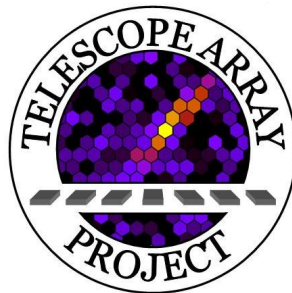


# Search for ultra-high energy photons with the Telescope Array surface detector

Mikhail Kuznetsov and Grigory Rubtsov  
for the Telescope Array collaboration

CRA-2019 GSSI,  
L'Aquila  
October 9, 2019



*Supported by Russian Science Foundation*

- ▶ Telescope Array experiment
- ▶ Technique of photon search — multivariate analysis

- ▶ Search for diffuse UHE photons

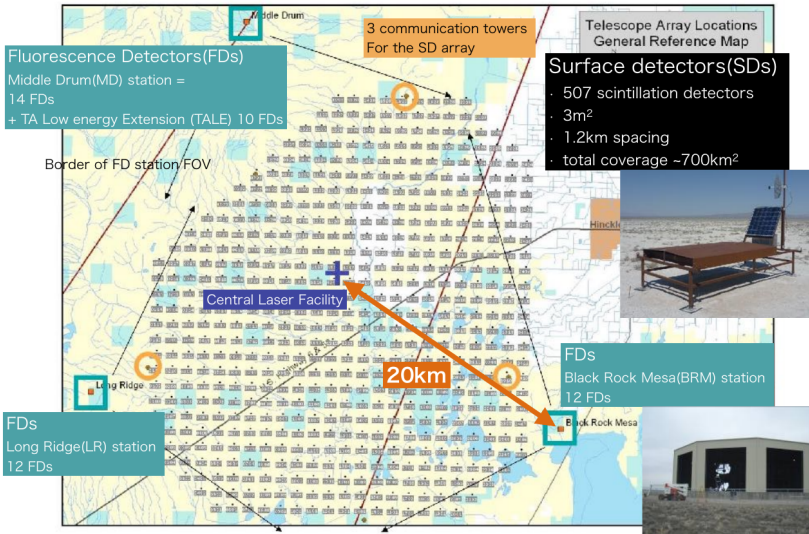
*TA, Astropart.Phys. 110, 8, 2019*

- ▶ Blind search for point sources of UHE photons

*TA, arXiv:1904.00300*

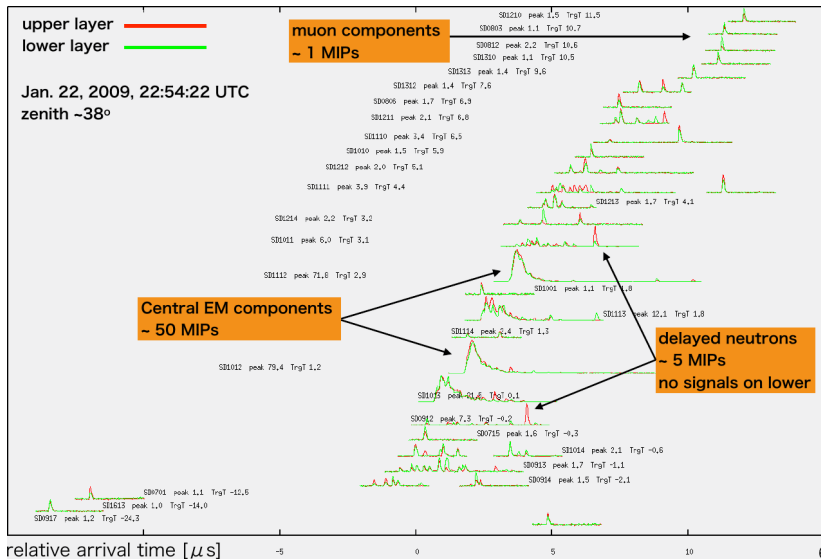
- ▶ Target search for UHE photons from dwarf galaxies

