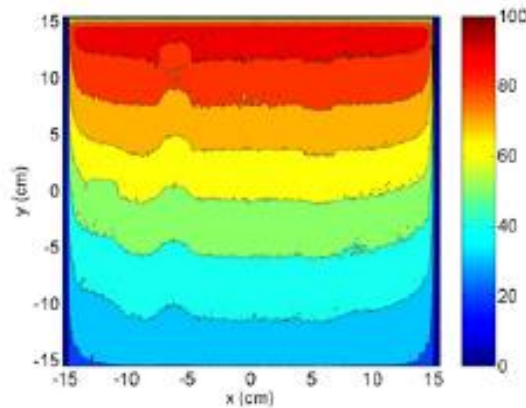
CatPhan 500 (The Phantom Laboratory)

Improper HU – ρ calibration

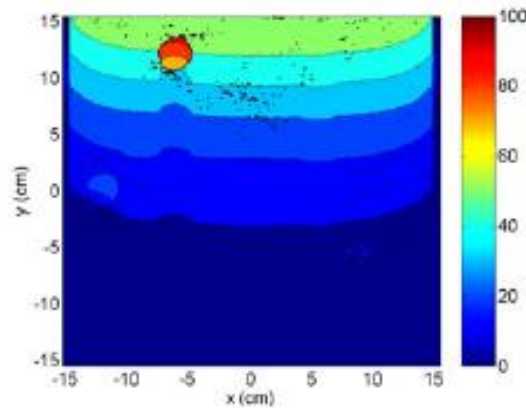


MC dose errors

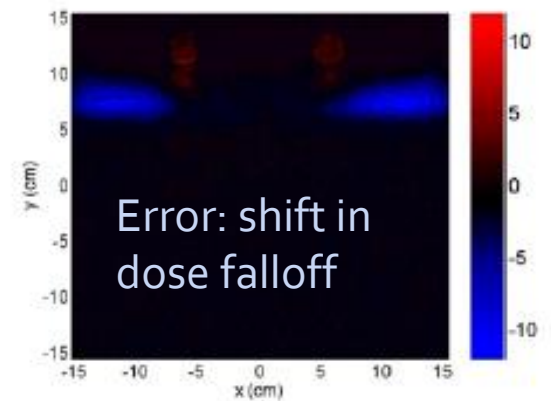
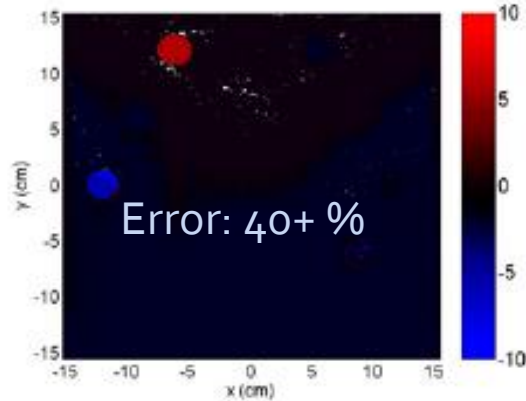
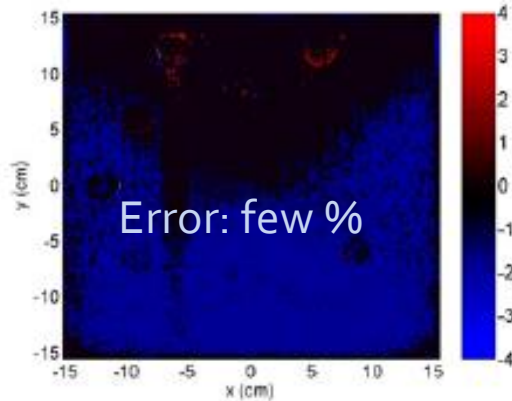
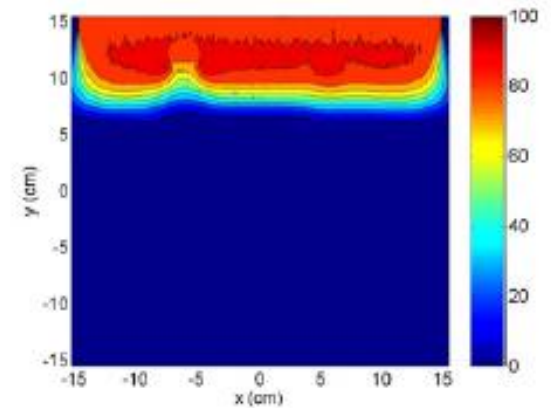
6MV X-rays



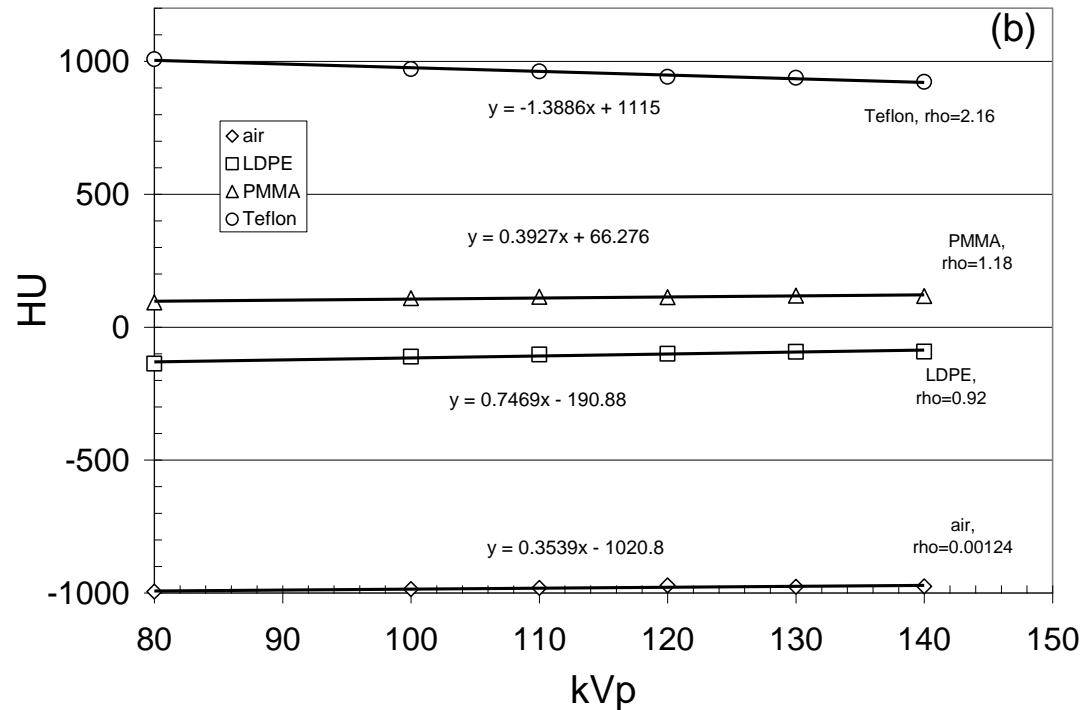
250 kVp X-rays



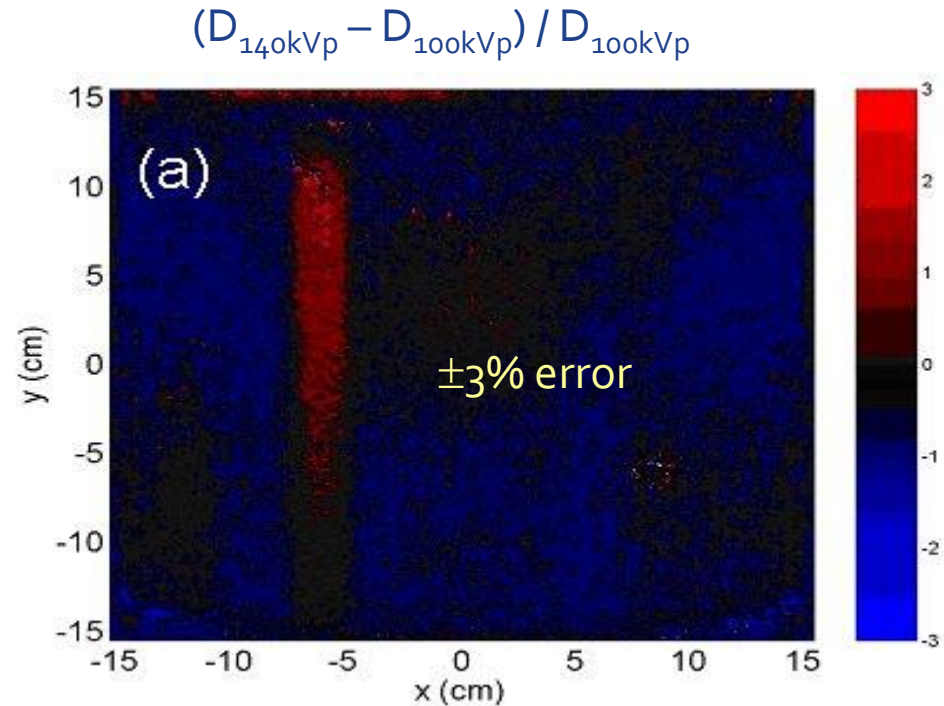
18 MeV electrons



Pick wrong kV of the CT scanner: HU depend on CT scanner kVp



Low HU: increase with kVp
High HU: decrease with kVp

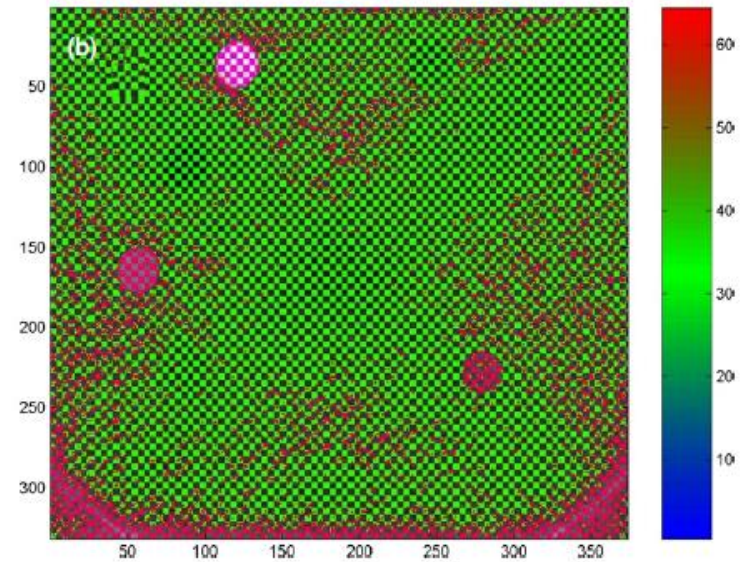
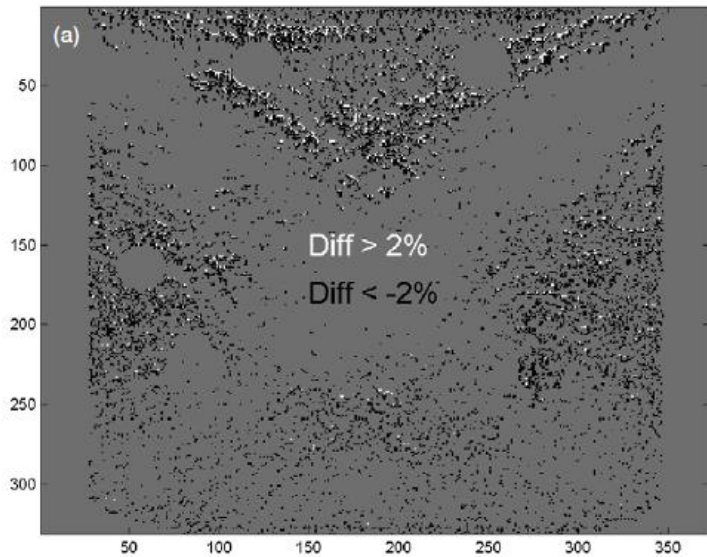


Common practice: use single 120 kVp calibration
Compare 6MV dose calculation in 100 kV and 140 kV CT image
3% errors
larger errors in kV photons

