Scientific prospects for a mini-array of ASTRI telescopes: a γ-ray TeV data challenge

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Abstract

ASTRI is a project aiming at the realization of a γ-ray imaging Cherenkov telescope that observes the sky in the TeV band. Recently, the development of a mini-array (MA) of ASTRI telescopes has been funded by the Istituto Nazionale di Astrofisica. The ASTRI Comprehensive Data Challenge (ACDC) project aims at optimizing the scientific exploitation and analysis techniques of the ASTRI MA, by performing a complete end-to-end simulation of a tentative scientific program, from the generation of suitable instrument response functions to the proposal, selection, analysis, and interpretation of the simulated data. We assumed that the MA will comprise nine ASTRI telescopes arranged in a (almost) square geometry (mean distance between telescopes of ∼250m). We simulated three years of observations, adopting a realistic pointing plan that takes into account, for each field, visibility constraints for an assumed site in Paranal (Chile) and observational time slots in dark sky conditions. We simulated the observations of nineteen Galactic and extragalactic fields selected for their scientific interest, including several classes of objects (such as pulsar wind nebulae, supernova remnants, γ-ray binaries etc), for a total of 81 point-like and extended sources. Here we present an overview of the ACDC project, providing details on the different software packages needed to carry out the simulated three-years operation of the ASTRI MA. We discuss the results of a systematic analysis applied on the whole simulated data, by making use of prototype science tools widely adopted by the TeV astronomical community. Furthermore, particular emphasis is also given to some targets used as benchmarks.

Keywords— gamma-rays: diffuse background; general – particle acceleration – Galaxy: centre – instrumentation: detectors – methods: data analysis – software: simulations – ASTRI – IACT – TeV – Data challenge

1 Introduction

In the last years, substantial progress has been achieved in the field of γ-ray astronomy thanks to the new generation of ground-based telescopes based on the imaging atmospheric Cherenkov technique (IACT, see e.g. de Naurois & Mazin 2015, for a review). More than 200 very-high-energy sources are now known (http://tevcat.uchicago.edu/), belonging to different classes. Amongst Galactic sources, the most numerous classes are pulsar wind nebulae (PWN) and supernova remnants (SNR), but also some pulsars (Crab and Vela) and some binary systems have been detected. Extragalactic sources are typically blazars plus a minority of other types of active galactic nuclei (AGN) and starburst galaxies. Finally, a significant fraction of TeV sources are still unidentified (e.g. HESS Collaboration et al. 2018).

The next large facility to further advance in this field is the Cherenkov Telescope Array (CTA, CTA Consortium, 2019). CTA will cover the energy range from 20 GeV up to 300 TeV with arrays of telescopes of different sizes, placed at two different sites in order to cover both the southern and northern celestial hemispheres. CTA will provide a sensitivity about one order of magnitude better than that of current IACT telescopes. As of 2019, CTA-North

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†https://www.cta-observatory.org/
will comprise two classes of telescopes with different dimensions: Large Size Telescopes (LST) of 23 m diameter (required energy range of 0.02–3 TeV) and Medium Size Telescopes (MST) of about 12 m diameter (required energy range of 0.08–50 TeV). The CTA-South array, in addition to LST and MST, will include a significant number of Small Size Telescopes (SST) of ~4 m diameter (required energy range of 1–300 TeV), in order to provide a good sensitivity also at the highest energies, which are mostly relevant for sources in our Galaxy.

The *Horn-D’Arturo* ASTRI\(^2\) telescope (Maccarone & Astri Project 2017; Pareschi 2016; Scuderi 2018) is one of the prototypes for the SST based on a dual-mirror Schwarzschild-Couder optical design (Canestrari et al. 2013; Vassiliev et al. 2007), that has been developed in the context of the Italian participation to the CTA project. The diameter of the primary and secondary mirrors of the telescope is 4.3 meters and 1.8 meters, respectively. The design is such that the telescope benefits from a large field of view (FoV) of ~10\(^\circ\) (Rodeghiero et al. 2016). The ASTRI camera is based on very-fast response SiPM sensors (of about ten ns Catalano et al. 2018), which provide high detection efficiency of photons and high single photo-electron resolution (e.g. Bonanno et al. 2016; Romeo et al. 2018). The ASTRI prototype is currently operating at the Serra La Nave observing station on Mount Etna in Sicily (Maccarone et al. 2013) and very recently has obtained the detection of the Crab nebula at TeV energies (Lombardi et al. 2020).

Based on the ASTRI prototype, a mini-array composed of nine ASTRI telescopes is being developed and led by Istituto Nazionale di Astrofisica (INAF). The design of the ASTRI telescopes will permit observations at very high energies (up to ~300 TeV) with a large FoV of ~10\(^\circ\) diameter. Therefore the mini-array will be able to observe several \(\gamma\)-ray sources simultaneously. Initially, the mini-array was intended to be developed in the context of the preparatory effort for participating in CTA-South, at the Paranal (Chile) site. However, on June 2019, the mini-array became a project independent of CTA and it was decided to locate it in the Northern hemisphere, at Mount Teide in the Canary island of Tenerife\(^3\). It is expected that the mini-array will begin operations within 2023.

Here, we discuss the ASTRI Comprehensive Data Challenge (ACDC) project that aims at characterizing the capabilities of an ASTRI mini-array and investigating the scientific exploitation of this innovative instrument in the era of the current generation of Cherenkov telescopes and CTA. The ACDC was not intended to provide observational constraints to the ASTRI mini-array but rather to test our end-to-end data analysis chain. Therefore, the results presented hereafter are to be considered examples of the potential instrument’s capabilities, independently on the final ASTRI mini-array site. Obviously, the data challenge will be repeated for the actual location using the updated array geometry on a different sample of sources which will partially overlap with the one used here.

