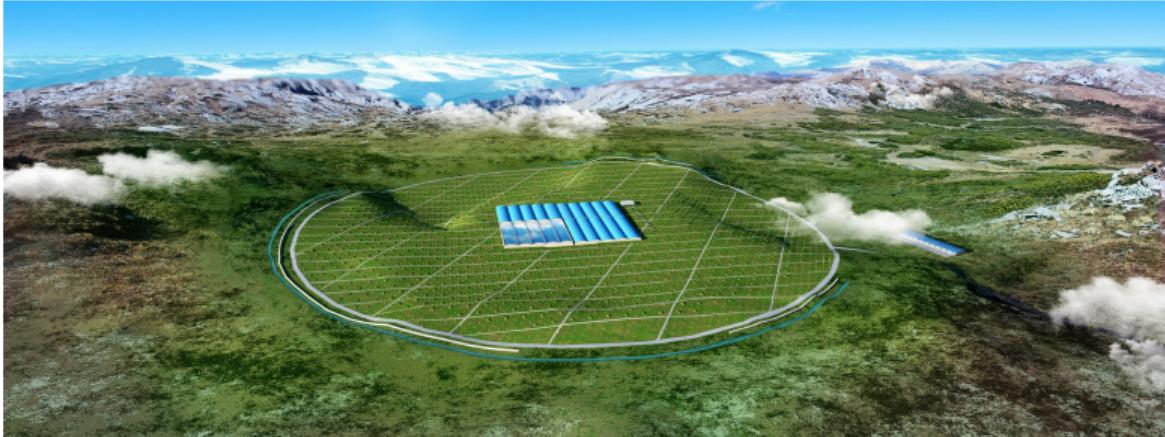
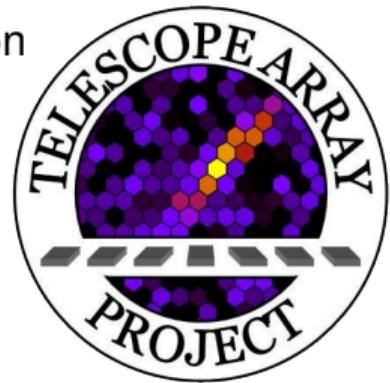


# The Telescope Array Experiment: cosmic-ray anisotropy, search for photons and neutrinos

G.I. Rubtsov (INR RAS) for the Telescope Array Collaboration

LHAASO Multi-Messenger Astronomy Workshop 2019  
Chengdu, April 26, 2019



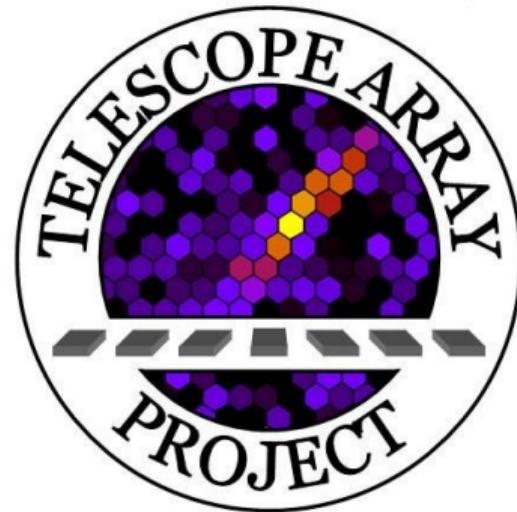
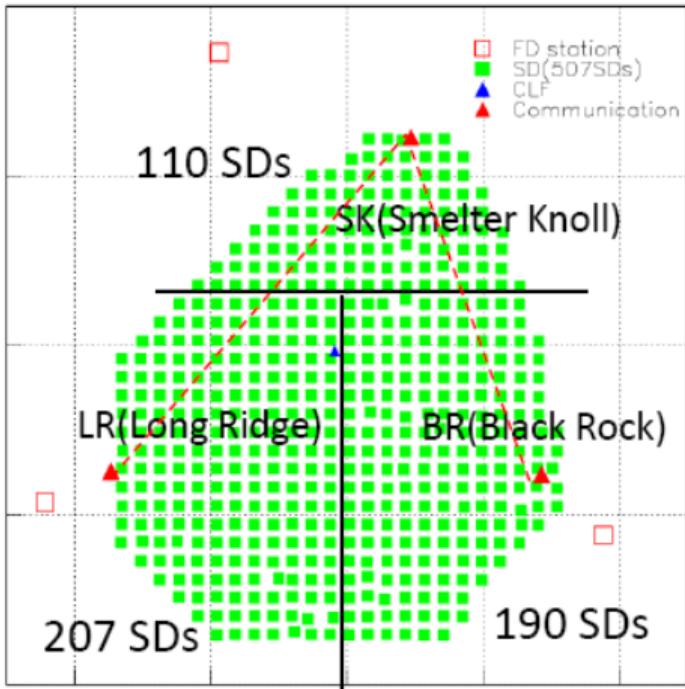
# Telescope Array Collaboration

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P. Tinyakov<sup>24;16</sup> I. Tkachev<sup>16</sup> H. Tokuno<sup>3</sup> T. Tomida<sup>27</sup> S. Troitsky<sup>16</sup> Y. Tsunesada<sup>3</sup> K. Tsutsumi<sup>3</sup> Y. Uchihori<sup>28</sup> S. Udo<sup>12</sup> F. Urban<sup>31</sup> G. Vasilov<sup>1</sup>  
T. Wong<sup>1</sup> R. Yamane<sup>9</sup> H. Yamaoka<sup>8</sup> K. Yamazaki<sup>9</sup> J. Yang<sup>20</sup> K. Yashiro<sup>5</sup> Y. Yoneda<sup>9</sup> S. Yoshida<sup>18</sup> H. Yoshii<sup>29</sup> Ya. Zhezher<sup>16</sup> R. Zollinger<sup>1</sup> Z. Zundel<sup>1</sup>

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Belgium, Czech Republic, Japan, Korea, Russia, USA

# Telescope Array surface detector



- ▶ 507 SD's,  $3 \text{ m}^2$  each
- ▶  $680 \text{ km}^2$  area
- ▶ 9 years of operation (this analysis)

Largest UHECR statistics in the Northern Hemisphere

- ▶ I. Cosmic-ray anisotropy
- ▶ II. Search for UHE photons
- ▶ III. Search for UHE neutrinos

# Hunting for UHECR sources

- We know that the sources of most UHECRs are extragalactic.

*TA, Astropart. Phys. 86 (2017) 21*

- How many sources there are?

- The event clustering is not observed at  $E > 50$  EeV  
 $n > 10^{-4}$  Mpc $^{-3}$  (for proton composition)

*Dubovsky, Tinyakov, Tkachev, PRL 85 (2000) 1154*

- Observation of dipole by Auger at  $E > 8$  EeV  
 $n \simeq 10^{-4}$  Mpc $^{-3}$  (for mixed composition)

*Auger collaboration, ApJ 868 (2018) 4*

- One of the sources is nearest. Model expectations for nearest source:

- Distance: 4-20 Mpc
  - 2-10% of the total UHECR flux

## Goal:

**search for the nearest source with UHECR, photons and neutrino!**

# TA SD data

9-year data: 12.05.2008 – 11.05.2017

## “anisotropy set”

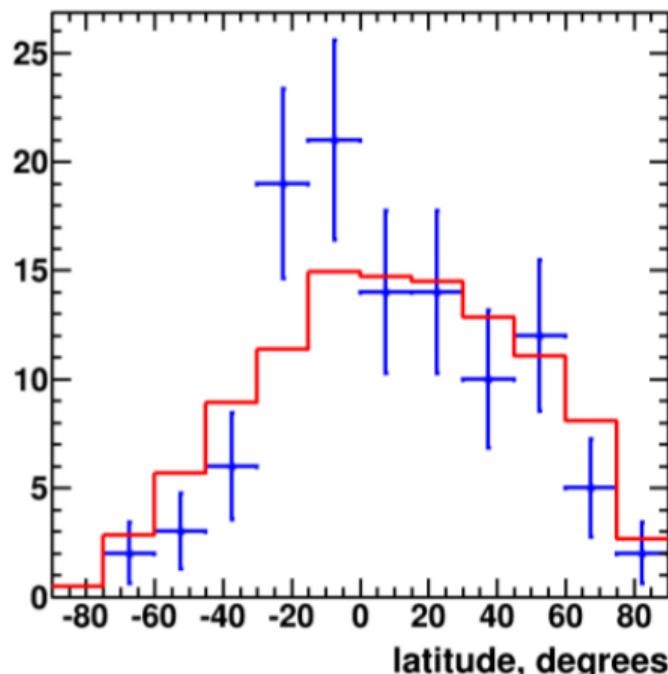
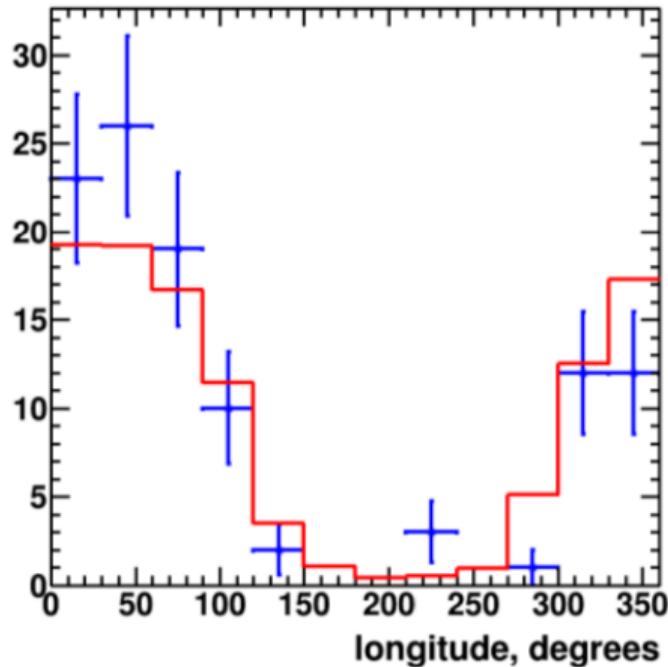
- zenith angle <55°
  - core inside array boundary
  - angular resolution: <1.5°
  - energy resolution: ~20%
- ▶ 3691 above 10 EeV
  - ▶ 257 above 40 EeV
  - ▶ 108 above 57 EeV