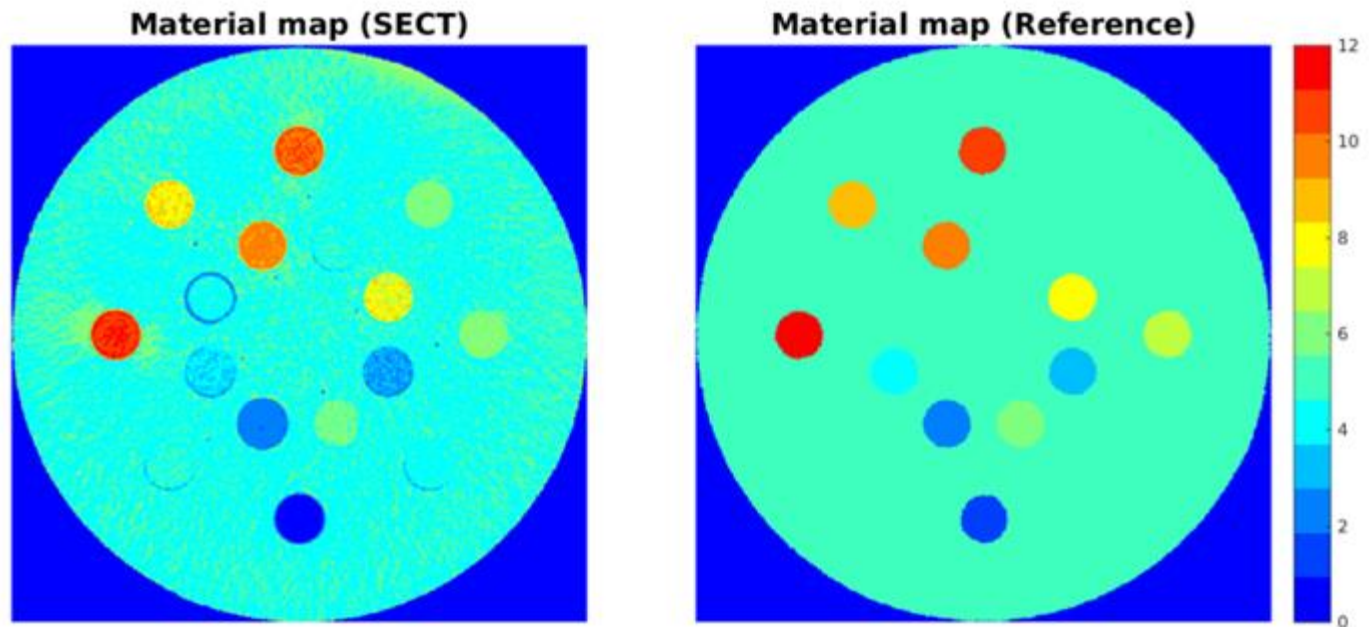
Errors can be larger if e.g. 140 kVp is used for calibration and 100 kVp for dose calculation

Pick wrong intervals for material assignment

- Compare 6MV dose calculation with bone threshold set to 1.1 or 1.2 g/cm³
- CT artifacts can cause larger errors in MC than in other methods



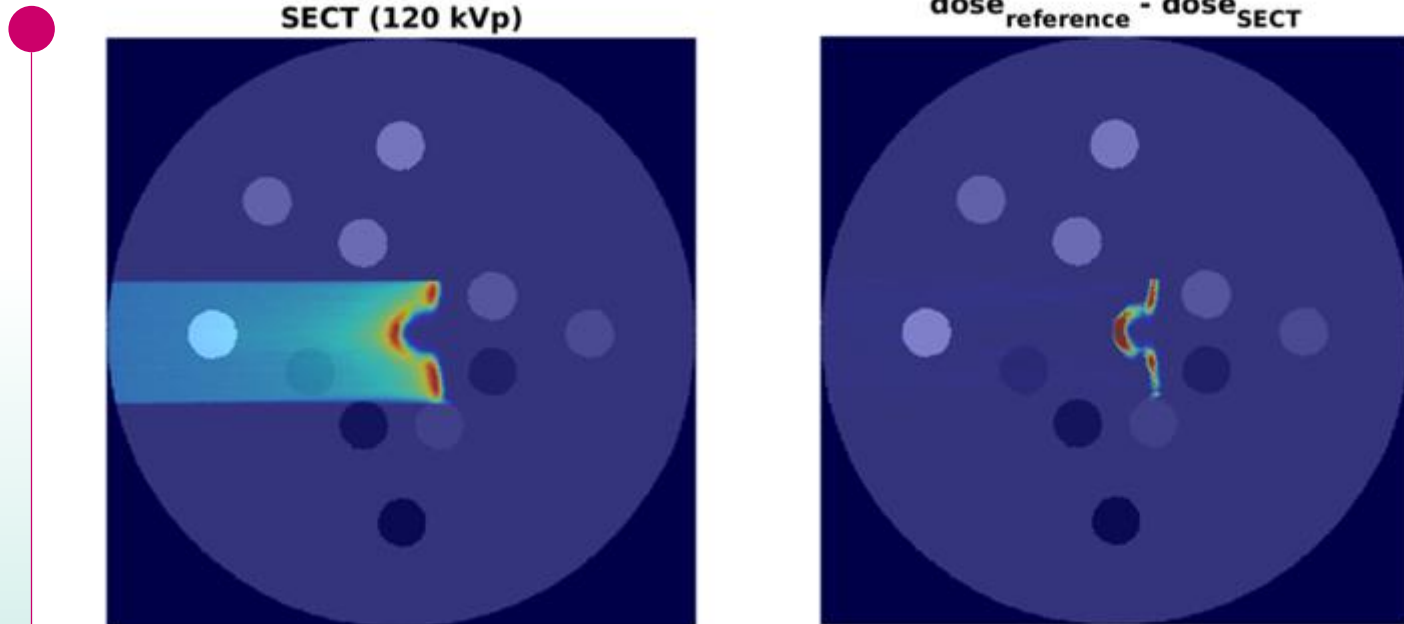
Protons: SECT vs absolute truth



RMI 467 phantom (Gammex)

Difficult to get all materials correctly identified based on density alone

Protons: Dose calculations based on stopping powers



175 MeV monoE protons

Errors in tissue assignment accumulate in Bragg peak position
Several mm shift of Bragg peaks \Rightarrow uncertainties in treatment margins

Conclusions: tissue assignment studies

- **Mis-assignment of media and/or $\rho_{(e)}$ in calibration procedure can cause significant dose errors**
 - Worst for kV photons, few% for MV photons
 - Significant range differences in protons
 - Need to explore this for kV therapy, kV imaging, brachytherapy, kV small animal radiotherapy
- **Accurate calibration is essential**
 - **Assess commercial phantoms carefully**
 - Teflon insert in Catphan phantom (older generation) inappropriate
 - **In some cases assigning water (with correct density) is better than assigning wrong media**

Is there a better way to do dose calibration?

The stoichiometric calibration (Schneider PMB 1996)

Method:

- Parametrize CT scanner (k_1, k_2) for set of materials (not necessarily tissue-equivalent)
- k_1, k_2 : fit coefficients; importance of Rayleigh scatter and photo-electric effect wrt Compton scatter

$$\frac{\bar{\mu}}{\bar{\mu}_w} = \frac{\rho}{\rho_w} \frac{\sum_i \frac{w_i}{A_i} (Z_i + k_1 Z_i^{2.86} + k_2 Z_i^{4.86})}{\frac{w_H}{A_H} (1 + k_1 + k_2) + \frac{w_O}{A_O} (8 + k_1 8^{2.86} + k_2 8^{4.86})}$$

- Minimize expression to obtain k_1, k_2

$$\sum_j \left[\left(\frac{\bar{\mu}}{\bar{\mu}_w}(k_1, k_2) \right)_j - \left(\frac{HU}{1000} + 1 \right)_j \right]^2$$

- Then calculate HU for any material \Rightarrow calibration curve

$$HU = \left(\frac{\bar{\mu}}{\bar{\mu}_w} - 1 \right) \times 1000,$$

Stoichiometric method

Was intended to make the calibration curve independent of the calibration phantom

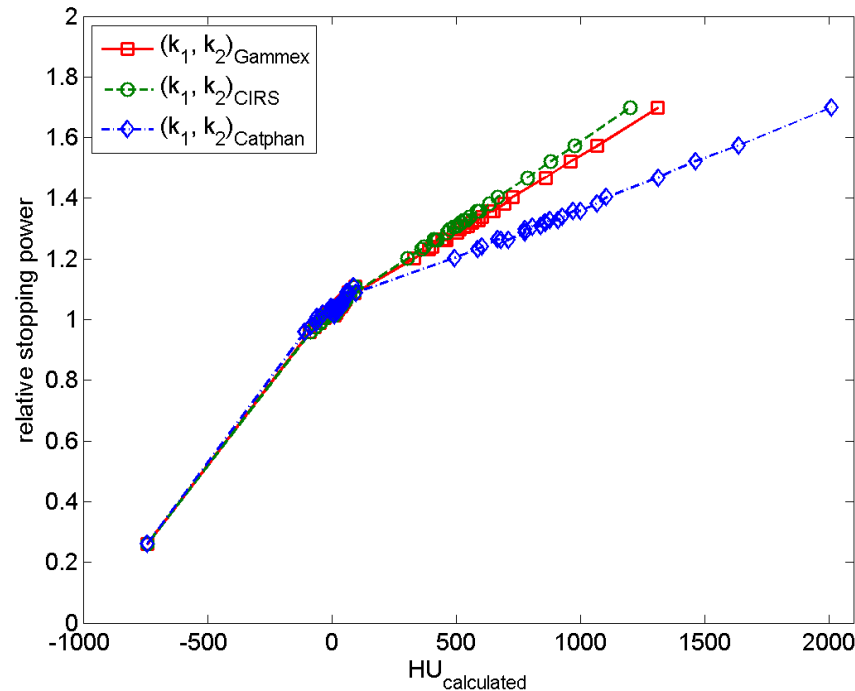
Very commonly used in proton dose calculations

However, no one seems to have verified this extensively

- ❑ Recently it was shown that $k_{1,2}$ characterization DOES depend on calibration phantom
- ❑ Calibration with a well-chosen phantom (e.g. Gammex) is as good as the more complex stoichio method

Gomà et al, in preparation, 2017

$k_{1,2}$ depend on calibration phantom (Goma et al, in prep)



- Gammex, CIRS and Catphan phantom
- Differences in SPR of up to 5%
- Additional source of uncertainty in proton dosimetry
- Gammex phantom works best



Use the stoichiometric method with care

This method deserves thorough inspection after 20 yrs of clinical use

⇒ Donate your CatPhan phantom to your Radiology Dept!

How sensitive are MC dose calculations to tissue composition?

● The case of low-energy photons

What are human tissues made of?

Human tissues vary from one individual to the other

Data in literature is scarce and old

Most refs trace back to: (Woodard&White, BJR 1986)

Body tissue	Elemental composition (% by mass)					Densities		
						Mass	Electron	
	H	C	N	O	Elements with $Z > 8$	kg m^{-3}	el. $\text{kg}^{-1} \times 10^{26}$	el. $\text{m}^{-3} \times 10^{26}$
Adipose tissue 1	11.2	51.7	1.3	35.5	Na(0.1), S(0.1), Cl(0.1)	970	3.342	3241
Adipose tissue 2	11.4	59.8	0.7	27.8	Na(0.1), S(0.1), Cl(0.1)	950	3.347	3180
Adipose tissue 3	11.6	68.1	0.2	19.8	Na(0.1), S(0.1), Cl(0.1)	930	3.353	3118

Does any of this matter dosimetrically?

Sensitivity of dose calcn to tissue composition:

Dose ratio for a breast case (Pd-103)

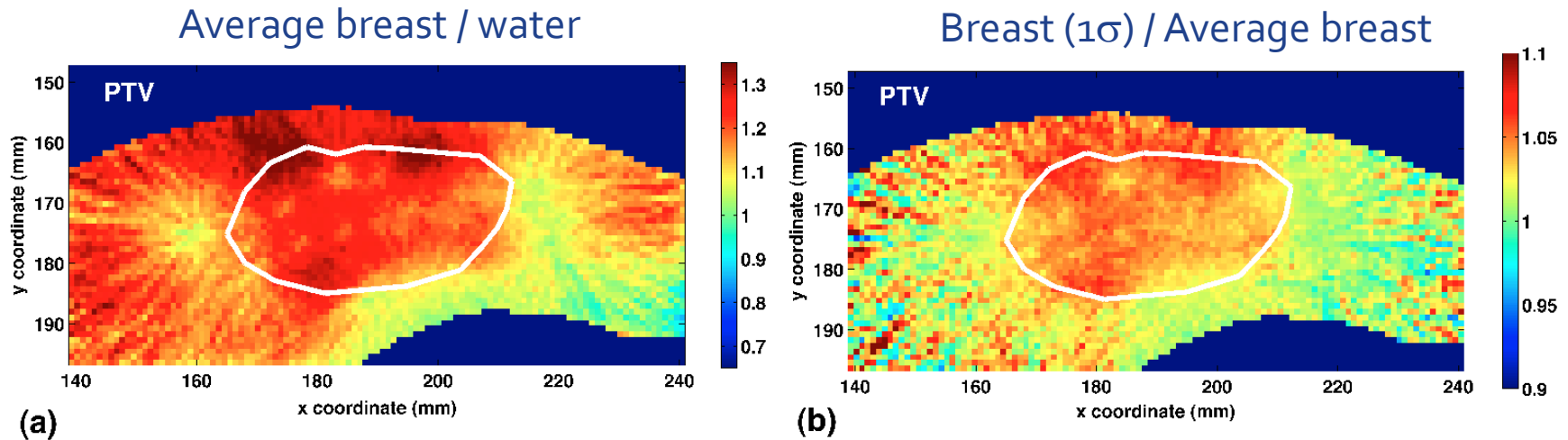


FIG. 7. (a) Ratio of *Breast mean-Z A70/G30* from a brachytherapy breast implant and D_{TG-43} . (b) Ratio of *Breast lo-Z* over *Breast mean-Z*.

