

# Simulating Muon Filter for MUonE and MSSM Proton Collisions for Dark Matter Searches

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**Part I:**

# Muon identification in the MUonE experiment

# Anomalous magnetic moment of a muon

$$a_{\mu SM} = 116591810(43) \times 10^{-11}$$

$$a_{\mu EXP} = 116592089(63) \times 10^{-11}$$

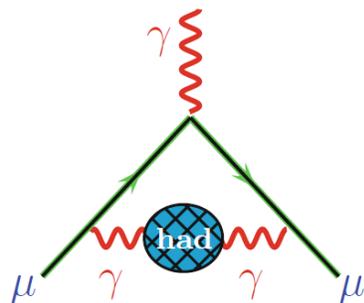
$$\Delta a_{\mu} = 279(76) \times 10^{-11} = 3.7 \sigma \quad [1]$$

$$a_{\mu SM} = a_{\mu}^{QED} + a_{\mu}^{EW} + a_{\mu}^{had}$$

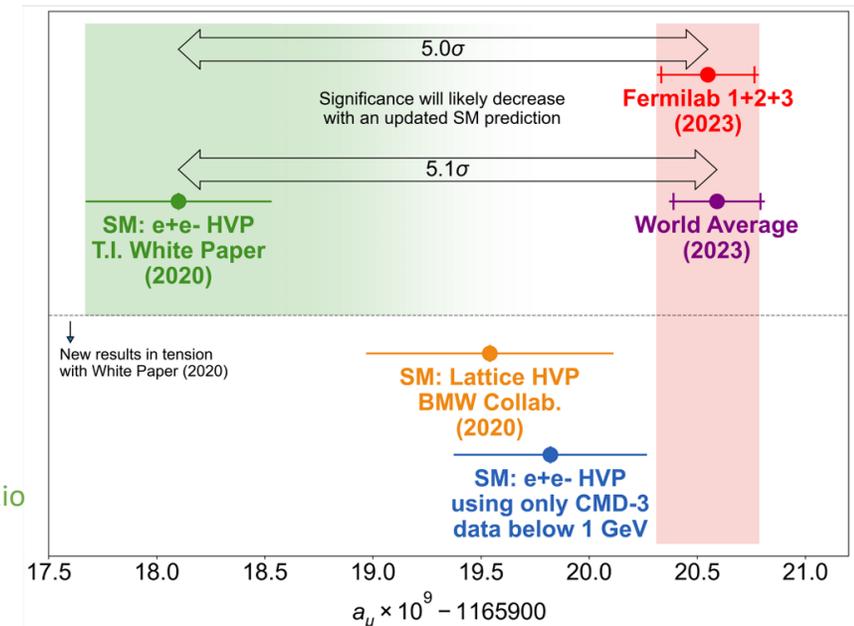
Main source of the uncertainty, influenced by the non-perturbative nature of QCD

The hadronic vacuum polarization - leading order hadronic contribution:

[2]



EPS-HEP Conference 2023.,  
Presentation by Riccardo Nunzio Pilato,  
University of Liverpool



# The Need for an Alternative Approach

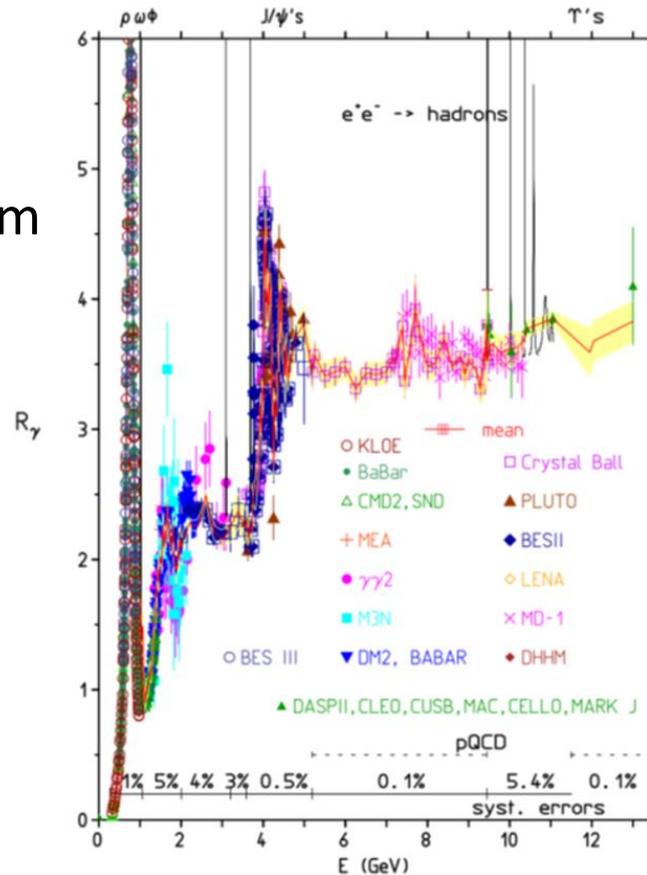
## Time-like approach

- Basic concepts:
  - unitarity and causality
  - Dispersion Relation and Optical Theorem
  - direct relation to data: total hadronic cross section  $\sigma(e^+e^- \rightarrow had)$

$$\alpha_\mu^{HLO} = \frac{\alpha}{\pi} \int_0^\infty \frac{ds}{s} \frac{1}{\pi} \text{Im}\Pi^{had}(s) K(s)$$

$$\text{Im}\Pi^{had}(s) = \frac{\alpha}{3} R_{had}(s),$$

$$R_{had}(s) = \frac{\sigma_{had}^0(e^+e^- \rightarrow had)}{4\pi\alpha^2/3s}$$



## Lattice QCD

- Results have uncertainties of 2-3%, compared to 0.5-0.6% error from  $e^+e^-$  measurements

[3]

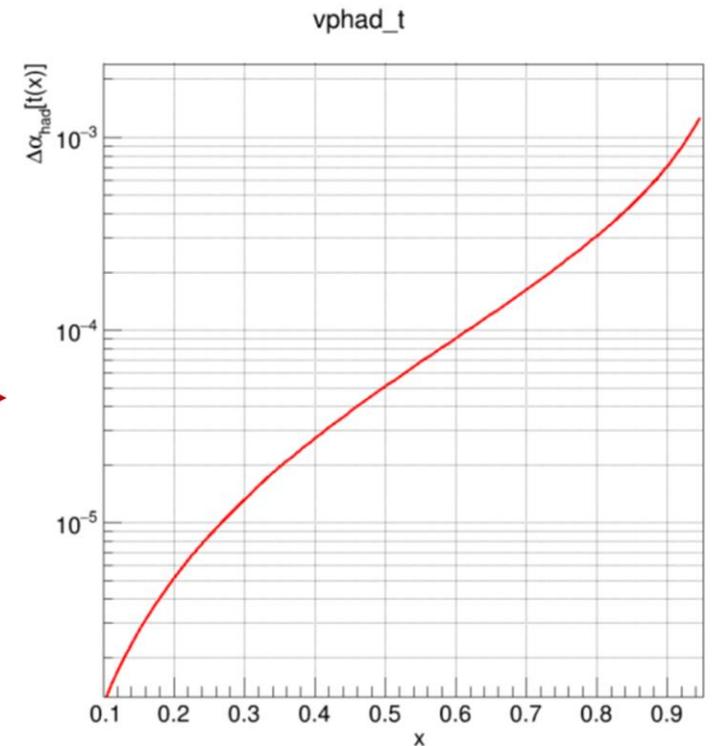
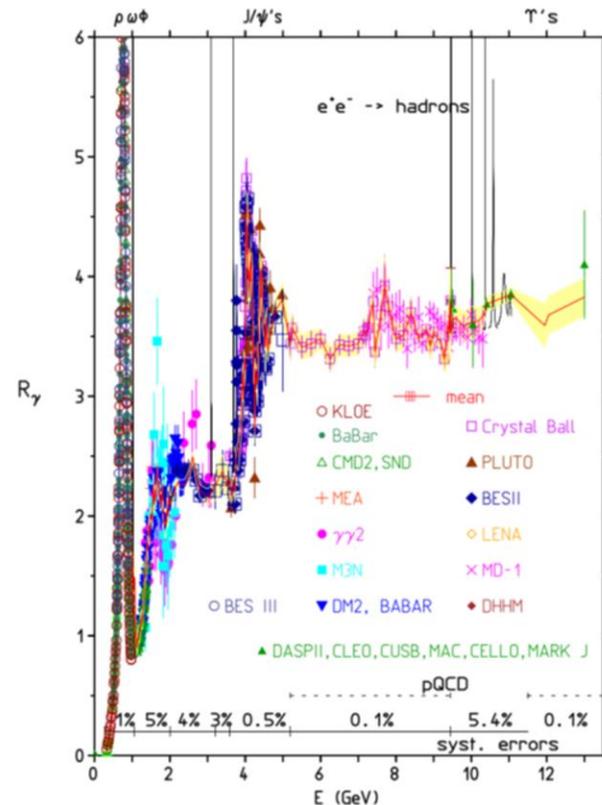
# The MUonE Experiment's Approach

