

# **Status of the SWGO air shower reconstruction using a template-based likelihood method**

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The Southern Wide-field Gamma-ray Observatory (SWGO) is a proposed facility for groundbased gamma-ray astronomy. It will consist of an array of water Cherenkov detectors to detect astrophysical gamma-rays mainly in the range of hundreds of GeV up to the PeV scale. To be constructed in South America, it will feature an approximately two-steradian field of view and a duty cycle close to 100%, which will complement the current generation of instruments by extending survey coverage to the Southern Hemisphere. As part of the development of the SWGO standard reconstruction framework, we employ a Monte Carlo template-based method to estimate the properties of the primary gamma-ray (such as core position and energy). In this method, an observed lateral amplitude distribution of a gamma-ray-induced air shower is fitted to the expected probability distribution stored in the templates. We validate this approach by estimating the energy performance for one of the currently investigated test array and detector unit configurations for SWGO.

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# **1. Introduction**

In the last decade, various experimental techniques for the precise measurement of astrophysical gamma rays have been established. Direct detection methods usually investigate gamma rays in a lower energy range, like for example, the Large Area Telescope (Fermi/LAT) that covers an energy range of a few MeV to some hundreds of GeV [\[1\]](#page-5-0). Ground-based instruments are used at higher energies since the particle flux becomes too small to be detected directly [\[2\]](#page-6-0).

At these energies, impinging gamma rays interact with the nuclei in the atmosphere and generate particle showers made up of mostly secondary electrons, positrons, and photons. Once these secondary particles enter a detection unit that is filled with water, they produce Cherenkov radiation [\[3\]](#page-6-1) that can be observed with photomultiplier tubes (PMTs). The deposited signal and timing measured in the detection units can be used for the shower reconstruction to estimate important characteristics of the primary gamma ray, such as the energy or direction of the particle. Current gamma-ray experiments that apply the water Cherenkov detection technique include the High-Altitude Water Cherenkov (HAWC) Observatory which is located in Mexico [\[4\]](#page-6-2) and the Large High Altitude Air Shower Observatory (LHAASO) in China [\[5\]](#page-6-3). So far, experiments of this type are limited to the Northern Hemisphere.

The Southern Wide-field Gamma-ray Observatory (SWGO) is a future instrument for groundbased gamma-ray astronomy that will also use water Cherenkov detection. It is planned to be constructed in South America and extend current-generation instruments to the Southern Hemisphere. It will allow an approximately two-steradian field of view and a duty cycle close to 100% and primarily study gamma rays in an energy range of hundreds of GeV up to the PeV scale<sup>[1](#page-1-0)</sup> [\[6\]](#page-6-4). To get information about the energy, direction, and core position of those gamma rays, their initiated particle cascades have to be reconstructed.

In this work, we describe the standard reconstruction method to reconstruct the energy and core position for gamma-induced particle showers for SWGO, which is currently being developed.

## **2. Template-based reconstruction method**

Based on the success of template-based reconstruction strategies in other experiments, such as HAWC [\[7\]](#page-6-5), we adapted the algorithm to the design of SWGO. An important advantage of the template-based technique is that the signal measured in the detection units can be incorporated directly in the reconstruction when filling the templates and does not have to be approximated [\[7\]](#page-6-5). This enables a stable reconstruction suffering from fewer fluctuations.

While the final layout of SWGO is not finalized, a few test configurations are available that are currently being investigated [\[8\]](#page-6-6). For this work, we used one of the currently available test array layouts. An image of the array layout can be found in Figure [1.](#page-2-0) The detection units consist of double-layered cylindrical tanks. Each cell includes one PMT. The PMT in the upper cell is fixed at the bottom of the cell, while the PMT in the lower cell is mounted to the top. The tanks have a diameter of 3.82 m, the upper cell has a height of 2.5 m, and the lower cell of 0.5 m, respectively. In this analysis, we limited ourselves to the use of the upper cells for the reconstruction. The array consists of two zones, a dense inner zone, and a sparser outer zone. The radius of the inner zone is

<span id="page-1-0"></span><sup>1</sup>Updated information on the official SWGO website <https://www.swgo.org/SWGOWiki/doku.php>.

