

Simulation Study of Muon Beam CT and Integration of MuDirac and Geant4 for Muonic X-ray Generation

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MIP 2024 @ Peking University

April 21, 2024

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 - Improve the cascade process of negative muons in Geant4 with the use of MuDirac

Experimental Muon Source (EMuS)

- EMuS was a research proposal for a muon facility at the China Spallation Neutron Source (CSNS) under the *NSFC Fund for Research on National Major Research Instruments (2016–2021)*.

Research Article |  Full Access

EMuS – A Pulsed Muon Facility for Multidisciplinary Research

Jing-Yu Tang , Ye Yuan, Bang-Jiao Ye, Zi-An Zhu, Zhi-Long Hou, Nikolaos Vassilopoulos, Jian Tang, Yu Chen, Yu-Kai Chen, Chang-Dong Deng, Jing-Yu Dong, Rui-Rui Fan, Chong-Chao He ... [See all authors](#) ▾

First published: 01 September 2022 | <https://doi.org/10.1002/pssa.202200426>

- Two schemes have been designed:

1. Phase-I or the simplified scheme



- Surface muon for μ SR applications
- Negative cloud muon for muonic X-ray analysis

2. Phase-II or the baseline scheme

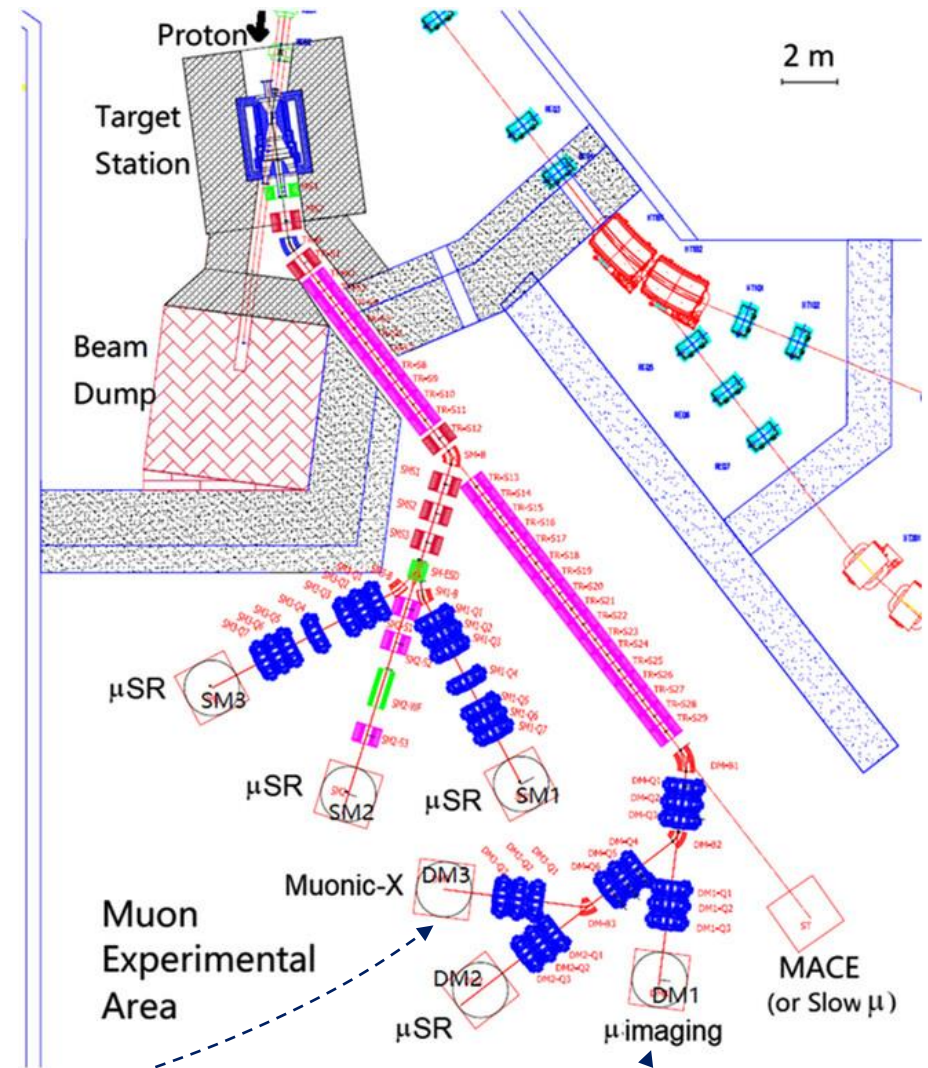


- Surface and decay muons for μ SR
- High-momentum decay muon for imaging
- Negative decay muon for depth-selective muonic X-ray analysis

EMuS Baseline Scheme

- CSNS accelerator facility provides a proton beam with a kinetic energy of **1.6 GeV**, and a repetition rate of **25 Hz**. It currently has a beam power of 140 kW, which can be upgraded to 500 kW at Phase-II. EMuS will take about **5% or 25 kW** of the total beam power (500 kW) from the CSNS-II accelerator complex.
- The high-momentum muon beams for imaging operate at a repetition rate of 2.5 Hz, with a momentum of up to 450 MeV/c and a beam intensity of 7.9×10^8 .

End station	Momentum [MeV c ⁻¹]	FWHM spot size [mm]	Intensity [10 ⁶ μ s ⁻¹]	Polar-z	Δp/p [FWHM]
DM1	450	108 101	790	-0.760	9.7%
DM2	45	29.1 28.6	0.25	0.839	6.5%
DM3	45	31.2 25.8	0.24	-0.858	9.1%
	150	30.3 30.6	10	-0.681	9.1%

