



TÉCNICO LISBOA

# A Toy Monte Carlo Model for the Simulation of Extensive Proton Air Showers

**Astroparticle Multi-Messengers**

30<sup>th</sup> of June, 2022

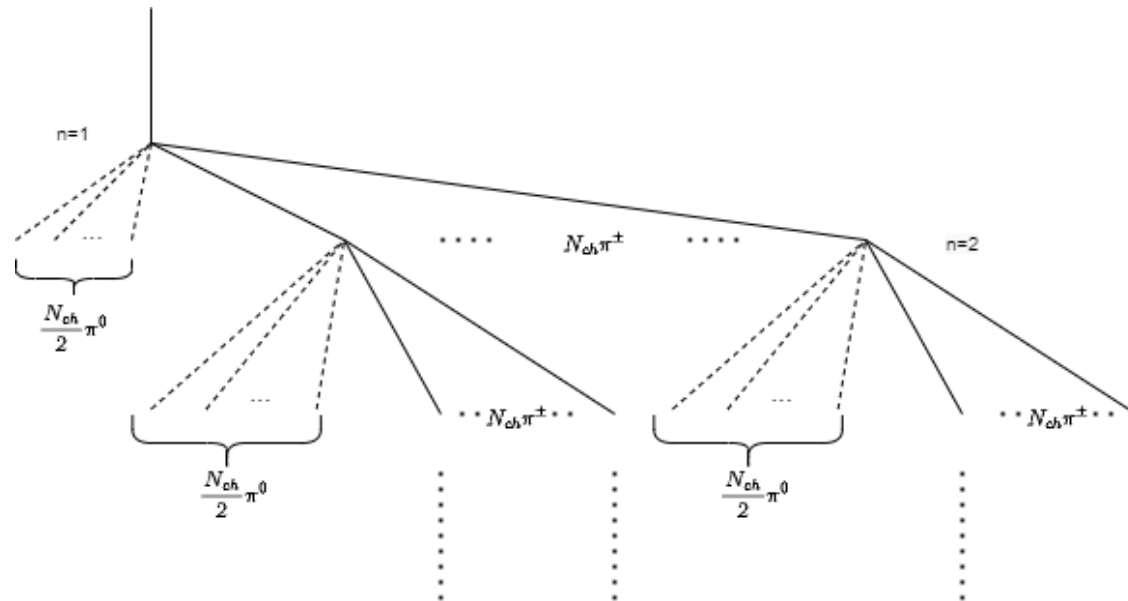
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# I. Introduction

## Matthews Model for Hadronic Cascades

- Inspired by Heitler Model for electromagnetic cascades
- Layers of atmosphere with thickness  $\lambda_I \ln(2)$
- After travelling this distance, hadrons interact, producing  $N_{ch}\pi^\pm$  and  $\frac{N_{ch}}{2}\pi^0$
- Only  $\pi^\pm$ 's give rise to new cascades, while  $\pi^0$ 's decay to photons, producing EM cascades
- Energy equally distributed for all the particles in an interaction
- When the energy of  $\pi^\pm$  falls below a critical energy,  $E_C$ , the  $\pi^\pm$ 's decay to muons



# I. Introduction

## Toy Monte Carlo and its objectives: how the work was divided

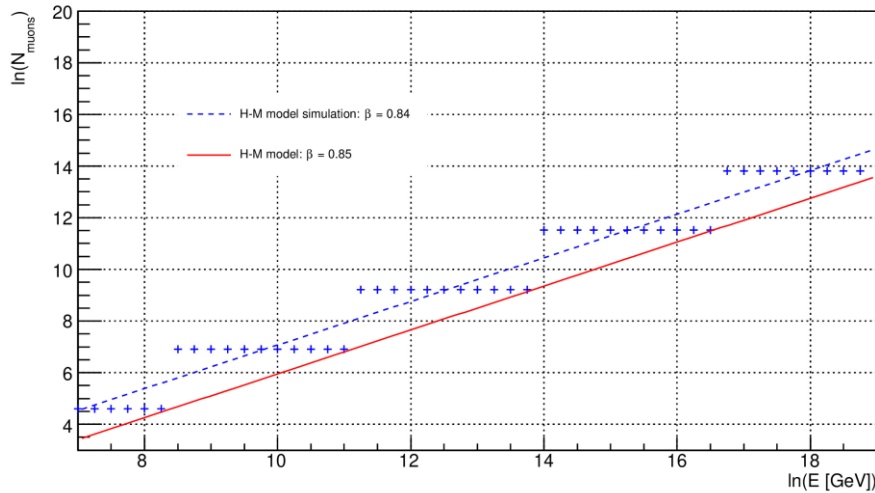
- 1. Toy Monte Carlo results under the same conditions of Matthews model and comparison with the analytical expressions from the model**
  - Number of muons and maximum shower depth as a function of energy
  - Evolution of the number of muons with the multiplicity
  - Evolution of the number of muons with  $p$ , the fraction of energy that goes into hadronic showers in each interaction (generalization of Matthews model for  $p \neq 2/3$ )
- 2. Introduction of stochasticity: relaxing of some conditions of Matthews model**
  - Multiplicity distribution
  - Comparison with Matthews model
    - Evolution of number of muons with primary energy
  - Try to understand the correlation between the number of muons and the maximum depth of the shower
    - Study of the correlation of the number of muons and maximum depth of the shower with several parameters

