

TATA INSTITUTE OF FUNDAMENTAL RESEARCH

GRADUATE SCHOOL PROJECT REPORT

---

**Comparison of CORSIKA hadronic  
interaction generators with  
GRAPES-3 data**

---

*Author:*

Mohit Saharan  
DHEP, TIFR, Mumbai

*Supervisor:*

Dr. Pravata K. Mohanty  
DHEP, TIFR, Mumbai

June 10, 2019

## Abstract

In GRAPES-3 experiment, hadronic interaction generators of CORSIKA simulation program are used to derive the composition and energy of primary cosmic rays (PCRs). The results are highly dependent on the assumptions taken by different type of generators. This study compares the two generators from CORSIKA-7.69: SIBYLL-2.3c and QGSJETII-04, on the basis of muon multiplicity distributions(MMDs). The parameters of SIBYLL-2.3c and QGSJETII-04 are tuned to LHC data, with center-of-mass energies  $\sqrt{s} = 0.9$  TeV and 7 TeV, and hence are called post-LHC generators. Low energy hadronic interactions were treated by FLUKA-2011. In this study, MMDs of monoenergetic showers with zenith angle  $= 0^\circ$ , induced by proton, He, N, Al, and Fe at energies: 10 TeV, 100 TeV, and 1000 TeV were compared. MMDs of monoenergetic proton initiated showers simulated using post-LHC generators were also compared with that of pre-LHC generators (SIBYLL-2.1, and QGSJETII-03 of CORSIKA-6.99). Proton initiated showers with primary energy  $10^{13} \text{ eV} < E < 10^{16} \text{ eV}$ , and zenith angle  $0^\circ < \theta < 60^\circ$  were generated using SIBYLL 2.3c. Analysis of a similar shower data simulated using SIBYLL 2.1 (CORSIKA 7.41) was done and the muon multiplicity distribution for differential shower size bins was compared with data recorded by GRAPES-3 detector array in the year 2014 (3 January to 30 December).

## Contents

<b>1</b>	<b>Introduction</b>	<b>2</b>
<b>2</b>	<b>Cosmic rays</b>	<b>3</b>
<b>3</b>	<b>GRAPES-3 detector array</b>	<b>3</b>
<b>4</b>	<b>Simulation of monoenergetic showers</b>	<b>4</b>
<b>5</b>	<b>Comparison of simulations results with GRAPES-3 data</b>	<b>6</b>
<b>6</b>	<b>Discussions and Summary</b>	<b>8</b>
<b>7</b>	<b>Acknowledgments</b>	<b>9</b>

# 1 Introduction

A lot of studies have been done on cosmic rays but we still do not fully understand the nature of their sources, their composition, and acceleration mechanism. The energies of cosmic rays range from less than  $\sim 10^9$  eV upto  $\sim 10^{20}$  eV. GRAPES-3 is an extensive air shower experiment consisting of scintillator detector as well as a large area muon detector, located in Ooty. [2] It is designed to study the primary cosmic rays and gamma rays in TeV-PeV energy range. The study of cosmic ray energy spectrum and nuclear composition is one of the primary objectives of GRAPES-3 experiment. In order to derive the nuclear composition of primary cosmic rays (PCRS), muon content corresponding to the primary particle is important, which can be studied by simulating shower by using Monte Carlo methods.

In GRAPES-3 experiment, CORSIKA simulation program is used to simulate the air showers. SIBYLL 2.3c and QGSJETII-04 are two of the high energy hadronic interaction generators packaged into CORSIKA-7.69 whose parameters are tuned to the LHC data with center-of-mass energies  $\sqrt{s} = 0.9$  TeV and 7 TeV, [5]. Proton-Proton collision energy  $\sqrt{s} = 7$  TeV corresponds to about  $2.5 \times 10^{16}$  eV in the laboratory frame. The predictions made by different hadronic interaction generators are highly dependent on the different assumptions that the generators are based upon. Therefore, it's very important to find out the generator whose predictions match best with the GRAPES-3 data.