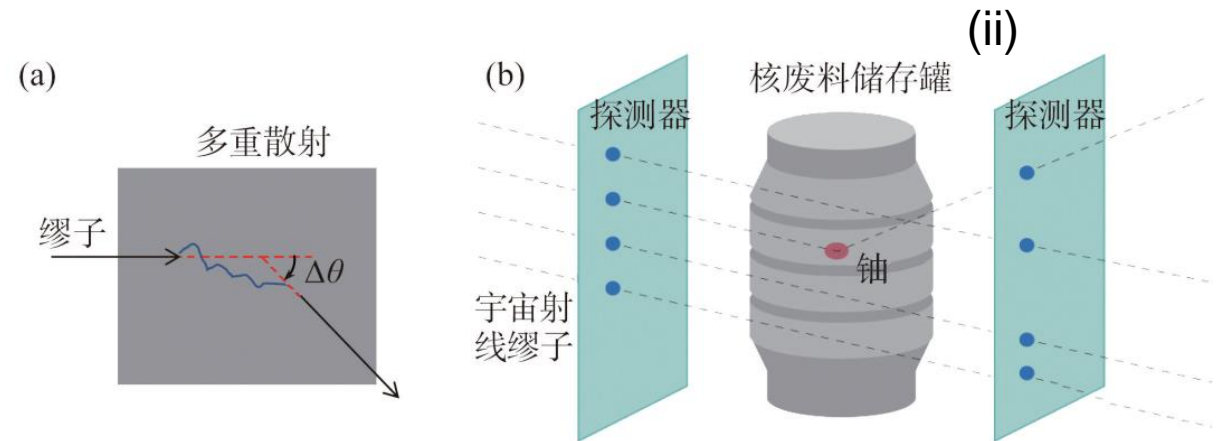
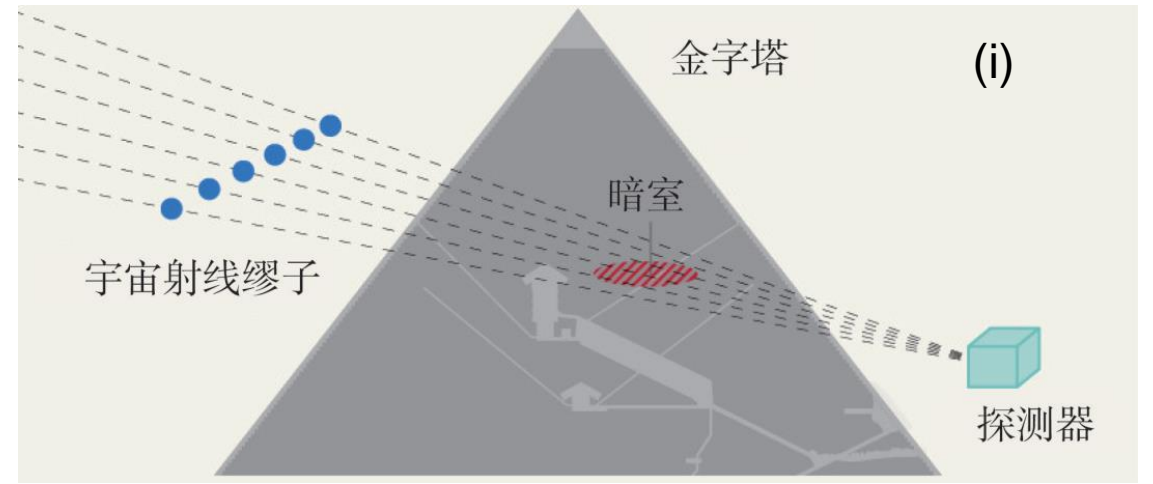


EMuS baseline scheme layout

- **DM1** endstation: high-momentum muon beam imaging
- **DM3** endstation: muonic X-ray analysis

Cosmic-ray Muon Imaging Methods

- Cosmic-ray muons
 - Average energy ~ 4 GeV
 - Up to 100 TeV
 - $\sim 1/(\text{cm}^2 \cdot \text{s})$ at sea level
- Cosmic-ray muons have been used to image large objects
 - Transmission and absorption imaging
 - Muon scattering imaging (Muon tomography)



Cosmic-ray muon imaging methods:

- (i) transmission and absorption
- (ii) scattering

Muon Beam CT

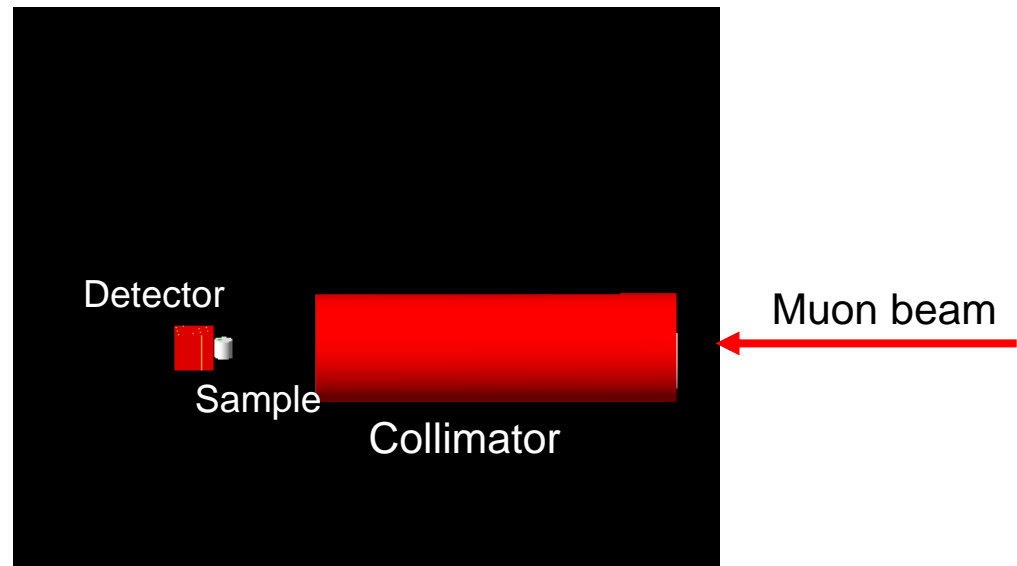
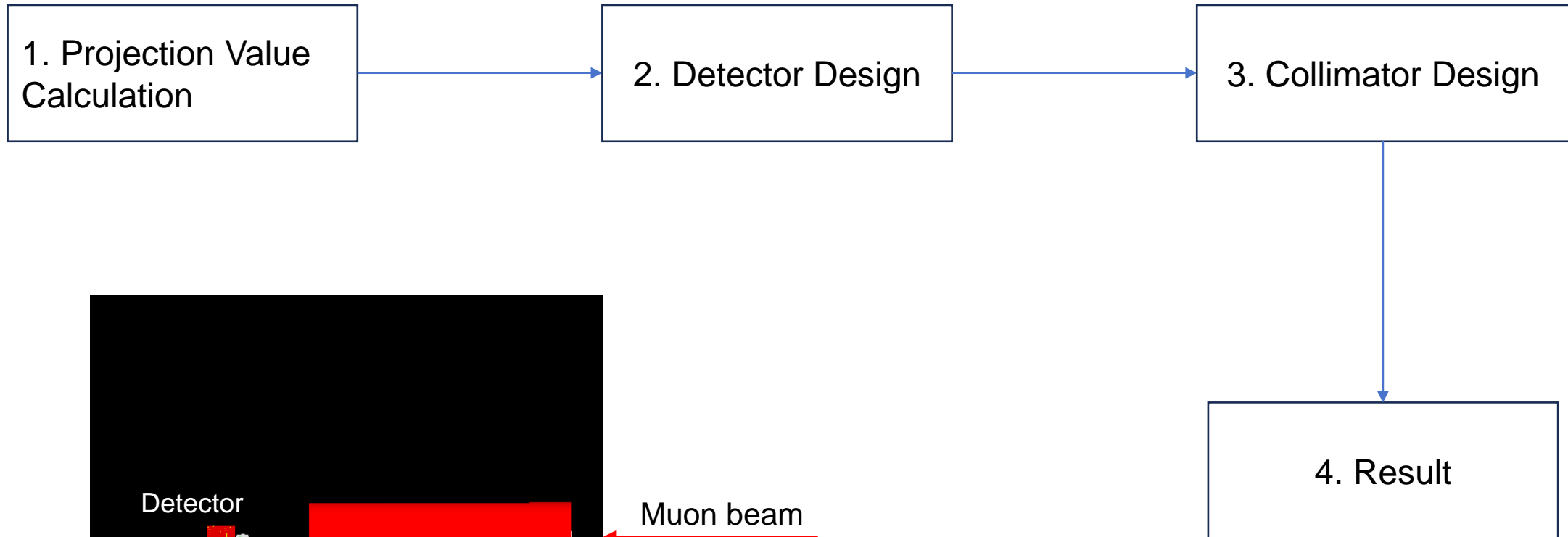
- Accelerator-based muon beam
 - ✓ **Controllable momentum**
 - ✓ **High intensity**
- Penetrating power of 450 MeV/c (360 MeV) muons
 - Could be used for imaging macroscopic samples
- The baseline scheme of EMuS provides possibility of imaging using high-momentum muon beam