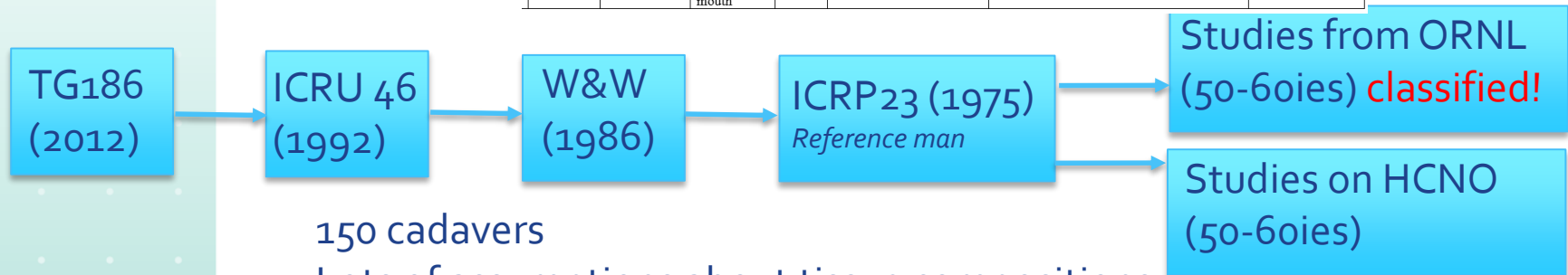
- Left: From water to average breast, 30% \Rightarrow **largest effect!**
- Right: Compositional uncertainty (1σ) among patients, $\pm 10\%$

This means most of the accuracy will be gained by replacing water \Rightarrow average breast tissue

A closer look at tissue compositions

D Mann-Krznisnik, F Verhaegen, S Enger. *The influence of tissue composition uncertainty on dose distributions in brachytherapy. Radiother Oncol, Submitted, 2017*

Siebert et al. (2013) [47]	HDR (^{192}Ir)	Floor of mouth, larynx and parotid	Target	D ₉₀ : -3.0%	D _{90,m} model-based with CT density compared to TG-43 unit density water. GBBS Acuros module of BrachyVision for model-based calculation. Percent difference computed using median values.	CT densities mapped to materials. Elemental compositions from lung, adipose tissue, skeletal muscle, cartilage and bone taken from ICRP 23 [33].
Chibani et al. (2014) [48]	HDR (^{192}Ir)	Esophageal	Target	D ₉₀ (CTV): -3.2%	MC calculations with CT density compared to simulated TG-43 unit density water. Both calculations make use of HDRMC MC dose calculation engine.	ICRU-46
Hadad et al. (2015) [49]	HDR (^{192}Ir)	Nasopharynx	Target	D ₉₀ : -40%	MC calculations (DOSXYZ) with CT density compared to TG-43 unit density water (Oncentra™ TPS)	Use of DOSXYZ/ctcreate [50] which maps CT densities to tissues. Compositions taken from ICRU-46.
		Mobile tongue, base of tongue, floor of mouth	Target (PTV)	D ₉₀ : -1.3%		



150 cadavers

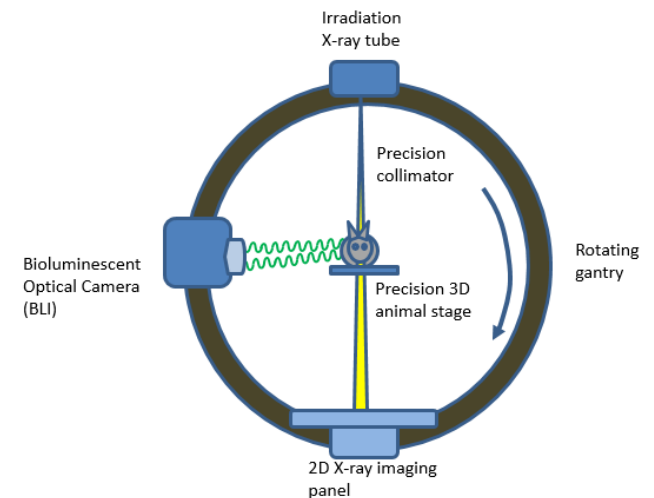
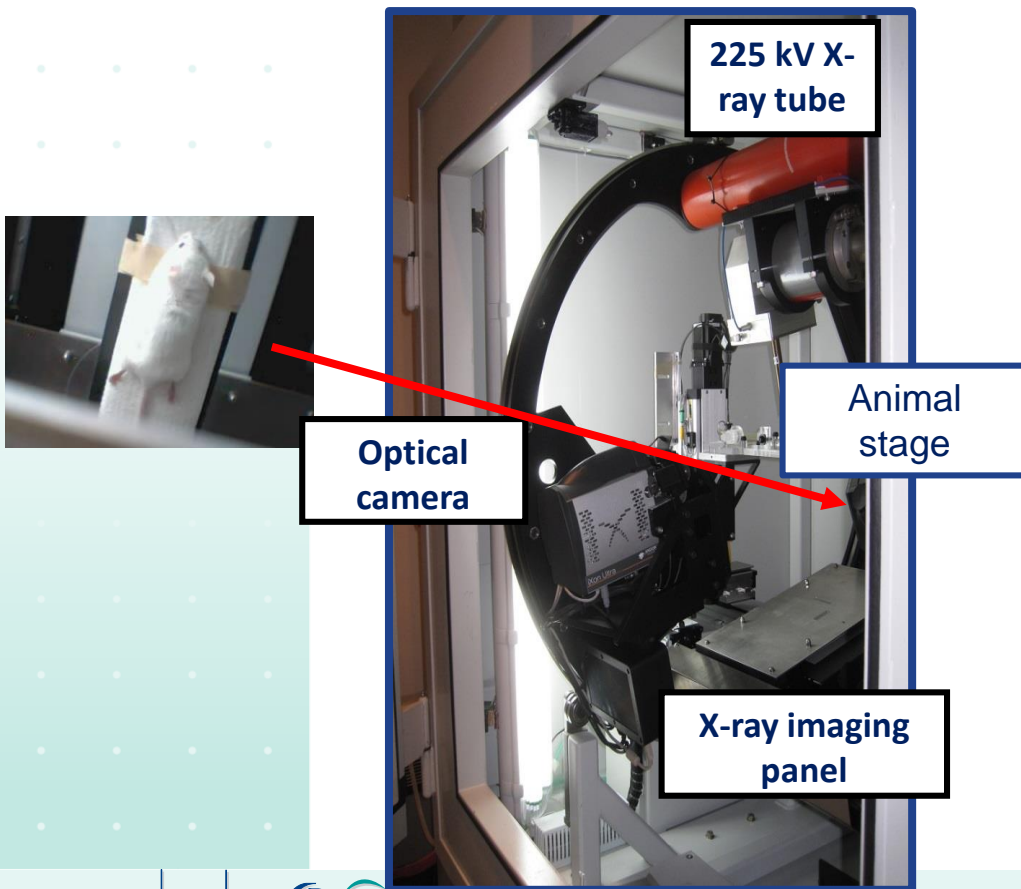
Lots of assumptions about tissue compositions

Spectrography by DC arc method for heavier atomic constituents

HCNO derived from evaporating water, dissolving fat, burning residue...

⇒ derive Z

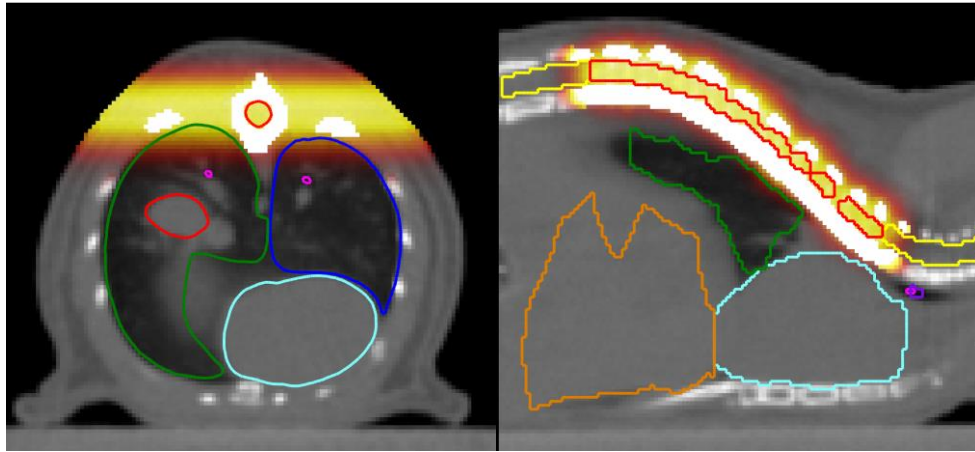
Need for accurate dose calculations in small animal radiotherapy



SmART: Small Animal RadioTherapy

Accurate kV photon dose calculations

'IMRT-like' dose painting in mice



Issues:

- Broad kV spectrum
- Very small beams + very small targets
- What are mouse tissues made of? No data
- How many different tissues should we assign for dose calculation?
- CT imaging can hardly distinguish any tissues at all

How will we improve this?

The need for more advanced imaging

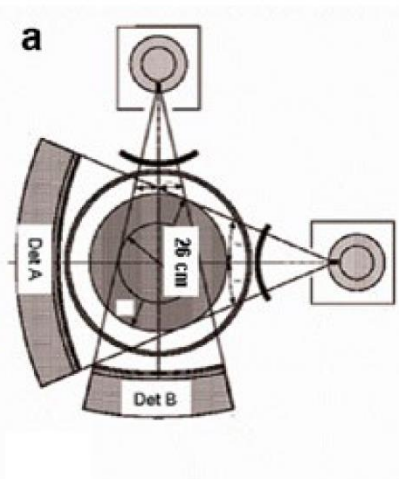
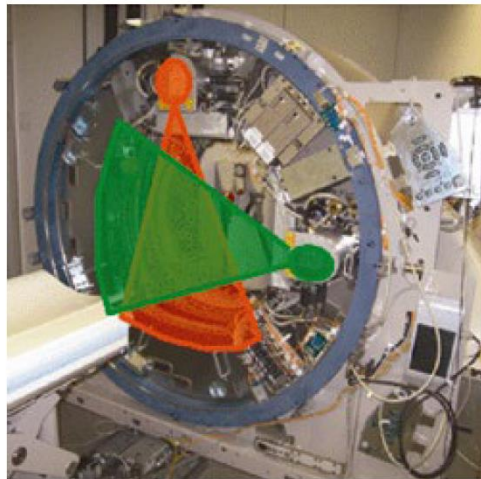
- Different flavours of CT imaging
 - Single-energy CT
 - Dual-energy CT
 - Spectral CT
 - Cone Beam CT (for dose recalculation)
 - Proton CT
- MR imaging (as in e.g. MR-linac)
 - MR images not directly suitable for dose calculations
 - MR+overriding ρ could be reasonable approximation for MV photon beams, possibly also for proton beams
 - Not suitable for kV, brachytherapy

Current Dual-Energy CT scanners

Dual Source - Dual Detector

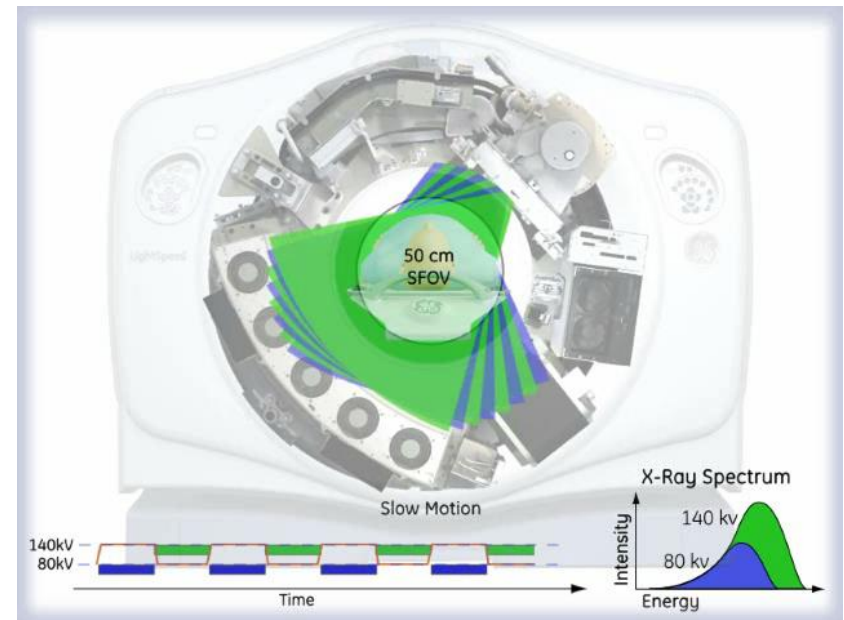
Siemens Definition Force CT

C.N. De Cecco et al. (eds.), *Dual Energy CT in Oncology*,
DOI 10.1007/978-3-319-19563-6_1