## 2 The ACDC Project

### 2.1 Simulating three years of ASTRI mini-array observations

The aim of ACDC is to perform a simulation of the observations of TeV gamma-rays representative of the data we expect to obtain with the ASTRI mini-array and to test the end-to-end analysis chain. In order to obtain a realistic three-year long set of observations\(^4\), we performed a sequence of activities and simulated operations like those expected to occur in reality. The ACDC project was divided in different work packages (WP, see the scheme in Figure 1) and hereafter we describe the ones relevant to this work.

We started by issuing a “Call for Proposal” in order to select the potential sources of interest in the southern-sky visible in the hypothesis of a mini-array of SSTs in Paranal using the ASTRI design (see above for caveats on this scenario). Then we proceeded with all the activities needed to simulate a complete end-to-end data-challenge: planning of the observations, generation of the instrument response function (IRF) of the system, production and archiving of the simulated data, analysis of the data and production of a catalog, multi-wavelength association of the detected sources, and, finally the production of a final archive of all scientific products.

### 2.2 Selection of the sample

The call for proposals, open to all ASTRI members, was for observations covering three years of operations. The accepted proposals span a variety of scientific cases, from dark matter candidates to acceleration of particles by neutron stars. They include the 20 reference targets (in 18 fields) listed in Table 1, corresponding to a total requested time of 4350 hours. Although these targets represent only a partial view of the southern sky, they were selected because of their high scientific interest. They belong to the classes of pulsar wind nebulae (PWN), \(\gamma\)-ray binaries, active galactic nuclei (AGN), dwarf spheroidal galaxies (dSph galaxies) dark matter candidates and supernova-remnants (SNR).

### 2.3 Pointing plan

One task of ACDC (*Pointing Plan Production* WP) was devoted to the production of a realistic observation schedule, matched on the time period from January 1, 2020 to January 1, 2023\(^5\), taking into account the visibility constraints and Moon conditions at Paranal. We estimated that this corresponds to ~5160 hr of useful time in the three years. This is longer than the exposure time requested in

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\(^{2}\)Astrofisica con Specchi a Tecnologia replicante Italiana, [http://www.brera.inaf.it/~astri/wordpress](http://www.brera.inaf.it/~astri/wordpress)

\(^{3}\)At the beginning of the ACDC project, the mini-array was still considered as a part of the future CTA-South. For this reason, we carried-on the whole project assuming the location of the mini-array at the Paranal site, and not the Teide site.

\(^{4}\)Here and in the following, when we refer to “observations”, we clearly mean simulated observations.

\(^{5}\)considered for simplicity and not optimized for possible science windows
Figure 1: Top: work flow of the ACDC project. Bottom: simulation of the Galactic plane. The possibility to observe simultaneously several sources can be appreciated thanks to the large FoV (\(\sim 10^\circ\) diameter). The map (in Galactic coordinates) was created for a total of 2250 pointings of 20 minutes each. Note that this map is background subtracted, not corrected for exposure and the color-bar is in counts per pixel (pixel size of 0.02 deg). The diameter of the ASTRI FoV is indicated with the white arrow.
the call for proposal (4350 hr) for the reference targets. In order to exploit all the available time, we used the time in excess (∼810 hr) to simulate blank sky fields (see below) and to increase, when possible, the exposure of the weak and extended reference targets.

We produced a run-schedule that optimised the temporal allocation, the observation elevation angle (chosen to be > 55 deg above the horizon) and that minimised the number of slews between different fields. We took into account only the temporal windows not disturbed by Moon light (i.e. when the Moon is below the horizon or new Moon epochs). We did not include any time loss due to weather conditions. All the observations were divided in blocks of ~ 20 minutes following a dithering pattern as follows: the pointing direction of each block was chosen randomly from a uniform distribution of directions within a radius of one degree from the reference target coordinates. This choice describes a realistic schedule where observing conditions and pointing directions may change not in a regular way. Therefore, each observation consists of a mosaic of blocks in which the sources are at different positions in the FoV. The adopted observational approach has the advantage of further enlarging the size of the ASTRI FoV, allowing us to smooth any structure of the instrumental background and to observe sources that would have been at the edge of the FoV in case of fixed pointing. In fact, a traditional wobbling observing mode is not applied in the case of our observations characterized by a large field of view containing several targets.

2.4 Background simulation

In each observation we also included the background contribution, given by the combination of the diffuse Galactic γ-ray background and the cosmic background (Sky Production WP). The diffuse Galactic background is due to the γ-ray emission from the interstellar medium, and it is based on predictions from codes solving the cosmic-ray (CR) transport equations and calculating the related multi-wavelength emission. The models used are informed by observations including direct CR measurements and high-energy γ-ray observations by Fermi-LAT. Inverse-Compton (IC) emission is produced by interactions of CR electrons and positrons on low-energy photons. We used predictions from Picard that assume a model with four spiral arms for the CR source distribution, which has hardening of the intensity/hardening of interstellar gamma-ray emission seen by Fermi-LAT toward the inner Galaxy (Gaggero et al. 2015).