This study presents the comparison of the two high energy hadronic interaction generators – SIBYLL 2.3c and QGSJETII-04, on the basis of muon multiplicity distributions (MMDs). Low energy hadronic interactions were treated by pairing FLUKA-2011 package with high energy generators. Monoenergetic showers were simulated for the following primaries: H, He, N, Al, and Fe at energies: 10 TeV, 100 TeV, and 1000 TeV. These primaries were chosen because they cover most of the primary range in terms of number of nuclei. Muon multiplicity is expected to vary widely over the range of chosen primaries and also with primary energy. Therefore, muon multiplicity can be a good parameter for composition studies.

The comparison of Pre-LHC (SIBYLL 2.1 and QGSJETII-03) and Post-LHC (SIBYLL 2.3c and QGSJETII-04) generators was also done taking proton induced showers at energies: 10 TeV, 100 TeV and 1000 TeV. The post-LHC generators were expected to produce more muons per shower as compared to pre-LHC generators.

Towards the end, proton induced showers generated by SIBYLL 2.1 (pre-LHC) paired with FLUKA-2011 for energy  $63.1 \times 10^{12} \text{ eV} < E < 10^{15} \text{ eV}$ , and zenith angle  $0^\circ < \theta < 25^\circ$  and following  $E^{-2.7}$  differential spectrum were analysed. The MMDs of this spectrum data for differential shower size ( $N_e$ ) bins (bin size =  $10^{0.5}$ ) was compared to that of GRAPES-3 data for year 2014 (3 Jan. to 30 Dec.). The MMDs of simulated spectrum data were not expected to match fully with that of experimental data because the experimental data is composed of showers induced by many type of primaries and not just protons[1]. Therefore, only in the low multiplicity regions of MMDs, where contribution of protons is more, the simulated data were to be compared with experimental data. The MMDs of simulation were expected to improve for the simulations done with post-LHC generator SIBYLL-2.3c. Therefore, to compare the post-LHC combination of SIBYLL 2.3c and FLUKA in the same manner with GRAPES-3 data, the proton initiated showers were simulated for energy  $10 \times 10^{12} \text{ eV} < E < 10,000 \times 10^{12} \text{ eV}$ , and zenith angle  $0^\circ < \theta < 60^\circ$ . This spectrum data would be analysed with the following cuts:  $63.1 \times 10^{12} \text{ eV} < E < 10^{15} \text{ eV}$  and zenith angle  $0^\circ < \theta < 25^\circ$ . Since the analysis of such a large amount of data

requires a lot of computation time and resources, the analysis of post-LHC spectrum data is currently in progress.

## 2 Cosmic rays

Cosmic rays (CRs) are high energy charged particles, originating in outer space, that travel at nearly the speed of light and strike the Earth from all directions. The CRs mostly contain protons (88%), helium (9%), nuclei of heavier particles and a minute fraction are high energy electrons, positrons. On the Earth's surface, we hardly detect any primary cosmic rays because most of them interact with the Earth's atmosphere. With the help of high altitude balloon experiments and space-borne detectors, these primary CRs can be detected directly. Direct detection of cosmic rays have been made for primary energies upto  $\sim 100$  TeV [4]. This constraint is due to steeply falling flux of CRs added with the measurements being performed with the small size detector with a limited exposure time. Therefore, measurements at higher energy are performed with ground based detectors having large effective surface area. The detected particles mainly include muons, electrons, photons, and hadrons. The information about muon content of the shower can be used to derive the mass composition of PCRs[1]. The muon content of a shower can also be used to distinguish between cosmic ray induced showers and gamma ray induced showers.

## 3 GRAPES-3 detector array

The GRAPES-3 (Gamma Ray Astronomy at PeV EnergieS-Phase 3) experiment is designed to observe extensive air showers (EAS) in the TeV-PeV energy range[2]. The objectives of GRAPES-3 are to probe the acceleration and propagation of high energy particles in the universe through energy spectrum and composition measurements of cosmic rays (PCRs), multi-TeV  $\gamma$ -ray observation, solar phenomena and atmospheric acceleration. The experimental setup is established in Ooty, at an altitude of 2200 m above sea level. The GRAPES-3 experiment [4][2] consists of an array of  $\sim 400$  plastic scintillator detectors and a  $560 \text{ m}^2$  area tracking muon detector as shown in Figure 1a.