Material	Range [mm]
Aluminum	718
Iron	271
Copper	248
Lead	238
Tungsten	137

Corresponding to ranges of **590 MeV proton**

End station	Momentum [MeV c ⁻¹]	FWHM spot size [mm]	Intensity [10 ⁶ μ s ⁻¹]	Polar-z	Δp/p [FWHM]
DM1	450	108 101	790	-0.760	9.7%
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	150	30.5 31.2	21	0.761	8.0%
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	150	30.3 30.6	10	-0.681	9.1%

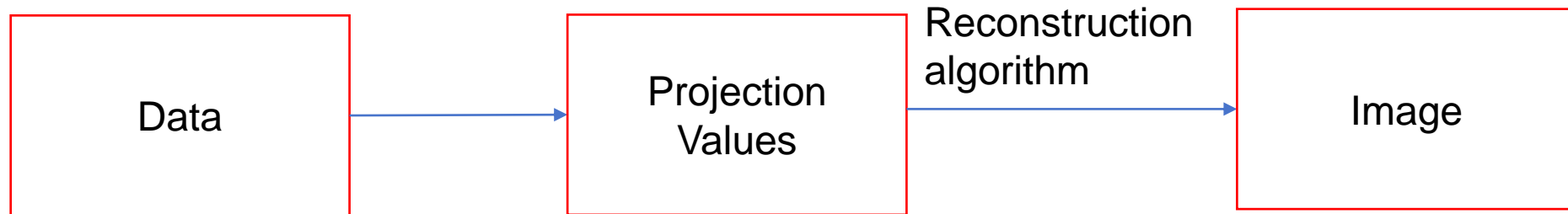
Simulation Study of Muon Beam CT



Geant4 simulation

Projection Value

- As a tomographic imaging technique, CT images **cannot** be directly obtained from the detector data. Instead, the data is used to **calculate projection values (PVs)**.
- Then, the calculated PVs are used as inputs for the **reconstruction algorithm**, which is used to produce the final image.

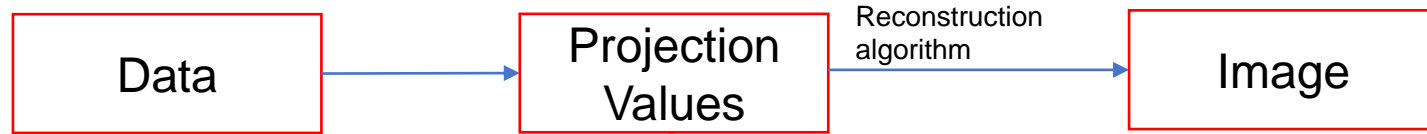


- Common CT reconstruction algorithms
 - Algebraic Reconstruction Technique (ART, this work)
 - Filtered Back Projection (FBP)
 - Maximum Likelihood Expectation Maximization (MLEM)

- The absorption of X-rays follows the **Lambert-Beer law**

$$I = I_0 e^{-u(x,y) \cdot l},$$

where u is the linear attenuation coefficient, I_0 the incident light intensity, and I the transmitted light intensity.



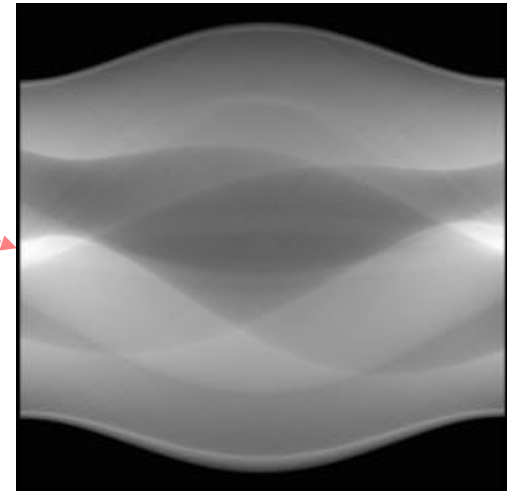
- For X-ray CT, the PV p is

$$p = \ln \frac{I_0}{I} = \int_l u(x, y) dl.$$

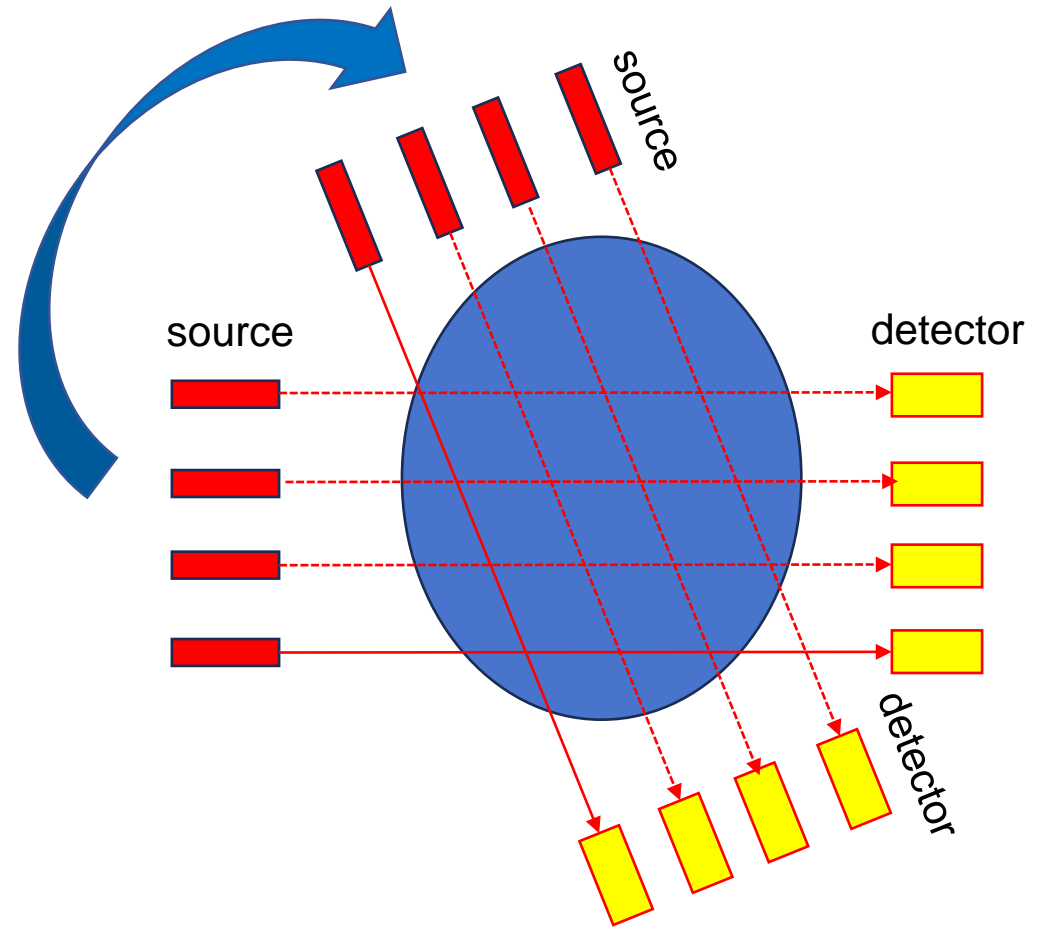
- When mono-energetic X-rays pass through a homogeneous medium, the **PV is proportional to the distance** traveled by the X-rays:

$$p = \ln \frac{I_0}{I} = u(x, y) \cdot l.$$

This forms the basis of CT reconstruction algorithm.



