# Material Characterization using Spectral X-ray CT



Matteo Busi PhD Student, DTU

October 23, 2018



LLNL-PRES-760324 (IM948925)

This work was performed under the auspices of the U.S. Department of Energy by Lawrence Livermore National Laboratory under contract DE-AC52-07NA27344. Lawrence Livermore National Security, LLC



### Introduction

- PhD Project: Model-Optimized screening of Checked-in Luggage
- Goals:
  - ✓ Increase the threat detection accuracy
- How?
  - ✓ Spectral X-ray detectors
  - ✓ Physical-based models









## **Current Techniques**





Conventional and Dual Energy CT:

Detectors integrate radiation over large energy range

- Beam hardening and polychromatic effects induce non-linear artifacts
- Highly attenuating materials (high-Z) completely attenuate low-energy photons



# **Current Techniques**





Conventional and Dual Energy CT:

Detectors integrate radiation over large energy range

- Beam hardening and polychromatic effects induce non-linear artifacts
- Highly attenuating materials (high-Z) completely attenuate low-energy photons
- Spectral CT:

Detectors discriminate the energy of single photons into Energy bins

- Spectral distortions (pile-up, charge sharing etc.) induce non-linear artifacts



### **Spectral detectors**

#### Multix ME-100



Specs	Multix ME-100
Pixel Pitch	800 µm (linear)
Pixel array	128
Sensor type	CdTe
Thickness	3 mm
Energy range	20-160 keV, 1.1 keV bins
Acquisition	1 ms - 100 ms
Time	
Count Rate	1,250,000
	Photons/s/mm

#### Spectral X-ray Computed Tomography (SCT):

 Simultaneous energy resolved measurement of the Linear Attenuation Coefficient (LAC): μ(E)





SIRZ<sup>+</sup> and SIRZ-2<sup>‡</sup> techiques introduced material characterization into system-independent features:

• Effective atomic number: Z<sub>e</sub>

• Electron density: 
$$\rho_e \left(\frac{e^{-1}mol}{cm}\right)$$

<sup>+</sup> S. G. Azevedo et al., **System-independent characterization of materials using dual-energy computed tomography**, IEEE Transactions on Nuclear Science 63 (1) (2016) 341–350.

<sup>‡</sup>K. M. Champley et al., **Method to extract system-independent material properties from dual-energy X-ray CT**, Submitted to IEEE Transactions on Nuclear Science (2018).



### System-independent material features

•  $\sigma_e(Z_e, E)$ : electronic cross sections (NIST standard tables)

SIRZ<sup>+</sup> and SIRZ-2<sup>‡</sup> techiques introduced material characterization into system-independent features:

- Effective atomic number: Z<sub>e</sub>
- Electron density:  $\rho_e \left(\frac{e^{-1}mol}{cm}\right)$

These are used to model the LAC:



<sup>‡</sup>K. M. Champley et al., **Method to extract system-independent material properties from dual-energy X-ray CT**, Submitted to IEEE Transactions on Nuclear Science (2018).

ES:  

$$Z_{e}$$

$$\frac{10^{1}}{10^{0}}$$

$$\frac{10^{1}}{10^{0}}$$

$$\frac{10^{1}}{10^{0}}$$

$$\frac{10^{1}}{10^{0}}$$

$$\frac{10^{1}}{10^{-1}}$$

$$\mu(E) = \rho_{e}\sigma_{e}(Z_{e}, E)$$

$$\frac{10^{-2}}{20 \ 40 \ 60 \ 80 \ 100 \ 120 \ 140 \ 160}$$
Energy (keV)





Lawrence Livermore National Laboratory

#### 8

- The technique requires dual-energy CT acquisitions, and knowledge about the source and detectors
- Using calibrated Detectors Spectral Response, the low- and high-energy scans are transformed into synthetic monochromatic sinograms  $\mu_{low}$ ,  $\mu_{high}$







wrence Livermore National Laboratory -PRES-760324

SIRZ-2 Briefed

150

- The technique requires dual-energy CT acquisitions, and knowledge about the source and detectors
- Using calibrated Detectors Spectral Response, the low- and high-energy scans are transformed into synthetic monochromatic sinograms  $\mu_{low}$ ,  $\mu_{high}$
- Volume Reconstruction and transformation into  $\rho_e, Z_e$ :







Using the SCT the energy dependence is collected simultaneously





• Using the SCT the energy dependence is collected simultaneously



- The detector spectral responses are calculated directly from flat field (I<sub>0</sub>) scans, by choosing the low- and high-energy intervals
- The acquisition is transformed into synthetic dual-energy data, integrating the energy bins within the two energy intervals



# **New Method: SRZE (Spectral** $\rho_e/Z_e$ **Estimation)**

Idea:

- SCT provides energy dependence of the measured LAC:  $\mu(E)$
- Estimate  $\rho_e$ ,  $Z_e$  from the LAC:

 $\mu(E) = \rho_e \sigma_e(Z_e, E)$ 





Idea:

- SCT provides energy dependence of the measured LAC:  $\mu(E)$
- Estimate  $\rho_e$ ,  $Z_e$  from the LAC:

$$\mu(E) = \rho_e \sigma_e(Z_e, E)$$

How:

Solving

$$\underset{\{\rho_e, Z_e\}}{\operatorname{argmin}} \sum_{E=1}^{N_E} \lambda_E |\mu_E - \rho_e \sigma_e(Z_e, E)|^2$$

• 
$$\lambda_E$$
: Energy weights;  $\lambda_E = \frac{1}{s^2(\mu(E))}$ ;  $s^2$ : variance



#### \* E. S. Dreier et al., **Spectral correction algorithm for multispectral CdTe x-ray detectors**, Optical Engineering 57 (5) (2018) 054117.

#### **SRZE Routines**

#### **1.** Detector Spectral Correction

A flux-dependent correction algorithm\* was developed to correct detector spectral distortions:

- Charge-sharing
- Pile-up
- Escape Peaks
- Insufficient charge collection
- Weighting potential cross talk







### **SRZE Routines**

DTU

- 1. Detector Spectral Correction
- 2. Energy rebinning (optional)





### **SRZE Routines**



- 1. Detector Spectral Correction
- 2. Energy rebinning (optional)

#### **3.** Conversion to attenuation and volume reconstruction

Using Lambert-Beer's law the projections are converted into energy resolved sinograms:

$$\mu(E_k) = -\frac{1}{l} \log\left(\frac{I(E_k)}{I_0(E_k)}\right), \qquad E_k = energy \ bin$$





# 1. Detector Spectral Correction

- 2. Energy rebinning (optional)
- 3. Conversion to attenuation and volume reconstruction
- 4. Region of Interest (ROI) and  $\mu(E)$  retrieval







### **SRZE Routines**



#### Lawrence Livermore National Laboratory LLNL-PRES-760324



# **SRZE Routines**

- **Detector Spectral Correction** 1.
- Energy rebinning (optional) 2.
- Conversion to attenuation and volume reconstruction 3.
- Region of Interest (ROI) and  $\mu(E)$  retrieval 4.

#### **Automated Energy thresholding** 5.









#### Conversion to attenuation and volume reconstruction Region of Interest (ROI) and $\mu(E)$ retrieval Silicon Automated Energy thresholding -Measurement $\mu(E)(cm^{-1})$ **Features Estimation** $-\rho_e, Z_e$ Fit Reference $\underset{\{\rho_e, Z_e\}}{\operatorname{argmin}} \sum_{E=1}^{N_E} \lambda_E |\mu_E - \rho_e \sigma_e(Z_e, E)|^2$ 2• $\lambda_E = \frac{1}{s^2(\mu(E))}$ ; $s^2$ : variance 0 50100 Energy (keV)

- 1. **Detector Spectral Correction**
- 2. Energy rebinning (optional)
- 3.
- 4.
- 5.
- 6.

## **SRZE Routines**



150

### **Experiments**

#### Samples

- 1. Carousel with 6 samples
  - Silicon, Graphite B, Magnesium, Water, PTFE, POM
- 2. Individual materials
  - Silicon, Titanium, Aluminum, Graphite A, Graphite A
- 360 Projections between 0° and 360°
- 100ms integration time, total exposure per projection: 5 s (average of 50 acquisitions)
- Filament current: 0.5 mA
- 2mm Al Filter
- Source-detector distance: 3000mm, sample-detector: 150mm





### Results











- We have presented a novel method for  $\rho_e/Z_e$  characterization of material from Spectral X-ray CT acquisitions
- The method is free of calibration, and works with any type of spectral detector
- Promising results, specially for high  $\rho_e/Z_e$  materials.







- We have presented a novel method for  $\rho_e/Z_e$  characterization of material from Spectral X-ray CT acquisitions
- The method is free of calibration, and works with any type of spectral detector
- Promising results, specially for high  $\rho_e/Z_e$  materials.

Future work:

- Test robustness of the method to different source condition (filters, source power)
- Test a broader range of  $Z_e$  materials, including K-edges materials







#### Disclaimer

This document was prepared as an account of work sponsored by an agency of the United States government. Neither the United States government nor Lawrence Livermore National Security, LLC, nor any of their employees makes any warranty, expressed or implied, or assumes any legal liability or responsibility for the accuracy, completeness, or usefulness of any information, apparatus, product, or process disclosed, or represents that its use would not infringe privately owned rights. Reference herein to any specific commercial product, process, or service by trade name, trademark, manufacturer, or otherwise does not necessarily constitute or imply its endorsement, recommendation, or favoring by the United States government or Lawrence Livermore National Security, LLC. The views and opinions of authors expressed herein do not necessarily state or reflect those of the United States government or Lawrence Livermore National Security, LLC, and shall not be used for advertising or product endorsement purposes.