<span id="page-2-0"></span>

<span id="page-2-1"></span>**Figure 1:** Test array layout of SWGO with a dense inner zone where the tank units stand wall to wall and a sparser outer zone.

	Bin range	Bin size
$log_{10}(E)$	$1.5 - 6.0$	0.05
$X_{\text{max}}$	$150$ g/cm <sup>2</sup> – 750 g/cm <sup>2</sup>	$50 \text{ g/cm}^2$
	$0^\circ - 50^\circ$	$0.06$ in $cos(\theta)$

**Table 1:** Binning of the simulated gamma-induced air showers that were used to fill the templates.

160 m where the tanks are positioned so that their walls touch the neighboring tanks. The radius of the outer zone is 300 m. The array is simulated at a height of 4.7 km above sea level.

We used simulations of gamma-induced air showers in an energy range of a few tens of GeV up to 1 PeV that were thrown in a radius of 1.5 km around the array center. The first interaction of the primary gamma ray as well as the shower development in the atmosphere was simulated with CORSIKA (version 7.740) [\[9\]](#page-6-7). The interaction of the secondary particles with the water tanks was simulated with GEANT4 (version geant4-10-00-patch-04) [\[10\]](#page-6-8).

The simulated showers that are used to fill the templates are binned in energy  $E$ , maximum shower depth  $X_{\text{max}}$  and zenith angle  $\theta$  (see Table [1\)](#page-2-1). Both the information of a single tank that measured charge as well as the information that no signal was measured are used. After filling the templates, we applied a smoothing using a Gaussian distributed weighted sum. An example of a smoothed template is shown in Figure [2.](#page-3-0)

The 2D histogram of Figure [2](#page-3-0) shows the probability distribution of measuring a certain number of photoelectrons ( $N_{\text{pe}}$ ) at a particular distance r between each tank and the shower core in the shower plane. Note that  $N_{\text{pe}}$  is a decimal number since it is processed with a jitter to represent the jitter

 $-1$ 

0

 $-5$ 

 $\mathsf{log_{10}}(\mathsf{P}% _{\mathrm{CL}}(\theta),\mathsf{C})=\mathsf{log_{10}}(\mathsf{P}_{\mathrm{CL}}(\mathsf{C})\mathsf{C})$ 

ි -

 $-10\frac{1}{0}$ 

0

1

lo g10(<sup>N</sup> pe)

2

3

<span id="page-3-0"></span>4





0 200 400 600 800 1000 1200 1400  $r$  [m]

r [m]

of the electronics in real operations. It is thereby possible to achieve slightly negative values for  $log(N_{\text{pe}})$ . The bottom panel of Figure [2](#page-3-0) shows the probability  $P_0$  that no signal was measured in a tank at a distance  $r$  from the shower core in the shower plane, which is also used in the reconstruction to constrain the likelihood.

We implemented the model in the current SWGO standard reconstruction chain to reconstruct the energy and core position of the particle shower, where we measure the signal in each detector unit and fit this shower footprint against the probability functions of the templates. For the fit, we minimize the negative log-likelihood:

$$
\log\left(L\right) = -2\sum_{i}\log\left(P\left(\log_{10}\left(N_{\text{pe}}\right)_{i}, r_{i}, X_{\text{max}}, E|\theta, \phi\right)\right). \tag{1}
$$

In this case, P is the individual tank probability that depends on the measured signal  $\log_{10} (N_{\text{pe}})_i$ , the distance  $r_i$  between the shower core and the tanks in the shower plane, the energy  $E$  and the maximum shower depth  $X_{\text{max}}$  of the reconstructed particle shower. The incoming zenith and azimuth angles  $\theta$  and  $\phi$  were taken from the preliminary angular estimation that is applied beforehand using a plane fit. The starting values for the minimization of the core position are taken from a first rough core estimate with a center of mass estimation. The seeds for the  $E$  and  $X_{\text{max}}$  are taken from lookup tables.