- In early CT scans, the source and detector move at an angle theta to cover the entire cross-section.
- The detector and collimator rotate multiple times to collect data from multiple angles.
- Nowadays, X-ray CT employs conical beams and detectors with larger areas to achieve multi-layer imaging at once.



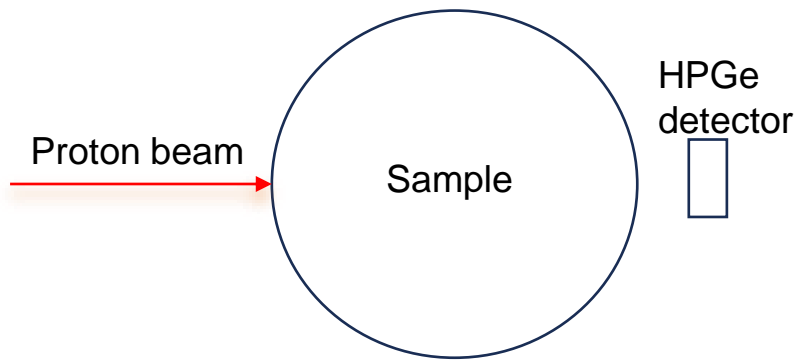
- Proton CT (pCT) uses the **energy loss** of protons for imaging.
 - pCT can **assist in proton therapy**.
 - Proton beams usually from a **cyclotron**.
 - The projection value of pCT is:

$$\frac{dE}{dx} = -K \frac{Z}{A} \frac{1}{\beta^2(E)} \left[\ln \left(\frac{2m_e c^2 \beta^2(E)}{I(r)(1 - \beta^2(E))} \right) - \beta^2(E) \right],$$

$$S = \frac{K}{\beta^2(E)} \left[\ln \left(\frac{2m_e c^2 \beta^2(E) \gamma^2(E)}{I(r)} \right) - \beta^2(E) \right],$$

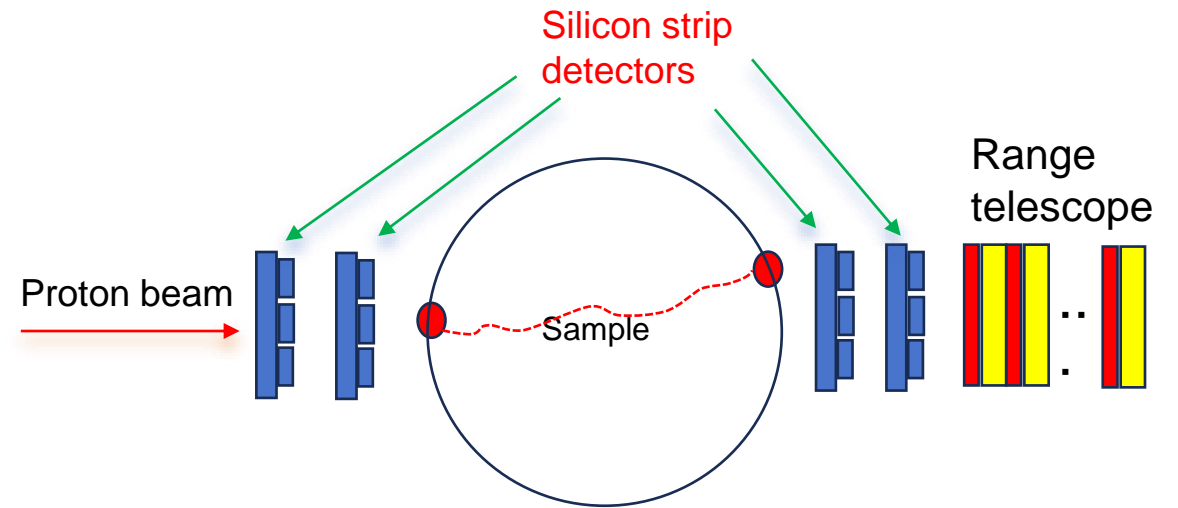
$$p = \int_{E_{in}}^{E_{out}} \frac{dE}{S(I_{water}, E)}.$$

In early proton CT, **high-purity germanium** detectors were used to measure the energy of outgoing protons.



Current proton CT uses **silicon strip detectors** (SSD) and **silicon pixel detectors** (SPD) to improve imaging efficiency.

- SSD: measure the entry and exit positions and angles of protons
- SPD: measure the energy of exiting protons
- With these measurements, trajectories of protons in the sample can be reconstructed using interpolation algorithms.



- The materials of samples for the μCT are not limited to those similar to human tissues.

✗ Proton: nucleon-nucleon interaction

✓ Muon: mainly electromagnetic interaction

- Bethe-Bloch formula with density effect correction

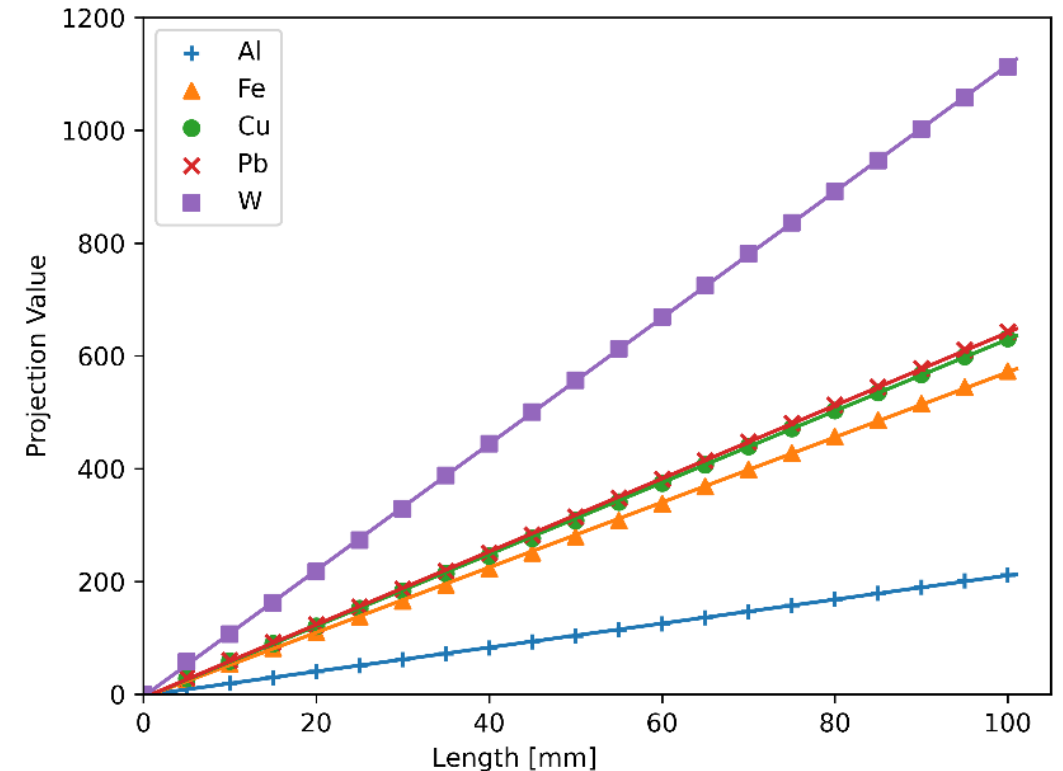
$$-\frac{dE}{dx} = KZ^2 \frac{Z}{A} \frac{1}{\beta^2} \left[\frac{1}{2} \ln \left(\frac{2m_e c^2 \beta^2 \gamma^2 T_{max}}{I^2} \right) - \beta^2 - \frac{\delta(\beta\gamma)}{2} \right],$$