# II. Toy Monte Carlo under Matthews conditions

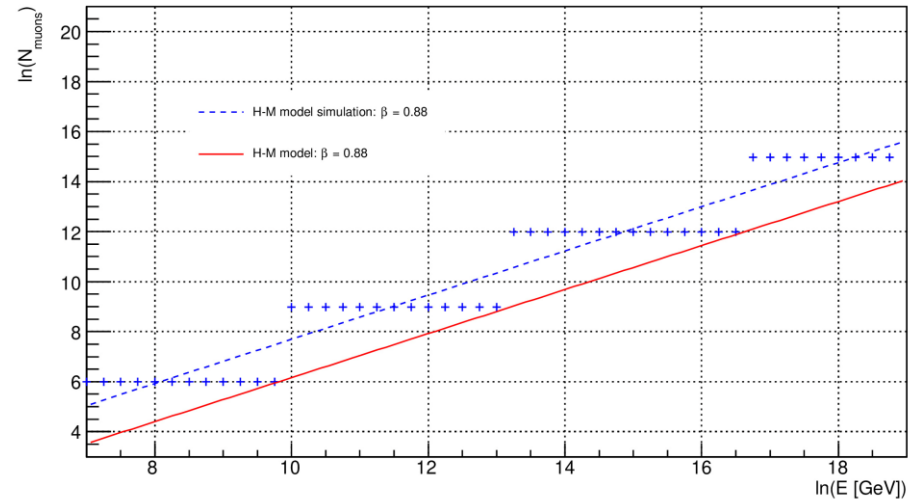
## Evolution of the number of muons with primary energy

Matthews model expression:  $\ln N_\mu = \beta \ln \left( \frac{E_0}{E_c} \right)$  , where  $\beta = \frac{\ln(N_{ch})}{\ln(1.5N_{ch})}$

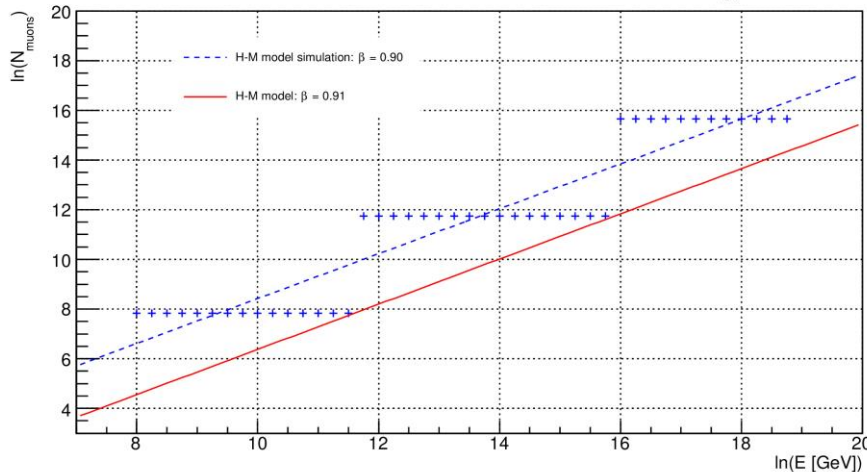
Number of muons as a function of primary energy for  $N_{ch} = 10$



Number of muons as a function of primary energy for  $N_{ch} = 20$



Number of muons as a function of primary energy for  $N_{ch} = 50$



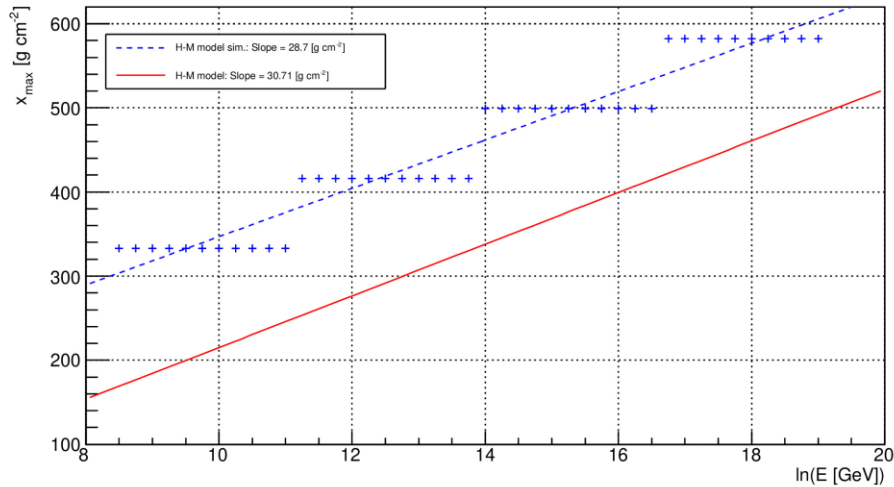
- Absolute values don't coincide with the analytical Matthews model due to the step-character of the simulation
- Evolution with energy in agreement with Matthews model for several multiplicities