## “hotspot set”

- loose cuts (4 stations)
  - angular resolution: <1.7°
- ▶ 143 above 57 EeV
  - ▶ 23 above 100 EeV

# Global anisotropy

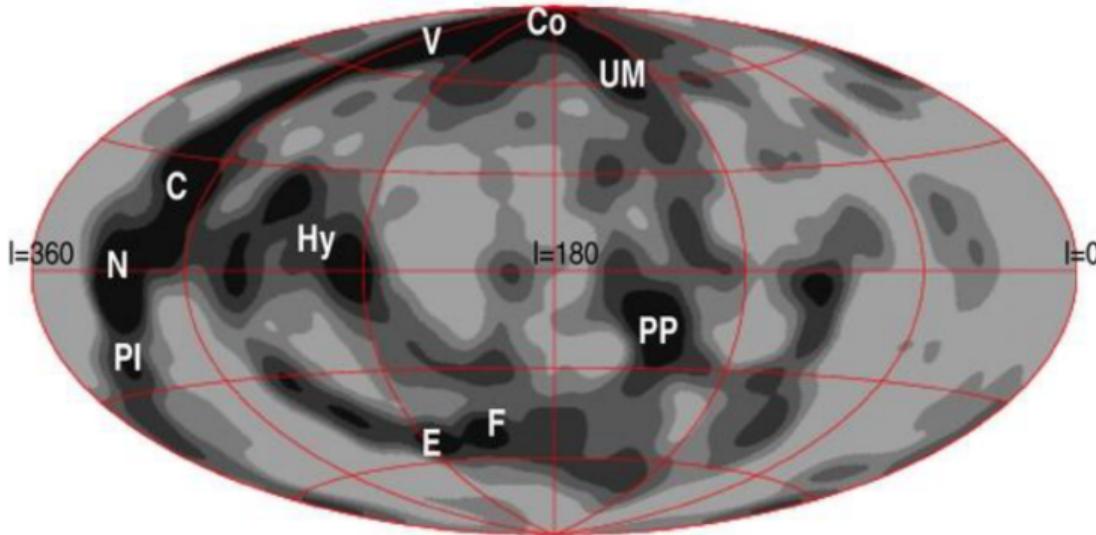
supergalactic coordinates



Kolmogorov-Smirnov p-value = 0.01 for SG latitude, E>57 EeV

other thresholds/coordinates = isotropic

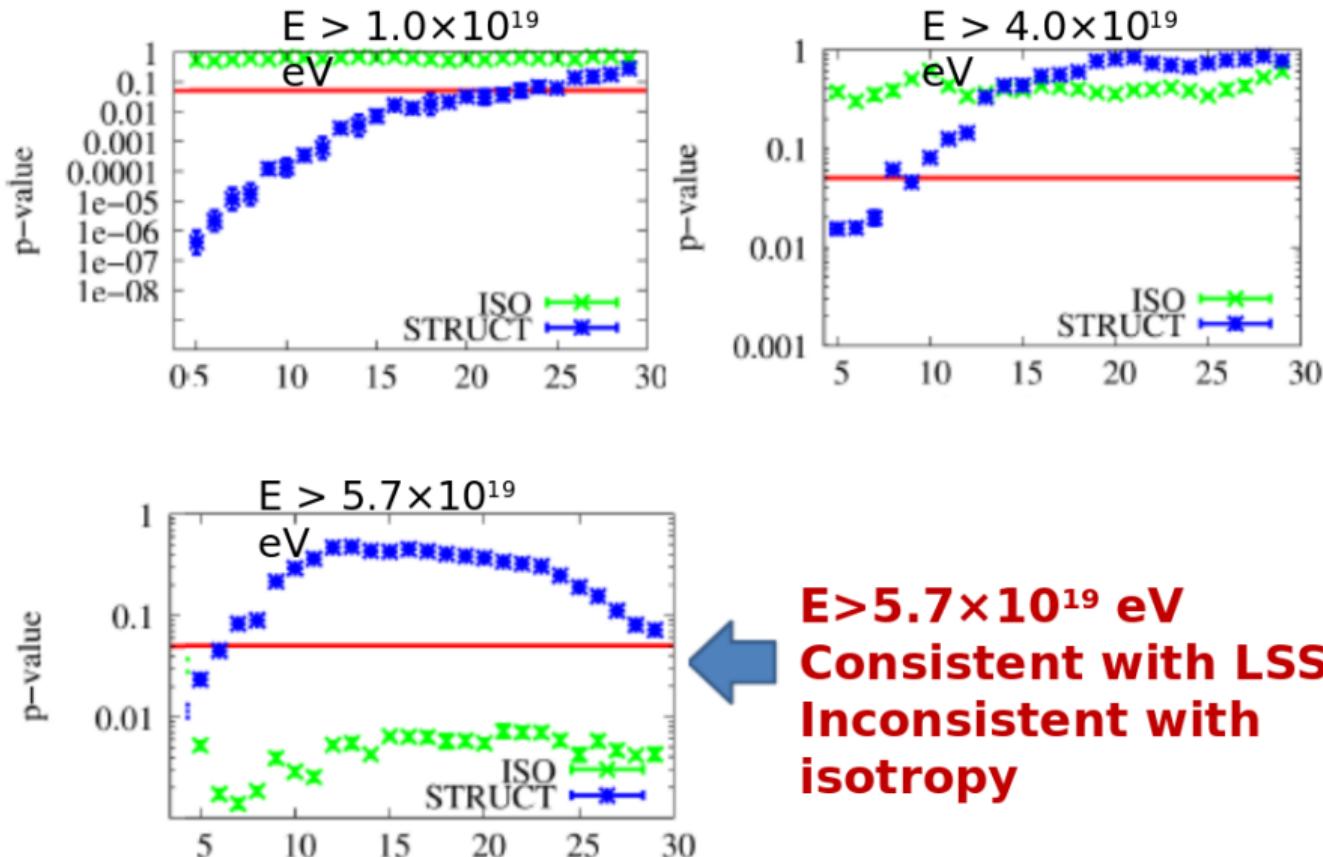
# Large-Scale Structure



C: Centaurus SCI (60 Mpc); Co: Coma Cl (90 Mpc); E: Eridanus Cl (30 Mpc); F: Fornax Cl (20 Mpc); Hy: Hydra SCI (50 Mpc); N: Norma SCI (65 Mpc); PI: Pavo-Indus SCI (70 Mpc); PP: Perseus-Pisces SCI (70 Mpc); UM: Ursa Major Cl (20 Mpc); and V: Virgo Cl (20 Mpc).