$$a_{\mu}^{HLO} = \frac{\alpha}{\pi} \int_0^1 dx (1-x) \Delta\alpha^{had}[t(x)]$$

$$t(x) = -\frac{x^2 m_{\mu}^2}{x-1} < 0$$

$$\alpha(t) = \frac{\alpha(0)}{1 - \Delta\alpha(t)}$$

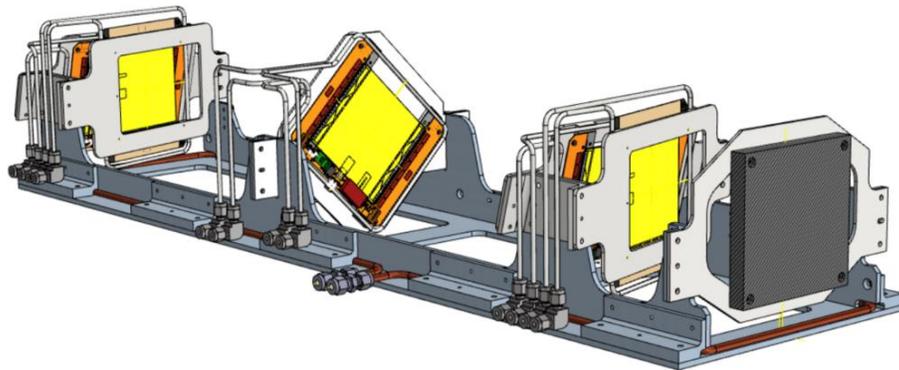
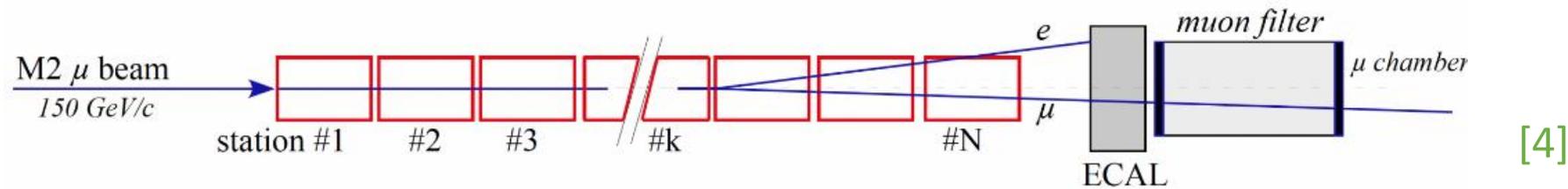
$$\frac{d\sigma}{dt} = \frac{d\sigma_0}{dt} \left| \frac{\alpha(t)}{\alpha(0)} \right|^2$$



[4]

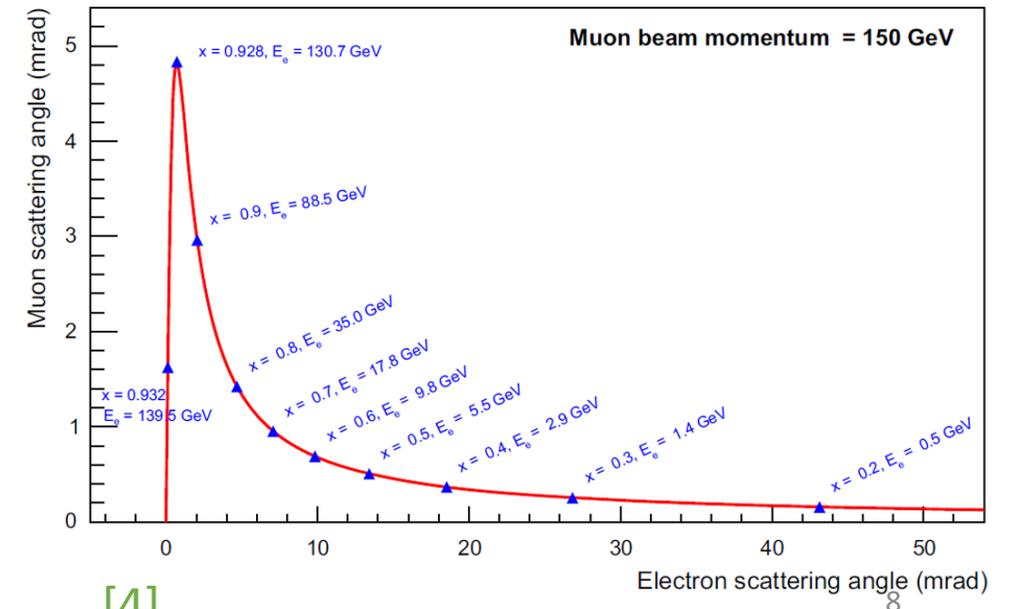
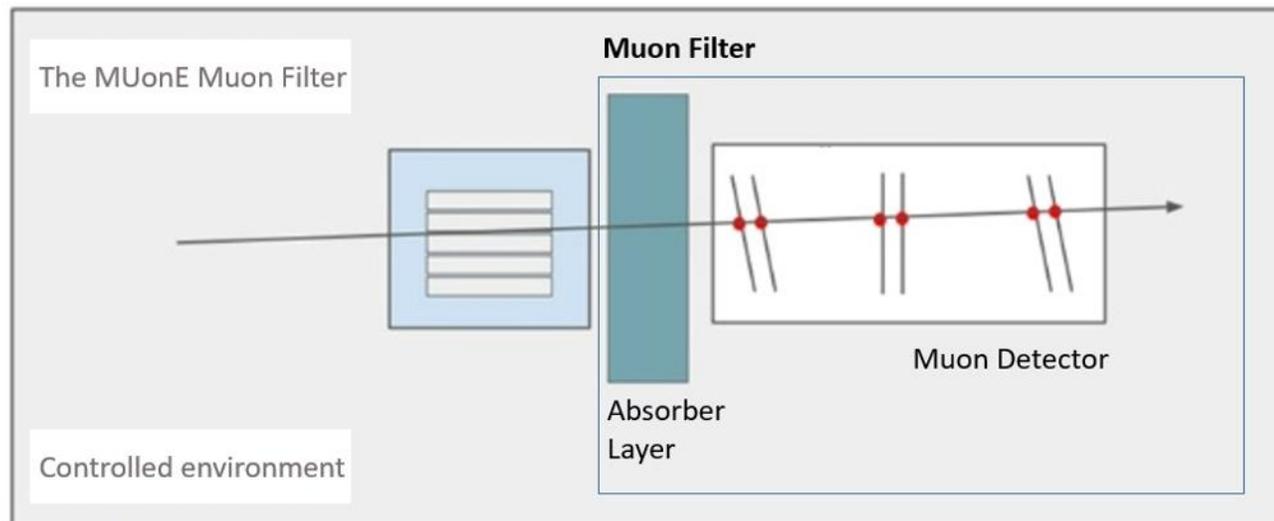
# MUonE experiment