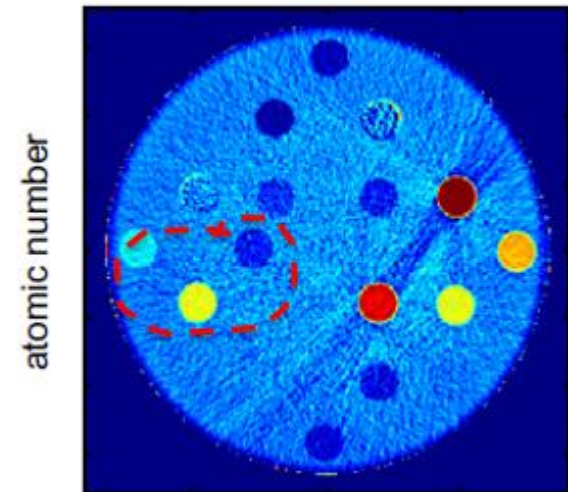
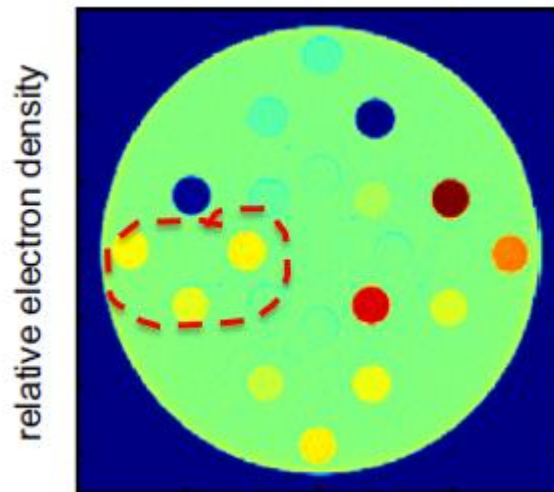


Rapid kV switching tube

GE Revolution GSI CT*



DECT yields density and atomic numbers



Atomic number images:
Bringing out differences in materials with similar densities

Z-images are noisy!

Review paper on DECT in 2016

Radiotherapy and Oncology 119 (2016) 137–144

Contents lists available at [ScienceDirect](#)

 **ELSEVIER**

Radiotherapy and Oncology

journal homepage: www.thegreenjournal.com



Review: Dual Energi CT

Dual energy CT in radiotherapy: Current applications and future outlook

Wouter van Elmpt^{a,*}, Guillaume Landry^b, Marco Das^c, Frank Verhaegen^{a,d}

 CrossMark

Applications in:

- brachytherapy
- MV photons
- protons

The type of CT scanner matters

EDGE: twinbeam

FLASH: dual-source

FORCE: dual-source

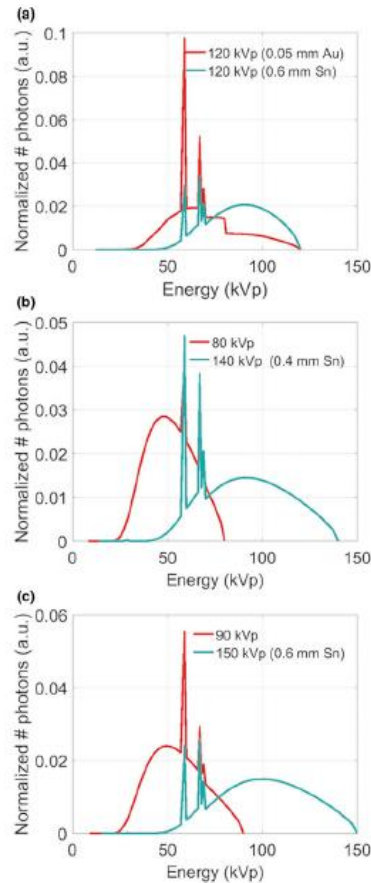


FIG. 1. Normalized X-ray photon spectra used in the EDGE (a), FLASH (b) and FORCE (c) scanners. All high energy spectra have a Sn filtration (0.6 mm for the EDGE and FORCE and 0.4 mm for the FLASH). The EDGE low energy spectrum has a gold (Au) filter of 0.05 mm.

Dual-energy CT quantitative imaging: a comparison study between twin-beam and dual-source CT scanners

Isabel P. Almeida, Lotte E. J. R. Schyns, Michel C. Öllers, and Wouter van Elmpt

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Frank Verhaegen^{a)}

Department of Radiation Oncology (MAASTRO), GROW – School for Oncology and Developmental Biology, Maastricht University Medical Centre, Maastricht, The Netherlands

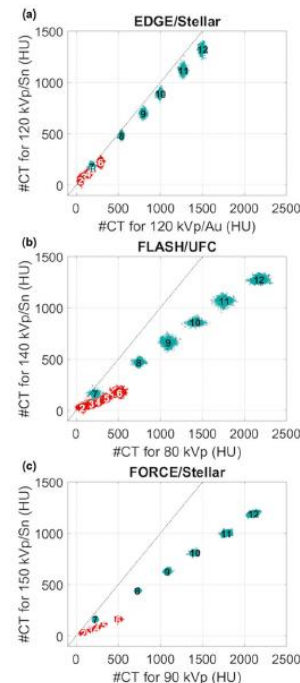
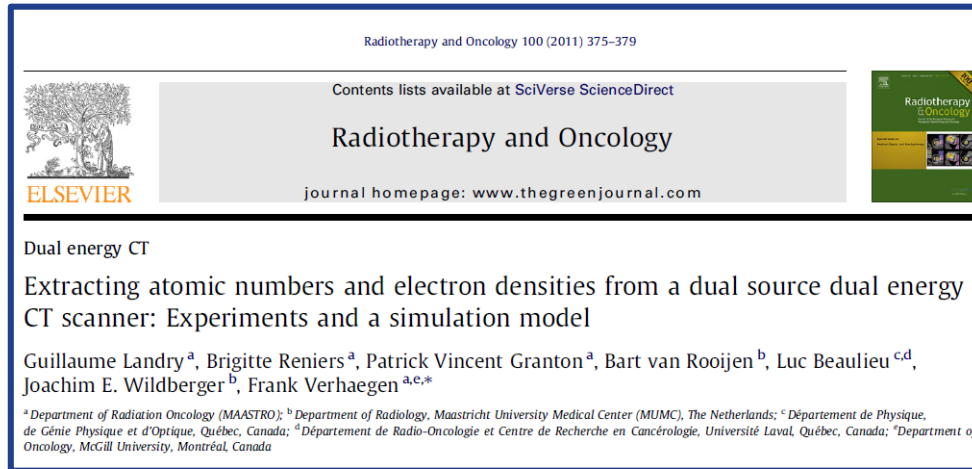


FIG. 3. Low and high energy #CT plots for the iodine (2, 2.5, 5, 7.5, 10, and 15 mg/ml) and calcium (50, 200, 300, 400, 500, and 600 mg/ml) inserts for CTDL₅₀ of approximately 20 mGy for the EDGE (a), FLASH (b), and FORCE (c) scanners. Inserts are numbered from low to high density, in which the iodine inserts have numbers 1 to 6 (iodine 2 mg/ml and 2.5 mg/ml overlap) and the calcium inserts are numbered from 7 to 12. The identity line is plotted in black and each scatter point corresponds to one pixel from each insert's ROI.

EDGE has very poor separation of Hounsfield Units

DECT in low energy photons (brachytherapy)



IOP PUBLISHING

PHYSICS IN MEDICINE AND BIOLOGY

Phys. Med. Biol. **56** (2011) 6257–6278

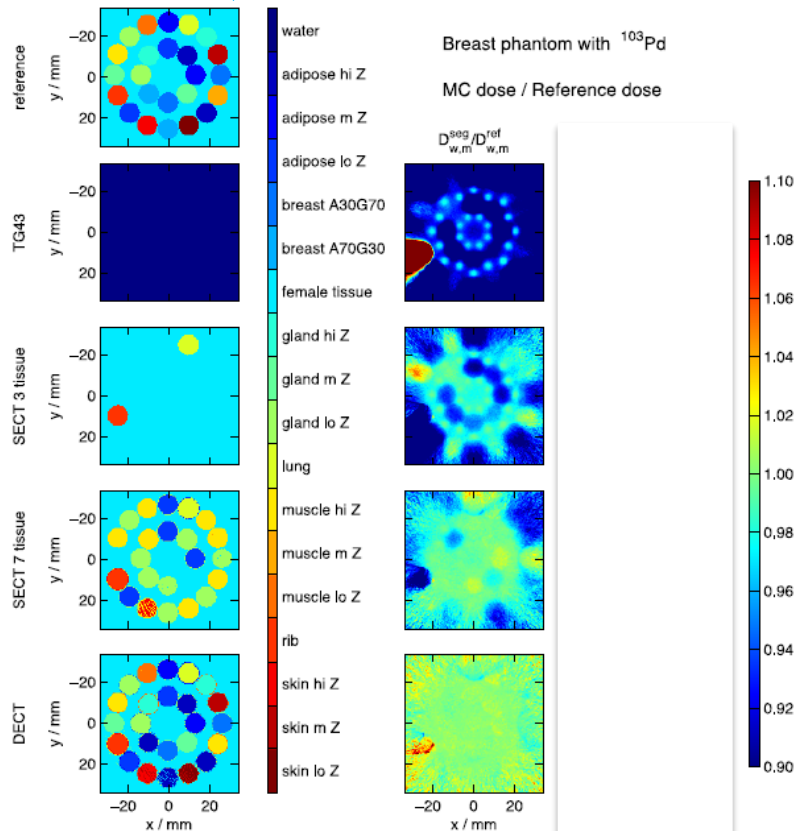
[doi:10.1088/0031-9155/56/19/007](https://doi.org/10.1088/0031-9155/56/19/007)

Simulation study on potential accuracy gains from dual energy CT tissue segmentation for low-energy brachytherapy Monte Carlo dose calculations

Guillaume Landry¹, Patrick V Granton¹, Brigitte Reniers¹, Michel C Öllers¹, Luc Beaulieu^{2,3}, Joachim E Wildberger⁴ and Frank Verhaegen^{1,5}

DECT in low energy brachytherapy dose calculations

DECT leads to much better tissue separation, which is essential for low-energy dose calcs

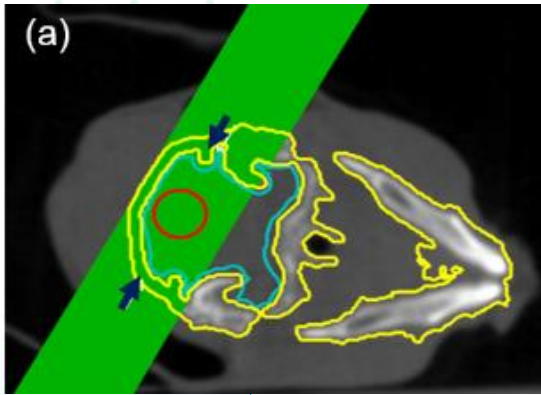


Landry et al. *Sensitivity of low energy brachytherapy Monte Carlo dose calculations to uncertainties in human tissue composition*. Med. Phys. 37, 5188-98, 2010.

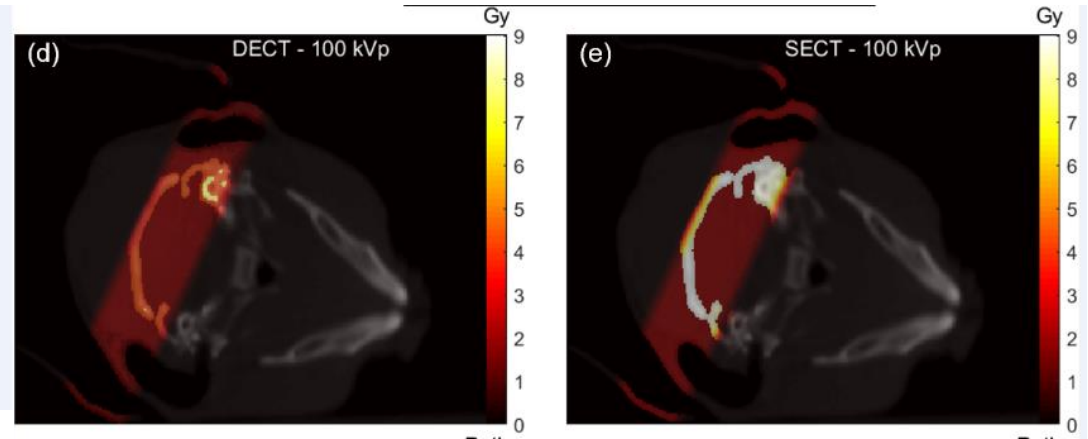
Landry et al. *Simulation study on potential accuracy gains from dual energy CT tissue segmentation for low energy brachytherapy Monte Carlo dose calculations*. Phys. Med. Biol. 56, 6257-78, 2011.