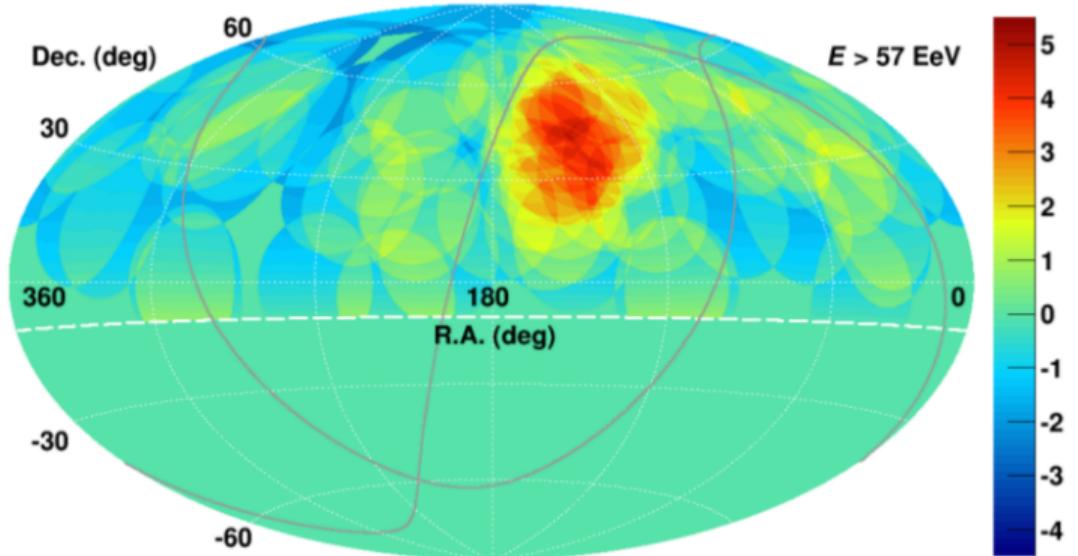
- **Sky map of expected flux at  $E > 57 \text{ EeV}$  (Galactic coordinates);**
- smearing angle is  $6^\circ$ .

# Large-Scale Structure



# Hot spot

E>57 EeV - Years 1-5 excess map  
TA 2014



Total events: 72  
Observed: 19  
Expected : 4.5

Best circle center: RA=146.7°, Dec=+43.2°  
Best circle radius: 20°  
Local significance : 5 σ  
Global significance : 3 σ

# Hot spot

Years 1-9 bin scan  
*TA preliminary*

“Li-Ma”:

approximation to Poisson statistics based on on-source/off-source exposure

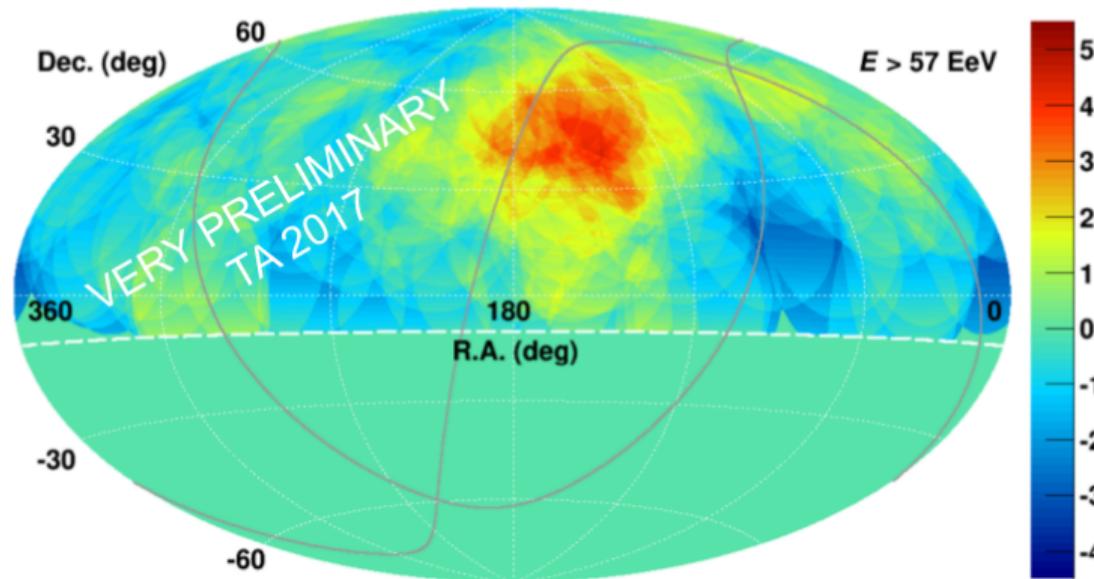
- “On”: inside the circle, “off”: the rest
- Scan for circle center (0.1 deg steps) and radius ( $15^\circ$ ,  $20^\circ$ ,  $25^\circ$ ,  $30^\circ$ ,  $35^\circ$ )

Bin size	15	20	25	30	35
$\sigma$	4.4	4.7	5.1	5.0	4.7

- Find the strongest excess  $\rightarrow$  local significance
- Repeat the procedure for isotropic Monte-Carlo sets  $\rightarrow$  global significance  
(look-elsewhere correction = penalty factor)

# Hot spot

E>57 EeV - Years 1-9 excess map

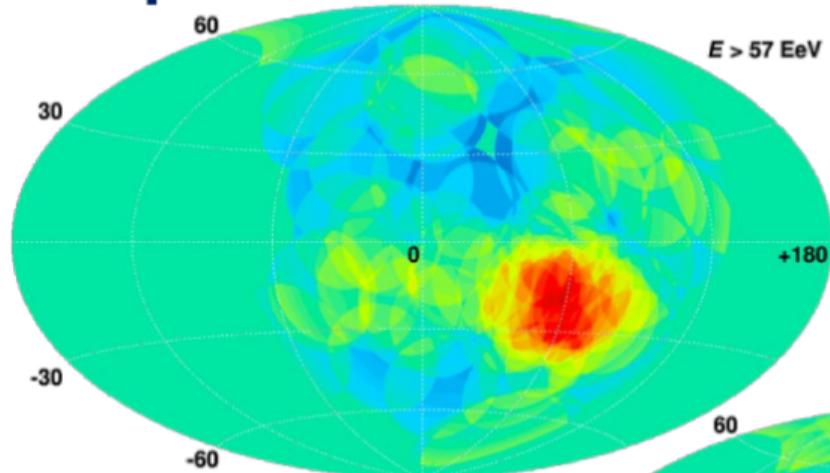


Total events: 143  
Observed: 34  
Expected : 13.5

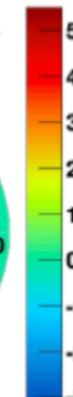
Best circle center: RA=144.3°, Dec=+40.3°  
Best circle radius: 25°  
Local significance : 5 σ  
Global significance : 3 σ

# Hot spot

Supergalactic coordinates

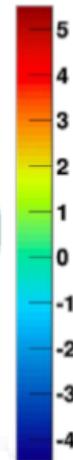
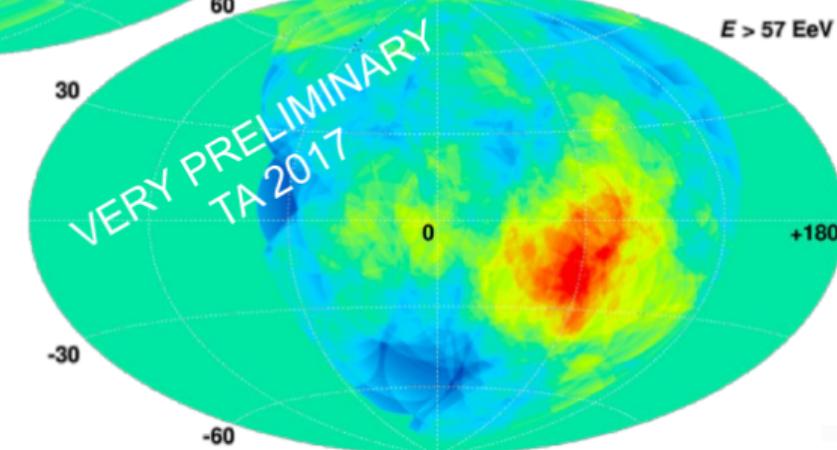