- Aims at determining the leading hadronic contribution to the muon anomalous magnetic moment by measuring the effective electromagnetic coupling in the space-like region at low momentum transfer
- Using a 160 GeV muon beam at CERN, the experiment targets a precision of  $O(10^{-5})$  in measuring the shape of the differential cross section of  $\mu$ -e elastic scattering



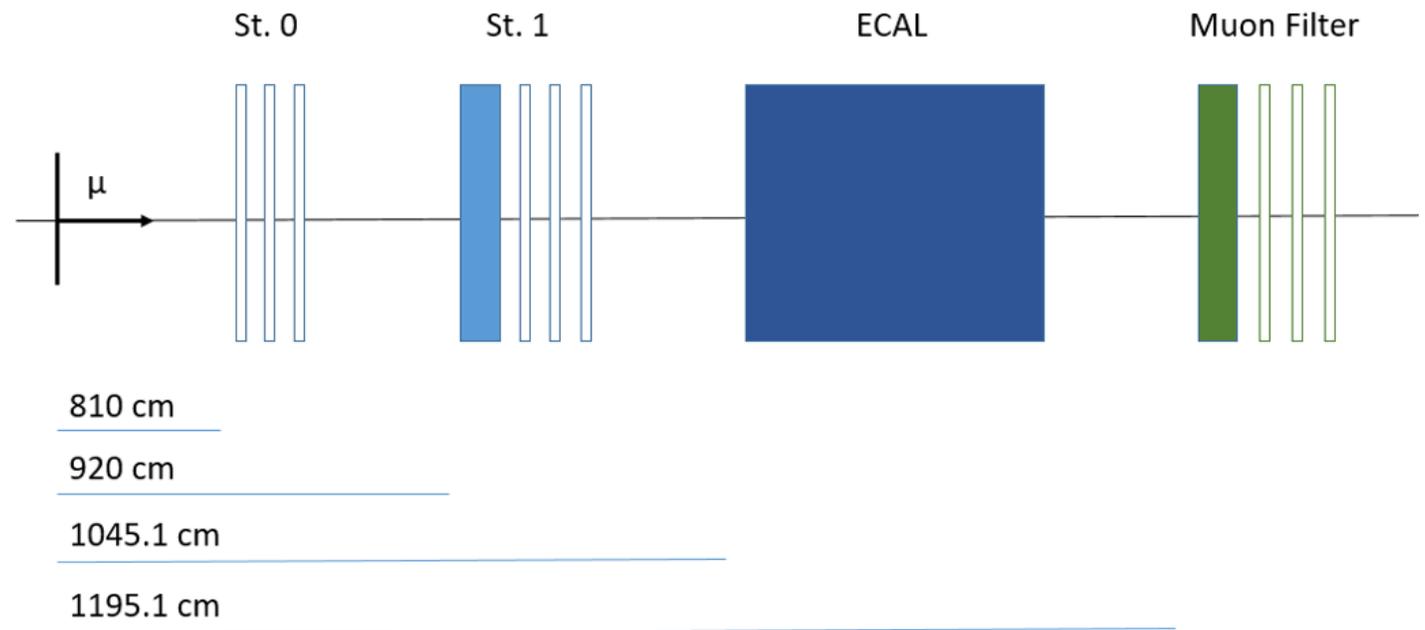
# Muon filter - Importance of Precise Particle Identification

- Location: downstream of the ECAL
- Structure: a thick absorber followed by tracking planes
- Role: particle identification (PID) and correcting for potential pion contamination in the muon beam



# My Research – Simulations for the Muon Filter

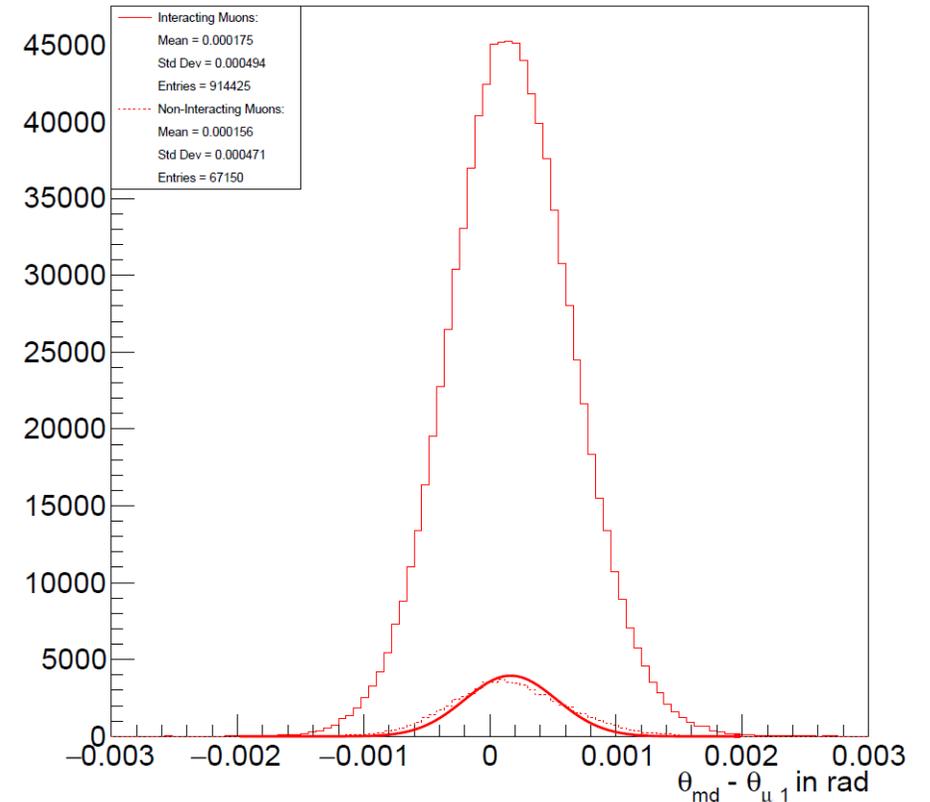
- The main focus of the thesis: simulation of the performance of the muon filter using the *FairMUonE* software in conjunction with the *Bura* supercomputer
- $10^6$  events ( $10^5$  for Pion Contamination Study)
- Beam generator:  
MuonGunBeamProfile
- Interaction generator:  
MESMER elastic interaction

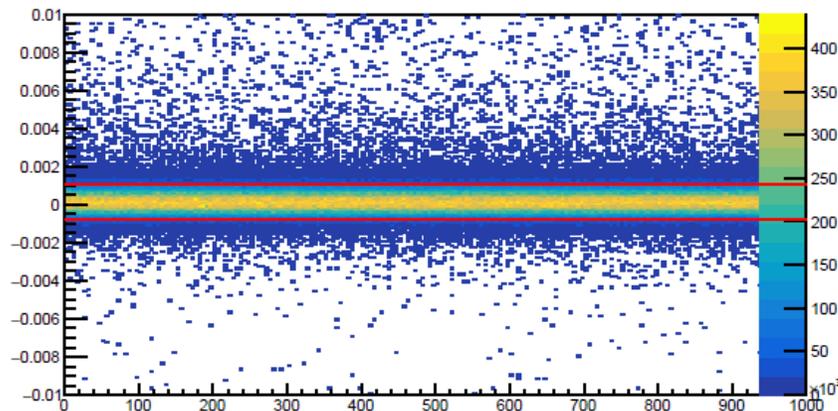


# Angle Method

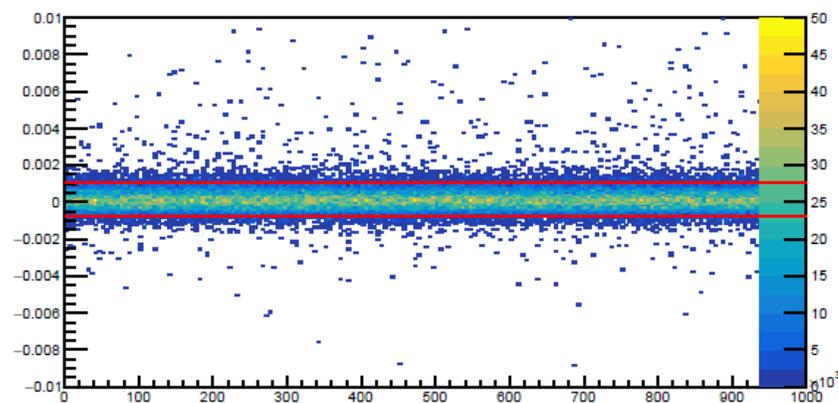
- Method for correct muon track extrapolation
- Main idea:
  - Take the distribution of muon angle differences and apply a cut-off interval of  $\mu \pm \sigma$  on all of the angles reconstructed in the muon detector
  - Check whether the signal muon angle reconstructed in the muon detector is within this cut-off interval
- Deviation from zero in the angle difference for non-interacting muons is due solely to Multiple Coulomb Scattering (MCS) → the analysis informs about how much background falls into the MCS uncertainty region around the muon