Figure 8. Left: representation of the performance of various segmentation schemes in assigning tissue composition. The top segmentation is the reference. Right: normalized to reference $D_{w,m}$ and $D_{m,m}$ distributions for each segmentation scheme. The radiation source is ^{103}Pd .

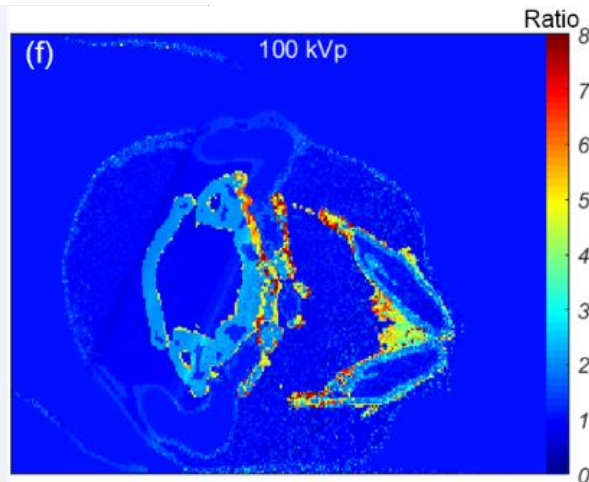
DECT in small animal irradiation



Parallel-opposed beams (100 kVp)
mouse brain tumor treatment plan

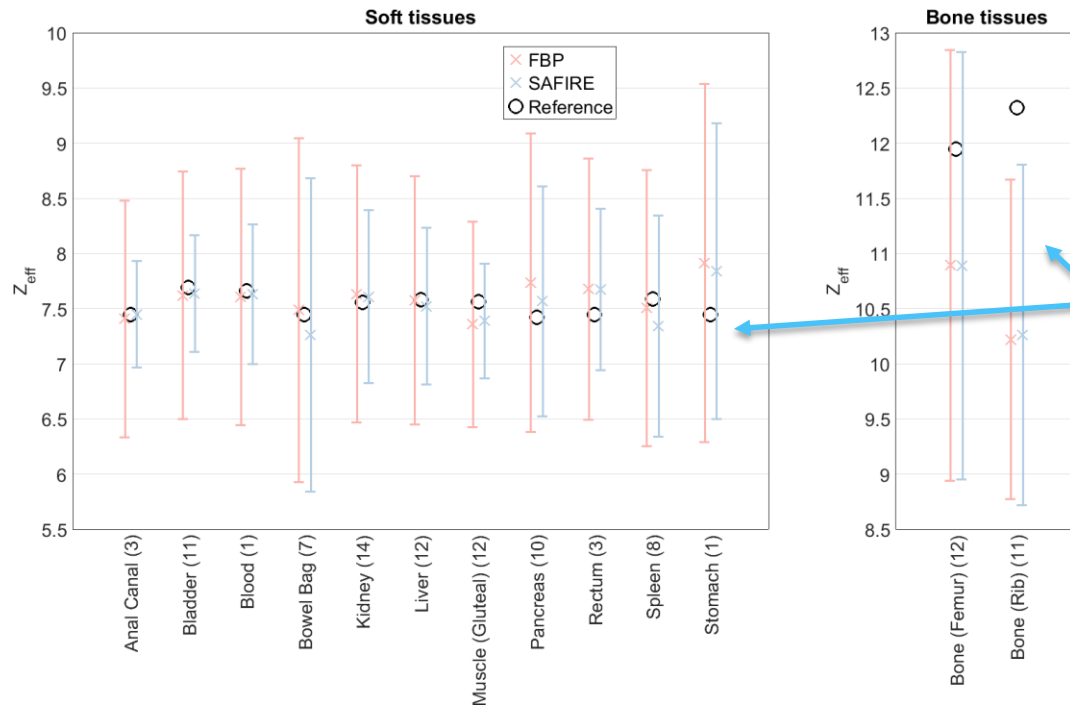


Dose distribution in SECT and DECT images for 100 kVp. SECT has only one type of bone.



Dose ratio (SECT/DECT) for 100 kVp: large dose differences in bone and adipose

DECT to determine human tissue composition: atomic number Z_{eff}

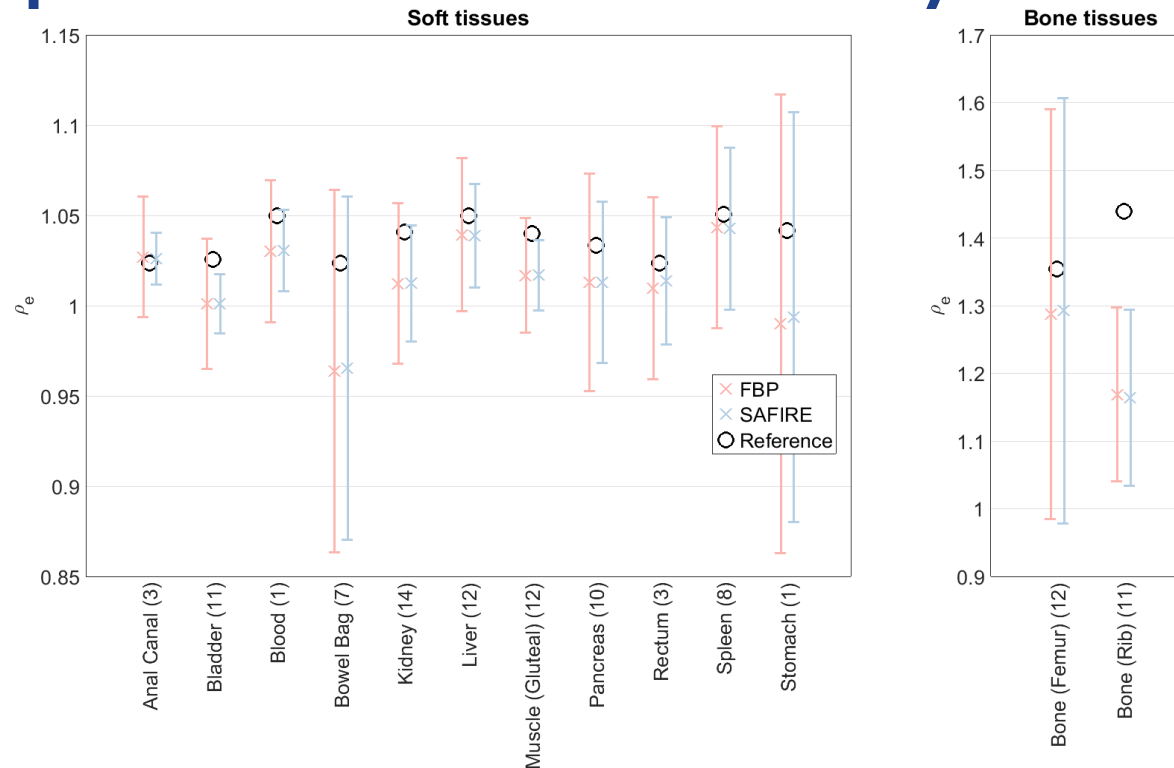


Large mean standard deviation over pts

- 26 patients, organs contoured
- DECT compared to W&W86: agrees reasonably
- DECT with different reconstruction methods:

filtered backprojection
Iterative reconstruction

DECT to determine human tissue composition: electron density

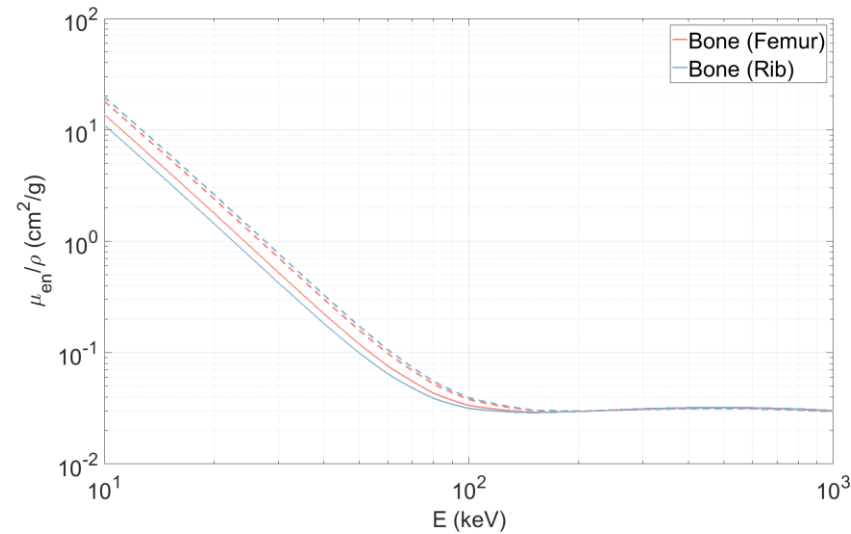


≈3-4% difference (DECT – W&W86) in soft tissues

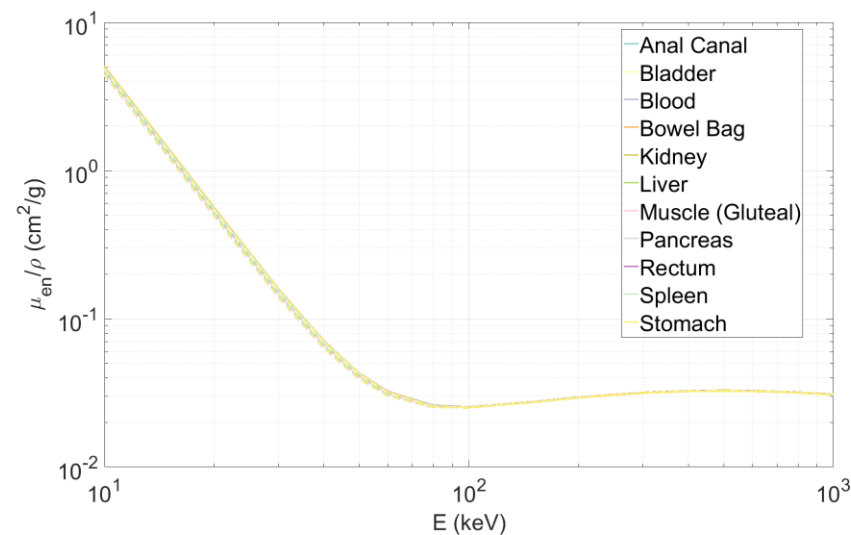
Larger differences in bone

⇒ you should take the ρ_e from the CT image, not from W&W86

Dose differences (μ_{en}/ρ)