$E > 57 \text{ EeV}$

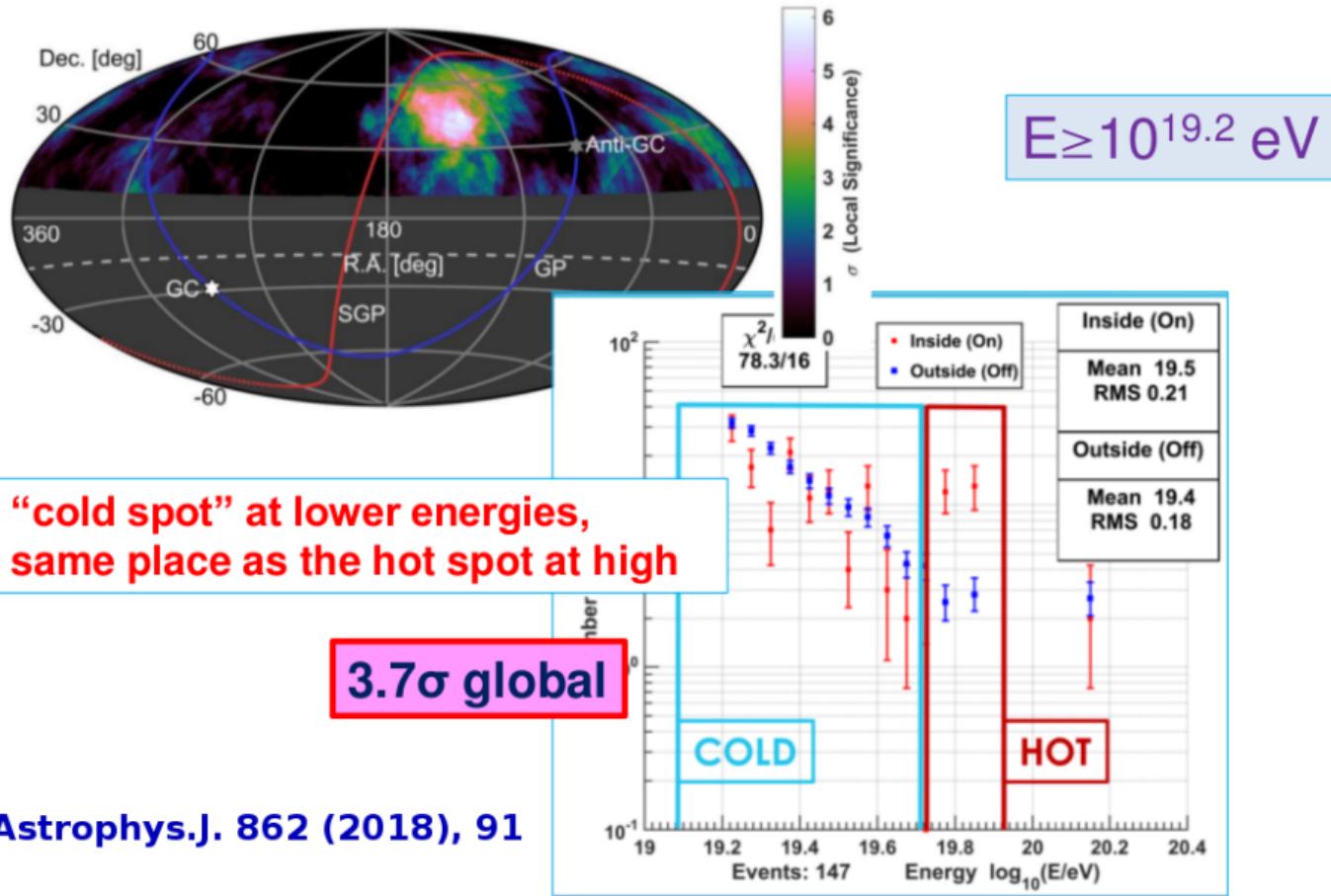


years 1-5  
20° circles

years 1-9  
25° circles

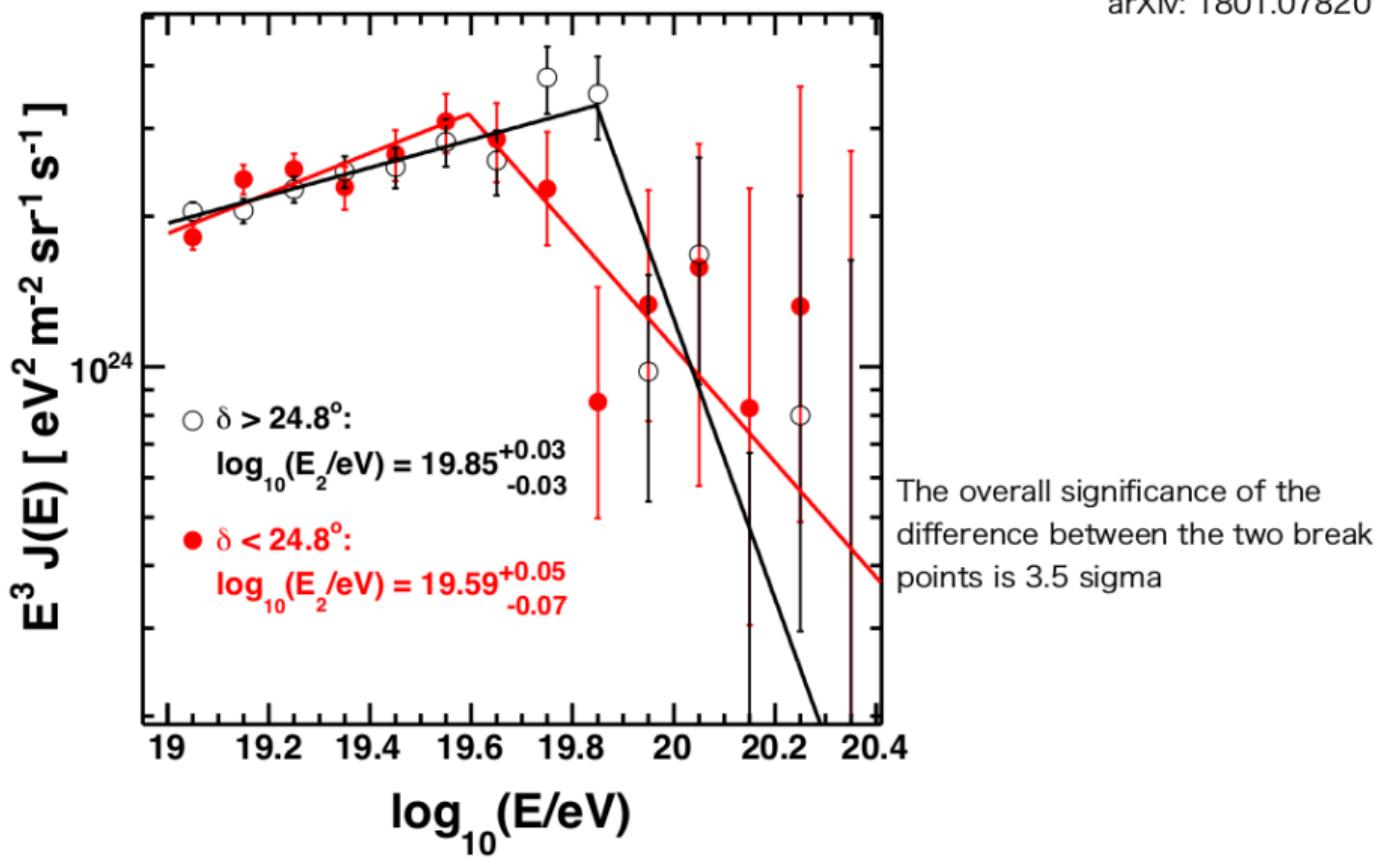


# Spectral anisotropy at the hot spot



# Declination dependence in TA

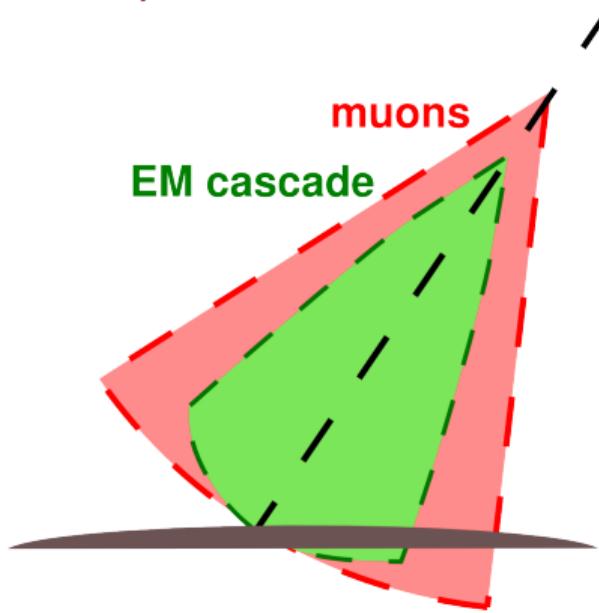
arXiv: 1801.07820



# Outline

- ▶ I. Cosmic-ray anisotropy
- ▶ II. Search for UHE photons
- ▶ III. Search for UHE neutrinos

*p*-induced EAS



$\gamma$ -induced EAS



### Photon-induced showers:

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

# Photon search: data and Monte-Carlo sets

- ▶ Data collected by TA surface detector for the nine years:  
**2008-05-11 — 2017-05-11**
- ▶  $p$  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)

**52769 events after all cuts expect lightning cut**

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

# Lightning-induced air showers

- ▶ It is shown that there are triggers of TA SD associated with the downward propagating ladders in lightning flushes.
    - ▶ Multiple SD triggers are observed within one millisecond
- Phys.Lett. A 381 (2017) 2565.*
- ▶ The results of Lightning Mapping Array (LMA) at TA site
- Journal of Geophysical Research: Atmospheres, 123, (2017) 6864-6879*
- ▶ The lightnings induce electromagnetic showers, which may be identified as photons. At least five candidates of this sort passed the cuts, see *GR, ICRC'2017* for details.
  - ▶ We use the National Lightning Detector Network (NLDN) data on lightnings at the location of TA SD.
- We appreciate Vaisala Inc's academic research policy*
- ▶ Both data and Monte-Carlo events are removed within  $\pm 10$  min from NLDN events. An associated loss of exposure is only 0.66% of the total exposure time.