# II. Toy Monte Carlo under Matthews conditions

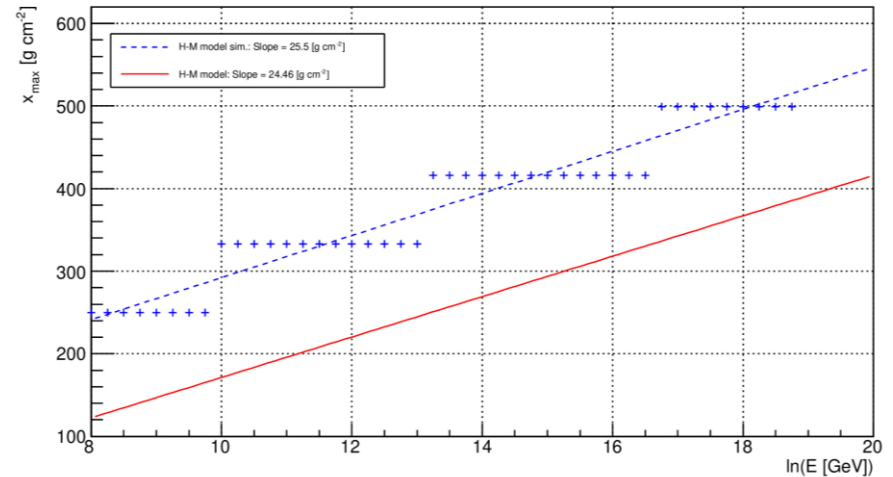
## Evolution of the maximum shower depth with primary energy

Matthews model expression:  $x_{max} = dn_c = \frac{d}{\ln(1.5N_{ch})} \ln\left(\frac{E_0}{E_c}\right)$  with  $d = \lambda_I \ln(2) = 83.2 \text{ g cm}^{-2}$

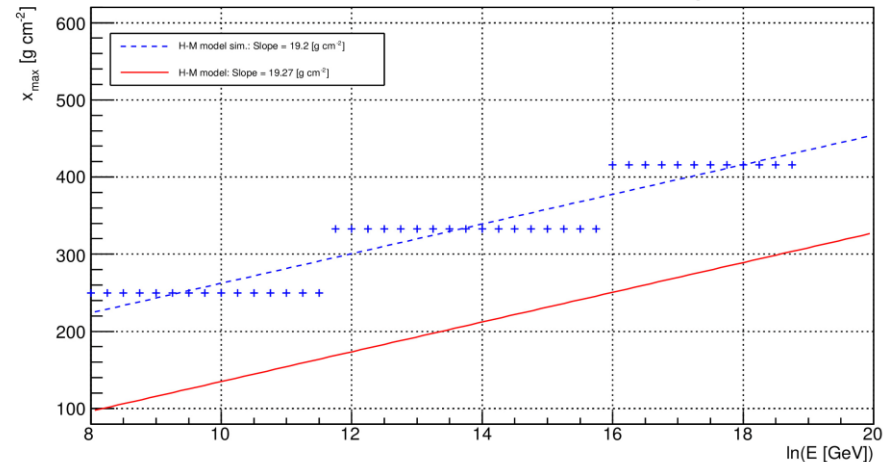
$x_{max}$  as a function of primary energy for  $N_{ch} = 10$



$x_{max}$  as a function of primary energy for  $N_{ch} = 20$



$x_{max}$  as a function of primary energy for  $N_{ch} = 50$

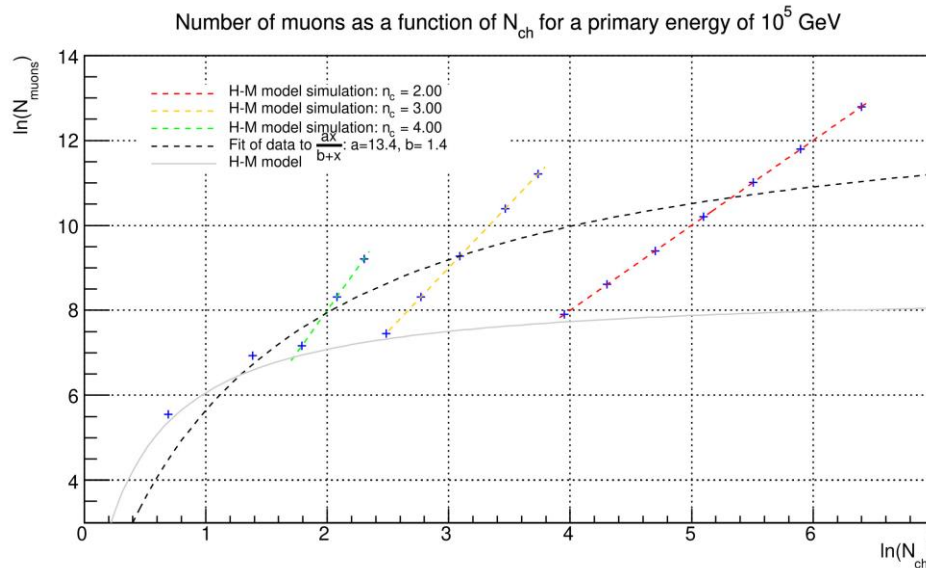


- Once again, absolute values differ from analytical Matthews model
- Evolution with energy in agreement with Matthews model for several multiplicities