The residual non-γ background was estimated through dedicated Monte Carlo simulations of cosmic ray and electron events. It was included into the IRF (see next Section) as a given spatial model rate, dependent only on the energy and the radial positions in detector coordinates on the camera, assuming radial symmetry. We

| Field | RA (deg) | Dec (deg) | Exposure (hr) | Main sources | Type | Extended |
|-------|----------|-----------|---------------|--------------|------|----------|
| 01+02** | 276.63 | -13.09 | 50+250 | LS 5039 | Binary | n |
| 03 | 40.67 | -0.01 | 200 | NGC 1068 | PWN | y |
| 04 | 15.04 | -33.71 | 100 | Sculptor | dSph galaxy | n |
| 05 | 53.93 | -34.05 | 100 | Reteculium II | dSph galaxy | n |
| 06 | 34.29 | -58.57 | 100 | Tucana II | dSph galaxy | n |
| 07 | 237.25 | -30.75 | 200 | Te-REX 1549 | AGN | n |
| 08 | 266.92 | -26.47 | 300 | HESS J1748-248 (Ter 5) | Globular cluster | y |
| 09 | 195.75 | -63.20 | 300 | HESS J1303-631 | PWN | y |
| 10 | 84.00 | -67.59 | 200 | LMC P3 | Binary | n |
| 11 | 248.25 | -47.55 | 150 | HESS J1632-478 | PWN? | y |
| 12 | 269.72 | -24.05 | 300 | SNR W38 | Globular cluster | y |
| 13 | 155.99 | -57.76 | 200 | Westerlund 2 | Star cluster | y |
| 14 | 128.75 | -45.60 | 100 | Vela | PSR and PWN | y |
| 15 | 266.85 | -28.15 | 400 | G0.9+0.1 | PWN | n |
| 16 | 228.53 | -59.16 | 200 | HESS J1748-248 (Ter 5) | Globular cluster | y |
| 17 | 278.39 | -10.57 | 300 | HESS J1833-105 | PSR and PWN | n |
| 18 | 83.63 | 22.01 | 100 | Crab | PWN | n |
| 19 | 329.72 | -30.22 | 200 | PKS 2155-304 | AGN | n |

* Reference target(s) in the field. We highlight in bold the sources discussed in detail in the paper.
** Same fields but corresponding to the high and low flux state of LS 5039.
note that about 800 hr of the pointing plan were devoted to observations of sky fields not containing TeV sources. These “blank” fields permit to perform ON-OFF analyses and to estimate the level of background when analyzing very extended sources or sources located in crowded fields.

### 2.5 The simulation of the γ-ray sky

Since the ASTRI telescope has a good sensitivity up to off axis angles of ∼3–4 degrees, several sources can be contained in the FoV, as shown in the example of Fig. 1. Therefore, besides the selected targets, we also included in our sky model all the known γ-ray sources falling in the FoV, even considering the increased sky regions covered thanks to the dithering pattern around the nominal target direction. The spectral and spatial properties of all the simulated sources were based on the results reported in the H.E.S.S. and Fermi catalogues (Acero et al. 2015). Finally, in addition to the known sources, we included eight (six transient and two persistent) sources reaching a peak flux comprised in the range ∼0.05–1% Crab units (in the 2.5–95 TeV energy band), in order to test the possibility of serendipitous Galactic or extragalactic discoveries of new sources. For these targets, we considered power-law or cut-off power-law spectral models, with random spectral parameters (photon indexes in the range [1.4–2.7]), and we also considered a random temporal variability as outbursts, flares or persistent emission. Therefore, we simulated a total of 81 sources, the vast majority being spatially extended and Galactic in nature. They comprise PWN (twenty-nine objects), SNR (nine objects), binary systems (three objects), AGN or galaxies (seven objects) with the rest being unidentified sources. The spectral shapes of the targets are, in most cases, modelled with power-laws ($\Gamma$ in the range 1.4–4.5 and normalization at 3 TeV between $\sim 10^{-14} - 3 \times 10^{-12}$ photons cm$^{-2}$ s$^{-1}$ TeV$^{-1}$). In a few cases either exponentially cut-off power-laws (with cut-off between 4–11 TeV) or log-parabola models were used. For more complex models for which an analytical description was not possible, we used tabulated models (three cases). We modelled the morphology of spatially extended sources with 2-D radial Gaussians (with symmetric standard deviation $\sigma$, in the range ∼0.1–2 deg), discs and ellipses (size 0.1–0.2 deg), or, in case of more complex shapes, we used energy-dependent template maps. The latter were generated in accordance to the source spatial and spectral properties taken from the literature (when available).

The whole observation program resulted in the coverage of a total of about 1250 square degrees of sky. The integral distribution of the exposure is shown in Fig. 2 (left panel). In the right panel of Fig. 2, we show the distribution of the sky exposure as a function of Galactic latitude. It is clear that most of the exposure was devoted to the Galactic plane.

### 2.6 Simulation of the Sky, data storage and multi-wavelength associations

In the Simulation WP, we used the tool ctoobsim of ctools-1.5.2 (Knödlseder et al. 2016) to produce simulated event lists (Level 3 Data) containing sky arrival direction, energy, arrival time, and other standard information for each event. For each 20-minute block of a given field, we provided as input to ctoobsim an XML file containing the spectral, temporal and morphological information on the sources in the field and on the background components. Every observation was defined by a start and stop time (taken from the pointing plan), and source+background events were simulated in the whole energy range and FoV of the IRF. We always passed to
different seeds for the random number generator and we assigned an observation identification (Obs.ID) to each 20-minute block.

We performed the simulations using Workflow Management Systems & Science Gateway technologies (Costa et al. 2015) that allowed us to make use of high performance computing capabilities with a customized interaction model provided by the WP “Simulation”. We used computational resources provided by INAF - Astrophysical Observatory of Catania in the framework of the CHIPP Pilot Project. The used Linux cluster has a total of 192 cores (384 with Hyper-Threaded), total RAM of 1024 Gb, 70 Tb storage and 3500 Gflops computing performance.

All simulated scientific data were then stored in an archive created by a dedicated WP (“Archive”). The main aim of the archive is to collect not only Level 3 data but also Level 4 (spectra, light-curves, sky images) and Level 5 (catalogues) data. The format of the stored data is compliant with the preliminary CTA requirements.