## Photon search: list of relevant observables

1. Zenith angle,  $\theta$ ;
2. Signal density at 800 m from the shower core,  $S_{800}$ ;
3. Linsley front curvature parameter,  $a$ ;
4. Area-over-peak (AoP) of the signal at 1200 m;

Pierre Auger Collaboration, Phys.Rev.Lett. 100 (2008) 211101

5. AoP LDF slope parameter;
6. Number of detectors hit;
7. N. of detectors excluded from the fit of the shower front;
8.  $\chi^2/d.o.f.$ ;
- 9,10.  $S_b = \sum S_i \times r_i^b$  parameter for  $b = 3$  and  $b = 4.5$ ;

Ros, Supanitsky, Medina-Tanco et al. Astropart.Phys. 47 (2013) 10

11. The sum of signals of all detectors of the event;
12. Asymmetry of signal at upper and lower layers of detectors;
13. Total n. of peaks within all FADC traces;
14. N. of peaks for the detector with the largest signal;
- 15,16. N. of peaks present in the upper layer and not in lower, lower and not upper;

# Multivariate analysis

- ▶ The Boosted Decision Trees (BDT) technique is used to build  $p\text{-}\gamma$  classifier based on multiple observables.

*Pierre Auger Collaboration, ApJ, 789, 160 (2014)*

- ▶ `root::TMVA` is used as a stable implementation.

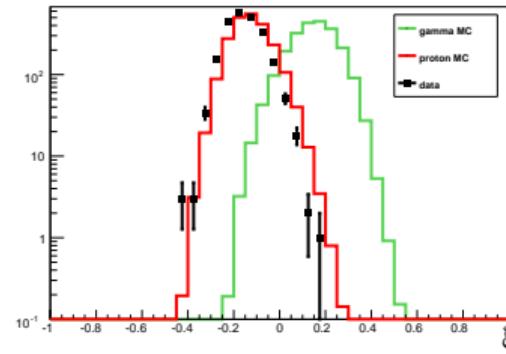
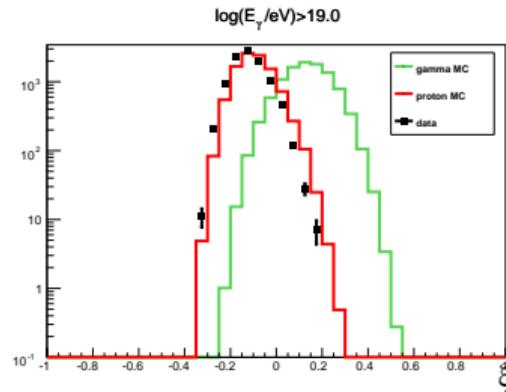
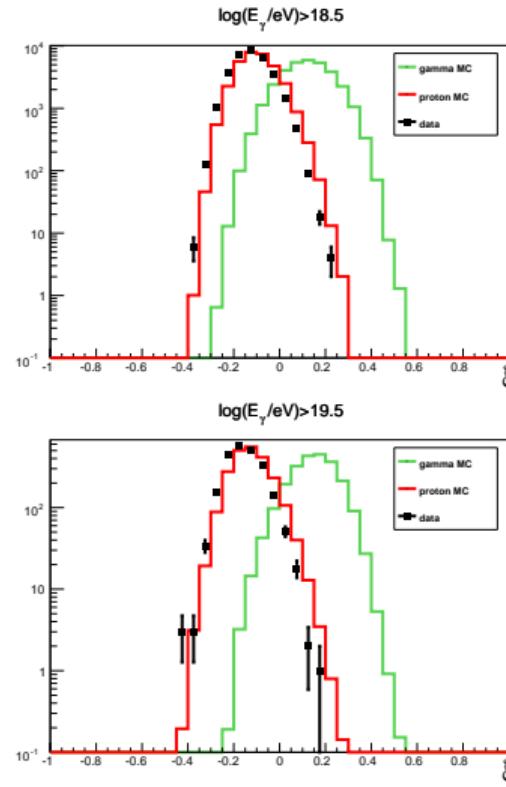
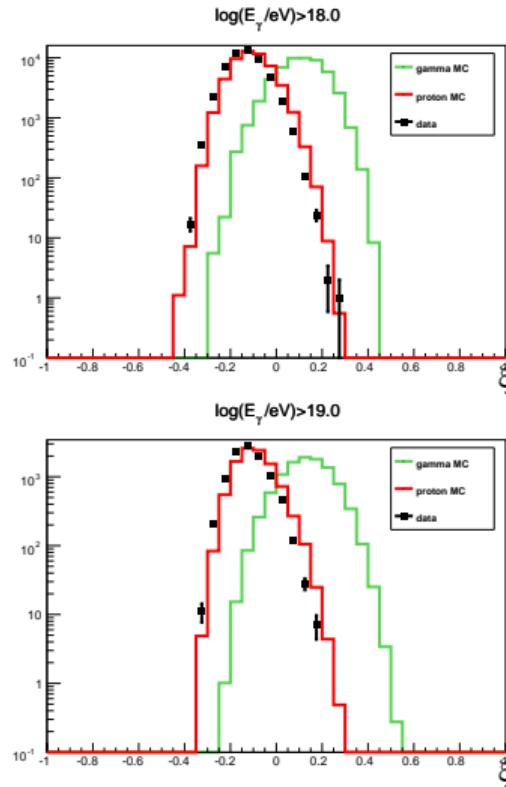
*PoS ACAT 040 (2007), arXiv:physics/0703039*

- ▶ BDT is trained with Monte-Carlo sets:

$\gamma$  (Signal) and  $p$  (Background)

- ▶ BDT classifier is used to convert the set of observables for an event to a number  $\xi \in [-1 : 1]$ : 1 - pure signal ( $\gamma$ ), -1 - pure background ( $p$ ).
- ▶  $\xi$  is available for one-dimensional analysis. The cut on  $\xi$  for the search is optimized using proton MC as a null-hypothesis.

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



data    photon MC    proton MC

# Optimization of cut on $\xi$

- ▶ The photon candidates are selected using the cut on  $\xi$ :  
$$\xi > \xi_{cut}(\theta)$$
- ▶ The cut is approximated as a quadratic function of  $\theta$
- ▶ Cut is optimized in each energy range using proton and photon Monte-Carlo (cut optimization subsets)
- ▶ The merit factor is an average photon upper limit if the null-hypothesis is true (all protons)

# Effective exposure

- ▶ Geometric exposure for  $\theta \in (0^\circ, 60^\circ)$ : **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	$A_{\text{eff}}$ 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>

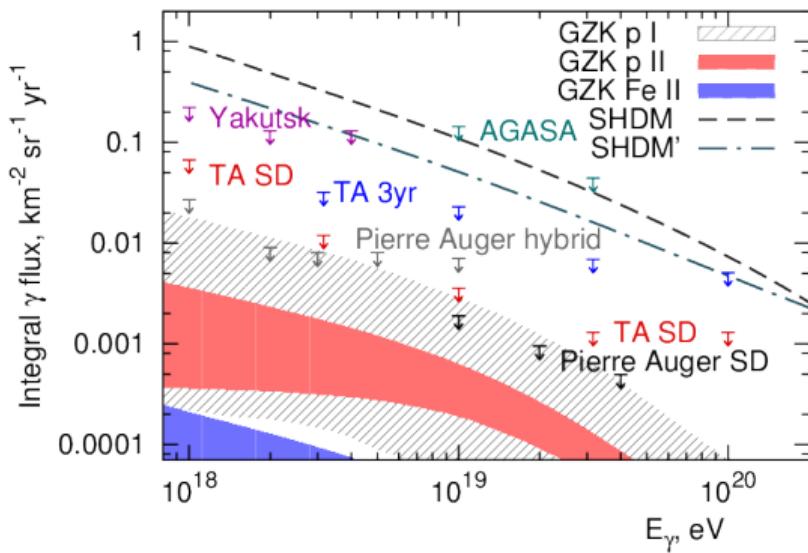
## Photon candidate events

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 composition and hadronic model. To stay conservative, zero background is assumed in the analysis.