# II. Toy Monte Carlo under Matthews conditions

## Evolution of the number of muons with multiplicity

Matthews model expression:  $\ln N_\mu = n_c \ln N_{ch} = \ln(E_0/E_c) \frac{\ln(N_{ch})}{\ln(1.5N_{ch})}$

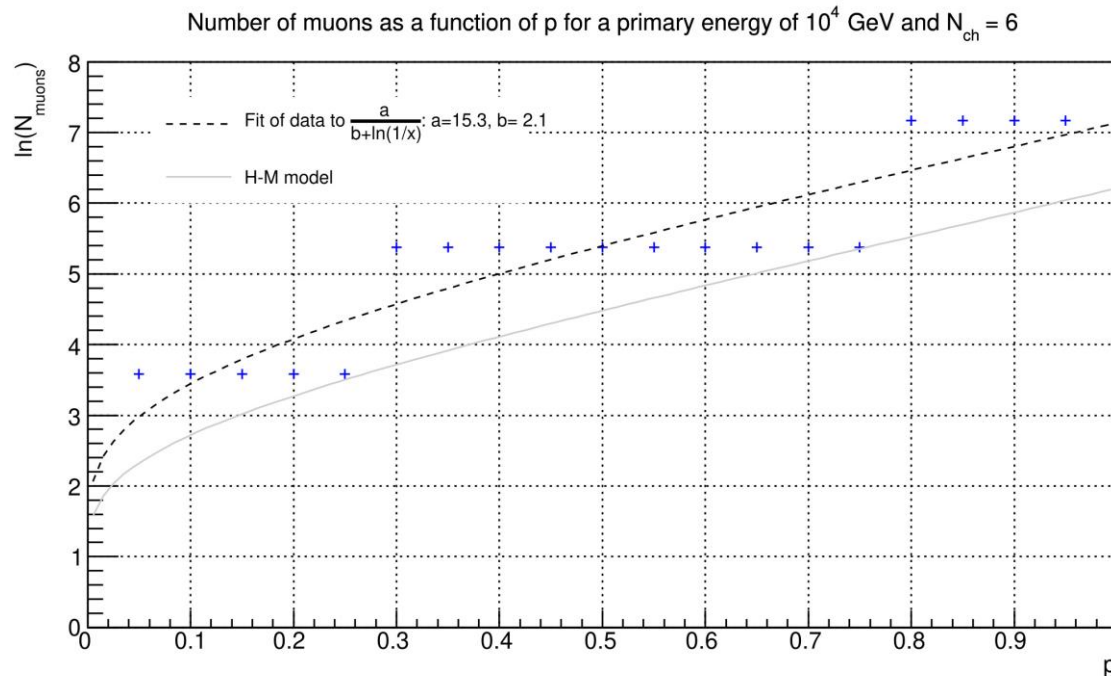


- Evolution of the number of muons with the multiplicity consistent with Matthews model

# II. Toy Monte Carlo under Matthews conditions

## Evolution of the number of muons with p

(Generalized) Matthews model expression:  $\ln N_{\mu} = n_c \ln N_{ch} = \frac{\ln(E_0/E_c) \ln(N_{ch})}{\ln(N_{ch}) - \ln(p)}$



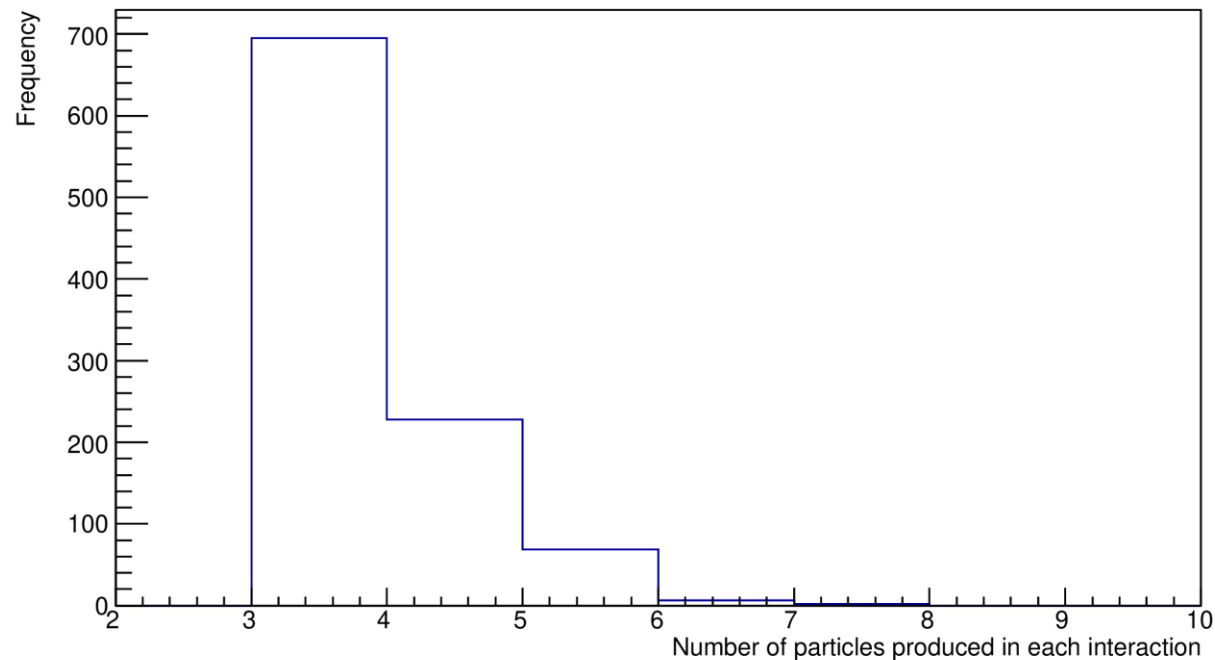
- Evolution of the number of muons with p matches the prediction from the analytical (generalized) Matthews model