# Telescope Array experiment

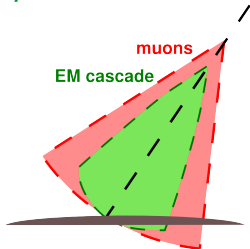


**More than 11 years of operation**  
**Largest UHECR statistics in the Northern Hemisphere**

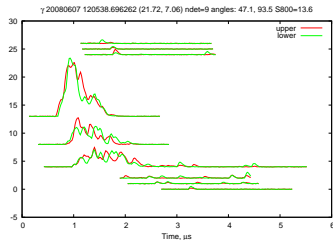
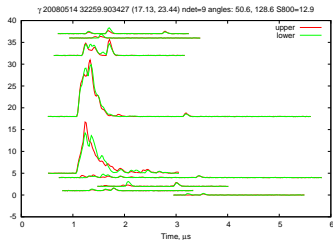
# Sample of TA surface detector event



## $p$ -induced EAS



## $\gamma$ -induced EAS



### Photon-induced showers:

- ▶ arrive younger
- ▶ contain less muons
- ▶ multiple SD observables affected: **front curvature**, **Area-over-peak**,  $\chi^2/d.o.f.$ , etc.

# Data and Monte-Carlo sets

- ▶ Data collected by TA surface detector for the 9 years:  
**2008-05-11 — 2017-05-10**
- ▶  $p$  and  $\gamma$  Monte-Carlo sets with CORSIKA and dethinning

*Stokes et al, Astropart.Phys.35:759,2012*

## Cuts for both data and MC:

- ▶ 7 or more detectors triggered
- ▶ core distance to array boundary is larger than 1200m
- ▶  $\chi^2/\text{d.o.f.} < 5$
- ▶  $\theta < 60^\circ$
- ▶  $E_\gamma > 10^{18}$  eV ( $E_\gamma$  is estimated with photon Monte-Carlo)
- ▶ remove events coincident with lightnings (lightning events mimics  $\gamma$ -induced events)

**52362 events after cuts**

# Photon search: list of relevant SD observables

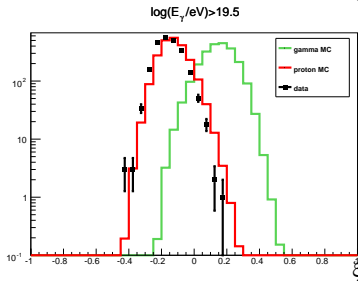
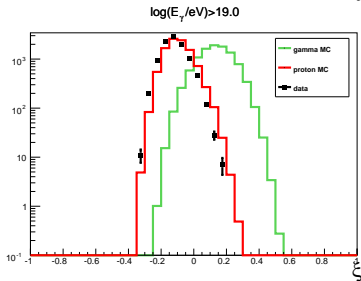
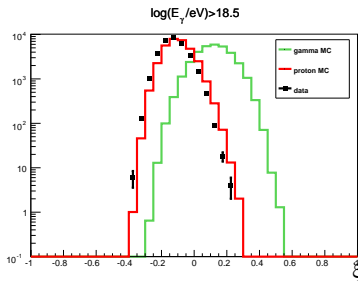
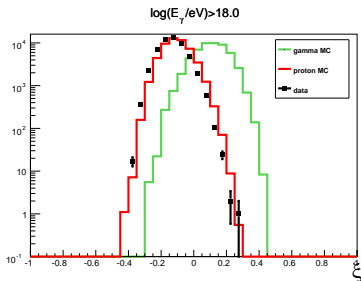
1. Linsley front curvature parameter,  $a$ ;
2. Area-over-peak (AoP) of the signal at 1200 m;  
*Pierre Auger Collaboration, Phys.Rev.Lett. 100 (2008) 211101*
3. AoP LDF slope parameter;
4. Number of detectors hit;
5. N. of detectors excluded from the fit of the shower front;
6.  $\chi^2/d.o.f.$ ;
7.  $S_b = \sum S_i \times r^b$  parameter for  $b = 3$  and  $b = 4.5$ ;  
*Ros, Supanitsky, Medina-Tanco et al. Astropart.Phys. 47 (2013) 10*
8. The sum of signals of all detectors of the event;
9. Asymmetry of signal at upper and lower layers of detectors;
10. Total n. of peaks within all FADC traces;
11. N. of peaks for the detector with the largest signal;
12. N. of peaks present in the upper layer and not in lower;
13. N. of peaks present in the lower layer and not in upper;