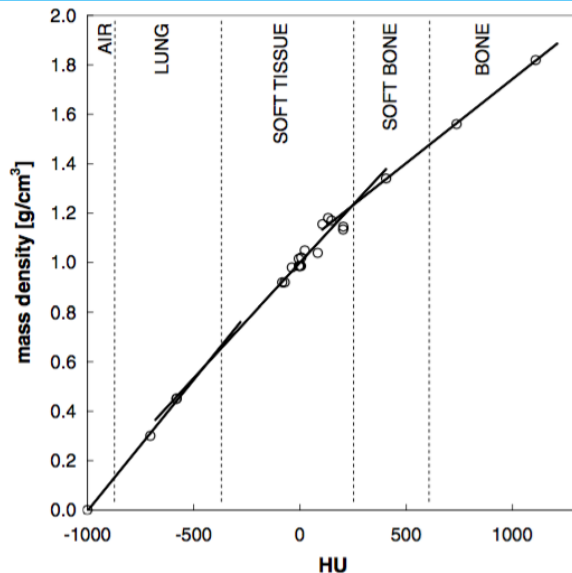
— DECT extracted
-- W&W86



Improved dose calculation proton therapy: SECT based Stopping Power Ratio

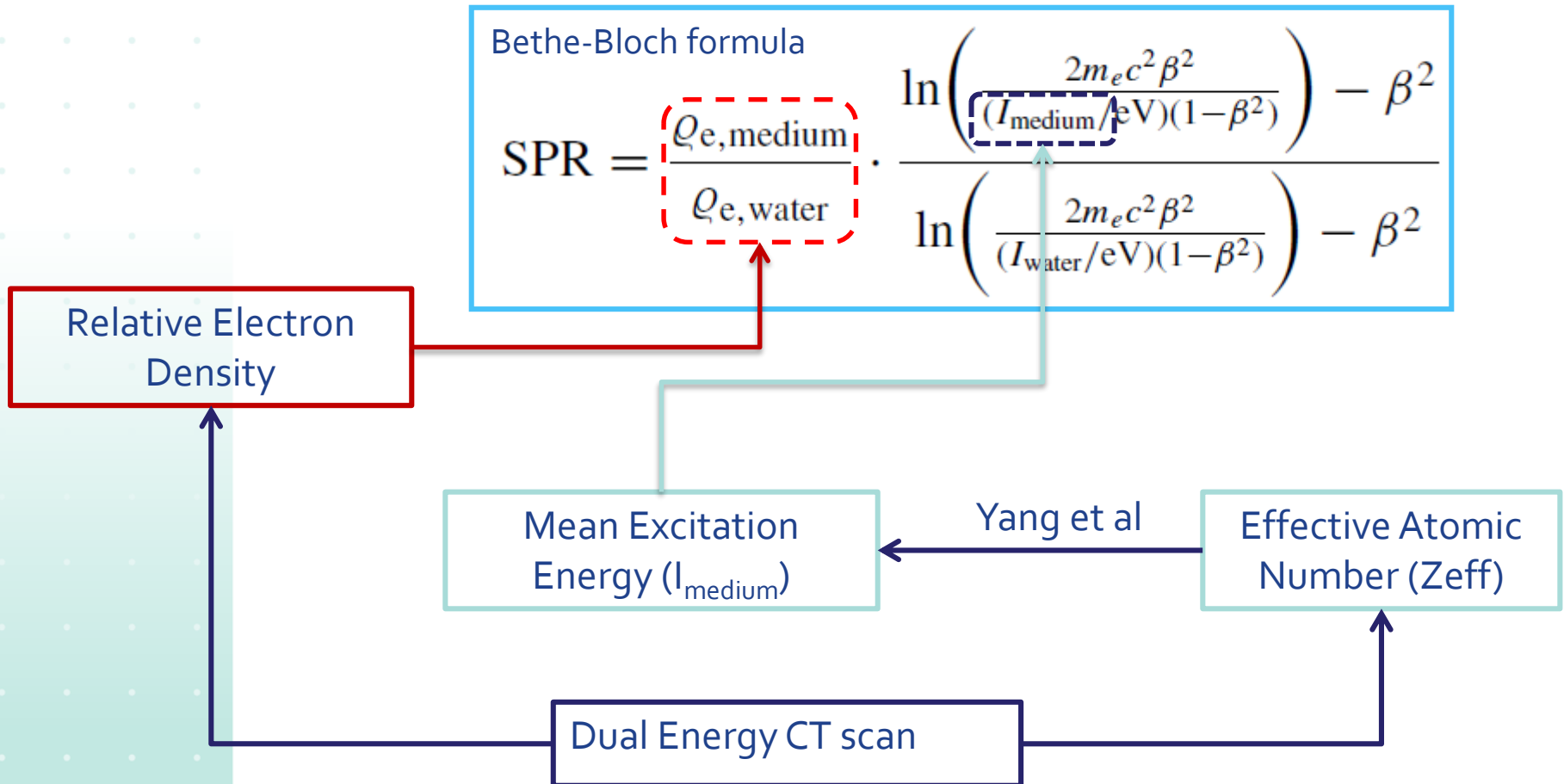
Bethe-Bloch formula

$$\text{SPR} = \frac{\rho_{e, \text{medium}}}{\rho_{e, \text{water}}} \frac{\ln \left(\frac{2m_e c^2 \beta^2}{I_{\text{medium}}/eV (1-\beta^2)} \right) - \beta^2}{\ln \left(\frac{2m_e c^2 \beta^2}{(I_{\text{water}}/eV)(1-\beta^2)} \right) - \beta^2}$$

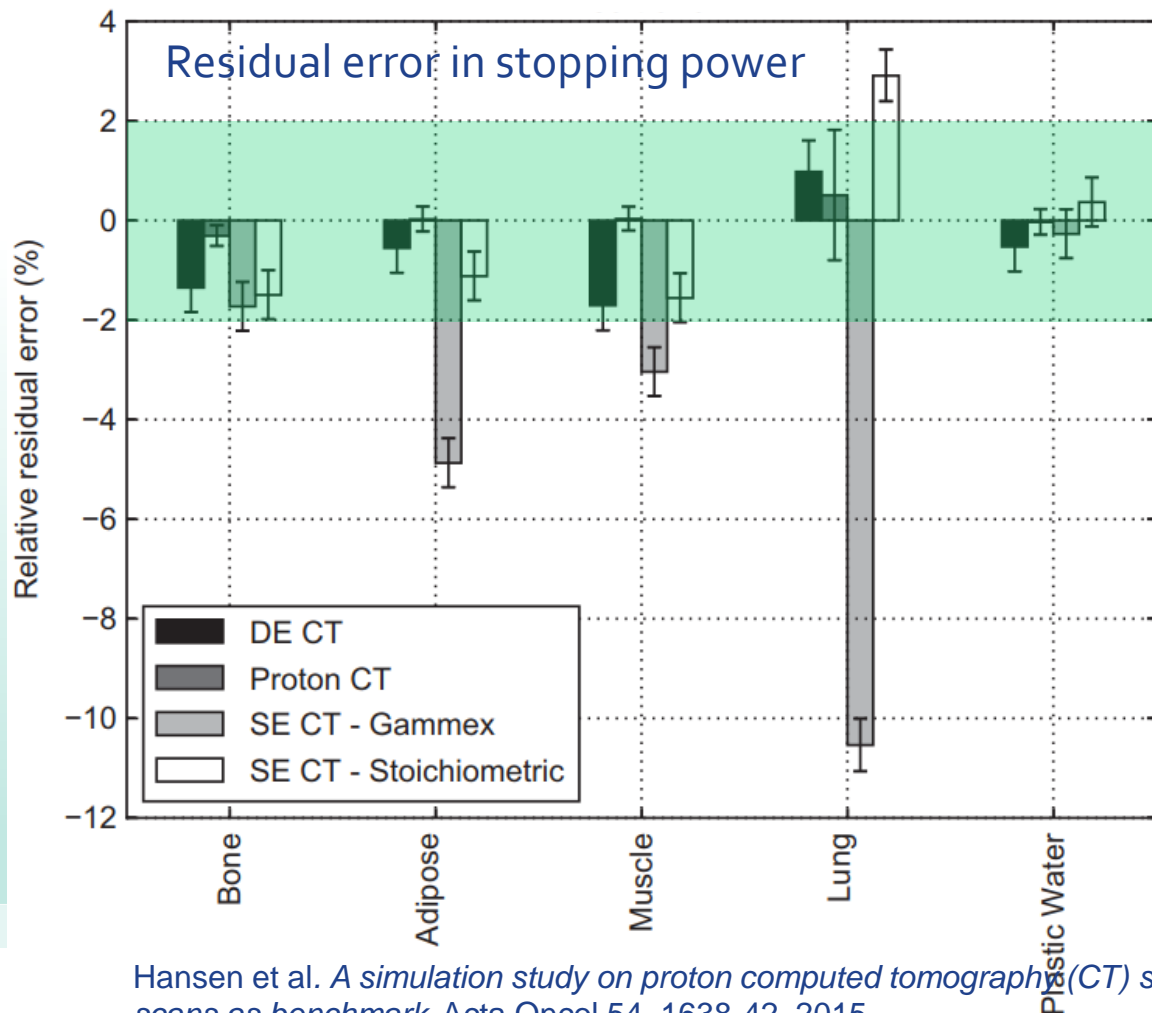


- CT Calibration curve
 - ρ_e
 - Material \Rightarrow Ionization potential
- Choices to be made:
 - how many linear segments should be used?
 - which tissue-equivalent materials are suitable for calibration?
 - where should the boundaries between tissue types be set?

DECT based estimation of Stopping Power Ratio



Comparison different approaches for SPR estimation: SECT vs DECT vs proton CT

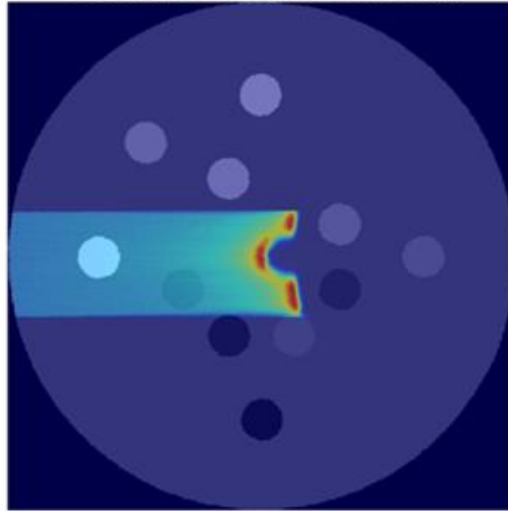


Conversion of SECT into stopping power results in ~3-4% range uncertainty

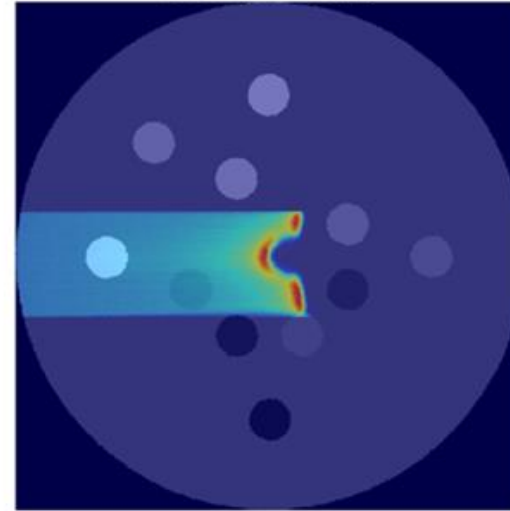
DECT allows for a reduction in this uncertainty → smaller safety margins

DECT vs SECT proton range

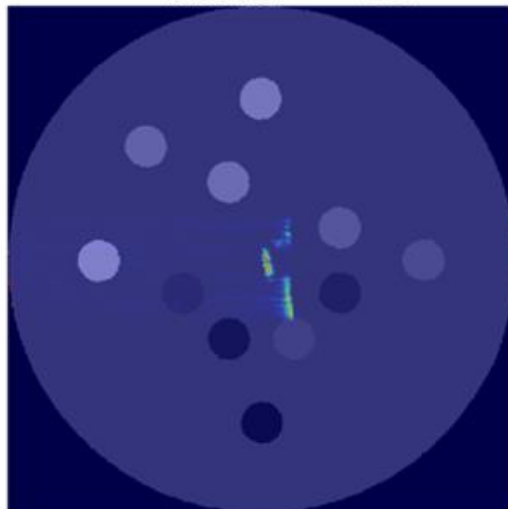
DECT (dual-spiral 80-140kVp)



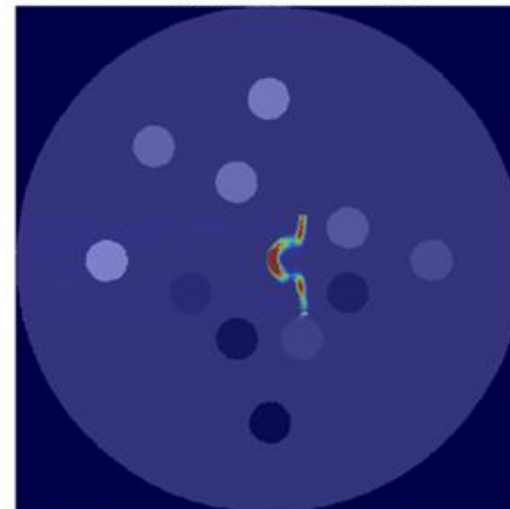
SECT (120 kVp)



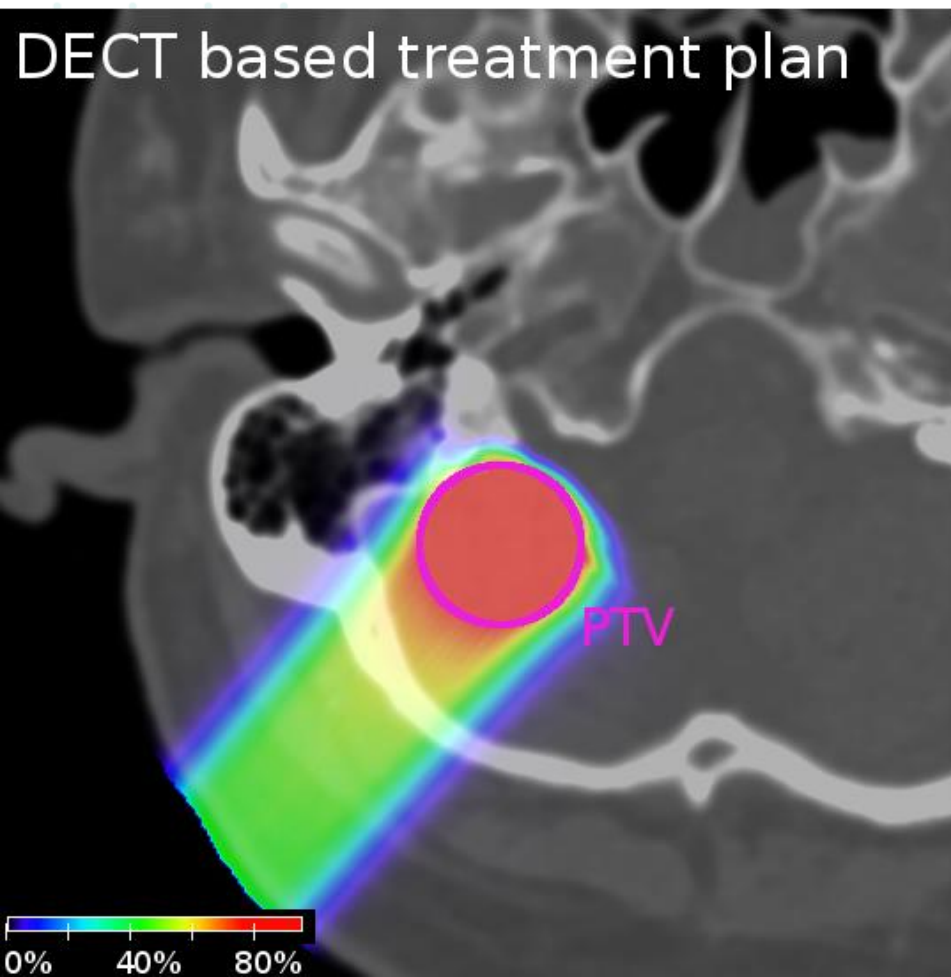
$\text{dose}_{\text{reference}} - \text{dose}_{\text{DECT}}$