# III. Toy Monte Carlo with stochasticity

## Introduction

- Relaxing of equally distributed energy and constant multiplicity along the shower
  - In each interaction, energies are distributed uniformly
  - Multiplicity adjusted as the distribution of energy occurs
  - $\pi^\pm/\pi^0$  2:1 ratio cannot always be guaranteed: increase of computational time and decrease of stochasticity
  - Choice: privilege  $\pi^\pm$  over  $\pi^0$

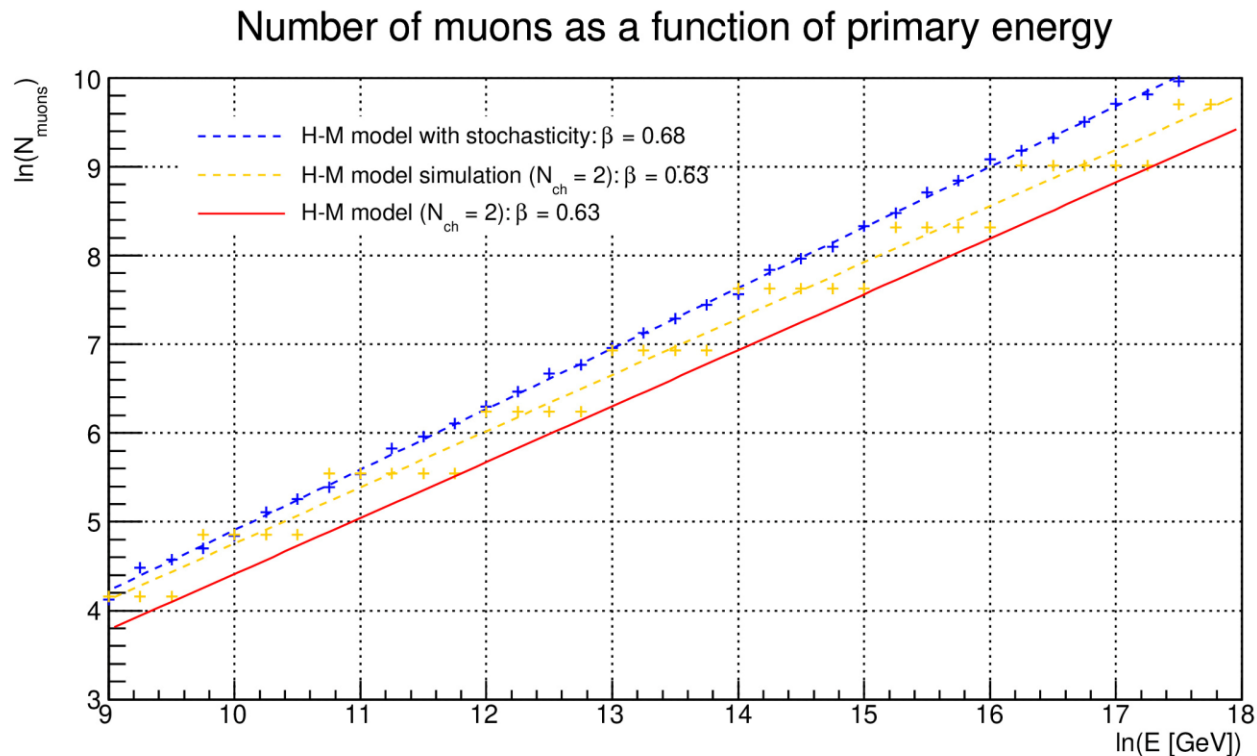
Multiplicity Spectrum Histogram





# III. Toy Monte Carlo with stochasticity

## Evolution of the number of muons with primary energy



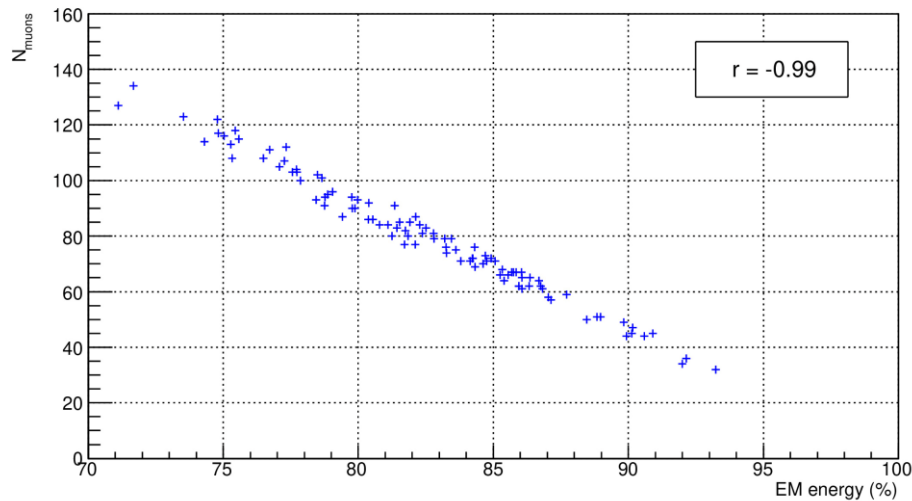
- Comparison with Matthews model for  $N_{ch} = 2$