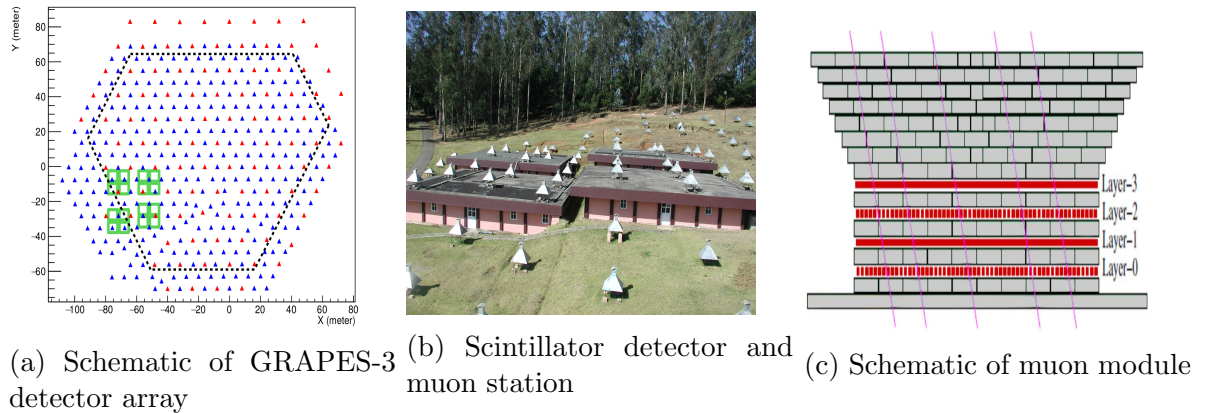


Figure 1: GRAPES-3 detector array

The scintillator detectors (shown as filled triangles in Figure 1a) are spread over an area of  $\sim 25,000 \text{ m}^2$ . Each of the GRAPES-3 scintillator detector is  $1 \text{ m}^2$  in area. The

Generator	Median	Sigma	Rel. S.D. (%)
SIBYLL-GHEISHA	1161	273	23.5
SIBYLL-FLUKA	1179	277	23.5
QGSII-GHEISHA	1185	258	21.8
QGSII-FLUKA	1200	250	20.8

Table 1: Comparison of muon multiplicity distribution for a 100 TeV primary proton

separation between two scintillator detectors is 8 m, which makes it one of the most dense array among the traditional EAS arrays. GRAPES-3 muon detector is comprised of 16 closely packed modules (shown as squares in Figure 1a). Each module contains 232 PRCs, placed in 4 layers, arranged in orthogonal directions. Each layer consists of 58 PRCs kept closely side by side. The effective area of each module is 35 m<sup>2</sup>. This large area, muon detector has been designed for studies on the composition of primary cosmic rays and studies on cosmic sources of UHE  $\gamma$ -rays.

## 4 Simulation of monoenergetic showers

For the treatment of low energy hadronic interactions, two low energy hadronic generators, namely FLUKA and GHEISHA, are commonly used. Table 1 shows the difference in muon multiplicity produced by the two hadronic generators. Here, these were paired with SIBYLL 2.3c and QGSJETII-04 to treat high energy hadronic interactions. FLUKA combination gives higher muon multiplicity as compared to GHEISHA combination. In the earlier CORSIKA simulations, done for GRAPES-3 experiment, fluka was found to be more reliable as the low energy hadronic generator. So in this study also all the simulations were done using FLUKA as low energy hadronic generator.

A comparison between the two post-LHC hadronic interaction generators was done to see the characteristics of the two generators. The comparison was done on the basis of muon content produced by the two generators. The PCR's were assumed to be composed of five species[1], Proton (H, A = 1), Helium (He, A = 4), Nitrogen (N, A = 14), Aluminum (Al, A = 27) and Iron (Fe, A = 56). Heavier nuclei N, Al and Fe were used to represent light (C,N,O), medium (Mg, Al, Si) and heavy (Mn, Fe, Co) masses in PCR's. For each primary, monoenergetic showers with zenith angle = 0 were simulated at energy: 10 TeV, 100 TeV, and 1000 TeV. Due to large amount of computation time and resources required to generate very high energy showers, 1000 TeV showers were generated for H, N, and Fe only. Comparison of muon multiplicity was made: 1) between the two generators, 2) between different primaries for each generator.