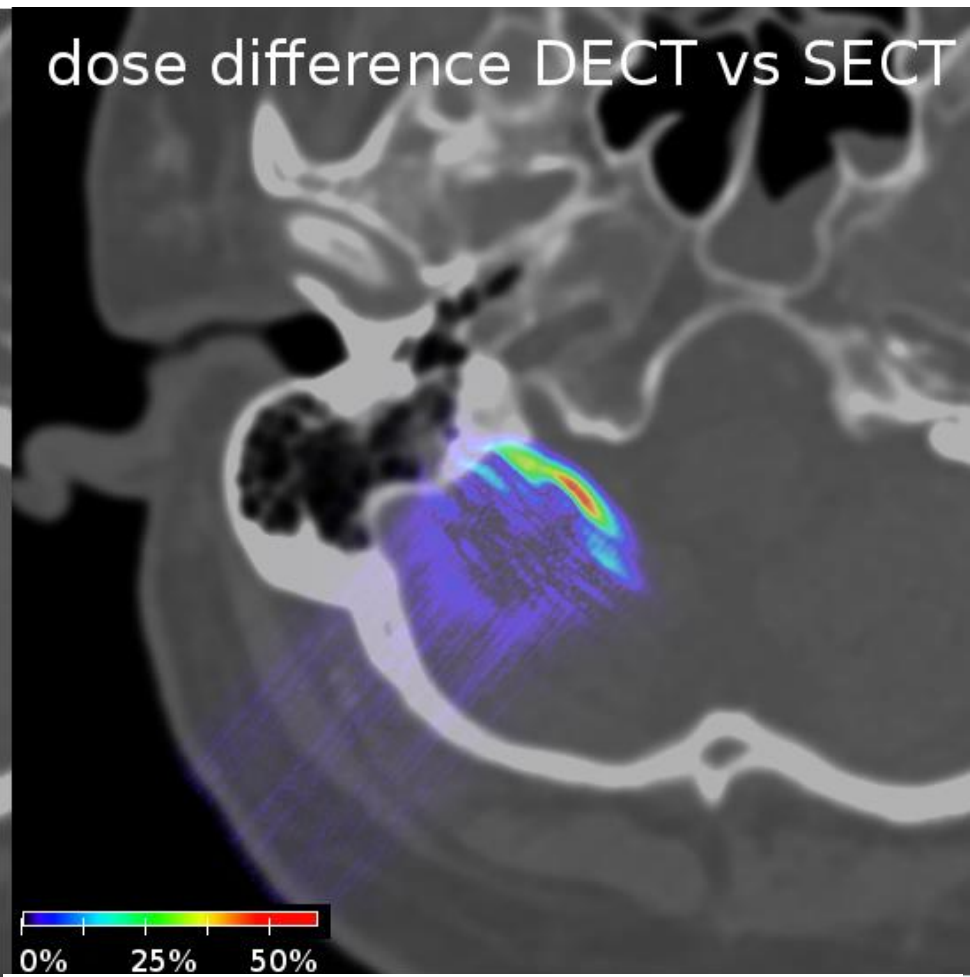
$\text{dose}_{\text{reference}} - \text{dose}_{\text{SECT}}$



DECT vs SECT: Proton therapy plan



Courtesy: Guillaume Landry, LMU



Hudobivnik et al. Med Phys 2016

Remark

- No treatment planning system can currently handle DECT images directly
 - Varian/Siemens, RaySearch, ... are thinking about it
- Can already use the improved electron density from DECT
- Atomic number info / tissue segmentation can only be used indirectly currently
- Pseudo-monochromatic images could be used e.g. for contouring

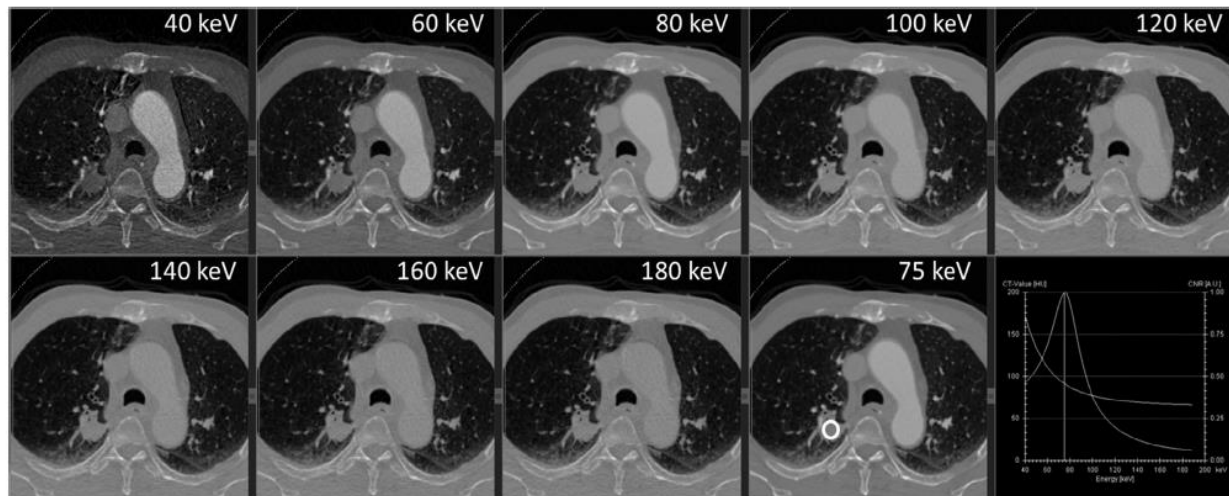


Fig. 2. Example of a mono-energetic reconstruction of a lung cancer patient. Various keV energy levels are reconstructed ranging from 40 keV to 180 keV. The bottom right panel shows the average Hounsfield Unit inside the region of interest together with an estimate of contrast-to-noise ratio, showing that 75 keV was optimal for this patient.

Noise reduction in Z-images with iterative reconstruction

Improved dose calculation accuracy for low energy brachytherapy by optimizing dual energy CT imaging protocols for noise reduction using sinogram affirmed iterative reconstruction

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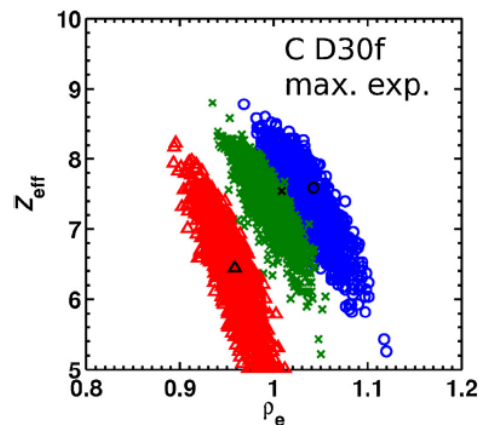
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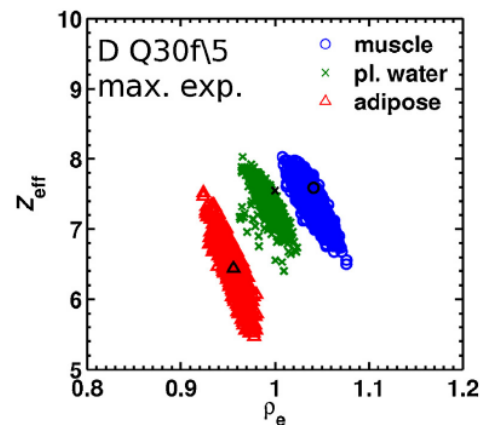
^eDepartment of Radiology, Maastricht University Medical Center (MUMC), Maastricht, The Netherlands

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Filtered backprojection



Iterative reconstruction



Applications of DECT in-vivo range measurements in ion therapy

C, O emit positrons (+annihilation photons) or prompt gammas

- Determine Z_{eff} from DECT
- Determine C, O concentrations from Z_{eff}

IOP PUBLISHING

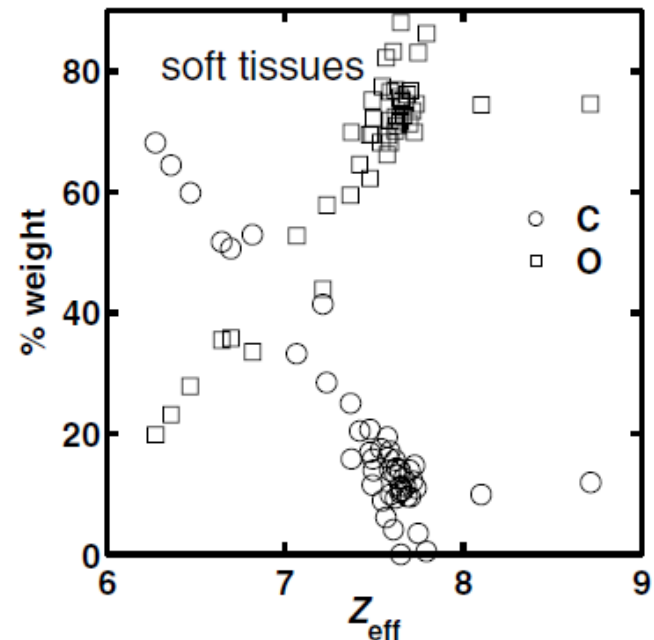
PHYSICS IN MEDICINE AND BIOLOGY

Phys. Med. Biol. 58 (2013) 5029–5048

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Deriving concentrations of oxygen and carbon in human tissues using single- and dual-energy CT for ion therapy applications

Guillaume Landry¹, Katia Parodi², Joachim E Wildberger³
and Frank Verhaegen^{1,4}



% weight for C, O vs Z_{eff}

Conclusions: What have we learned from all these studies

- DECT gives better estimates of ρ_e : good for all dose calculations
- DECT gives Z-maps: good for low energy photons and protons
- DECT gives better estimates for proton SPR
- It matters which CT scanner you're using
- Tissue compositions are uncertain 😞
 - Both in academic sense & in how you derive them from imaging
 - Human tissues need more study
 - Animal tissues completely unknown

Future work

- Do we need individual tissue compositions?
 - How?
- Or are averages (with age?) sufficient?
- Do we need spectral CT to characterize tissues

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 - Siemens Healthineers
 - IBEX
 - Eurostars (EU) research program

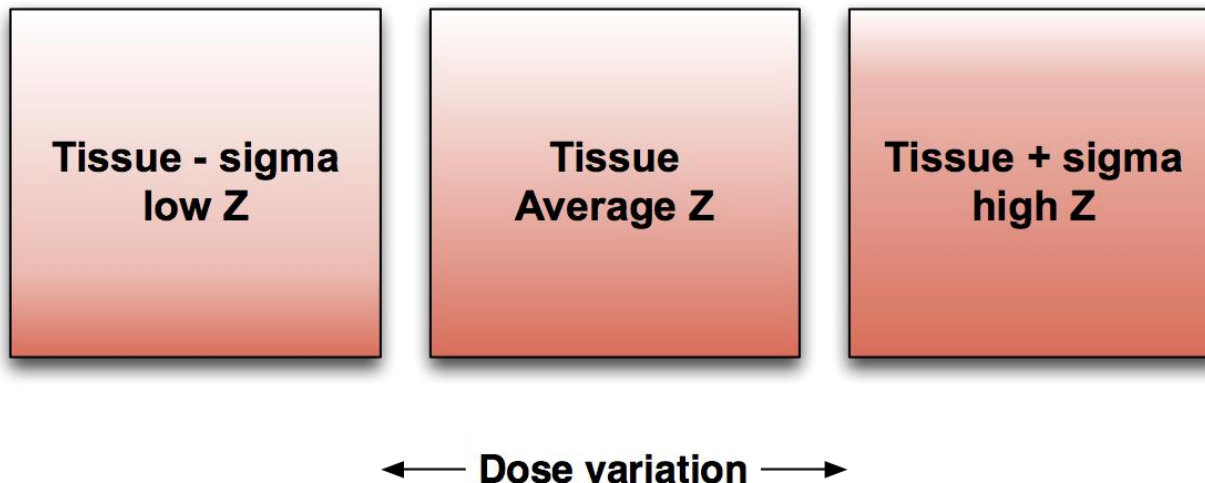
Backup slides

“Dead mouse moving”