Finally, we performed a multi-wavelength association of the detected sources by means of an automatic identification pipeline. The pipeline first checks if there are known sources that can be potentially associated with the target, using positional coincidence and comparing their spectral and morphological properties. In case no viable association is found, the pipeline devises an optimized strategy for the multi-wavelength follow-up observations, quantifying the effort (telescopes, instruments, observing time) needed to properly cover an unidentified source. The present version of the pipeline incorporates an identification/strategy procedure only for the most abundant classes of Galactic VHE sources, namely PWNe and SNRs. In the future, we plan to extend this work and implement a dedicated strategy for the most numerous class of extragalactic VHE sources, namely Blazars.

### 2.7 The ASTRI response functions

The IRF of the ASTRI mini-array are needed to simulate the observations as well as in the subsequent data analysis.

We used the IRF obtained through dedicated CTA Monte Carlo (MC) simulations of the Cherenkov light produced by extensive air showers previously simulated by CORSIKA (Heck et al. 1998). The sim telarray (Bernlör 2008) program (adopted by the CTA Consortium) and the official ASTRI pipeline (as part of the ASTRI Scientific Software) were adopted to derive the response of the ASTRI mini-array. In particular, the IRF was extracted from the CTA Prod3b9 MC simulations (Level 0 Data), considering a mini-array of nine SST with a layout assumed at the site in Paranal (Chile), as shown in Figure 3-left (mean distance between telescopes of ~250 m). The incoming directions of the simulated showers are Zenith = 20 deg and Azimuth at 0 deg and 180 deg. The MC data have been reduced from Level 0 up to the IRF generation with A-SciSoft MC data reduction pipeline (Lombardi et al. 2016). The gammaness (i.e. a gamma/hadron separation parameter) cuts for IRF’s calculation were defined such as to have a 70% efficiency for gammas in each estimated-energy bin (21 logarithmic bins between 0.012 TeV and 199.5 TeV) and in each off-axis bin (10 linear bins between 0 and 5 deg).

The ASTRI mini-array IRF provides effective area, energy dispersion (Edisp) and point spread function (PSF) for the energy range 0.01–199.5 TeV (split into 21 logarithmic bins, as defined in Hassan et al. 2017 and Acharyya et al. 2019) and for ten values of the OFF-axis angle (between 0 and 5 deg). However, due to the energy threshold of the system of ~1 TeV, the effective response
3 General results

3.1 Data analysis

The analysis of the data was performed with ctools-1.5.2. We first carried out a systematic analysis of the whole data set to derive the significance, mean flux and spectrum of each simulated source. For this preliminary step, we assumed to know the exact position and spatial morphology of each simulated source.

We performed a binned Maximum Likelihood analysis, rather than an un-binned one, because the latter was computationally extremely time-consuming and thus not convenient for a systematic analysis of such a large data set. However, we checked on four targets (two point-like and two extended) used as test cases that the two approaches gave results consistent within their uncertainties. Using ctbinn we created, for each analyzed target, a counts cube with 20 logarithmic bins in the energy range 2.5–95 TeV (where ASTRI is best calibrated) and 20×20 spatial pixels of side 0.05 deg each, centered at the source position. The PSF, exposure, energy dispersion and background cubes were obtained using the tools ctpsfcube, ctexpcube, ctedispcube and ctbgkcube, respectively. For each of these tasks, we adopted the same energy selection of ctbinn, while for the energy dispersion and point spread function cubes, the spatial map was created considering 10×10 pixels of side 1 deg, since these quantities vary slowly within the FoV and a finer binning is not necessary.

Subsequently, we determined the source spectral properties with ctlike. In particular, we provide an input XML file with all the simulated sources (including their spatial and spectral properties), where we left free to vary only the spectral parameters for a single source of interest at a time (and hence, as mentioned above, assuming that its exact position and morphology are known). We used, for each source, a reference energy of 3 TeV for all the fitted spectral models. For some sources with a complex spectrum, the data were simulated using a non-parametric spectral description (i.e. using tabular files). For example, this was the case for some extragalactic sources where the absorption from the extragalactic background light can be important. In such cases, we left only a multiplicative normalization constant free to vary in the fit.

3.2 Source significance and validation of the results

We analyzed individually each simulated field listed in Table 1. Therefore, since some of the 81 sources appear in more than one field, we investigated a total of 136 sources. Of these, we detected 83 sources (67 of which seen only once) with a value of TS≥25 (corresponding to a detection significance of ~5σ). This number
includes also three extragalactic sources (the AGN) and three of the serendipitous transients, which have 2.5–95 TeV fluxes in the range 0.4 – 4 × 10^{-12} erg cm^{-2} s^{-1} and good agreement between simulated and observed spectral parameters. All these were simulated with power-law spectral shapes (Γ in the range [1.4 : 2.6]) and point-source morphology. We obtained generally a good agreement between the measured values and the simulated ones. 63 of the detected sources were spectrally modelled by power-laws, 14 by exponentially cut-off power-laws, 1 log-parabola, and 4 constant models (used as multiplicative constants, i.e. normalizations, for input cube map and file-function models). Instead, the number of extended detected sources is 68 (radial Gaussians: 45; elliptical Gaussian: 1; radial disk: 1; elliptical disk: 4; cube maps: 17).

The remaining simulated sources that were not detected were either too faint or poorly exposed and/or placed at very large off-axis angles resulting in small exposures. Amongst them, there are the dark matter candidates, which were simulated with a 1–10 TeV integrated flux in the range (3 – 11) × 10^{-17} erg cm^{-2} s^{-1}.

In Fig. 4-left, we present the source significance (in units of standard deviations, σ, estimated as the square root of TS) as a function of the number of simulated counts in the energy band 2.5–95 TeV. There is a good correlation between the two quantities, as it can be expected when the exposure times are similar (in our case within a factor of 2–3). We note that these significances can be considered as upper limits on the values that can be obtained with the real data, where the sky model is not known a priori.