Angle Difference: Muons

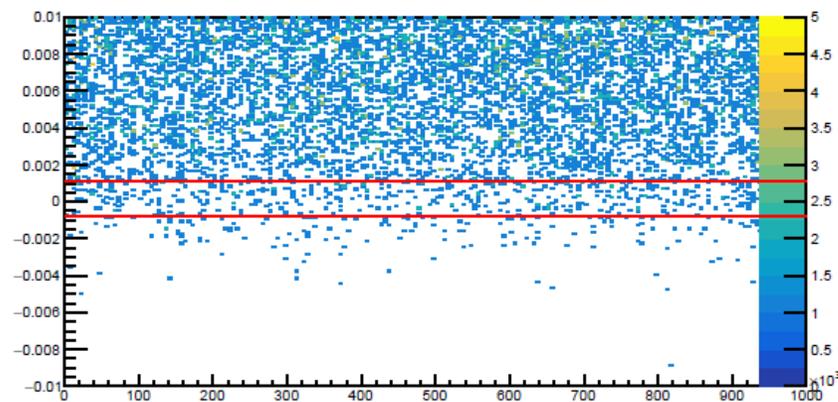




Interacting Muons



Non-Interacting Muons

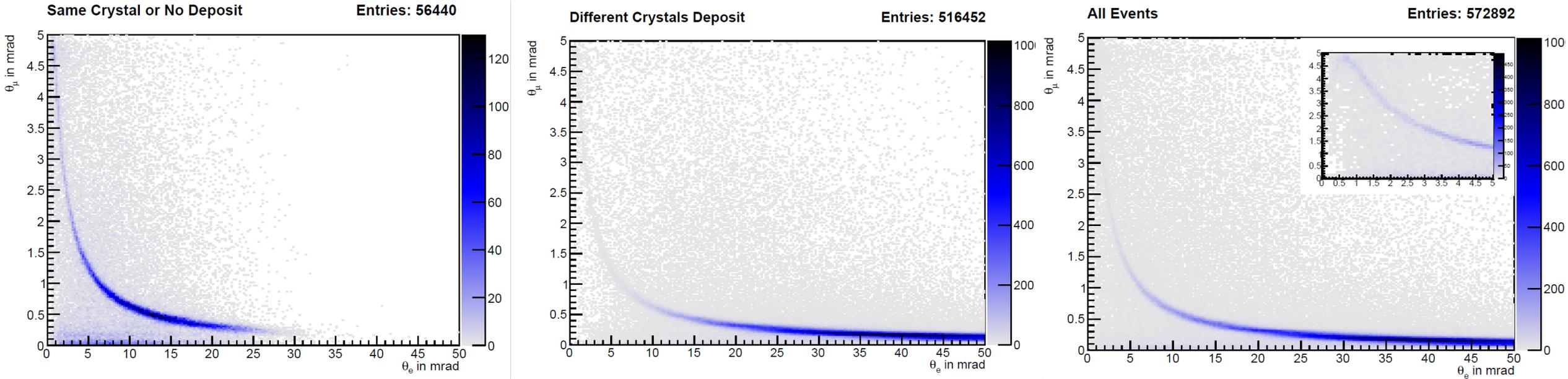


Background

<b>10 cm Iron</b>	<b>Probability</b>	<b>Uncertainty</b>
Non-Interacting Muon Data, 1 Sigma Cut-Off	0.99937	$4 \times 10^{-5}$
Non-Interacting Muon Data, 2 Sigma Cut-Off	0.99869	$4 \times 10^{-5}$
Interacting Muon Data, 1 Sigma Cut-Off	0.99899	$3 \times 10^{-5}$
Interacting Muon Data, 2 Sigma Cut-Off	0.99781	$5 \times 10^{-5}$
Non-Interacting Muon Data, 1 Sigma Cut-Off, Filter Relevant Events	0.9986	$4 \times 10^{-4}$
Non-Interacting Muon Data, 2 Sigma Cut-Off, Filter Relevant Events	0.9973	$5 \times 10^{-4}$
Interacting Muon Data, 1 Sigma Cut-Off, Filter Relevant Events	0.9981	$5 \times 10^{-4}$
Interacting Muon Data, 2 Sigma Cut-Off, Filter Relevant Events	0.996	$7 \times 10^{-3}$

By comparing muon angles before and after the absorber, I achieved over **99% background rejection** with minimal muon loss.

# Final correlation curve



Scenario	No Absorber (%)	1 cm Fe (%)	2 cm Fe (%)	10 cm Fe (%)
Muon Filter Required	8.78764	8.992	9.085	9.012
Muon Filter Required, Correctly Identified Events	8.75795	8.968	9.050	8.970

Scenario	No Absorber (%)	1 cm Fe (%)	2 cm Fe (%)	10 cm Fe (%)
Muon Filter Required	84.618	81.460	85.347	81.862
Muon Filter Required, Correctly Identified Events	83.7466	80.923	84.886	81.203

In **9% of all events**, the muon filter was crucial for identification. Without the filter, the ECAL alone correctly identified only **20% of ambiguous cases ( $\theta_e < 5$  mrad)**.

## Part II:

# Probing Dark Matter at the LHC: Monte Carlo Simulations in the MSSM

# Introduction

- **Research Focus:** Simulating proton-proton collisions within the MSSM framework.
- **Scenario:** Only light superparticles are a **bino-like dark matter candidate** ( $\chi$ ) and a **nearly-degenerate slepton** ( $\tilde{l}$ ).
- **Challenge:** Traditional searches fail due to:
  - **Soft leptons** and **small missing transverse energy (MET)**.
  - **High background** from standard model processes like  $t\bar{t}$  and **WZ decays**.
- **Our Approach:**
  - Investigate an **alternative search strategy** involving an additional **radiated jet** to provide transverse boost.
  - Use **angular distributions** and other discriminatory variables to enhance signal-background separation.

# Event Generation and Simulation Strategy

## • Tools Used:

- **MadGraph & Pythia8** for event generation, simulated on the HPC.

## • Signal Definition:

- Focus on **opposite-sign, same-flavor dileptons + MET**.
- Simulated with **strict decay channels** to make detection challenging.
- $qg (q\bar{q}) \rightarrow j\gamma^* / Z^* \rightarrow j\tilde{l}^*\tilde{l} \rightarrow j\chi\chi\bar{l}l$

## • Technical Parameters:

- Adjusted **xqcut** and **qcut** parameters for optimization.
- MSSM SLHA2 model used with:
  - **Smuon mass = 110 GeV**
  - **Neutralino mass = 100, 90, 80, 70, 60, 50 GeV**
  - All other particles decoupled.

## • Background Approach:

- **Exclusive:** Only backgrounds that directly mimic the signal (muonic decays enforced).
- **Inclusive:** Covers a **wider phase space**, ensuring a comprehensive background study.