## Machine learning for multivariate analysis.

- ▶ The Boosted Decision Trees (BDT) technique is used to build  $p$ - $\gamma$  classifier based on multiple observables.  
*TA, Astropart. Phys. 110, 8 (2019); PRD 99, 022002 (2019)*
- ▶ root::TMVA is used as a stable implementation.  
*PoS ACAT 040 (2007), arXiv:physics/0703039*
- ▶ BDT is trained with Monte-Carlo sets:  $\gamma$  (signal) and  $p$  (background)\*
- ▶ BDT classifier is used to convert the set of observables of each event to a number  $\xi \in [-1 : 1]$
- ▶  $\xi$  is available for one-dimensional analysis.

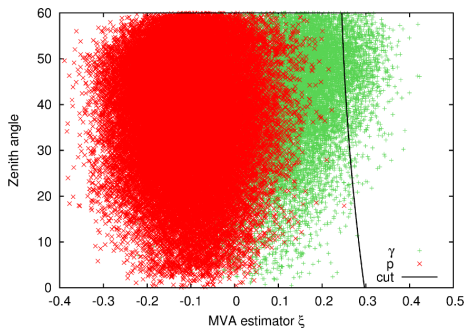
\* MC set is split into 3 equal parts: (I) for training the classifier, (II) for  $\xi$ -cut optimization, (III) for exposure estimate.

# Distribution of MVA estimator $\xi$ for data and MC



data    proton MC    gamma MC

# TA MVA Search for diffuse UHE photons



- ▶ The photon candidates are selected using the cut on  $\xi$ :  
 $\xi > \xi_{cut}(\theta)$
- ▶ Cut is optimized in each energy range using proton and photon Monte-Carlo
- ▶ The null-hypothesis is assumed for the cut-optimization (all events are protons)

# Effective exposure for photons

- ▶ Geometric exposure for  $\theta \in (0^\circ, 60^\circ)$  is **12060 km<sup>2</sup> sr yr**
- ▶ Effective exposure is estimated using photon MC assuming  $E^{-2}$  primary spectrum

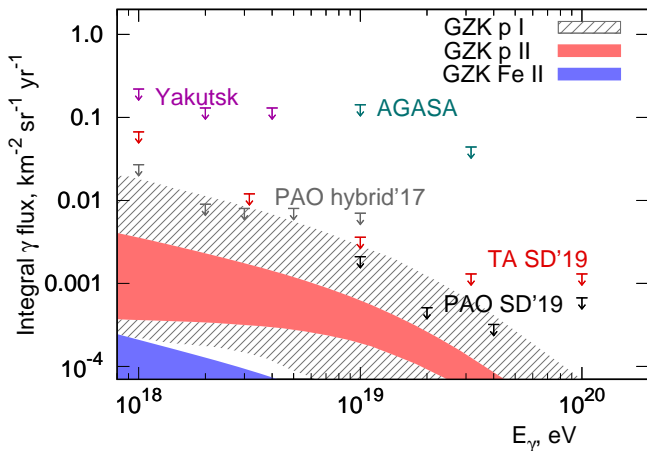
$E_0$	quality cuts	$\xi$ -cut	$A_{eff}$ km <sup>2</sup> sr yr
$10^{18.0}$	6.5%	9.8%	<b>77</b>
$10^{18.5}$	19.9%	10.6%	<b>255</b>
$10^{19.0}$	43.6%	16.2%	<b>852</b>
$10^{19.5}$	52.0%	37.2%	<b>2351</b>
$10^{20.0}$	64.2%	52.3%	<b>4055</b>

# Photon candidate events

energy cut	event date and time
$E_0 > 10^{18.0}$ eV	2012-03-24 14:06:23
$E_0 > 10^{18.5}$ eV	none
$E_0 > 10^{19.0}$ eV	none
$E_0 > 10^{19.5}$ eV	none
$E_0 > 10^{20.0}$ eV	2012-03-24 14:06:23

- ▶ No thunderstorms in March 2012.
- ▶ Expected background from proton misclassification:  $\sim 0.5$  events in each energy range.
- ▶ The background estimate depends on mass composition and hadronic model. To stay conservative, zero background is assumed.