For the sources detected with significance larger than 5σ, we compared the observed (F_{obs}) and simulated (F_{sim}) fluxes in the 2.5–95 TeV range, by computing for each source the residuals χ=(F_{sim} – F_{obs})/ΔF_{obs}, where ΔF_{obs} is the 1σ uncertainty of F_{obs}. Fig. 4-right shows that these residuals, as expected, are independent on the source flux and that there is a good agreement between F_{sim} and F_{obs}. However, the distribution of the residuals does not properly follow the shape of a Gaussian distribution, as it would be instead expected. We explain this with the presence of a global systematic uncertainty, possibly due to the uniform choices adopted for the analysis of all the sources, which is not optimized for specific cases, or due to the poor statistics in some energy bins that makes the flux estimation non-gaussian, or fixing the parameters of the non-target sources in the FoV to the simulation input values, which may not match exactly the simulated data. We evaluate the global systematic uncertainty for the reconstructed, integrated fluxes to be of the order of ~ 8%; this allows us to obtain a statistically acceptable fit to a constant of the integrated fluxes shown in Figure 4-right.

4 Individual cases

In this Section we report a few examples of a more detailed analysis of representative sources, in order to better illustrate the results of the simulations and the expected performance of the ASTRI mini-array. These examples provide a variety of different morphological and spectral shapes as well as temporal variability, unlike our simulated extragalactic sources. In addition, these test-case sources are located in crowded fields, where the analysis is more complex. We note that a thorough assessment of the scientific capabilities of the mini-array in the case of specific sources would require more extensive simulations of each target that is outside the scope of a data challenge.

4.1 The Crab nebula and pulsar

The Crab is one of the brightest and best studied TeV γ-ray sources. It has been also traditionally used as a calibration source for high-energy instruments, although this should be reconsidered at GeV energies in the light of the variability observed by AGILE and Fermi (FERMI Collaboration 2011; Tavani et al. 2011). It was the first γ-ray source detected by a Cherenkov telescope (Weekes et al. 1989) and it is currently regularly monitored at TeV energies by MAGIC, H.E.S.S., VERITAS and HAWC (Abeysekara et al. 2017a; Aleksic et al. 2015; Holler et al. 2017; Kevin Meagher for the VERITAS Collaboration 2015) and FACT\footnote{https://fact-project.org/monitoring/index.php?y=2012&m=12&d=13&s=5&timebin=12&plot=all} (Anderhub et al. 2013). The angular size of the Crab nebula decreases with energy and in the TeV band it is expected to be < 0.2 deg (Aharonian et al. 2000). Very recently, its TeV extension has been measured with H.E.S.S. (52.2′′ ± 2.9′′ ± 7.8′′_{\gamma}; Holler et al. 2017).

We simulated ~100 hr of observations of the Crab (field 18), that was modeled taking into account the emission from both the pulsar and the nebula. Although we do not expect to detect the Crab pulsar in this short observation (less than 20 expected counts), we included it in the sky model with a power-law spectrum (Ansoldi et al. 2016). Because the on-axis ASTRI mini-array PSF, in the 1–100 TeV, spans the range 0.06 – 0.1 deg (hence larger than its measured extension), the Crab nebula was simulated as a point-like source with a log-parabola model (Aleksic et al. 2015) of the form:

\[
 f(E) = 1.89 \times 10^{-12} \left( \frac{E}{3 \text{TeV}} \right)^{-\alpha/\beta} \text{ph. cm}^{-2} \text{s TeV}^{-1}
\]

with $\alpha = 2.698$ and $\beta = 0.104$.

Our spectral analysis yielded the following best-fit parameters for the nebula: $K = (1.87 \pm 0.02) \times 10^{-12}$ photons cm^{-2} s^{-1} TeV^{-1}, $\alpha = 2.68 \pm 0.02$ and $\beta = 0.115 \pm 0.015$, which are consistent within 1σ with the expected ones, as shown in Fig. 5. For the sake of completeness, we tried also to fit the Crab PSR spectrum, fixing the Crab nebula spectral parameters to those reported above. We found that the Crab PSR component is indeed not significant. We did not perform any timing analysis because the number of pulsar events was too low (14 counts).

These results indicate that the ASTRI mini-array, in 100 hr, will be able to extend the maximum detection energy of the Crab nebula up to ~ 100 TeV, with a significance of the spectral points larger than 3σ. This is an important improvement with respect to the current generation of Cherenkov telescopes: VERITAS detected the...
Crab up to a maximum energy of $\sim 30 - 40$ TeV in $\sim 115$ hr (e.g. Kevin Meagher for the VERITAS Collaboration 2015), MAGIC and H.E.S.S. up to $\sim 10 - 20$ TeV in $\sim 360$ hr and $\sim 10$ hr, respectively (Aleksić et al. 2015; Ansoldi et al. 2016; Holler et al. 2017). We also note that recently HAWC, the Tibet Air Shower Array and MAGIC measured the first Crab nebula photons at energies $\geq 100$ TeV in $\sim 837, \sim 719$ observing days and $\sim 50$hr, respectively (Amenomori et al. 2019; HAWC Collaboration et al. 2019).\(\textsuperscript{11}\)