Since the threshold energy of muon detector of GRAPES-3 experiment is  $1(\sec(\theta))$  GeV [3] for muons incident on the detector with zenith angle  $\theta$  (with coverage upto 45°), in simulations also the muons with energy greater  $1(\sec(\theta))$  GeV were counted. Table 2 shows the variation of muon multiplicity with changing primaries, primary energies, and with different generators.

Table 2 shows that QGSJETII-FLUKA gives slightly higher muon multiplicity as compared to SIBYLL-FLUKA and the difference increases with mass of primary. As the energy increases from 10 TeV to 1000 TeV, the difference in muon multiplicity of two generators decrease. Figure 2 and Figure 3 show the muon multiplicity distributions at different primary energies.

	<b>SIBYLL-FLUKA</b>		<b>QGSJETII-FLUKA</b>		<b>S vs Q</b>
	Median	% Increase	Median	% Increase	% Increase
<b>10 TeV</b>					
H	146		150		2.7
He	174	19.2	182	21.33	4.6
N	214	46.6	227	51.33	6.0
Al	239	63.7	254	69.33	6.3
Fe	259	77.4	278	85.33	7.3
<b>100 TeV</b>					
H	1180		1200		1.7
He	1340	13.6	1375	14.58	2.6
N	1531	29.8	1577	31.42	3.0
Al	1659	40.6	1724	43.67	3.9
Fe	1845	56.4	1931	60.92	4.7
<b>1000 TeV</b>					
H	9393		9586		2.1
N	12132	29.2	12337	28.7	1.7
Fe	13874	47.7	14284	49.0	3.0

Table 2: Muon multiplicity at 10 TeV, 100 TeV, and 1000 TeV. Column 3 and 5 show the percentage increase in muon multiplicity of different primaries w.r.t. H of respective generators. Column "S vs Q" shows the percentage increase in muon multiplicity in QGSJETII-FLUKA w.r.t. that of SIBYLL-FLUKA.

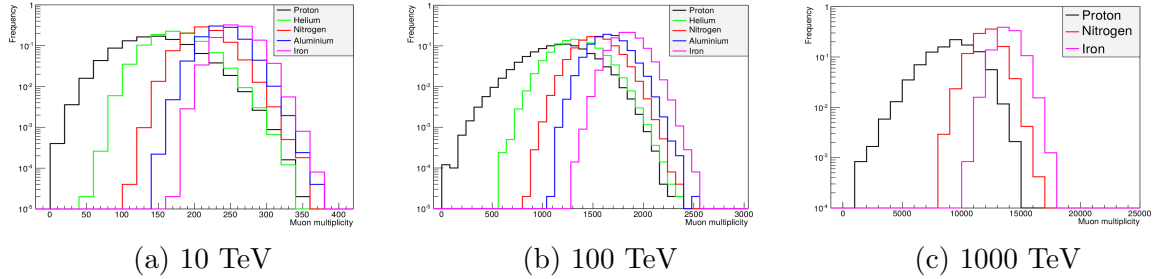


Figure 2: Muon multiplicity distribution for different primaries using SIBYLL-FLUKA

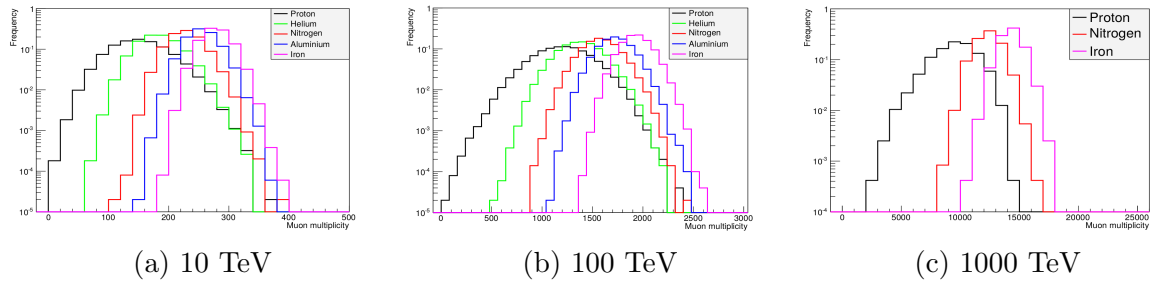


Figure 3: Muon multiplicity distribution for different primaries using QGSJETII-FLUKA