[5]

- $pp \rightarrow jZ \rightarrow j\bar{\tau}\tau \rightarrow j\bar{\ell}\bar{\nu}\nu\bar{\nu}\nu\tau$ ,
- $pp \rightarrow \bar{t}t(j) \rightarrow \bar{b}W^-bW^+(j) \rightarrow \bar{b}b\bar{\ell}\bar{\nu}\nu(j)$ ,
- $pp \rightarrow jZZ/jW^+W^- \rightarrow j\bar{\ell}\bar{\nu}\nu, j\bar{\ell}\bar{\ell}\bar{\tau}\tau (\rightarrow \bar{\ell}\bar{\nu}\nu + \text{jets})$

**Example;**

Exclusive:  $p p > w^+ w^-$ ,  $w^+ > \mu^+ \nu_\mu$ ,  $w^- > \mu^- \bar{\nu}_\mu$

Inclusive:  $p p > w^+ w^-$

# Event Selection and Analysis

- **Goal:** Separate signal from background by applying a series of event selection cuts.
- **Three Sets of Cuts:**
  - **Primary Cuts:** Define the event topology.
  - **Secondary Cuts:** Further reduce backgrounds, globally beneficial to all targeted mass splittings..
  - **Tertiary Cuts:** Optimize based on **mass splitting ( $\Delta m = 10\text{--}60\text{ GeV}$ )**, using kinematic variables.
- **Results:** Shown in tables, demonstrating how signal-to-background separation improves.
- **Analysis:** Conducted using a **custom program in MadAnalysis** to track distributions and cross-section changes.

Selection	$t\bar{t}jj$	$\tau\tau jj$	$Zjjjj$	$ZZjj$	$WZjj$	$WWjj$	$S_{10}^{110}$	$S_{20}^{110}$	$S_{30}^{110}$	$S_{40}^{110}$	$S_{50}^{110}$	$S_{60}^{110}$
Matched Production	$6.1 \times 10^5$	$5.6 \times 10^4$	$5.2 \times 10^7$	$1.3 \times 10^4$	$4.2 \times 10^4$	$9.5 \times 10^4$	$1.9 \times 10^2$					
$\tau$ -veto	$5.4 \times 10^5$	$3.0 \times 10^4$	$5.1 \times 10^7$	$1.2 \times 10^4$	$4.0 \times 10^4$	$8.9 \times 10^4$	$1.9 \times 10^2$					
OSSF muon	$3.5 \times 10^3$	$4.3 \times 10^2$	$6.0 \times 10^5$	$3.2 \times 10^2$	$5.8 \times 10^2$	$5.1 \times 10^2$	$3.9 \times 10^1$	$6.8 \times 10^1$	$8.1 \times 10^1$	$8.8 \times 10^1$	$8.9 \times 10^1$	$9.1 \times 10^1$
exactly 1J $P_T > 30$	$6.6 \times 10^2$	$2.6 \times 10^2$	$7.1 \times 10^4$	$9.4 \times 10^1$	$1.5 \times 10^2$	$1.1 \times 10^2$	$7.6 \times 10^0$	$1.3 \times 10^1$	$1.6 \times 10^1$	$1.7 \times 10^1$	$1.7 \times 10^1$	$1.8 \times 10^1$
Jet $b$ -veto	$1.9 \times 10^2$	$2.5 \times 10^2$	$7.0 \times 10^4$	$8.0 \times 10^1$	$1.4 \times 10^2$	$1.1 \times 10^2$	$7.5 \times 10^0$	$1.3 \times 10^1$	$1.6 \times 10^1$	$1.7 \times 10^1$	$1.7 \times 10^1$	$1.8 \times 10^1$
$\cancel{E}_T > 30$ GeV	$1.6 \times 10^2$	$1.8 \times 10^2$	$8.9 \times 10^3$	$3.3 \times 10^1$	$6.6 \times 10^1$	$9.2 \times 10^1$	$6.3 \times 10^0$	$1.0 \times 10^1$	$1.3 \times 10^1$	$1.4 \times 10^1$	$1.5 \times 10^1$	$1.6 \times 10^1$

Selection	$t\bar{t}jj$	$\tau\tau jj$	$Zjjjj$	$ZZjj$	$WZjj$	$WWjj$	$S_{10}^{110}$	$S_{20}^{110}$	$S_{30}^{110}$	$S_{40}^{110}$	$S_{50}^{110}$	$S_{60}^{110}$
$m_{\ell\ell} \notin M_Z \pm 10$ GeV	$1.4 \times 10^2$	$1.8 \times 10^2$	$6.2 \times 10^2$	$2.0 \times 10^0$	$1.0 \times 10^1$	$7.9 \times 10^1$	$6.0 \times 10^0$	$9.2 \times 10^0$	$1.1 \times 10^1$	$1.2 \times 10^1$	$1.3 \times 10^1$	$1.4 \times 10^1$
$\cos \theta_{\ell_1, \ell_2}^* < 0.5$	$8.1 \times 10^1$	$1.6 \times 10^2$	$4.7 \times 10^2$	$1.4 \times 10^0$	$6.7 \times 10^0$	$4.5 \times 10^1$	$4.8 \times 10^0$	$6.9 \times 10^0$	$8.0 \times 10^0$	$9.0 \times 10^0$	$9.5 \times 10^0$	$1.0 \times 10^1$
$m_{\tau\tau} > 125$ GeV	$2.7 \times 10^1$	$2.3 \times 10^1$	$8.7 \times 10^1$	$3.0 \times 10^{-1}$	$1.4 \times 10^0$	$1.4 \times 10^1$	$3.0 \times 10^0$	$3.4 \times 10^0$	$3.6 \times 10^0$	$3.9 \times 10^0$	$4.1 \times 10^0$	$4.3 \times 10^0$
$\cancel{E}_T > 125$ GeV	$2.9 \times 10^0$	$6.6 \times 10^{-1}$	0	$1.5 \times 10^{-2}$	$2.2 \times 10^{-1}$	$2.3 \times 10^0$	$5.1 \times 10^{-1}$	$5.8 \times 10^{-1}$	$6.6 \times 10^{-1}$	$7.1 \times 10^{-1}$	$7.9 \times 10^{-1}$	$8.9 \times 10^{-1}$
Jet $P_T > 125$ GeV	$1.1 \times 10^0$	$6.6 \times 10^{-1}$	0	$1.1 \times 10^{-2}$	$1.9 \times 10^{-1}$	$1.7 \times 10^0$	$4.9 \times 10^{-1}$	$5.2 \times 10^{-1}$	$5.2 \times 10^{-1}$	$4.6 \times 10^{-1}$	$4.5 \times 10^{-1}$	$4.5 \times 10^{-1}$

Selection	$t\bar{t}jj$	$\tau\tau jj$	$ZZjj$	$WZjj$	$WWjj$	$S_{10}^{110}$	$S_{20}^{110}$	$S_{30}^{110}$	$S_{40}^{110}$	$S_{50}^{110}$	$S_{60}^{110}$
Small Mass Gap Optimization											
$1.0 < P_T^j \div \cancel{E}_T < 1.3$	$4.5 \times 10^{-1}$	$5.5 \times 10^{-3}$	$2.7 \times 10^{-3}$	$6.2 \times 10^{-2}$	$6.6 \times 10^{-1}$	<b><math>4.2 \times 10^{-1}</math></b>	<b><math>3.0 \times 10^{-1}</math></b>	$2.4 \times 10^{-1}$	$1.8 \times 10^{-1}$	$1.6 \times 10^{-1}$	$1.4 \times 10^{-1}$
$\Delta\phi(\cancel{E}_T, j) \div \pi > 0.95$	$1.8 \times 10^{-1}$	$5.5 \times 10^{-3}$	$2.2 \times 10^{-3}$	$2.7 \times 10^{-2}$	$3.8 \times 10^{-1}$	<b><math>4.0 \times 10^{-1}</math></b>	<b><math>2.3 \times 10^{-1}</math></b>	$1.7 \times 10^{-1}$	$9.6 \times 10^{-2}$	$7.7 \times 10^{-2}$	$6.2 \times 10^{-2}$
Events at $\mathcal{L} = 300 \text{ fb}^{-1}$	52.7	1.7	0.7	8.1	113.6	<b>120.0</b>	<b>69.0</b>	51.0	28.8	23.1	18.6
$S \div (1 + B)$	-	-	-	-	-	<b>0.68</b>	<b>0.39</b>	0.29	0.16	0.13	0.10
$S \div \sqrt{1 + B}$	-	-	-	-	-	<b>9.0</b>	<b>5.2</b>	3.8	2.2	1.7	1.4

[5]

# Next Steps – Machine Learning and Neural Networks

- No simple set of cuts can perfectly separate signal from background.
- Traditional cut-based methods rely on trial and error.
- Machine learning, especially **neural networks**, can optimize selection by recognizing complex patterns in kinematic variables.
- The goal is not only better event selection but also understanding why certain cuts work.
- I am currently learning about machine learning techniques to apply them in this analysis.