- The projection value of μCT is

$$p = K \frac{Z}{A} l = - \int_{E_0}^E \frac{dE}{\beta^2 \left[\frac{1}{2} \ln \left(\frac{2m_e c^2 \beta^2 \gamma^2 T_{max}}{I^2} \right) - \beta^2 - \frac{\delta(\beta\gamma)}{2} \right]}.$$

- Simulation

- Aluminum, Iron, Copper, Lead, Tungsten
- 1~100 mm



Relationship between the **projection value** and the **thickness** of the material which the muon passes through → **Good linearity**

Muon Selection for CT

- As charged particles, muons undergo **multiple Coulomb scatterings** (MCS) when passing through objects. This brings **challenges in accurately estimating the voxels** through which the muons have passed, especially for the pulsed muon beam.

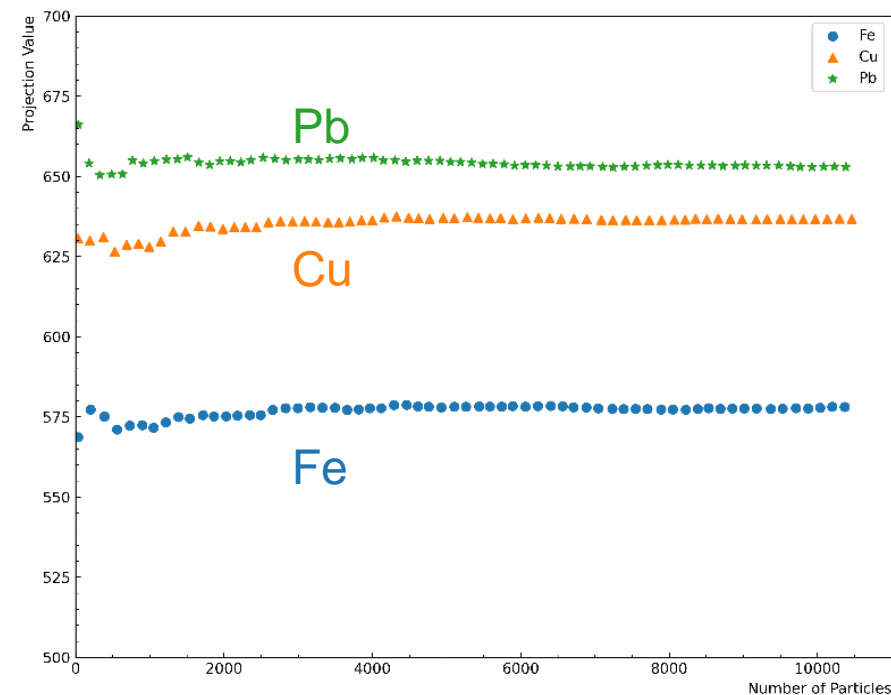
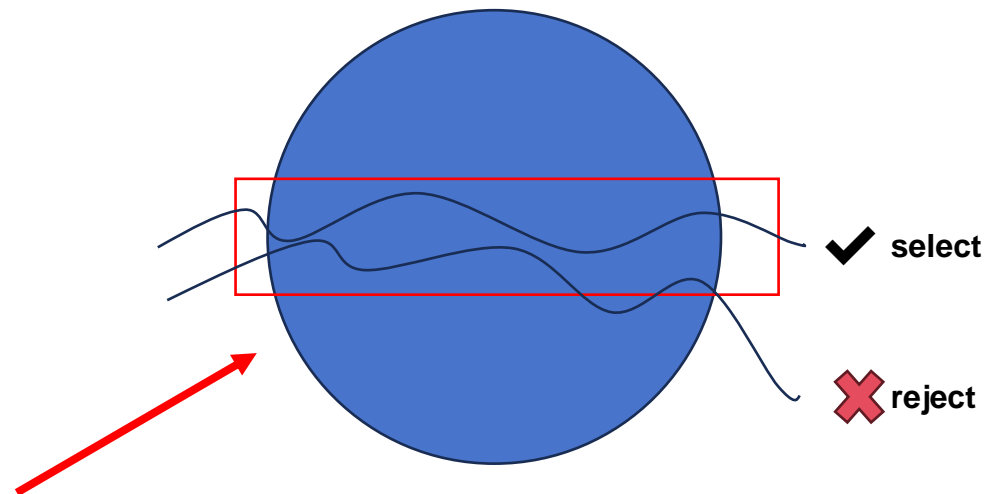
- To mitigate the effects of MCS and improve the quality of CT, **only muons with incident and exit positions within a limited, small range** are selected and labeled as “good”.

- The final projection value is the average of the projection values of all “good” muons:

$$\bar{p} = \frac{\sum_{i=1}^N p_i}{N}.$$

- How many “good” muons are needed to obtain a stable projection value?