	<b>SIBYLL-FLUKA</b>		<b>QGSJETII-FLUKA</b>		<b>S vs Q</b>
	Median	% Increase	Median	% Increase	% Increase
<b>10 TeV</b>					
Pre-LHC	130		142		9.2
Post-LHC	146	12.3	150	5.6	2.7
<b>100 TeV</b>					
Pre-LHC	1006		1088		8.2
Post-LHC	1180	17.3	1200	10.3	1.7
<b>1000 TeV</b>					
Pre-LHC	7866		8327		5.9
Post-LHC	9393	19.4	9586	15.1	2.1

Table 3: Muon multiplicity at 10 TeV, 100 TeV, and 1000 TeV using pre-LHC and post-LHC generators. Column 3 and 5 represents the percentage increase in muon multiplicity of post-LHC hadronic generators w.r.t. that of pre-LHC hadronic generators. Column 6 represents the percentage increase in muon multiplicity of QGSJETII-FLUKA w.r.t. that of SIBYLL-FLUKA.

Monoenergetic proton induced showers with zenith angle =  $0^\circ$  were simulated using generators of CORSIKA-6.99, namely SIBYLL 2.1 and QGSJETII-03, at energies: 10 TeV, 100 TeV, and 1000 TeV. Table 3 shows that the difference between muon multiplicity of SIBYLL- and QGSJETII-FLUKA is more in pre-LHC as compared to post-LHC generators. In other words, post-LHC generators are expected to give relatively close results in shower analysis as compared to pre-LHC generators. Column 3 and column 5 of the Table 3 show that the difference of muon multiplicity between pre- and post-LHC generators is higher for more massive primaries.

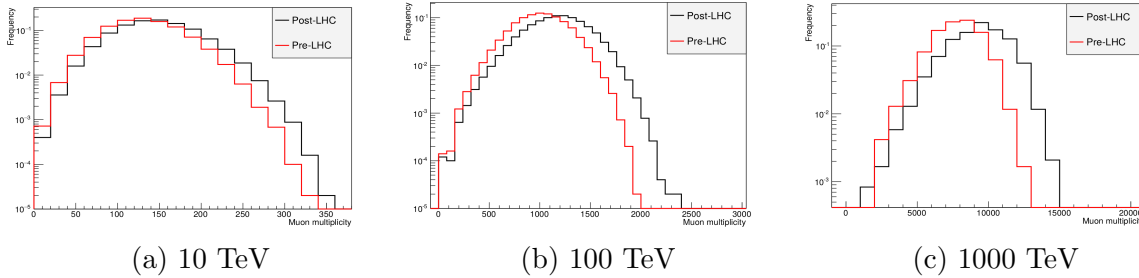


Figure 4: Muon multiplicity distribution of pre- and post-LHC hadronic generators (SIBYLL-FLUKA)

## 5 Comparison of simulations results with GRAPES-3 data

Study of monoenergetic showers was done to see the behaviour of different generators for different primary energies and primary types. For comparison with detector data, the pre-existing shower data was used which was generated using SIBYLL-2.1 (CORSIKA-7.41). The data was generated for the energy range of 10 TeV to 3000 TeV, in 18 logarithmic energy bins of bin width = 0.2. A total of 999 files were generated in each energy bin

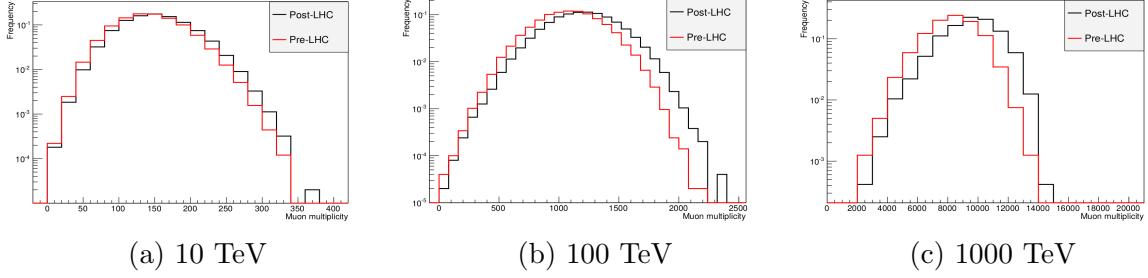


Figure 5: Muon multiplicity distribution of Pre- and Post-LHC hadronic generators (QGSJETII-FLUKA)