# Part III:

## Research interests and future work

# Research interests and future work

- Passion for Quantum Field Theory, Particle Physics, General Relativity, and Cosmology.
- Interest in scattering amplitudes, dark matter, dark energy, and fundamental interactions.
- Aim to contribute to theoretical physics.
- Plan to stay engaged with MUonE and Ljubljana research while focusing on PhD work.

# Bibliography

[1] T. Aoyama et al. “The anomalous magnetic moment of the muon in the standard model”. In: *Physics Reports* (2020). Preprint.

[2] F. Jegerlehner. “The Anomalous Magnetic Moment of the Muon”. In: Second Edition. Springer, 2017.

[3] Jegerlehner, F. (2015). Leading-order hadronic contribution to the electron and muon  $g-2$ . *The European Physical Journal Conferences*, 118, 01016.

<https://doi.org/10.1051/epjconf/201611801016>

[4] The MUonE Collaboration. Letter of Intent: The MUonE Project. CERN-SPSC-2019-026 / SPSC-I-252. European Organization for Nuclear Research, June 2019.

[5] Dutta, B., Fantahun, K., Fernando, A., Ghosh, T., Kumar, J., Sandick, P., Stengel, P., & Walker, 2017, Probing Squeezed Bino-Slepton Spectra with the Large Hadron Collider, arXiv:1706.05339v2

# APPENDIX I: MUONE EXPERIMENT

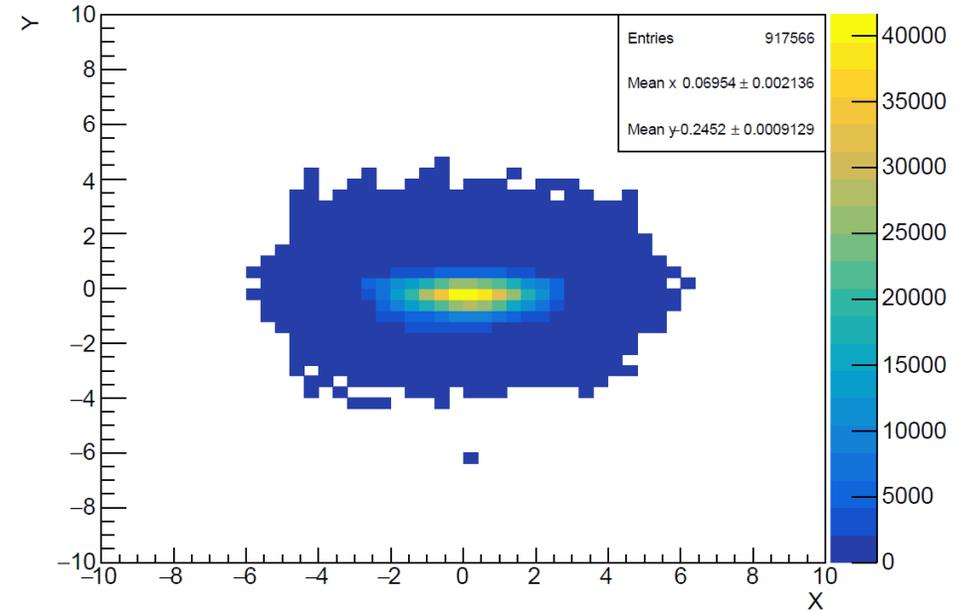
# Acceptance study

- $acceptance = \frac{reconstructed}{generated}$

Configuration	Acceptance Station 1	Acceptance Muon Detector
No Absorber	99.85 ± 0.01%	99.812 ± 0.009%
1 cm Iron	99.85 ± 0.02%	99.80 ± 0.02%
2 cm Iron	99.85 ± 0.02%	99.80 ± 0.01%
10 cm Iron	99.85 ± 0.02%	99.76 ± 0.02%

No Absorber	Interacting outside Absorber	Non-Interacting	Interacting in Absorber
Reconstruction Inefficiency	27 ± 4%	4 ± 1%	0 ± 0%
Sensor Inefficiency	47 ± 4%	10 ± 2%	0 ± 0%
Zero Hits (Escape)	9 ± 4%	3 ± 2%	0 ± 0%
10 cm Iron	Interacting outside Absorber	Non-Interacting	Interacting in Absorber
Reconstruction Inefficiency	14 ± 4%	1 ± 1%	27 ± 4%
Sensor Inefficiency	30 ± 4%	7 ± 1%	9 ± 1%
Zero Hits (Escape)	8 ± 2%	3 ± 03%	$2 \times 10^{-7} \pm 4 \times 10^{-7}\%$

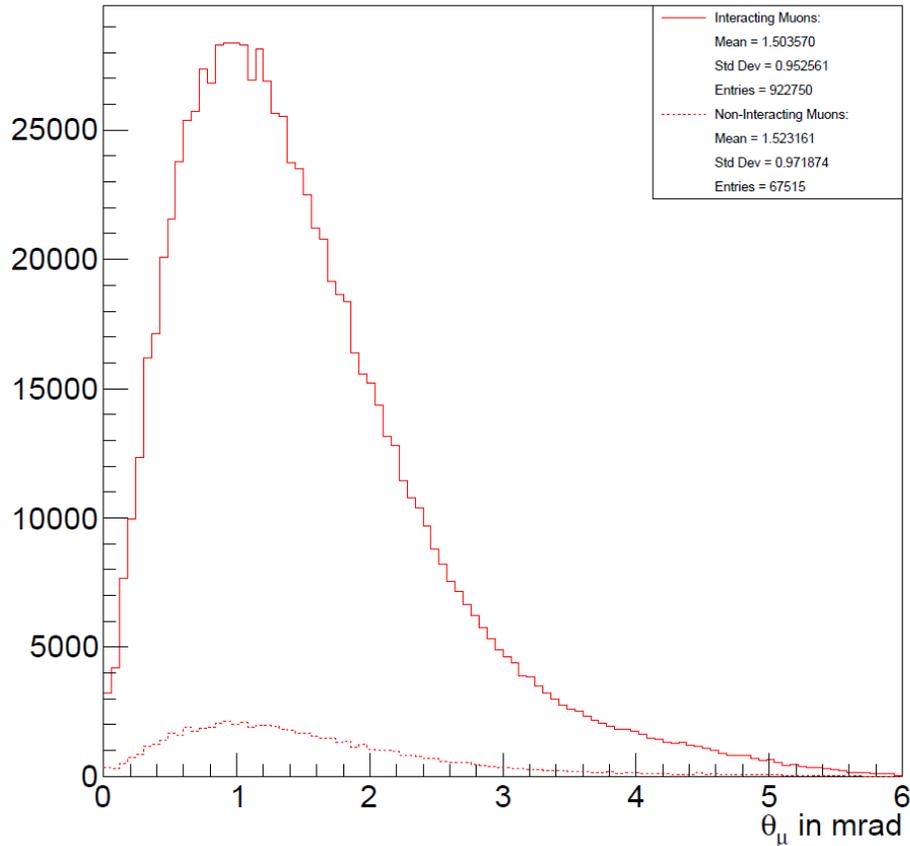
Entering Global Coordinates in Muon Detector, Interacting Muons



Increasing absorber thickness slightly reduced the number of detected muons in muon detector, but most losses were due to **sensor inefficiency**, not the absorber layer itself.