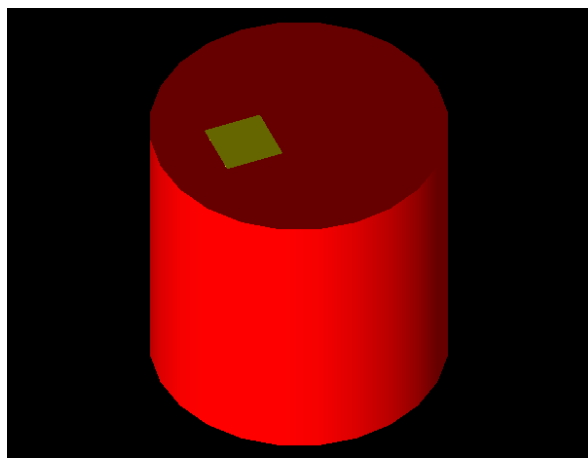
- Test samples: 100 mm thick iron, copper, and lead
- Result: with >3000 muons**, projection values tend to stabilize



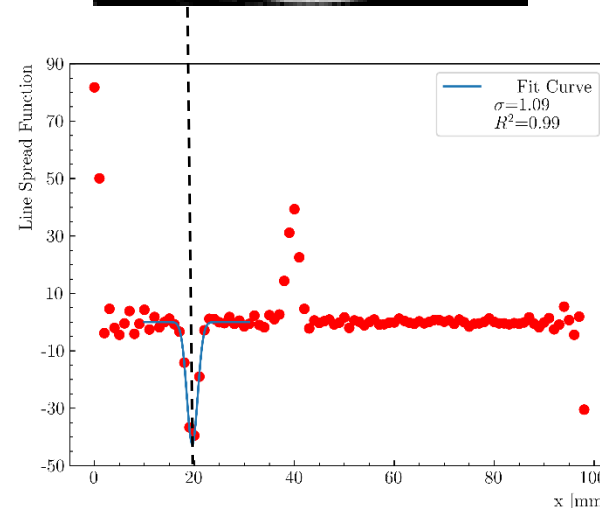
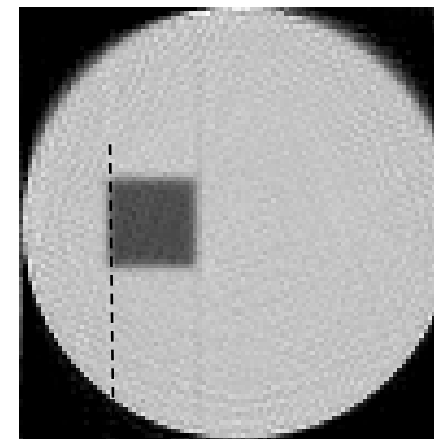
Relationship between the **projection values** of different materials and **the number of “good” muons**

Projection Value Calculation

- The calculation of projection value was verified with Geant4 simulation.
- Simulation settings:
 - Small incident beam spot
 - Virtual detector
 - Sample: aluminum inside iron
 - **Iron**: red cylinder (diameter 100 mm, height 100 mm)
 - **Aluminum**: yellow cuboid (20*100*20 mm³)



Reconstructed image



Fit to the Line Spread Function of the aluminum edge → Resolution ~1.1 mm (σ)

Detector and Track Reconstruction

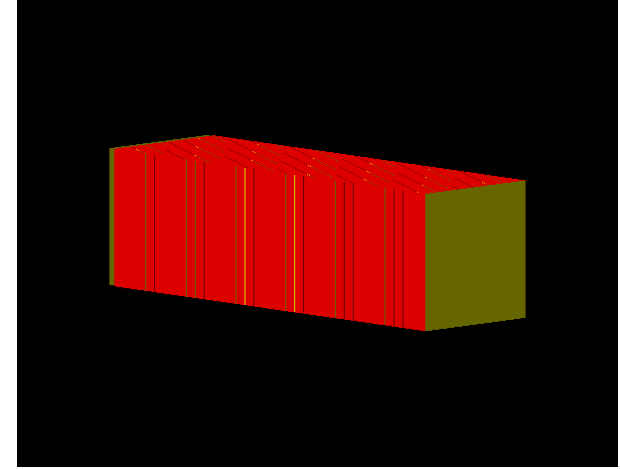
- Detector: **range telescope**
 - Silicon pixel detectors + Degraders
- Track reconstruction: **inward search tree**
 - Initially proposed in ALICE experiment at LHC
 - Now widely used in proton CT to **reconstruct energy**
 - Fixed threshold:

$$S_{\max} = 3\sigma_{\theta}$$

$$= 3\sqrt{2} \left[\int_0^x \left(\frac{14.1 \text{ MeV}}{pv(x')} \right)^2 \frac{1}{X_0} \right]^{\frac{1}{2}} \left(1 + \frac{1}{9} \log_{10} \frac{x}{X_0} \right),$$

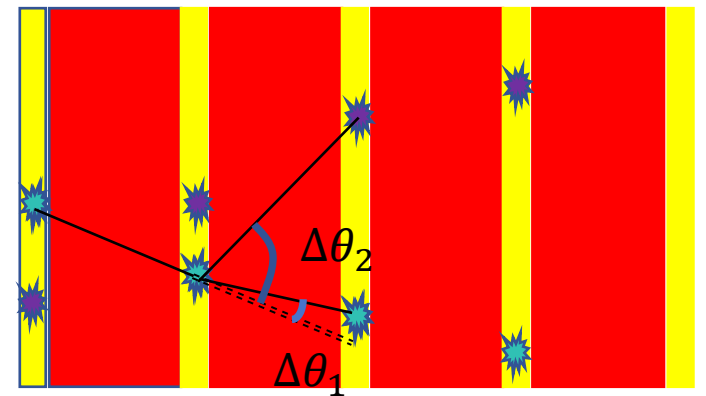
- Score:

$$S = \sqrt{\sum_{i=1}^n (\Delta\theta_i)^2},$$



Range telescope model built with Geant4

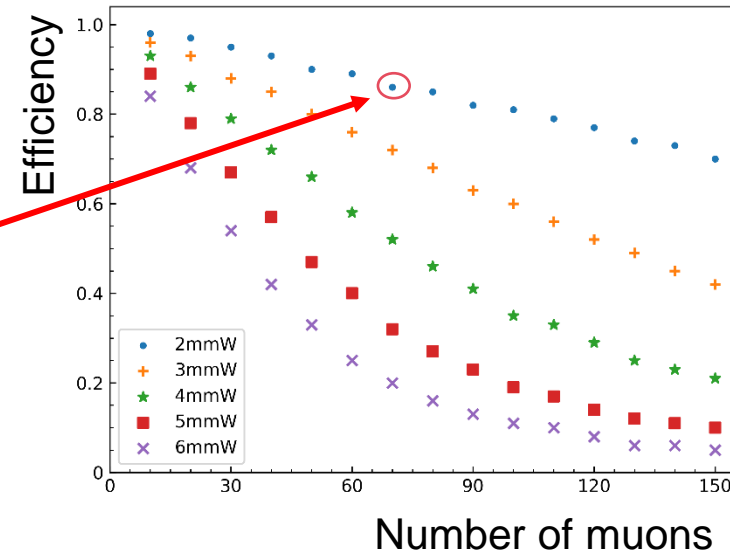
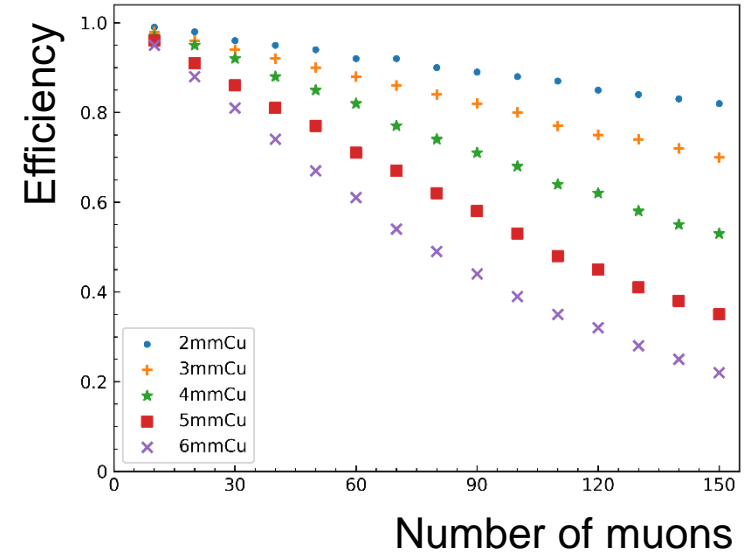
- Yellow: silicon pixel detector
- Red: degrader