- Higher  $\beta$  mainly justified by a  $\pi^\pm/\pi^0$  ratio greater than 2:1
- Evolution of number of muons with energy follows the same law as in Matthews model

# III. Toy Monte Carlo with stochasticity

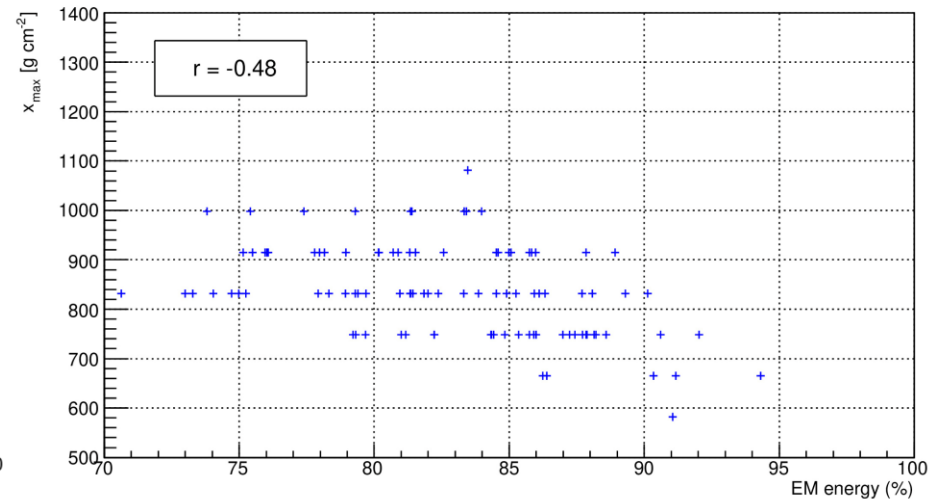
## Sensitivity of $N_{muons}$ and $x_{max}$ to the energy percentage that goes into EM showers

- Expected negative correlation for both  $N_{muons}$  and  $x_{max}$

$N_{muons}$  as a function of EM energy percentage



$x_{max}$  as a function of EM energy percentage



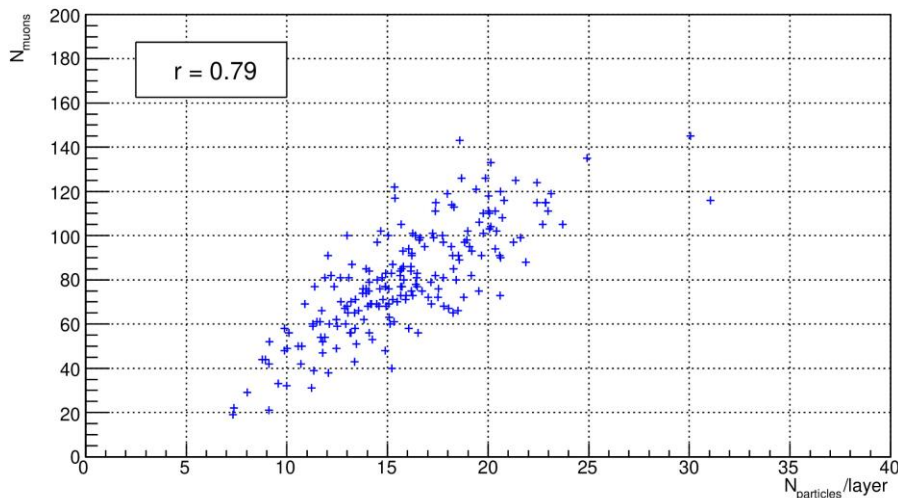
- Very strong negative linear correlation between  $N_{muons}$  and EM energy percentage
- Weaker correlation between  $x_{max}$  and EM energy percentage