\subsection{4.2 The bright Pulsar Wind Nebula HESS J1825–137}

HESS J1825–137 is one of the brightest extended sources in the TeV sky. It is spatially coincident with the pulsar PSR B1823–13 that is most likely powering it (e.g. Pavlov et al. 2008). The source distance is estimated to be about 4 kpc (Cordes & Lazio 2002). HESS J1825–137 shows a multi-wavelength extended emission detected in the soft X-ray energy band (with a size of $\sim 5\degree$; e.g. Finley et al. 1996; Gaensler et al. 2003), in the radio band (e.g. Castelletti et al. 2012), and in the $\gamma$-ray by FERMI (with an extension of $\sim 1.1\degree$; Ackermann et al. 2017) and HAWC (Abeyshekara et al. 2017b). The source has been extensively observed by H.E.S.S. in the last decade (e.g. Abdalla et al. 2019, and reference therein). These observations confirmed the existence of diffuse TeV emission which extends for approximately 1.5 deg from the pulsar position (Abdalla et al. 2019), mainly towards the south-east direction (e.g. Aharonian et al. 2006a). HESS J1825–137 is characterized by a clearly energy-dependent morphology, with a spectrum becoming softer with increasing distance from the pulsar (Abdalla et al. 2019; Aharonian et al. 2006a). This can be explained as the effect of radiative cooling of the electrons, or by changes of the injection spectrum of electrons during the source history, or by diffusion or advection effects. Its average spectrum, extracted from a region of 0.8 deg, can be modelled better with a cut-off power-law rather than a simple power-law (Abdalla et al. 2019).

HESS J1825–237 is in the same FoV of the $\gamma$-ray binary LS 5039, and our simulated total exposure time for the source is 300 hr, coming from fields 01 and 02 in Table 1 (in field 17 the source was too far off axis). We considered the same spatially varying spectrum found by Abdalla et al. (2019) (their figure 8), although we did not consider the variation of the PWN size with energy. We also extrapolated it, following the relations showed in figure 9 of Abdalla et al. (2019), to slightly larger distances (about 10-20 arcminutes) in the south-east and in the north-west directions in order to avoid a sharp cut of the source morphology. However, for the aim of this paper, we only estimated the HESS J1825–137 background-subtracted radial profile (Fig. 6-left) along the south-east direction using the green region shown in Fig. 7-right, similar to the one adopted in Aharonian et al. (2006a). We estimated the background from the closest blank field of the data challenge. Our results show that HESS J1825–137 stands-out above the background, with a significance larger than $3\sigma$, up to a distance of $\sim 1.5$ deg from the pulsar position. This demonstrates the capabilities of the ASTRI mini-array to detect very extended sources.

We estimated the total spectrum extracted from a circular region of 0.8 deg (as presented by Abdalla et al. 2019) centered at $RA = 276.40$ deg and $DEC = -13.967$ deg. In particular, we used a disc morphology with fixed parameters and we fitted the data with both a power-law and a cut-off power-law model. As expected, we found that the latter provides a better fit than the power-law (TS = 13908 vs TS = 13745, for 1 additional d.o.f.) indicating that the cut-off is significantly detected. The best-fit parameters (shown in Fig. 6-right) of the exponential cut-off power-law are $N_0 = (1.90 \pm 0.04) \times 10^{-12}$ ph cm$^{-2}$ s$^{-1}$ TeV$^{-1}$, $\Gamma = 2.24 \pm 0.04$ and $E_{\text{vir}} = 19 \pm 2$ TeV (for a reference energy of 3 TeV). Such values are totally in line with those reported in Abdalla et al. (2019) in ~ 400 hr of exposure time. Thus, the ASTRI mini-array will not only provide a better spatial resolution (allowing a more detailed study of the energy-dependent morphology) but it also may provide comparable, or even significantly reduced, uncertainties of the spectral parameters, for the same exposure time as H.E.S.S..

\subsection{4.3 The binary LS 5039}

LS 5039 is a $\gamma$-ray binary composed of a compact object and an ON6.5V(f) star (Clark et al. 2001; McSwain et al. 2004), in an eccentric, 3.9 day orbit ($e=0.31 \pm 0.04$). It was detected above 250 GeV for the first time with H.E.S.S. (Aharonian et al. 2005) and its orbital modulation was the first one observed at TeV energy.

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\(\textsuperscript{11}\)https://www.icrc2019.org/uploads/1/9/8/119067782/vlza_crab_peresano_icrc2019.pdf. https://www.icrc2019.org/uploads/1/1/9/8/119067782/vlza_crab_peresano_icrc2019.pdf
Orbital phase-resolved spectroscopy showed the existence of two different spectral states: a high-state in the orbital phase range $0.45 < \phi < 0.9$, comprising the inferior conjunction (the apastron passage is at $\phi=0.5$), and a low-state in the remaining part of the orbit (Aharonian et al. 2006b). Adopting a power-law model with exponential cutoff ($dN/dE \sim E^{-\Gamma} \exp(-E/E_{\text{cut}})$), the 0.2–10 TeV high-state spectrum gives $\Gamma = 1.85 \pm 0.06_{\text{stat}} \pm 0.1_{\text{syst}}$ and $E_{\text{cut}} = 8.7 \pm 2.0$ TeV, while a simple steeper power-law is a good description of the low-state spectrum ($\Gamma = 2.53 \pm 0.07_{\text{stat}} \pm 0.1_{\text{syst}}$). The 0.2–10 TeV luminosity is $1.1\times10^{34}$ erg s$^{-1}$ and $4.2\times10^{33}$ erg s$^{-1}$ in the high and low state, respectively (Aharonian et al. 2006b).

As in most of the $\gamma$-ray binaries, the nature of the compact object in LS 5039 is still unknown: both the microquasar (a black hole in accretion from the massive stellar wind) and the young non-accreting pulsar scenarios are possible (Dubus 2013). The periodic variability of the shape of its radio emission may originate from the interaction of a pulsar wind with the wind of the early type companion star (Moldón et al. 2012), contrary to the first interpretation of the resolved radio emission as a jet in a microquasar (Paredes et al. 2000).