# Results: photon diffuse flux limits

$E_0$ , eV	$10^{18.0}$	$10^{18.5}$	$10^{19.0}$	$10^{19.5}$	$10^{20.0}$
$\gamma$ candidates	1	0	0	0	1
$\bar{n} <$	5.14	3.09	3.09	3.09	5.14
$A_{\text{eff}}$	77	255	852	2351	4055
$F_\gamma <$	0.067	0.012	0.0036	0.0013	0.0013



*Astropart.Phys.* 110 (2019) 8-14

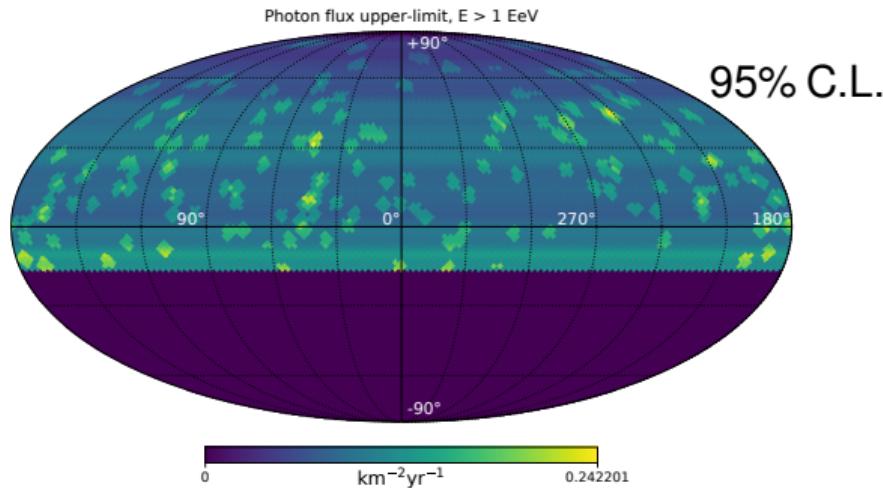
models from J. Alvarez-Muniz et al. *EPJ Web Conf.* 53, 01009 (2013)

# Search for point sources of the ultra-high-energy photons

- ▶ The skymap is pixelized into 12288 directions with HEALpix
- ▶ An independent search with the cut optimization is performed in circles centered in each of the pixels;  
radius = angular resolution
- ▶ Angular reconstruction for photons:

$E_\gamma$ , eV	ang. resolution 68%
$10^{18.0}$	$3.00^\circ$
$10^{18.5}$	$2.92^\circ$
$10^{19.0}$	$2.64^\circ$
$10^{19.5}$	$2.21^\circ$
$10^{20.0}$	$2.06^\circ$

# Point-source photon flux upper-limits



$E_\gamma \geq$ eV	$\langle F_\gamma \rangle \leq$ $\text{km}^{-2}\text{yr}^{-1}$	max. $\gamma$ signif. (pre-trial)
$10^{18.0}$	0.094	$2.72\sigma$
$10^{18.5}$	0.029	$2.71\sigma$
$10^{19.0}$	0.010	$2.89\sigma$
$10^{19.5}$	$7.1 \times 10^{-3}$	$2.76\sigma$
$10^{20.0}$	$5.8 \times 10^{-3}$	$3.43\sigma$

*arXiv:1904.00300*

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

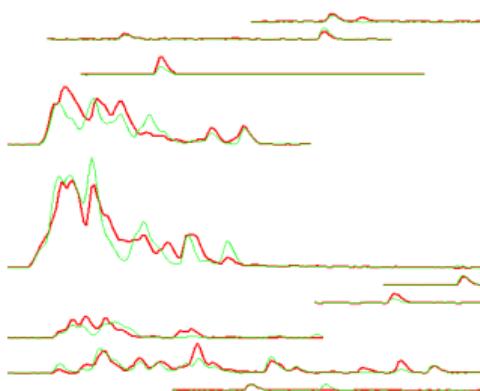
A. Aab et al. ApJ 789, 160 (2014)

# Outline

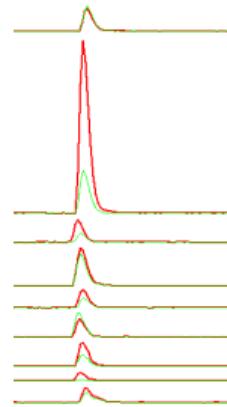
- ▶ I. Cosmic-ray anisotropy
- ▶ II. Search for UHE photons
- ▶ **III. Search for UHE neutrinos**

# Neutrino search strategy

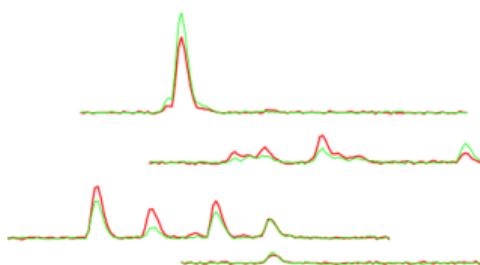
**young shower,  $\theta = 19.5^\circ$**



**old shower,  $78.3^\circ$**



**neutrino shower,  $\theta = 78.6^\circ$**



- ▶ Neutrino-induced showers are young while very inclined
- ▶ Waveform has many peaks

**upper layer      lower layer**

# Method

- ▶ Cuts:

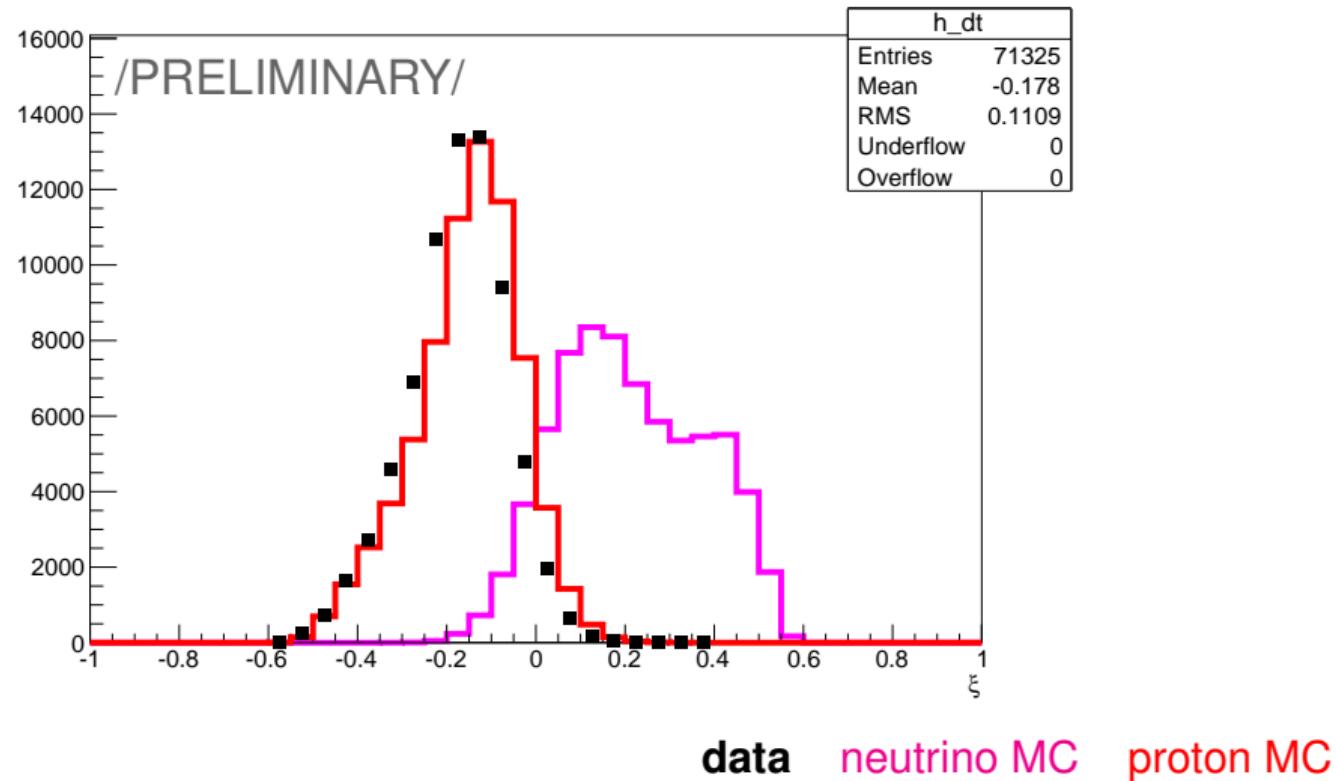
- ▶ 5 or more detectors triggered
- ▶ core distance to array boundary is larger than 1200m
- ▶  $\chi^2/\text{d.o.f.} < 5$
- ▶  $45^\circ < \theta < 90^\circ$
- ▶ no energy cut

**197250 events after cuts**

- ▶ Multivariate analysis is used

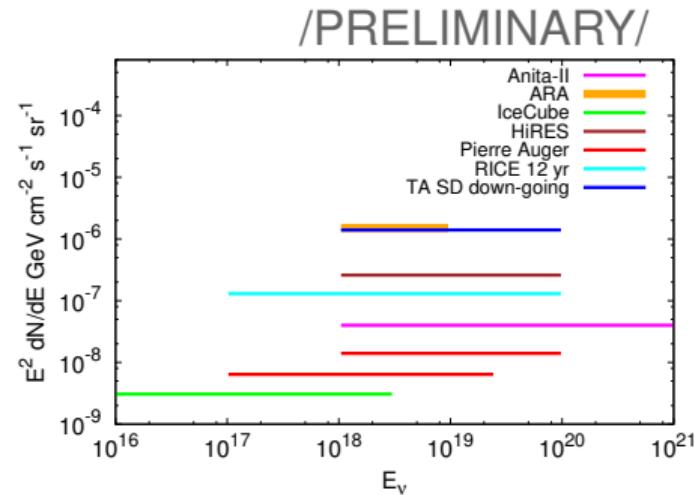
- ▶ The set of observables is the same as for photon search (Energy is replaced with  $S_{800}$ )
- ▶ Method: Boosted decision tree trained with inclined proton (background) and all-flavor down-going neutrino (signal) Monte-Carlo
- ▶ The cut on  $\xi$  is optimized in a similar to photon search way