with energy cuts of 50 MeV, 10 MeV, 1MeV, and 1MeV for hadrons, muons, electrons, and photons respectively. During the analysis of data for this study, events from bin 10 - bin 15 were used. There were 999 files for each energy bin and each file had 10 showers. Each shower was used 10 times, with it's core randomized, to increase the statistics. The spectrum was produced using this data with spectral index of -2.7. The number of events used from each bin are shown in Table 4.

Bin No.	Energy Range (TeV)	No. of events analysed
10	63.10 - 100.00	99900
11	100.00 - 158.49	45700
12	158.49 - 251.19	20900
13	251.19 - 398.11	9500
14	398.11 - 630.96	4400
15	630.96 - 1000.0	2000

Table 4: Number of events analysed from each energy bin

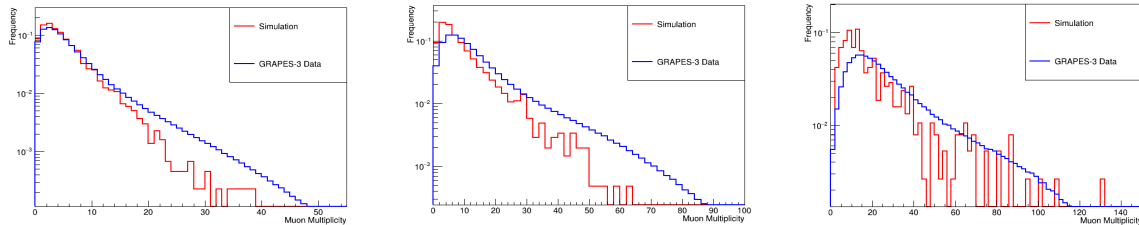
The core of each shower was randomized in a circular radius = 150 m around the array center. Then only those showers were processed which fell inside the fiducial area of array (shown by dashed line in Figure 1a), and satisfied trigger-0 and trigger-1 condition of detector array[2]. In this work, analysis code used to analyze the simulated showers was modified and updated. The code now can detect the muons hitting individual layers of the muon detector. If muon hits the following layers: layer 0 and layer 2 , or layer 1 and layer 3, or all layers , the muon hit is considered. Only those muons were counted which had kinetic energy greater than  $1(\sec(\theta))$  GeV on the muon detector surface. Then, the muon multiplicity spectrum was created for shower size ( $N_e$ ) varying from  $10^3$  to  $10^7$  with bin width =  $10^{0.5}$ .

GRAPES-3 data of year 2014 (3 January to 30 December) was analysed and MMDs were created for each size bin. This spectrum was compared to that of GRAPES-3 data, for each bin. Figure 6 shows the normalized MMDs for three differential shower size bins. From previous observations, it's known that the shower size  $10^{4.0}$  corresponds to primary energy  $\sim 50$  TeV. and shower size  $10^{5.5}$  corresponds to primary energy  $\sim 1000$  TeV. Hence, MMD of only these shower size bins were compared.

For higher muon multiplicities in either of the three plots in Figure 6, the statistics of simulation data is insufficient. This was expected because the muon multiplicity of experimental data also has contribution from other type of primaries. As shown in Figure 2, the lower values of muon multiplicity are dominated by proton. Therefore, in Figure 6, we compare the region of low muon multiplicities i.e. region around the peak.



The position of the peak of simulation data in Figure 6a matches to that of GRAPES-3 data. For higher size bins, the position peaks of the two distributions do not match very well because of fluctuations. For higher shower size bins, the distributions suffer from poor statistics. This is expected to improve with the analysis of post-LHC spectrum data because as was shown earlier, SIBYLL-2.3c produces upto  $\sim 19\%$  more muons w.r.t to SIBYLL-2.1.