# Results: diffuse UHE photons flux limits



*Telescope Array, Astropart.Phys. 110, 8, 2019*

$E_\gamma >$ , eV	$10^{18.0}$	$10^{18.5}$	$10^{19.0}$	$10^{19.5}$	$10^{20.0}$
$\gamma$ candidates	1	0	0	0	1
$F_{\text{UL}}(95\% \text{CL})$	0.067	0.012	0.0036	0.0013	0.0013

## The way to improve the photon search sensitivity:

Hadron background is highly isotropic



Assume that photons are emitted by point source



In angular vicinity of the source the **photon/hadron ratio** would be larger than in full TA field of view



**Easier to separate photons from hadrons!**

### Bonus!

Specific photon source hypotheses could be tested by search in certain directions stacked

- ▶ Dwarf spheroidal galaxies (heavy DM decay hypothesis)

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# Features of $\gamma$ point sources search: blind search

- ▶ Independent search for  $\gamma$  in each skymap direction
- ▶ The angular size of the each search region is equal to the  $\gamma$  **angular resolution**:

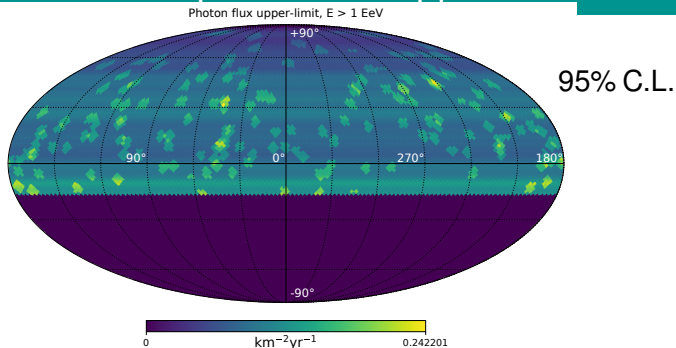
$E_\gamma \geq$ , eV	$10^{18.0}$	$10^{18.5}$	$10^{19.0}$	$10^{19.5}$	$10^{20.0}$
ang.res.	$3.00^\circ$	$2.92^\circ$	$2.64^\circ$	$2.21^\circ$	$2.06^\circ$

- ▶ The skymap is pixelized into 12288 directions with HEALpix (7720 in TA field of view)

## Optimisation of MVA-cut for $\gamma$ flux upper-limit:

- ▶ Assume the flux consists of protons only (null hypothesis):  
 $F_{\text{total}} = F_p$
- ▶ Optimize the  $\xi$ -cut for the best upper-limit separately in each constant declination band  $\delta_j \pm \text{ang.res.}$  using MC  $p$  and MC  $\gamma$
- ▶  $E^{-2}$   $\gamma$ -spectrum is assumed

# Results: point-source photon flux upper-limits



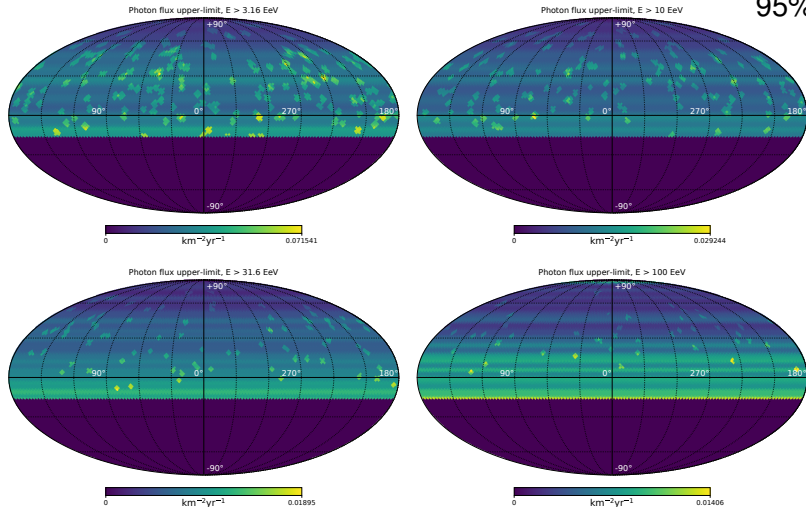
$E_\gamma \geq, \text{eV}$	$\langle F_\gamma \rangle \leq, \text{km}^{-2}\text{yr}^{-1}$
$10^{18.0}$	0.094
$10^{18.5}$	0.029
$10^{19.0}$	0.010
$10^{19.5}$	0.0071
$10^{20.0}$	0.0058