Figure [3](#page-4-0) shows an example reconstruction of a gamma-ray shower. The true values of the primary gamma ray were  $E_{true} = 6.8$  TeV,  $x_{true} = -2.2$  m,  $y_{true} = -92.7$  m,  $\theta_{true} = 13.5$ ° and  $X_{\text{max,true}} = 427 \text{ g/cm}^2$ . The result for the core reconstruction is visualized in Figure [3a.](#page-4-0) Each

 $-12$ 

<span id="page-4-0"></span>

**Figure 3:** (a) Likelihood surface for the reconstruction of the shower core of an example event going from green (maximum) to purple (minimum). The different colored stars show the position of the reconstructed (red) and the true shower core (orange) on the array. (b) Likelihood values for the reconstruction of the energy of the same example event with the true (orange) and reconstructed (red) energies.

black dot represents the center of a tank, and the stars show the true core position (orange) and the reconstructed core position (red), respectively. Because the reconstructed core ( $x_{\text{reco}} = -2.2$  m and  $y_{\text{reco}} = -92.6 \text{ m}$ ) of this event agrees excellently with the true core position, the orange star is barely visible. The visible contours ranging from green (maximum) to purple (minimum) denote the "likelihood surface" for the region around the reconstructed core, giving an estimate for the reconstruction uncertainty. In Figure [3b,](#page-4-0) we present the likelihood values in detail of and around the reconstructed energy  $E_{true} = 7.4$  TeV. Again, the reconstructed value lies in the minimum of the likelihood values.

# **3. Energy estimation for one of the current test arrays**

To validate the implementation of the method, we estimate the performance of the energy reconstruction of one of the current test arrays of SWGO. We use showers with a zenith angle below 45° whose true core fell directly on the array. In addition, some loose quality cuts were applied for the reconstruction. To examine the reconstruction performance, we show the reconstruction bias in Figure [4a](#page-5-1) and the energy resolution in Figure [4b.](#page-5-1) The used energy bias and resolution are defined as the mean and the RMS of the distribution of  $\log_{10} (E_{\text{reco}}) - \log_{10} (E_{\text{true}})$ . We compare the results for the test array with ones from HAWC [\[7\]](#page-6-5) and ones that were estimated in the Southern Gamma-ray Survey Observatory (SGSO) white paper [\[6\]](#page-6-4), which represents a first estimation of the future performance of SWGO. Both the energy bias as well as the energy resolution show promising results. At around 10 TeV an energy resolution of around 30% can be attained. Nevertheless, note that the reconstruction is still under development, and the final results can only be evaluated once the final array configuration of SWGO is fixed.

<span id="page-5-1"></span>

**Figure 4:** First results for the energy bias (a) and energy resolution (b) of an SWGO test configuration with results from HAWC [\[7\]](#page-6-5) and the SGSO white paper [\[6\]](#page-6-4) as a comparison. The bias and the resolution are calculated as mean and RMS of the distribution of  $log_{10} (E_{\text{reco}}) - log_{10} (E_{\text{true}})$ .

#### **4. Summary and outlook**

The standard reconstruction chain for the future SWGO is currently in development. One of the important steps within this chain is the implementation of a module for reconstructing particle energies. We applied a template-based method for the reconstruction of the energy and core position of gamma-induced particle showers for one of the current test arrays of SWGO. For this, we created a set of templates using Monte Carlo simulations. The observed lateral distribution function of a reconstructed shower is then fitted to the generated templates using a negative loglikelihood approach to find the best matching parameters for the core position and the energy. We validated the reconstruction by estimating the resolution of an example test array. The found energy bias and energy resolution of the investigated test array are very encouraging and similar to the performance estimated by the SGSO white paper [\[6\]](#page-6-4). We successfully implemented this method in the SWGO standard reconstruction framework offering a performance estimation of other SWGO test configurations. Once the final array configuration of SWGO is fixed, this method can be applied to estimate the final performance for the energy reconstruction of SWGO.

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