(a) Shower size -  $10^{4.0}$  to  $10^{4.5}$  (b) Shower size -  $10^{4.5}$  to  $10^{5.0}$  (c) Shower size -  $10^{5.0}$  to  $10^{5.5}$

Figure 6: Comparison of MMD between pre-LHC simulation data (SIBYLL-2.1) with GRAPES-3 data (3 January, 2014 to 30 December 2014)

## 6 Discussions and Summary

Two hadronic interaction generators from CORSIKA 7.69 simulation package: SIBYLL-2.3c and QGSJETII-04, were compared on the basis of muon content produced by each generator. Low energy hadronic interactions were treated by FLUKA-2011. MMDs of monoenergetic showers with zenith angle  $= 0^\circ$ , induced by H, He, N, Al, and Fe at energies—10 TeV, 100 TeV, and 1000 TeV were compared. Muons produced by QGSJETII-FLUKA were found to be 1.7% to 7.3% higher than that of SIBYLL-FLUKA. The difference between muon content of the two generators decreased with increasing primary energy. For each primary energy, the difference between the two generators increased as the primary became more massive.

MMDs of monoenergetic proton initiated showers simulated using post-LHC generators (SIBYLL 2.3c and QGSJETII-04) were also compared with that of pre-LHC generators (SIBYLL-2.1 and QGSJETII-03 of CORSIKA-6.99). Proton initiated showers were simulated at energies: 10 TeV, 100 TeV, and 1000 TeV using above-mentioned post-LHC and pre-LHC generators. SIBYLL 2.3c produced 12.3% to 19.4% higher than that of SIBYLL-2.1. QGSJETII-03 produced 5.6% to 15.1% more muons than that of SIBYLL-2.1. Among pre-LHC generators, QGSJETII-03 produced 5.9% to 9.2% more muons than that of SIBYLL-2.1. Among post-LHC generators, QGSJETII-04 produced 1.7% to 2.7% more muons than that of SIBYLL-2.3c. Thus, the difference between muon content produced by QGSJETII and SIBYLL has decreased after tuning of the generator parameters to the LHC data.

Proton initiated showers with primary energy  $63.1 \times 10^{12} \text{ eV} < E < 1000 \times 10^{12} \text{ eV}$ , and zenith angle  $0^\circ < \theta < 25^\circ$  were analysed. The muon multiplicity distribution for differential shower size bins was compared with data recorded by the GRAPES-3 detector in the year 2014 (3 January to 30 December). The lower multiplicity region (peak region) of muon multiplicity distribution was expected to be relevant for proton's contribution to GRAPES-3 data. That region of simulation MMD was in agreement with that of GRAPES-3 data however, there were fluctuations due to insufficient statistics in

simulation data. The difference near the peak regions increased with increasing shower size because of poor statistics of simulated data. This distribution of simulated data is expected to improve with the analysis of post-LHC (SIBYLL 2.3c) spectrum data for which work is currently in progress.

## 7 Acknowledgments

I thank Dr. Pravata K. Mohanty for his invaluable guidance through out this work. I thank my GRAPES-3 group members: Mr. B. Hari Haran, Mr. Fahim Varsi, Mr. Diptiranjana Pattanaik, Ms. Medha Chakraborty, and Mr. Meeran Zuberi for helping me out whenever I faced problems with data analysis. I thank Mr. Samuel D. Morris for providing technical help to keep my work going, as he was handling the server I was working on.

## References

- [1] H.Tanaka et al., J. Phys. G: Nucl. part. Phys. 39 (2012) 025201 (16pp)
- [2] S.K. Gupta et. al, Nucl. Instr. and Meth. A 540 (2005) 311-323.
- [3] Y. Hayashi et.al, "A large area muon tracking detector for ultra-high energy cosmic ray astrophysics—the GRAPES-3 experiment", url: <https://doi.org/10.1016/j.nima.2005.02.020>.
- [4] Anuj Chandra, "A Study of High-Energy Cosmic Ray Showers by Extending the Dynamic Range of Scintillator Detectors in GRAPES-3 Experiment", PhD Thesis.
- [5] Stephan Runderkamp, url: <https://esc.fnwi.uva.nl/thesis/centraal/files/f512727007.pdf>