# Muon and background particle angle analysis

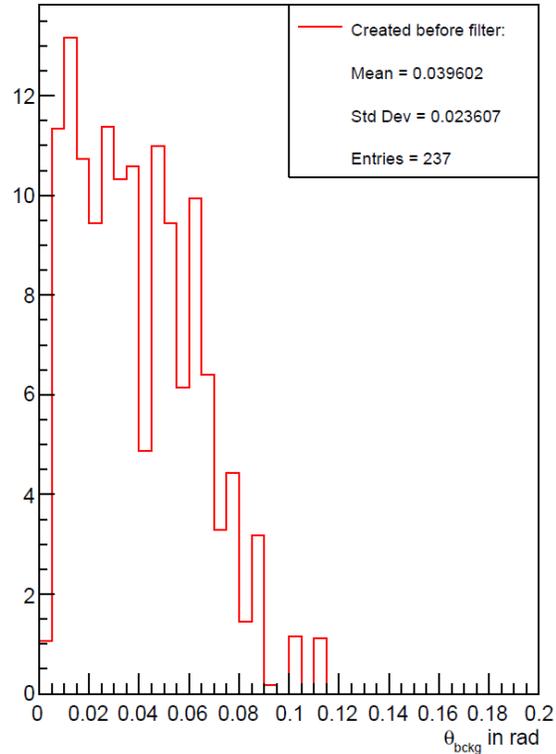
Muon Angles in Muon Detector



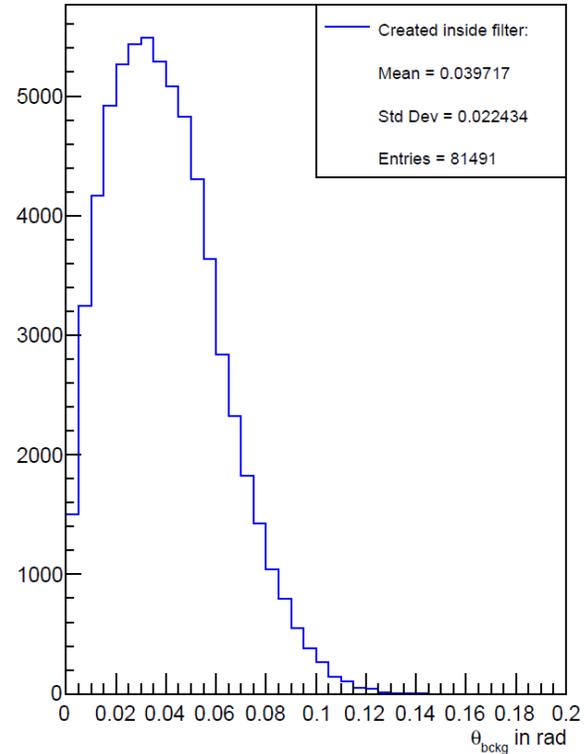
Material	Muon Type	Mean / mrad	Std Dev / mrad
<b>No Absorber</b>	Interacting	1.5	0.9
	Non-Interacting	1.5	0.9
<b>1 cm Iron</b>	Interacting	1.5	0.9
	Non-Interacting	2.0	1.0
<b>2 cm Iron</b>	Interacting	1.5	0.9
	Non-Interacting	2.0	1.0
<b>cm Iron</b>	Interacting	2.0	1.0
	Non-Interacting	2.0	1.0

Description	No Absorber	1 cm Iron	2 cm Iron	10 cm Iron
Interacting muons	85.8 ± 0.2%	86.4 ± 0.3%	87.5 ± 0.1%	93.2 ± 0.1%
Muons interacting in Absorber	-	7.3 ± 0.1%	14.1 ± 0.1%	53.3 ± 0.3%
Non-interacting muons	14.5 ± 0.2%	13.6 ± 0.3%	12.5 ± 0.1%	6.8 ± 0.1%
Interacting muons, reconstructed in muon detector	85.3 ± 0.2%	86.3 ± 0.3%	87.3 ± 0.1%	93.0 ± 0.1%
Muons interacting in Absorber, reconstructed in muon detector	-	7.3 ± 0.1%	14.1 ± 0.1%	53.2 ± 0.3%
Non-interacting muons, reconstructed in muon detector	14.5 ± 0.2%	13.5 ± 0.3%	12.5 ± 0.1%	6.7 ± 0.1%

Background Angles in Muon Detector (Before Filter)



Background Angles in Muon Detector (Inside Filter)



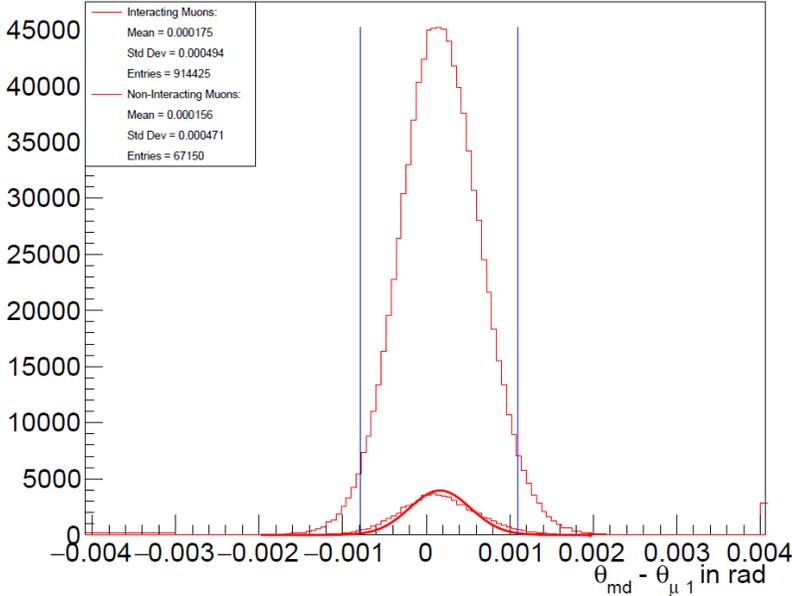
Histogram	Mean / rad	Std Dev / rad	Entries
Before; No Absorber	0.03	0.03	34099
Before; 1 cm Iron	0.04	0.02	18453
Before; 2 cm Iron	0.04	0.02	10728
Before; 10 cm Iron	0.04	0.02	237
Inside; No Absorber	0.0	0.0	0
Inside; 1 cm Iron	0.04	0.02	40195
Inside; 2 cm Iron	0.04	0.02	55481
Inside; 10 cm Iron	0.04	0.02	81491

Absorbers reduce background from particles produced before them but also generated new background internally.