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

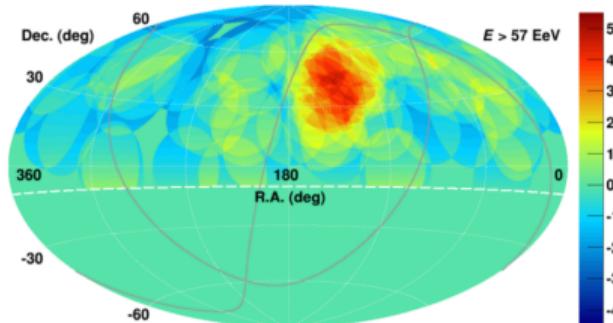


# Neutrino search results

- ▶ 0 neutrino candidates after cuts,  $\bar{n}_\nu < 2.44$  (90% C.L.)
- ▶ **Exposure:**
  - ▶ Geometric exposure for  $\theta \in (45^\circ, 90^\circ)$ :  
 $8042 \text{ km}^2 \text{ sr yr}$
  - ▶ probability to interact in the atmosphere:  
 $1.4 \times 10^{-5}$
  - ▶ trigger, reconstruction and quality cuts efficiency  $\sim 7\%$
  - ▶  $\xi$  cut efficiency:  $\sim 24\%$
  - ▶ total exposure (all flavors):  
 $A = 1.9 \times 10^{-3} \text{ km}^2 \text{ sr yr}$
- ▶ Single flavor diffuse neutrino flux limit for  $E > 10^{18} \text{ eV}$ :  $E^2 f_\nu < 1.4 \times 10^{-6} \text{ GeV cm}^{-2} \text{s}^{-1} \text{sr}^{-1}$  (90% C.L.)



# Conclusions

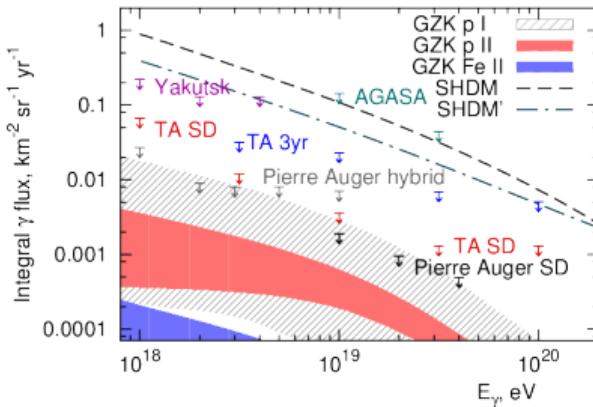


## Results presented:

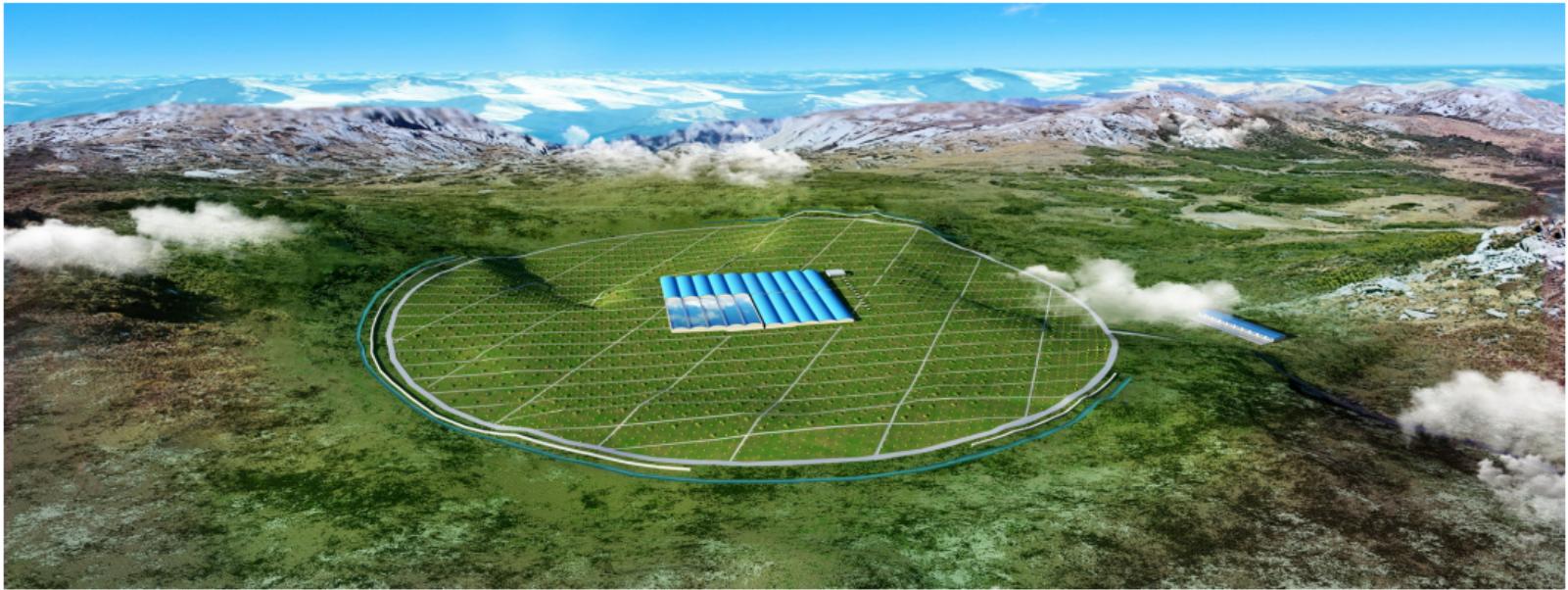
- ▶ Indications of intermediate-scale anisotropy is observed above 57 EeV.
- ▶ Diffuse and point-source photon flux upper limits above 1 EeV.
- ▶ Down-going neutrino diffuse flux limits above 1 EeV.

## Prospects:

- ▶ The exposure and energy range will be extended with TAx4 and TALE SD experiments.
- ▶ Improved data analysis based on machine learning techniques (supported by Russian Science Foundation).



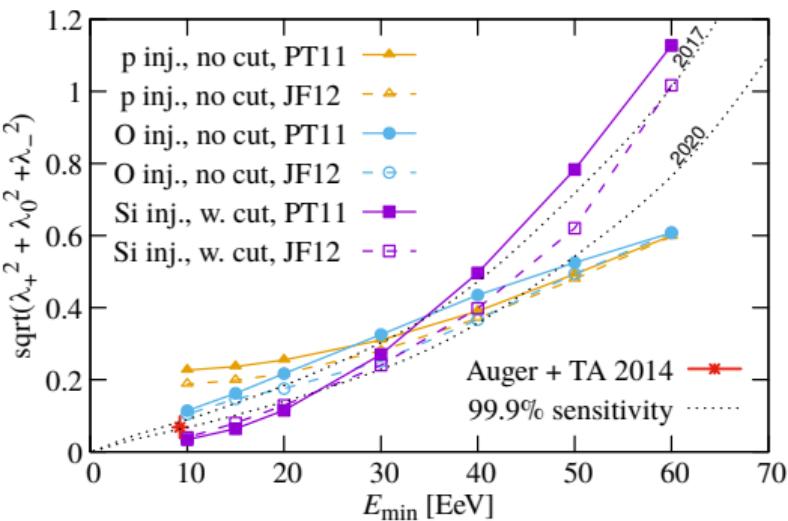
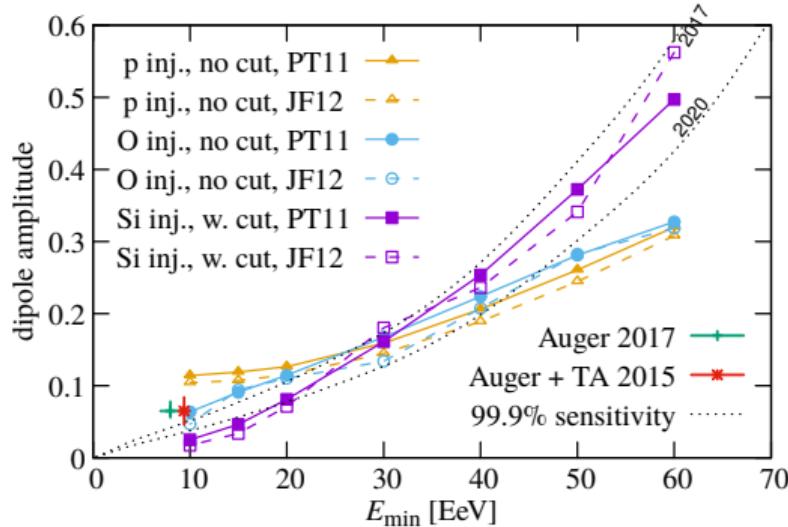
# Congratulations to LHAASO!