Schematic of track reconstruction algorithm

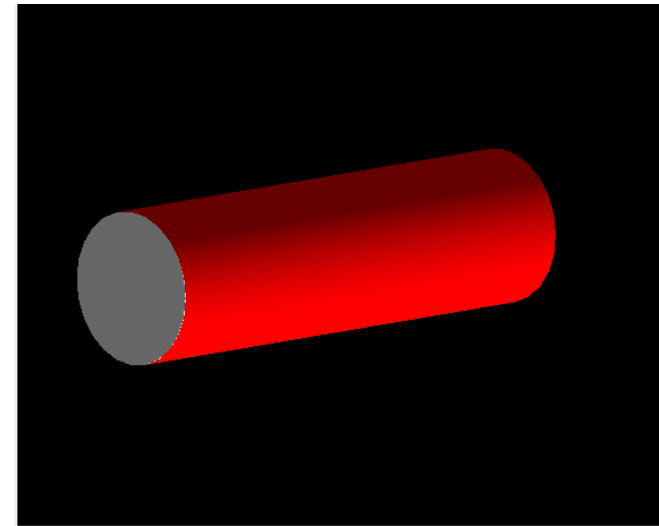
Design of Degradar

- Factors affecting track reconstruction efficiency:
 - number of incident muons
 - **material** and **thickness** of the energy degrader
- Track reconstruction efficiency $r = \frac{T_S}{T_N}$
 - T_S : the number of tracks in which the EventID of the seed signal is identical to the EventID of the signal on the first layer
 - T_N : the total number of tracks simulated
- Test materials and thickness: Cu and W, 2–6 mm
- **Simulation results** indicate that **tungsten of 2 mm thick and ~70 muons incident each time** is a good working point.

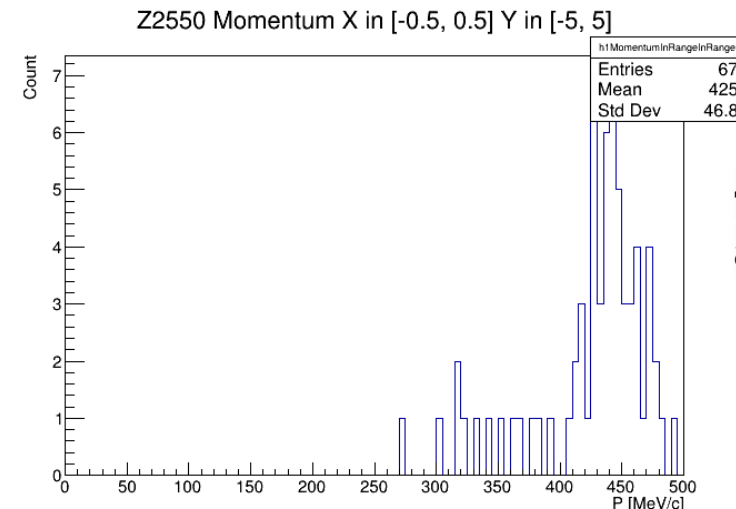


Design of Collimator

- Main design goals of the collimator
 - To collimate a small beam spot for CT:
 $|\text{beamX}| < 0.5 \text{ mm}$, $|\text{beamY}| < 5 \text{ mm}$
 - To control the number of muons for CT:
around 70 muons per pulse
- Two components
 1. **Beam spreader (gray)**
 ϕ 300 mm, 2 mm thickness
 2. **Beam collimator (red)**
 ϕ 300 mm, 2000 mm length
- Beam intensity for muon CT can be tuned by varying the collimator design.



Design of the collimator with Geant4 simulation



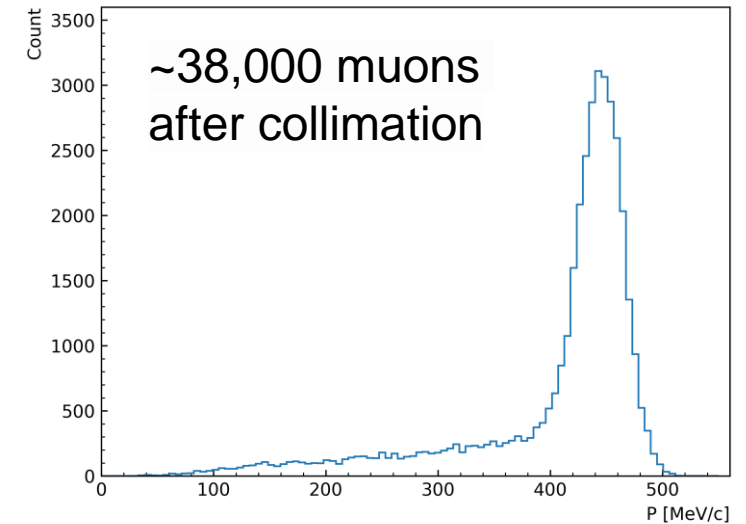
~70 muons remaining after collimation

Momentum of muons after collimation

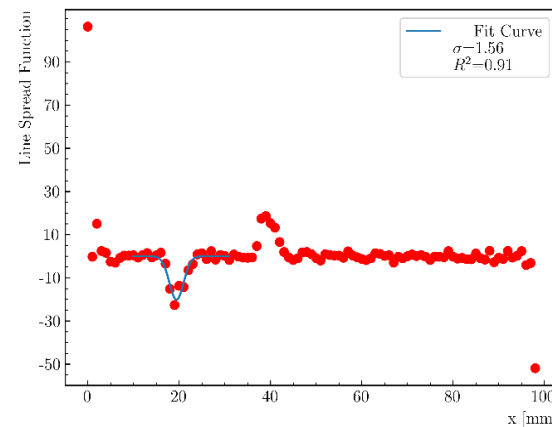
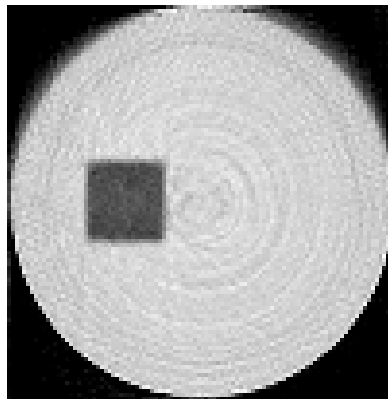
Simulation Result

Full simulation of muon beam CT was conducted, including:

1. EMuS DM1 beam ($\sim 10^8$ muons simulated)
2. Collimator
3. Sample
4. Range telescope



Momentum distribution of muons after passing through the collimator



Fit to the Line Spread Function of the sample edge yields a resolution of ~ 1.6 mm (σ)