- Main source of background:  $e^+$  and  $e^-$  from pair production process

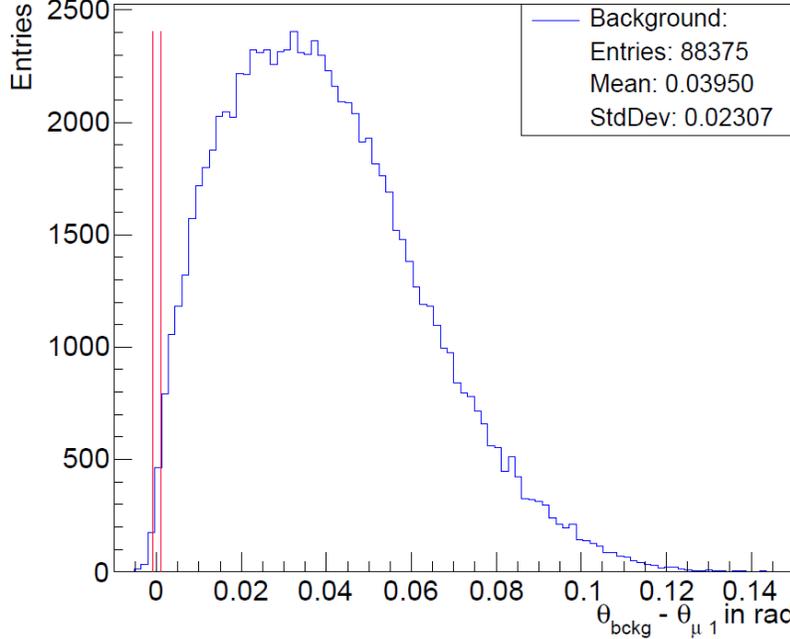
# Angle method

Angle Difference: Muons



Percentage of lost muons:  
 Interacting: 6.0181%  
 Non-Interacting: 5.0040%

Angle Difference: Background

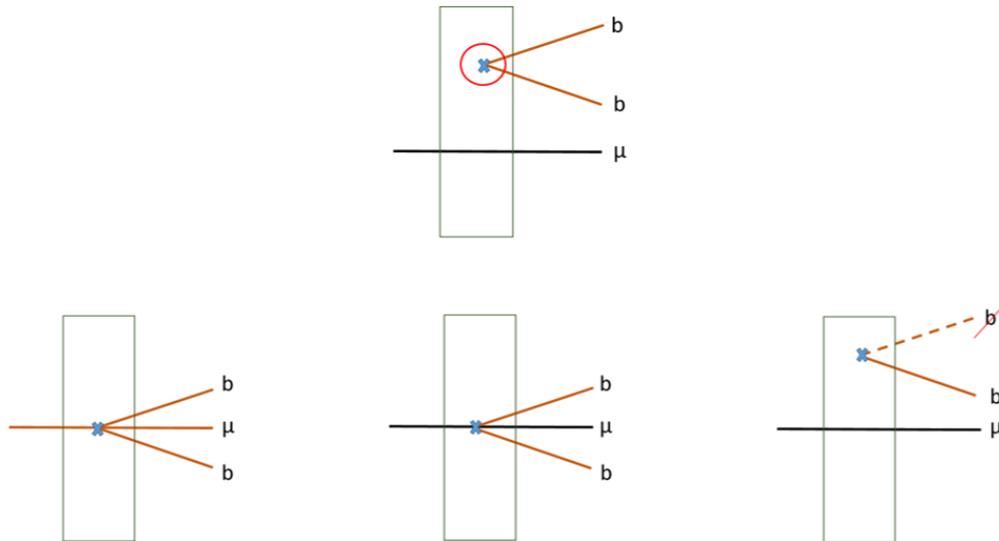


Percentage of background inside cut-off: 0.5262%

	No Absorber	1 cm Iron	2 cm Iron	10 cm Iron
Lost Interacting Muons	0.0025%	5.7833%	5.9584%	6.0181%
Lost Non-Interacting Muons	0.0018%	4.8270%	5.2950%	5.0040%
Background within line cut-off	5.1232%	0.9102%	0.7893%	0.5262%

# Vertexing Method for background rejection

- Background particles reconstructed in the muon detector but originating in the absorber can be traced back to their origin, or vertex  $\rightarrow$  If the vertex lies within the absorber, the corresponding track is identified as background and rejected.
- This method works only for background particles generated within the absorber.

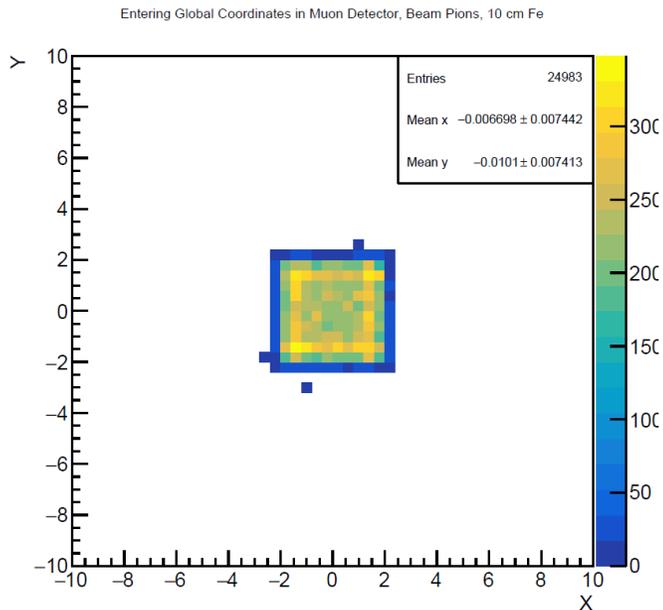


- The percentage of usable tracks in the configuration without an absorber is high, suggesting that most of the background tracks within the cut-off originate from the ECAL
- As the thickness of the absorber increases, the percentage of usable tracks rises
- While the no-absorber setup shows the highest percentage of eliminated background tracks, it is essential to consider the overall data when evaluating performance

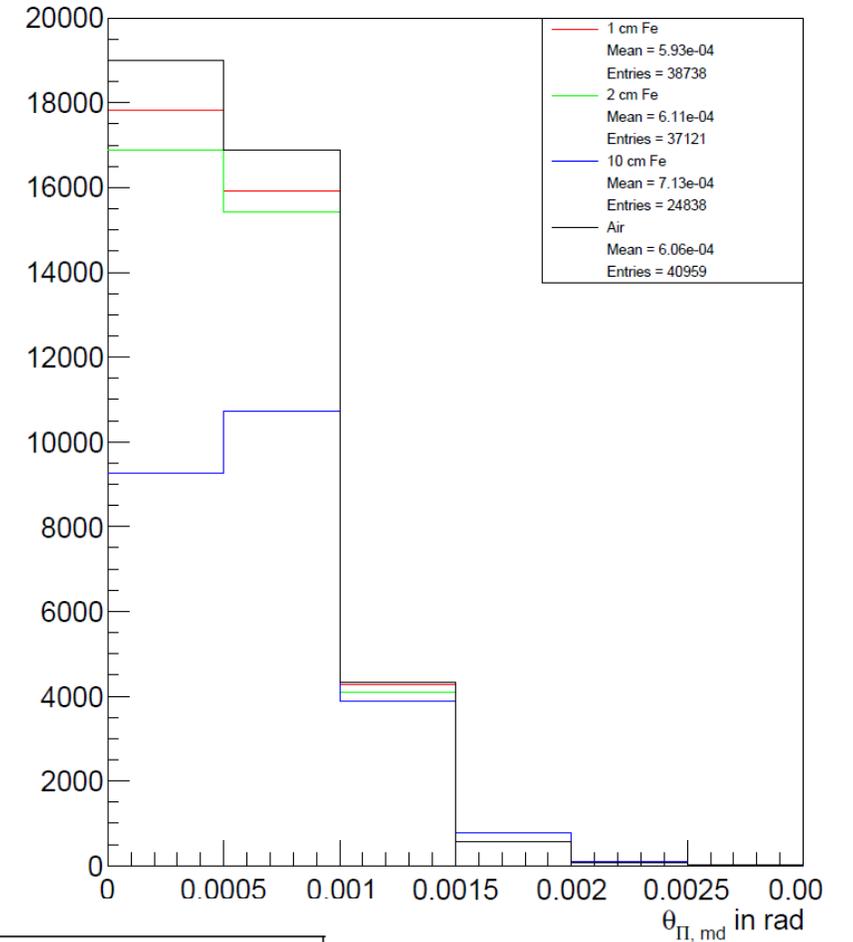
<b>Metric</b>	<b>No Absorber</b>	<b>1 cm Iron</b>	<b>2 cm Iron</b>	<b>10 cm Iron</b>
Percentage of Usable Tracks	98.1245 %	41.8706 %	44.7911 %	64.9742 %
Muon-Interaction Error	44.3627 %	48.1649 %	42.6244 %	35.5949 %
Track Elimination Efficiency	16.2383 %	13.4586 %	13.4586 %	9.1120 %

# Pion contamination study

- Goal: to determine the absorber layer ability to stop beam pions from reaching the muon detector.
- Updated version of FairMUonE
- $10^5$  events
- Square-shaped pionic beam generator
- Future work: more realistic beam profile, consisting of a mix of muons and pions



Reconstructed  $\Pi$  angles in muon detector



Absorber Configuration	Station 1	Muon Detector
No Absorber	$96.2 \pm 0.2\%$	$41.0 \pm 0.3\%$
1 cm Iron	$96.2 \pm 0.2\%$	$38.7 \pm 0.3\%$
2 cm Iron	$96.2 \pm 0.2\%$	$37.1 \pm 0.4\%$
10 cm Iron	$96.2 \pm 0.1\%$	$24.8 \pm 0.4\%$