# III. Toy Monte Carlo with stochasticity

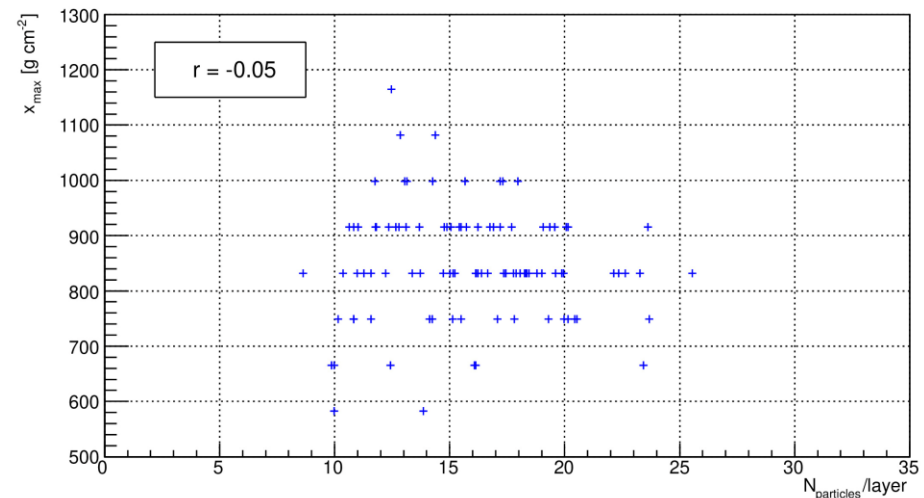
## Sensitivity of $N_{muons}$ and $x_{max}$ to multiplicity

- Multiplicity measured as the geometric mean of the number of particles per layer
- Correlation is harder to predict: a greater multiplicity increases the number of subshowers but decreases (on average) the energy per particle

$N_{muons}$  as a function of the geometric mean of the number of particles in each layer



$x_{max}$  as a function of the geometric mean of the number of particles in each layer



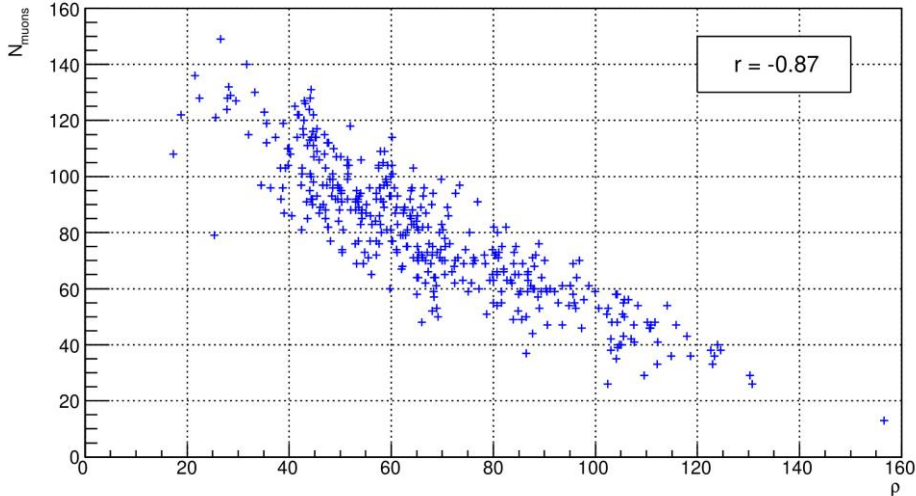
- Strong positive correlation between  $N_{muons}$  and multiplicity: despite the decrease of the average energy per particle, the increase in the number of subshowers increases  $N_{muons}$
- No correlation between  $x_{max}$  and multiplicity (alone): find another parameter

# III. Toy Monte Carlo with stochasticity

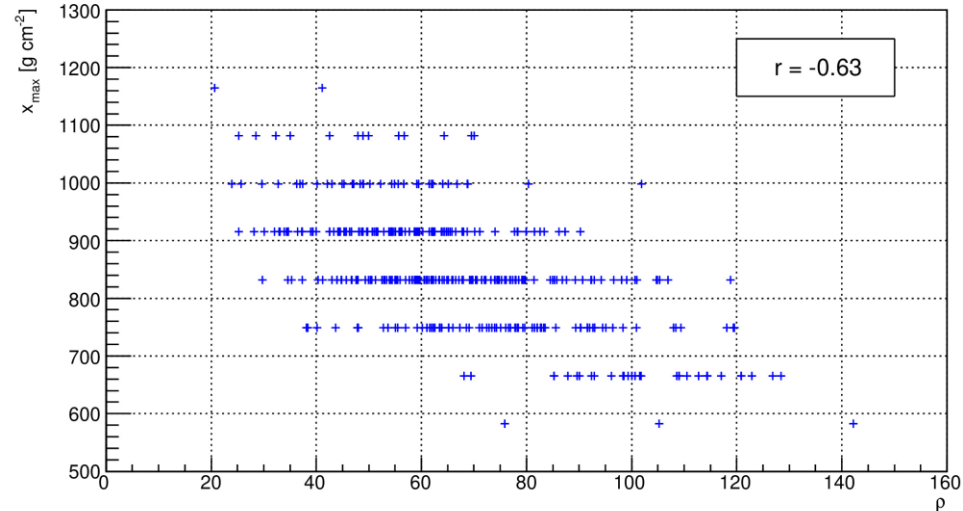
## Sensitivity of $N_{muons}$ and $x_{max}$ to $\rho$

- Basic idea: the greater the fraction of energy that goes into EM showers in the first levels, the smaller the energy available either to increase  $N_{muons}$  or  $x_{max}$
- $$\rho = \sum_{layer=1}^4 \frac{E_{em,layer}(\%)}{\sqrt{layer}}$$