Pierre Auger:  $\langle F_\gamma \rangle \leq 0.035 \text{ km}^{-2}\text{yr}^{-1}$  ( $1^\circ \text{ ang.res.}, 10^{17.3} \leq E \leq 10^{18.5} \text{ eV}$ )

*A. Aab et al. ApJ 789, 160 (2014)*

# Results: point-source photon flux upper-limits

95% C.L.

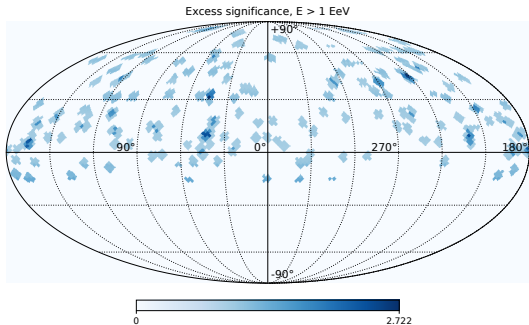


The results for all points are available in a table form with paper

*Telescope Array, arXiv:1904.00300*

It can be used to constrain models of UHECR sources.

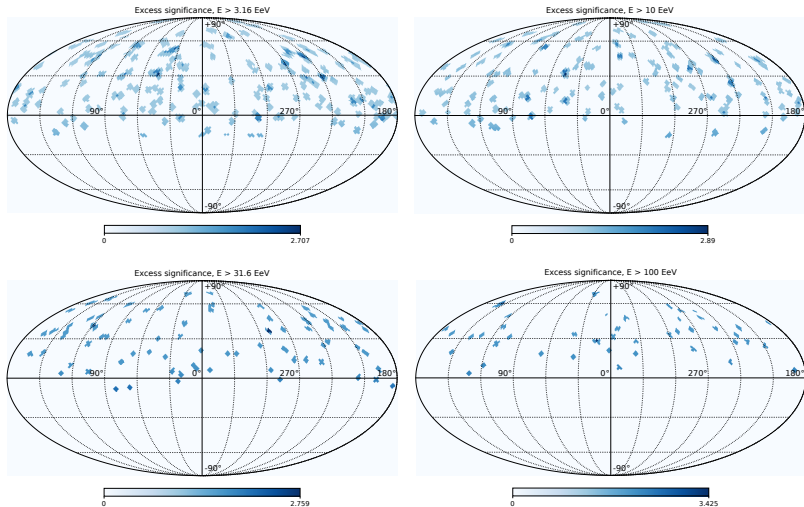
# Results: photon excesses significance



$E_\gamma \geq, \text{eV}$	max. $\gamma$ signif. (pre-trial)
$10^{18.0}$	$2.72 \sigma$
$10^{18.5}$	$2.71 \sigma$
$10^{19.0}$	$2.89 \sigma$
$10^{19.5}$	$2.76 \sigma$
$10^{20.0}$	$3.43 \sigma$

The excesses are insignificant, given the large number of trials

# Results: photon excess significance



Though not significant enough, the largest excess is  $3.43 \sigma$  for  $E_\gamma \geq 10^{20.0}$  eV located at  $\{\alpha = 155.3^\circ, \delta = 60.4^\circ\}$

# Target search for photons from dwarf galaxies

## Probe for the possible decay of heavy dark matter (HDM)

- ▶ HDM decay produce significant amount of photons in any model  
*M. Kachelriess et al., PRD 98, 083016 (2018)*
- ▶ DM is abundant in dwarf galaxies (Galactic Center is outside the TA field of view)
- ▶ Target source set: 21 dwarf galaxies — satellites of Milky Way  
*V. Bonnivard et al., MNRAS 453 (2015), 849*
- ▶ Search for  $\gamma$  in stacked skymap pixels of dwarf galaxies (pixel size =  $\gamma$  **ang.res.**)

