LATTES Gamma/Hadron Discrimination

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on behalf of the LATTES team



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The problem...



The number of hadrons overwhelms the gammas by several orders of magnitude

Possible solutions...

- If a gamma source emits continuously then increase the acquisition time
- ♦ Increase angular resolution
- Increase the energy reconstruction
- Take advantage of shower characteristics to distinguish between a gamma/hadron induced shower

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Shower characteristics



A pure electromagnetic shower (gamma) has distinct features from a shower with an hadronic component (hadron)

Strategies for primary discrimination



Strategies for primary discrimination



Lateral extension in x [m]

Hit pattern at ground

 Hits from hadronic showers are more sparse than in gamma induced showers

RPC detectors

- Explored by the ARGO collaboration
- Not yet explored for LATTES
 - complex pattern
 recognition problem

Strategies for primary discrimination



Lateral extension in x [m]

 Calorimetric information at ground

- Search for energetic clusters far from the shower core
- Lateral Distribution
 Function (LDF)
 steepness
- Water Cherenkov
 Detectors
- Explored by HAWC
 HAWC
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- ARGO has a higher granularity (too much?)
- Similar concept so ARGO g/h discrimination analysis should be importable to LATTES

HAWC vs LATTES



Take advantage of hybrid detector
 RPCs: timing and segmentation
 WCD: calorimetry

Energetic clusters far away from the shower core



Shower calorimetric information

E=5 TeV

Gamma induced showers Proton induced showers All Particles Spectrum (r > 40 m)All Particles Spectrum (r > 40 m) Particles per Shower 10² ^Darticles per Shower All particles All particles gammas gammas 10 electrons electrons 10 muons muons hadrons hadrons 10⁻¹ 10^{-1} 10⁻² 10⁻² 10⁻³ 10^{-3} -2 2 0 _4 -2 -4 0 2 log(E/GeV) log(E/GeV)

- * High pT sub-shower carry large amounts of energy
- Look for energetic clusters far from the shower core (> 40 m)
 - * Muons and high-energy photons/electrons

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Looking for high- p_T sub-showers

♦ HAWC g/h discrimination

- Look for high signal far away from the shower core (> 40 m)
- Take advantage of height of the tank to distinguish muons from electrons



hadron shower



Looking for high p_t sub-showers

ATTES g/h discrimination

- Use only stations with a distance above 40 m
- \$ \$40: sum all WCD stations signal
- \$ S40_high: sum all WCD stations that have a signal above the muon energy threshold
- Compute S40_high / S40
- ♦ Not optimized...



ρ (m⁻²)

Shower lateral distribution



r (m)

High-energy discrimination strategy



- Lateral distribution function (LDF)
 - LDF of gamma showers is more steep than the LDF of hadron showers

High-energy discrimination strategy

- Get the gamma average LDF for each reconstructed energy bin
- ♦ Fit the average LDF to each single event
 - Absorb the normalization factor
 Absorb the normalization
 Absorb the
- Compute the shower compactness
 - Event LDF "distance" to the gamma average LDF

Compactness =
$$\log_{10} \left(\sum_{i=1}^{n} \right)^{i}$$

$$\left(\sum_{i}^{n} \left(\left\langle LDF \right\rangle (r_i) - y(r_i) \right)^2 \right)$$

High-energy discrimination strategy



Shower compactness discrimination variable allows for a good background rejection which increases with energy

Combine information

 Fisher discriminant analysis to combine the two variables

- S40high/S40
- Compactness
- $\Rightarrow S/\sqrt{B} = 6 \text{ (at 2 TeV)}$

LATTES MVA toolkit created

- ♦ ROOT::TMVA
- ♦ TinyXML
- ♦ Python / C++

- add more discrimination variable
- ♦ use higher-order methods BDT, ANN...



LATTES g/h discrimination



Although not optimized the gamma/hadron discrimination results are already very encouraging

Towards the use of ANN...

- Simple artificial
 neural network
- ANN with 3 layers:
 Keras + Scikit-learn
- LATTES summer student work



- Encouraging results but need more simulations
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- Simulation time recently considerably improved

Summary

- LATTES WCDs can be used to distinguish between gamma and hadron induced showers
 - ♦ First results are very encouraging
 - Analysis not optimized
 - More variables (ideas) can be easily added and tested
 - LATTES RPCs still to be explored in g/h discrimination
 - The combination of both techniques shower further improve LATTES discrimination

Acknowledgements









Backup slides

Towards LATTES sensitivity...



LATTES: a hybrid detector

♦ Thin lead plate

- To convert the secondary photons
- Improve geometric reconstruction
- Resistive Plates Chamber
 - Sensitive to charged particles
 - Good time and spatial resolution
 - Improve geometric reconstruction
 - ♦ Explore shower particle patterns at ground

Water Cherenkov Detector

- Sensitive to secondary photons and charged particles
- Measure energy flow at ground
- Improve trigger capability
- Improve gamma/hadron discrimination



Inter-calibration

WCD vs RPC (station level)

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Crab



Accidentals contamination

Considering a time window D, the mean number of stations that randomly trigger within D is :

$$n_s = N_s \times R \times D$$

with N_s the # of stations in the array and R the single station trigger rate.

For LATTES $N_s = 3600$ and R was estimated from MC simulations to be of the order of 500 Hz; taking D ~ 200 ns yields :

to be compared with the minimum of stations required in a shower trigger, $n_s=3$.

In any case a detailed MC simulation of the impact of the accidentals should be performed !

Random triggers



Cosmic rays and station trigger rate



Reconstruction efficiency