Sensitivity of dose calcs to tissue composition

- Assess the influence in tissue composition and its variation across the population on dose calculations
- Compare everything to water (commonly used for low-energy photons (brachytherapy))

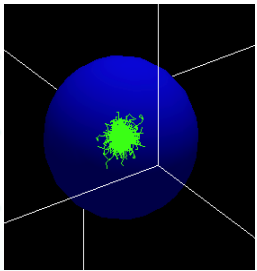


A good way to misassign densities

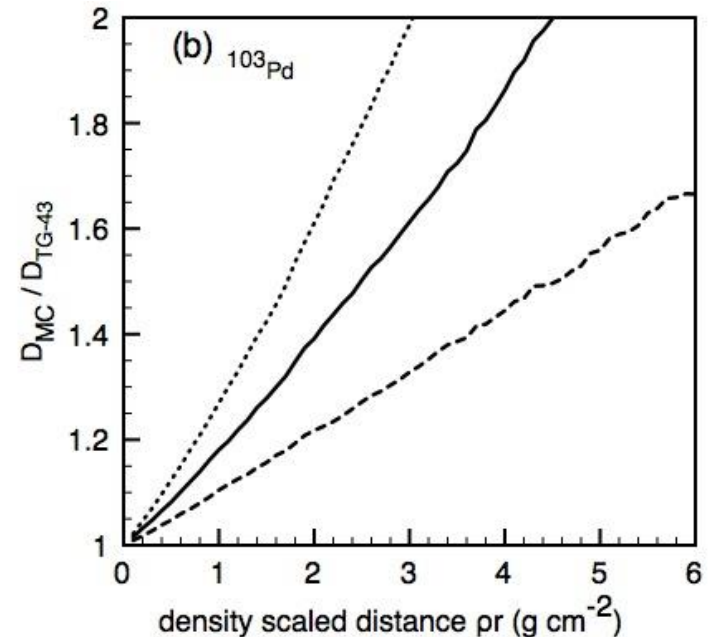
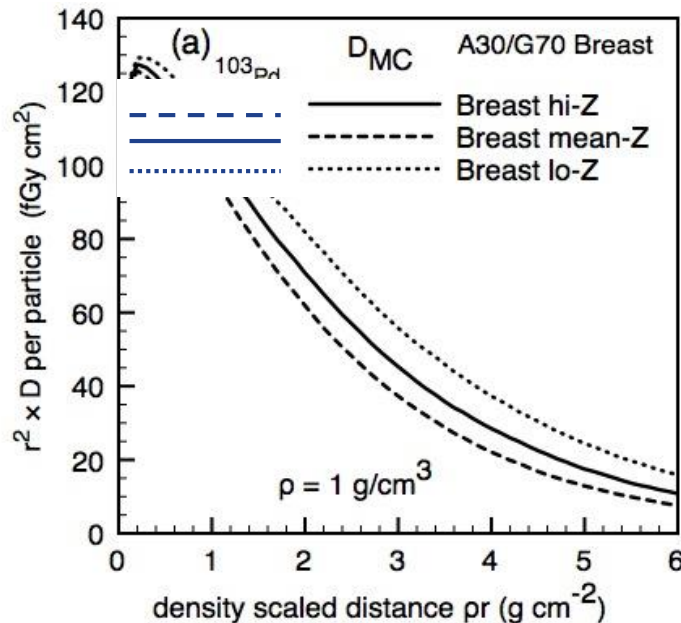
- For tissue compositions everyone refers to W&W86
- In clinical practice $\rho(e)$ is commonly deduced from CT scan
 - We have seen the calibration is critical
- If one would get ρ from W&W86
 - ⇒ additional 2% uncertainty

Moreover, ρ depends on temperature, so make sure you use the 37° density values!

Simulation - breast tissue (adipose + gland)



Point source in infinite geometry



- D can differ from D_{water} by $>80\%$ in 3cm
- Difference due to variation in breast composition
- Different low energy sources behave differently

Even trace elements influence the dose

TABLE III. Material definitions. Water is given for comparison.

Tissue	H	C	N	O	Z > 8	Mass density
	% by weight					g·cm ⁻³
Prostate ¹⁰⁵	10.5	8.9	2.5	77.4	Na(0.2), P(0.1), S(0.2), K(0.2)	1.040
Mean adipose ¹⁰⁵	11.4	59.8	0.7	27.8	Na(0.1), S(0.1), Cl(0.1)	0.95
Mean gland ¹⁰⁵	10.6	33.2	3.0	52.7	Na(0.1), P(0.1), S(0.2), Cl(0.1)	1.02
Mean soft tissue ¹⁰⁴	10.1	11.1	2.6	76.2		1.00
Mean skin ¹⁰⁴	10.0	20.4	4.2	64.5	Na(0.2), P(0.1), S(0.2), Cl(0.3), K(0.1)	1.09
					Na (0.1), Mg (0.2), P (10.3), S (0.3),	

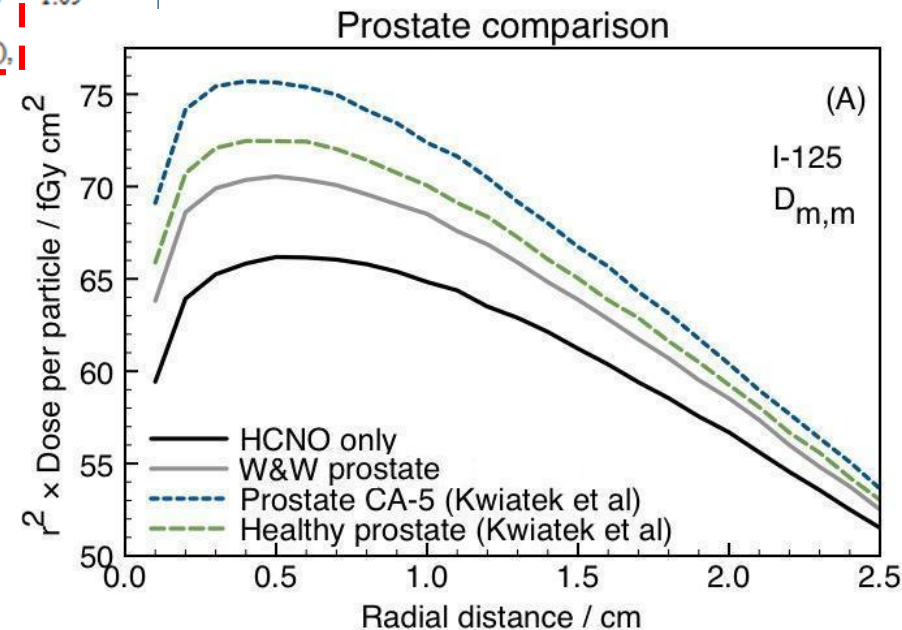
Woodard and White, 1986

- > 10% difference compared to pure HCNO
- Dependence on distance

⇒ photo-electric effect is to blame!

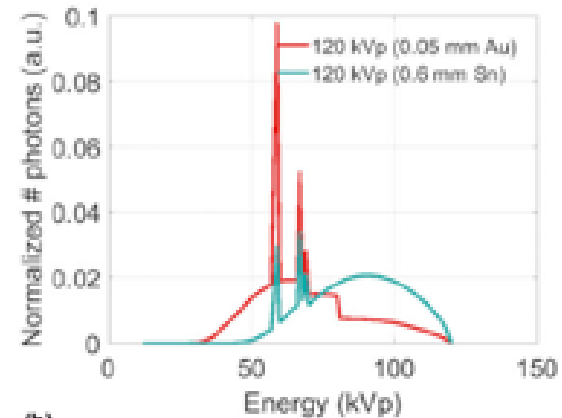
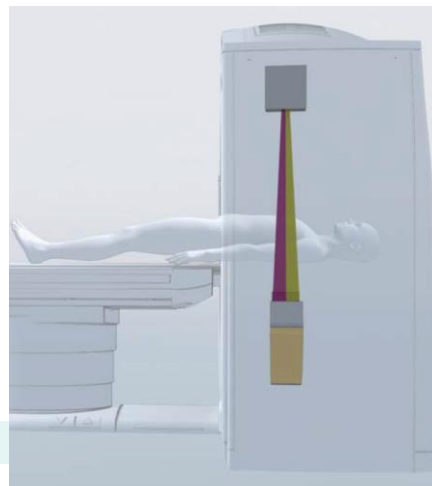
What about prostate calcifications?

Difference between healthy/cancerous tissue?



Imaging technology for Dual Energy CT

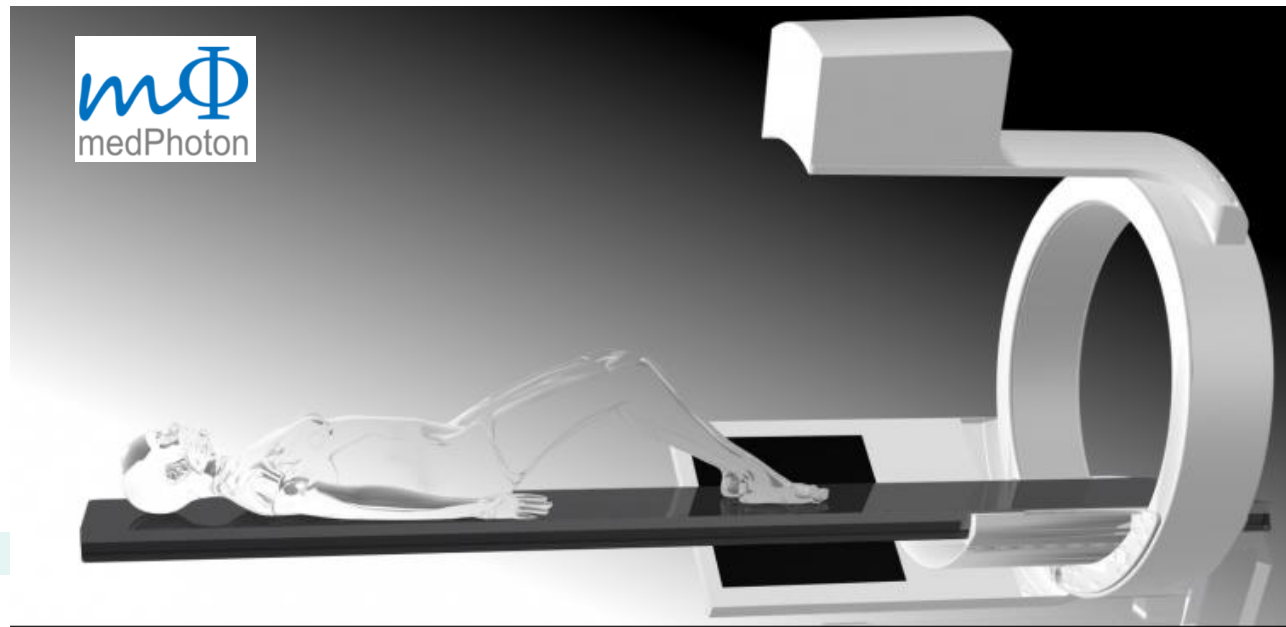
- Rotate-Rotate DECT: two sequential helical CT scans at different kVp ('poor man's DECT')
- Dual Source – Dual Detector approach (Siemens)
- Rapid kV switching (GE)
- Dual-layer detector technology (Philips)
- Single Source – sequential rotations with different kVp (Toshiba)
- Split-beam (Siemens)



Split filter: Au and Sn

Dual energy Cone Beam CT: Imaging Ring System (medPhoton)

- CBCT with Rapid-switching dual-energy system
- Independent x-ray source and imaging panel
- Many more degrees of freedom compared to conventional CBCT
- Project to develop multi-energy imaging system for photon and proton radiotherapy



MC dose calculation is perfect, but it requires imperfect images as input

Sensitivity study 2005

CT artifacts exaggerated in MC (due to material assignment, artifacts can be set to bone)

Stoechiom method + problems with different phantoms

Sensitivity of low energy photon dose calculations

Trace elements

Where to get data on human tissues? (story of ORNL)

Mostly CT, sometimes MRI (look up papers MR based dose calculations – would be very logical for MR-linac)

CT comes in many flavors: CT/DECT/ spectral CT/ CBCT

Using different CT scanners can lead to different results: some CT scanners especially made for radiotherapy are not doing all that well

DECT works for brachy (esp low energy)!

No TPS can handle DECT

Small animal systems, a kV application where it matters

-DECT, spectral CT

Protons: seems to be consensus SPR are better estimated, but by how much?

“Dead mouse moving”

Lotte’s tissue overview

TG186 recommendations

Is there an advantage for MV? Perhaps contouring

General DECT info (PMI, Zeff, ...)

Radiomics

Overview TPS: which imaging data can they handle?