**Wish long-term success  
and physics beyond expectations!**

# Backup slides

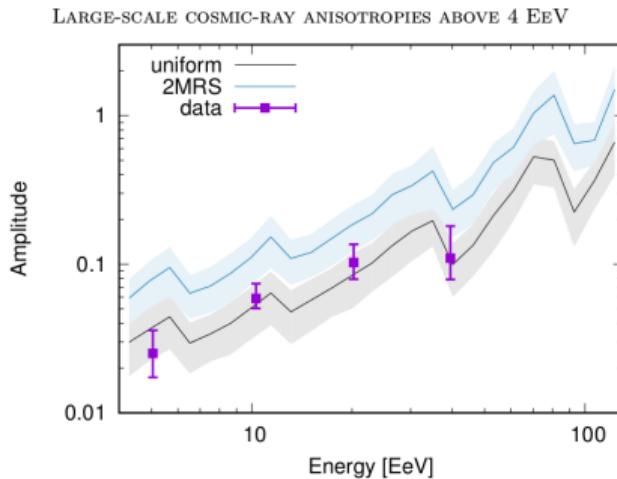
# Search for dipole and quadrupole



di Matteo, Tinyakov, MNRAS 476 (2018) 715

- ▶ The growth with energy of dipole and quadrupole amplitude is predicted in the source model resembling LSS
- ▶ The Auger+TA dipole data agree with the prediction
- ▶ No quadrupole is observed by now

# Search for dipole and quadrupole



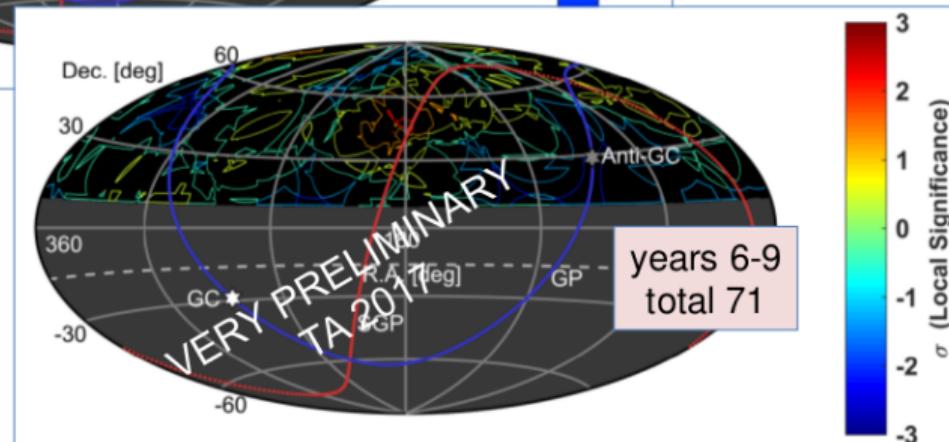
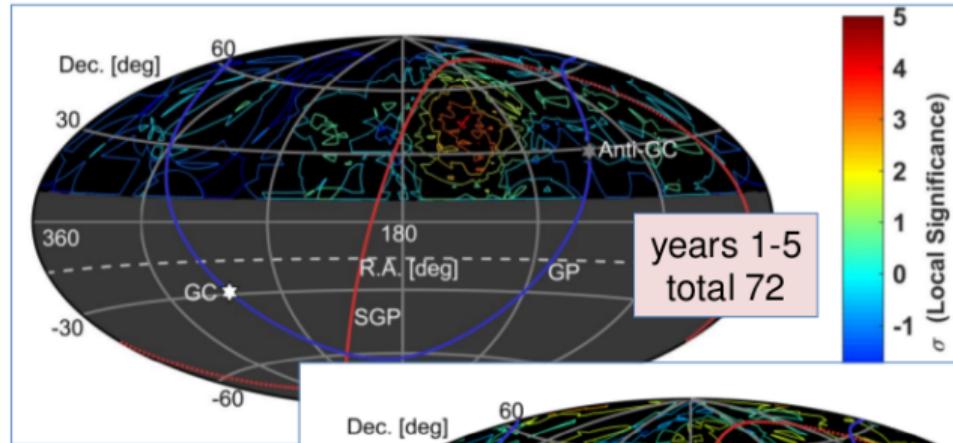
Auger collaboration, ApJ 868 (2018) 4

- ▶ discovery of dipole at  $5\sigma$  for  $E > 8$  EeV
- ▶ in agreement with the model of isotropic sources  $\rho = 10^{-4} \text{ Mpc}^{-3}$

# Hot spot

Years 6-9 vs. 1-5

no hypothesis – no tests



# Hot spot

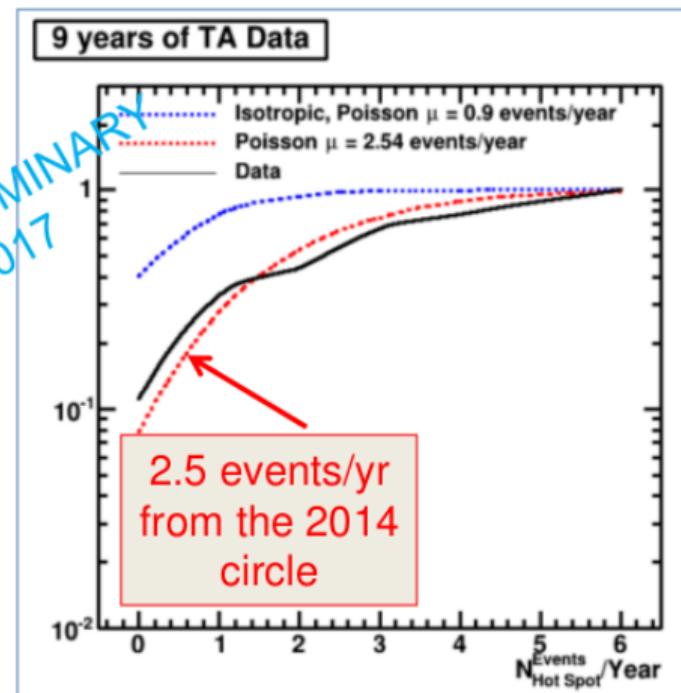
Years 6-9 vs. 1-5

## “would-be hypothesis” – “would-be tests”

global  $\neq$  local P-value  $\rightarrow$  positive fluctuation, need to correct our expectations

circle defined in [TA, ApJ 2014] = years 1-5:  
center RA= $146.7^{\circ}$ , Dec= $+43.2^{\circ}$ , radius:  $20^{\circ}$

	Years 1-5	Years 6-9
Expected (isotropic)	4.5	3.6
Expected (hot spot)	12.5	10.0
Observed	19	5



# Hot spot

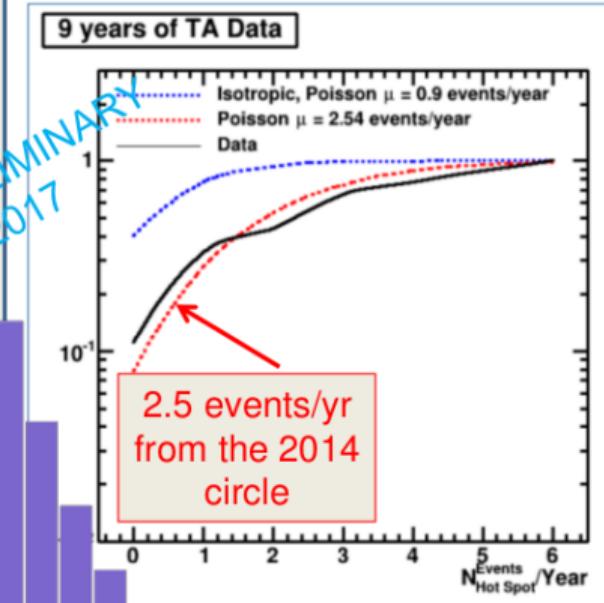
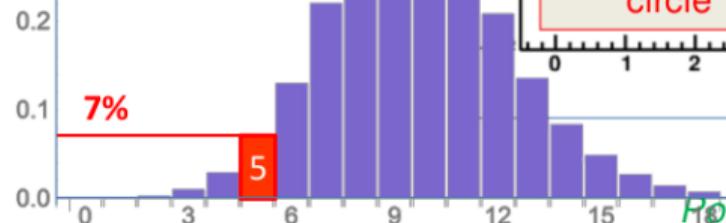
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VERY PRELIMINARY  
TA 2017