We simulated observations of 50 h for the high state (field 01) and 250 h for the low state (field 02), using the spectra described above. The source is too far off-axis in the field 17 and not considered here. Fig. 7 shows the sky-maps in the 2.5–95 TeV range for the two states, while Fig. 8 shows the spectra and best-fit models.

In the high spectral state (blue in Fig. 8), the source is detected with a significance of $\sim 25 \sigma$ (TS=600.5, 2.5–95 TeV) and the best fit parameters are $\Gamma = 2.1 \pm 0.3$, $E_{\text{cut}} = 8.7 \pm 4$ TeV, and normalization (flux at 1 TeV) $N=(2.9\pm0.6)\times10^{-12}$ photons cm$^{-2}$ s$^{-1}$ TeV$^{-1}$ (to be compared with the simulated value of $2.28\times10^{-12}$ photons cm$^{-2}$ s$^{-1}$ TeV$^{-1}$). The best fit parameters agree with those of the model within 2$\sigma$, although the presence of the cut-off at $\sim 9$ TeV, together with the analysis truncated at 2.5 TeV, leads to large statistical uncertainties. We verified that the detection of the spectral cutoff is statistically significant in the high state: indeed, a fit with a single power-law gives $\Gamma = 2.8 \pm 0.1$, but it is worse by $3.7 \sigma$ than that with a cutoff power-law.

In the low spectral state (in green in Fig. 8), the source is detected with a significance of $\sim 18 \sigma$ and we obtained $\Gamma = 2.55 \pm 0.08$ and $N=0.9\pm0.1\times10^{-12}$ photons cm$^{-2}$ s$^{-1}$ TeV$^{-1}$ (input $0.91\times10^{-12}$ photons cm$^{-2}$ s$^{-1}$ TeV$^{-1}$). Unlike the high-state data, in the low-state spectrum the simulated ASTRI mini-array data alone do not constrain a possible high-energy cut-off. A constraint could be obtained assuming an ‘a priori’ knowledge of the photon index. For example, freezing the power-law parameters to the low-state H.E.S.S. values ($\Gamma = 2.53$ and $N_{\text{TeV}}=0.91\times10^{-12}$ photons cm$^{-2}$ s$^{-1}$ TeV$^{-1}$), we would obtain a 3$\sigma$ lower limit on the cutoff of $E_{\text{cut}} > 46$ TeV. This value, well within the ASTRI mini-array energy range, is above the H.E.S.S. coverage and is consistent with a scenario where the energy of the spectral cutoff increases from the high state ($E_{\text{cut}} \sim 9$ TeV) to the low state ($> 45$ TeV).

The short-term as well as long-term variability of the orbital TeV emission of LS 5039 and relative spectral cut-off is worth investigating both with the forthcoming ASTRI mini-array observations as well as with respect to previous H.E.S.S. data. Hence it is vital to recover the very low energy of the IRF, below 2.5 TeV, stabilizing the spectrum with lower energy photons, where the highest statistics resides.
data points are the spectral fluxes calculated with csspec while the blue/green line and shaded area are the best-fit model and relative butterfly, respectively, as obtained with cTLIKE.

4.4 The P3 binary in the Large Magellanic Cloud

Figure 7: Background subtracted 2.5–95 TeV sky-maps (in counts per pixel; pixel size of 0.03 deg) as obtained for the high state data (50 h, left panel) and low state data (250 h, right panel) of LS 5039, in celestial coordinates. The nearby PWN HESS J1825–137, visible in the map, is discussed in section 4.2, where the green regions are used to estimate its radial profile. The latter is centered on the position of the pulsar PSR B1823-13...

Figure 8: LS 5039 simulated spectra for the high state (50 h, blue) and low state (250 h, green). The black line is the simulated model, while the blue/green line and shaded area are the best-fit model and relative butterfly, respectively, as obtained with cTLIKE.

LMC P3 is the only extragalactic γ-ray binary known to date. It has an orbital period of 10.3 days and is associated with a massive O5III star located in the Large Magellanic Cloud (LMC) supernova remnant DEM L241 (Corbet et al. 2016). Both its X-ray and radio emissions are modulated at the orbital period, but are in anti-phase with the γ-ray modulation. These results, together with the high ratio between the γ-ray and the X-ray flux, lead to the identification of this source as a high-mass γ-ray binary (Corbet et al. 2016). At γ-ray energies LMC P3 is significantly more luminous than any other γ-ray binary, since its 0.2–100 GeV luminosity is L = 2.5×10^36 erg s^{-1} (Ackermann et al. 2016). Moreover, it is at least 10 times more luminous in radio and X-rays than LS 5039 and 1FGL J1018.6-5856 (Corbet et al. 2016). This is very peculiar, since both the luminosity of the companion star and the orbital separation of LMC P3 are comparable to those of these two binary systems.

The extensive coverage of the LMC carried out with H.E.S.S. since 2004 (effective exposure ~100 hr) showed that the TeV emission from LMC P3 has an orbital variability (HESS Collaboration et al. 2018a). If the orbital phase φ = 0 is defined as the maximum of the GeV light curve at MJD 57410.25, LMC P3 was clearly detected as a point-like source (at a 6.9σ confidence level) only in the orbital phase range between 0.2 and 0.4. Its time-averaged spectrum (accumulated along the whole orbit) is a power-law with Γ = 2.5 ± 0.2 and normalization N = (2.0 ± 0.4)×10^{-13} ph cm^{-2} s^{-1} TeV^{-1} (at 1 TeV). On the other hand, for the spectrum of the on-peak phase only, the photon index decreases to Γ = 2.1 ± 0.2 and N = (5±1)×10^{-13} ph cm^{-2} s^{-1} TeV^{-1} (at 1 TeV). The flux above 1 TeV varies by a factor larger than 5 between on-peak and off-peak parts of the orbit, since it is (5 ± 2)×10^{-13} and < 0.88 ×10^{-13} ph cm^{-2} s^{-1}, respectively.