$N_{muons}$  as a function of  $\rho$



$x_{max}$  as a function of  $\rho$



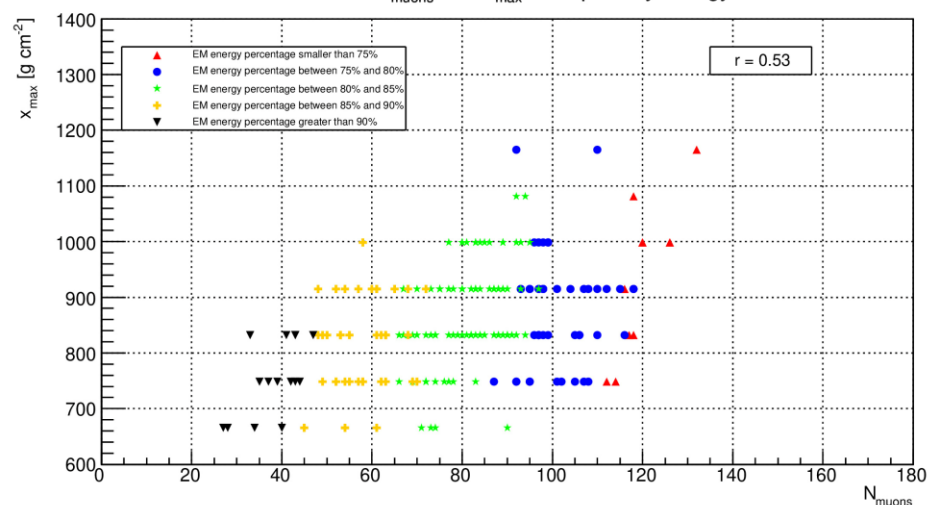
- Both  $N_{muons}$  and  $x_{max}$  show a negative correlation with  $\rho$
- Correlation between  $x_{max}$  and  $\rho$  seems to be stronger than between  $x_{max}$  and the percentage of primary energy that goes into EM showers

# III. Toy Monte Carlo with stochasticity

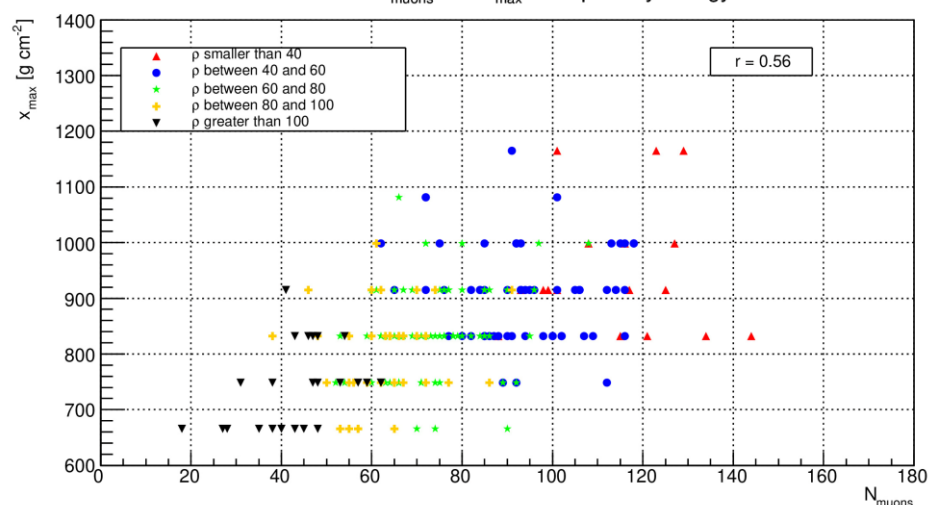
## Correlation between $N_{muons}$ and $x_{max}$

- Use of EM energy percentage and  $\rho$  to study correlation between  $N_{muons}$  and  $x_{max}$

Correlation between  $N_{muons}$  and  $x_{max}$  for a primary energy of  $10^4$  GeV



Correlation between  $N_{muons}$  and  $x_{max}$  for a primary energy of  $10^4$  GeV



- $N_{muons}$  mainly governed by EM energy percentage, as expected
- Weak negative correlation between  $x_{max}$  and both EM energy percentage and  $\rho$
- Weak positive correlation between  $N_{muons}$  and  $x_{max}$

# IV. Conclusions

- Matthews analytical model coincides in several aspects with the Toy Monte Carlo simulation under the model's assumptions:
  - Discrepancies attributed to the step-character of the simulation, in contrast with the continuous analytical expressions
  - Despite discrepancies in the absolute values, the evolution of several quantities with energy, multiplicity and  $p$  follows the analytical Matthews model
- Evolution of  $N_{muons}$  with energy when stochasticity is introduced follows what we expect from Matthews model

# IV. Conclusions

- $N_{muons}$  is strongly correlated with the parameters studied, mainly the EM energy percentage. Intuitive: when EM energy percentage decreases, there is more energy going into hadronic showers, producing more muons
- $x_{max}$  is weakly correlated with the parameters studied. It seems to decrease slowly with the increase of the EM energy percentage and  $\rho$ , which matches the intuition
- $N_{muons}$  and  $x_{max}$  were observed to be weakly and positively correlated. Despite understanding that when the EM energy percentage decreases,  $N_{muons}$  increases and  $x_{max}$  tends to increase, a deeper analysis of the variation of  $x_{max}$  with different parameters is needed