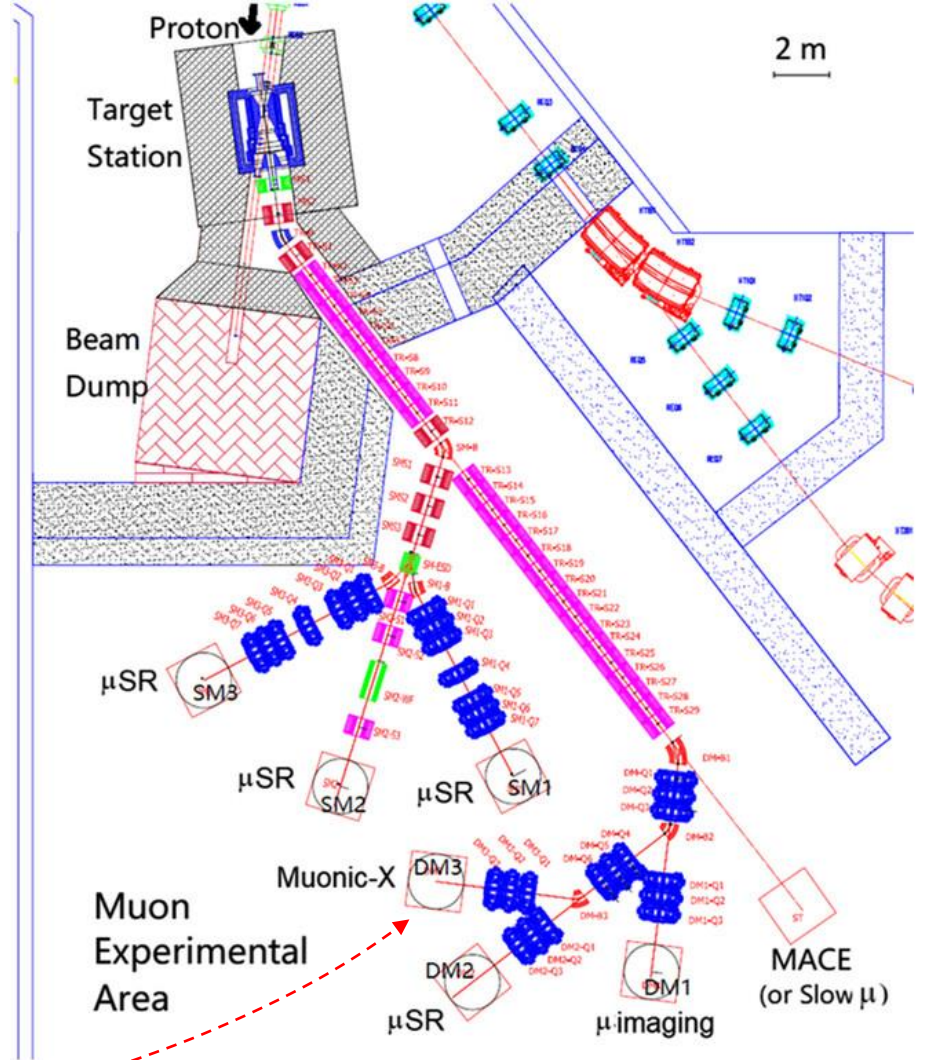
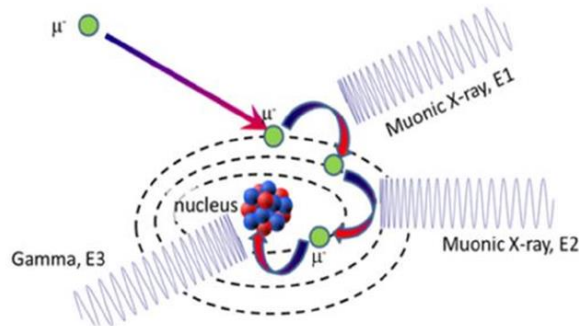
Reconstructed image of muon beam CT

Summary and Outlook

- Geant4 simulation and image reconstruction study in the EMuS baseline scheme demonstrate the potential of muon beam CT.
- Simulation results suggest that bulk sample imaging with muon CT could be a promising application for muon facilities with high-momentum muon beams.
- Current EMuS baseline design would require approximately one week to image a single cross-section of the sample studied in this work.
- Improvements:
 - Simultaneous irradiation with more beam spots
 - Improve the track reconstruction algorithm
- Continuous-wave muon beam
 - Capability to measure individual muon

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EMuS baseline scheme layout

- DM1 endstation: high-momentum muon beam imaging
- **DM3** endstation: muonic X-ray analysis

Study of Muonic X-ray with Geant4

- **Background:** start-to-end simulation of muonic X-ray analysis on EMuS DM3 is performed with G4beamline (a Geant4-based program)
- **Problem:** muonic X-ray emission lines are incorrectly calculated by Geant4, especially for high-energy transition (e.g., K-shell)

G4MuonMinusCapture
G4EmCaptureCascade

Preliminary **solution:**

1. Use **MuDirac*** to produce muonic X-ray database (energies and probabilities) for all elements
2. **Modify** *G4EmCaptureCascade* to **extract** the transition energy and probability from database
3. Create a new **messenger class** to manage whether to replace the original G4 process (for G4beamline or other Geant4-based program)

Progress:

1. Developed Python scripts to run MuDirac in multi-process mode (< 1 hour for all nuclides using a 64-core server)
2.
 - ✓ Finished: transition energy extraction
 - ❑ Ongoing: implementation of transition probability
3. Finished

[Git repository](#)

***MuDirac** is a software developed by the ISIS muon group, which calculates the transition energies and probabilities of muon cascade with a precision of a few keV.

<https://doi.org/10.1002/xrs.3212>

<https://doi.org/10.3390/condmat8040101>

Transition		K α (2p-1s) [keV]		
Element	G4bl before	G4bl now	Exp.	
²⁹ Cu	1491	1502	1507	

Future Improvement

- Intensities are also important for quantitative elemental analysis.
- The intensities of the simulated spectra are not correct (either by MuDirac or Geant4).
 - Need to consider the initial muon population on initial energy level, i.e. the angular momentum distribution at capture, ***L*-distribution**.
 - Try to collaborate with MuDirac team and other groups.

**Thank
You!**

Backup

Summary of variables used in Bethe-Bloch formula.

Symbol	Definition	Units or Value
K	$4\pi N_A r_e^2 m_e c^2 / A$	0.307075 MeV·g ⁻¹ ·cm ²
N_A	Avogadro's number	6.022 1415(10) × 10 ²³ mol ⁻¹
$m_e c^2$	Electron mass × c ²	0.510 998 918(44) MeV
Z	Atomic number of absorber	
A	Atomic mass of absorber	
β	v/c	
γ	$\gamma = 1/\sqrt{1 - \beta^2}$	
I	Mean excitation energy	
δ	Density effect correction	
M	The mass of incident particles	

T_{max} is the maximum energy transfer possible in a single collision.

$$T_{max} = \frac{2m_e c^2 \beta^2 \gamma^2}{1 + 2\gamma m_e / M + (m_e / M)^2}$$