Spectroscopic observations of this source (van Soelen et al. 2019) were performed using the High Resolution spectrograph (HRS) of the Southern African Large Telescope (SALT). They revealed that the binary orbit is slightly eccentric (e = 0.40 ± 0.07). The phase of the superior conjunction is φ = 0.98, close to the maximum in the Fermi-LAT light curve, while inferior conjunction is at phase φ = 0.24. This orientation may explain the anti-phase between the GeV and TeV light curves. The mass function is f = 0.0010 ± 0.0004 M⊙, which favours a neutron star compact object.

We simulated 200 hr of time-constrained observations in order to observe the source only during the orbital phase range φ = 0.2–0.4 (field 10). In the simulated data, LMC P3 is detected with a significance of TS > 500 (i.e. ≥ 22σ). The best-fit power-law parameters are Γ = 2.12 ± 0.05 and N = (5.4 ± 0.6)×10^{-13} ph cm^{-2} s^{-1} TeV^{-1} (at 1 TeV), fully consistent with the simulated values. As shown in Fig. 9, the source is clearly detected up to ~70 TeV. This is well above the high-energy limit of 20 TeV reached with H.E.S.S. in 100 hr.
Figure 9: The spectral energy distribution of LMC P3, in the energy range 2.5–95 TeV, where the red points are the fluxes calculated with csspec, the black line is the simulated model, and the blue shadow is the butterfly of the best-fit model.

4.5 The supernova remnant W28

We simulated a set of ASTRI mini-array observations of the sky region around the Galactic coordinates l,b ~ (5.5,-0.5) for a total exposure of about 300 hours (field 12). This field covers about 7 degrees of the inner Galactic plane and it is rich of known TeV sources, among which the supernova remnant W28 is one of the most prominent. W28 is an old SNR (2 – 3.5 × 10^4 yrs) interacting with a complex of massive molecular clouds with masses of ~ 10^4 M⊙. It is a source of an intense flux of γ-rays, extending from ~100 MeV to ~10 TeV, with a soft power-law spectrum (photon index of ~ 2.7; Aharonian et al. 2008; Giuliani et al. 2010). The γ-ray emission is believed to arise from the interaction of the gas inside the molecular clouds and the hadronic cosmic rays accelerated by the shock of the SNR. H.E.S.S. did not detect any sign of a cut-off in the spectrum of this object. The detection of a drop of the spectrum at very high energy can test if this SNR was a PeVatron in its early life. In fact, if W28 accelerated particles up E ≥ 10^15 eV in the past (and if the ambient medium is able to confine them) the γ-ray spectrum should continue without a cutoff up to, at least, 100 TeV. A cut-off in the spectrum can instead have two explanations: either this accelerator never reached such a high energy and/or the propagation of cosmic ray changes regime (i.e. from diffusion to free streaming) above a certain energy. We simulated the W28 spectrum with a power-law without cut-off (i.e. assuming a PeVatron-like spectrum) and we tested the ASTRI mini-array capability to derive a lower limit on the maximum energy of the accelerated protons. In our analysis, we derived the spectrum of this source using csspec. The resulting spectral points are significant (more than 3σ) up to about 80 TeV.

Similar to what was found in other analysis of this class of sources (Aharonian et al. 2008), a single power-law can connect the GeV spectral data points with the TeV spectrum. We then used the Fermi and ASTRI data to better constrain the spectral parameters of the γ-ray emitting protons. We used the Naima package (Zabalza 2015) to fit the spectrum from few hundreds of MeV to about 100 TeV. The results are shown in Fig. 11.

As a result of this fit, a cut-off in the protons distribution with energy less than 300 TeV can be excluded by these set of data at 90% of c.l. This shows how this kind of analysis can lead to observe the cosmic rays at an energy very near the knee in the spectrum and then to constrain the role of SNR in the acceleration of Galactic cosmic rays.

5 Conclusions

ACDC is an INAF project aiming at simulating realistic end-to-end operations of three years of observations of the future ASTRI mini-array. We considered a layout of the mini-array for an assumed site in Paranal. We focused on the fields of 20 reference targets of different types of objects, chosen for their scientific relevance in the TeV sky. Thanks to a realistic pointing plan, we simulated up to a total of 5160 hr of useful time over three years. In addition, the large FoV (~ 10°) of the ASTRI mini-array allowed us to include in the simulation also a large number of H.E.S.S. and Fermi sources falling into the fields of the reference targets, for a total of 81 simulated point-like and extended objects.

In this paper, we have shown the results of a systematic analysis with croools-1.5.2 of the ASTRI mini-array data-challenge. We
found that 67 sources were detected with a significance larger than 5σ, with a good agreement between their observed and simulated spectral parameters. We also estimated a global systematic error, which includes both uncertainties in the IRF and limits of the analysis, of ~ 8% on the estimated fluxes.

Our results show that the ASTRI mini-array will be able to carry out scientific observations of the γ-ray sky up to about 100 TeV, extending significantly the range of energies covered by current Cherenkov instruments. We showed that the ASTRI mini-array will permit to investigate the properties of a large number of different types of objects, offering the possibility to study the morphology of extended sources (thanks to its high angular resolution of ~ 0.05 – 0.15 deg), to detect faint TeV objects and also to discover serendipitous transient sources. The findings presented in this work show that the capabilities of the ASTRI mini-array will provide results comparable, or even better than, those currently available with H.E.S.S. at high energies. We finally note that the ASTRI mini-array will be important in the search of PeVatron candidates.

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