## Results

No evidence for photon signal ( $N_{\gamma}^{\text{cand.}} = 0$  at all energies)

$E_{\gamma}$ , eV	$10^{18.0}$	$10^{18.5}$	$10^{19.0}$	$10^{19.5}$	$10^{20.0}$
$F_{ul}^{\gamma}$ , $\text{km}^{-2}\text{yr}^{-1}$	0.15	0.057	0.014	0.0076	0.0052

These results can be used to constrain HDM models

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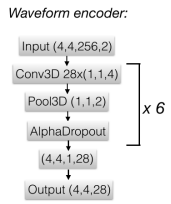
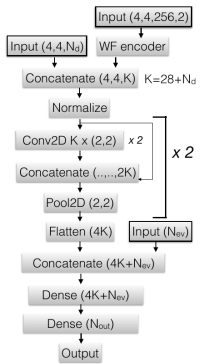
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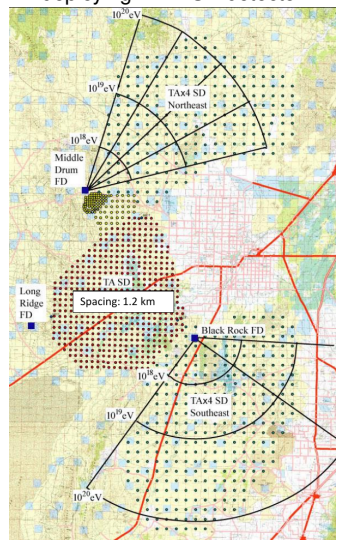
These results can be used to constrain HDM models

Improve  $\gamma$ -search sensitivity with recently developing Neural Net



*Telescope Array, PoS(ICRC2019)30*

Increase  $\gamma$ -search exposure with recently deploying TAx4 SD detector



## ▶ Search for diffuse photons

- ▶ The diffuse upper-limits for photons with  $E > 10^{18}$  eV were set
- ▶ No significant evidence for photons was found
- ▶ The limits are starting to probe cosmogenic photons area

## ▶ Search for point sources of photons

- ▶ The directional upper-limits for photons with  $E > 10^{18}$  eV were set
- ▶ The directional upper-limits for  $E > 10^{18.5}$  eV were set for the first time
- ▶ No significant evidence for photon signal was found in blind search
- ▶ The results can be used to constrain UHECR sources models
- ▶ The photons from staked dwarf galaxies were searched — no candidates were found
- ▶ The flux upper-limits for dwarf galaxies can be used to constrain heavy dark matter models

Thank you!

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Thank you!

# Backup slides

- ▶ QGSJet II-03 proton MC is used for MVA estimator training and cut optimization
- ▶ Systematics in proton MC affects the method sensitivity
  1. protons are closer to photons than data: tighter  $\xi$ -cut and underestimation of photon exposure
  2. protons are farther to photons than data: looser  $\xi$ -cut and extra photon candidates in the data set
- ▶ In both cases the flux upper-limits stay conservative

# Monte-Carlo: photon angular resolution

The geometry reconstruction of events is crucial for point source search.

There is a bias in zenith angle  $\theta$  reconstruction.

We correct all data and MC events for the mean value of this bias:

$$\langle \theta_{\text{rec.}} - \theta_{\text{true}} \rangle$$

Angular reconstruction for photon primaries (used in this search)

$E_\gamma$ , eV	$\langle \theta_{\text{rec.}} - \theta_{\text{true}} \rangle$	ang. resolution
$10^{18.0}$	$-2.25^\circ$	$3.00^\circ$
$10^{18.5}$	$-2.24^\circ$	$2.92^\circ$
$10^{19.0}$	$-2.16^\circ$	$2.64^\circ$
$10^{19.5}$	$-2.06^\circ$	$2.21^\circ$
$10^{20.0}$	$-1.72^\circ$	$2.06^\circ$