

Bayesian analysis on the origin of ultra-high energy cosmic ray events collected by the telescope array experiment

Anatoli Fedynitch

Research Results Presentation Meeting of the ICRR Inter-University Research Program FY2022

ICRR (online), 2023/02/20



People involved



Keito Watanabe

- BSc @ University of Alberta, Canada
- Now MSc cand @ Cologne U. (Germany)
- **Twice at ICRR** in summers 2020 and 2021
- Invited via my KAKENHI (JSPS) grant



Dr. Francesca Capel

- **Astroparticle physicist/Astrostatistician**
- Non-tenured staff scientist at Max-Planck (MPP) Munich
- **Visited ICRR** in 2019 before COVID
- Invited via my KAKENHI (JSPS) grant



Dr. Anatoli Fedynitch

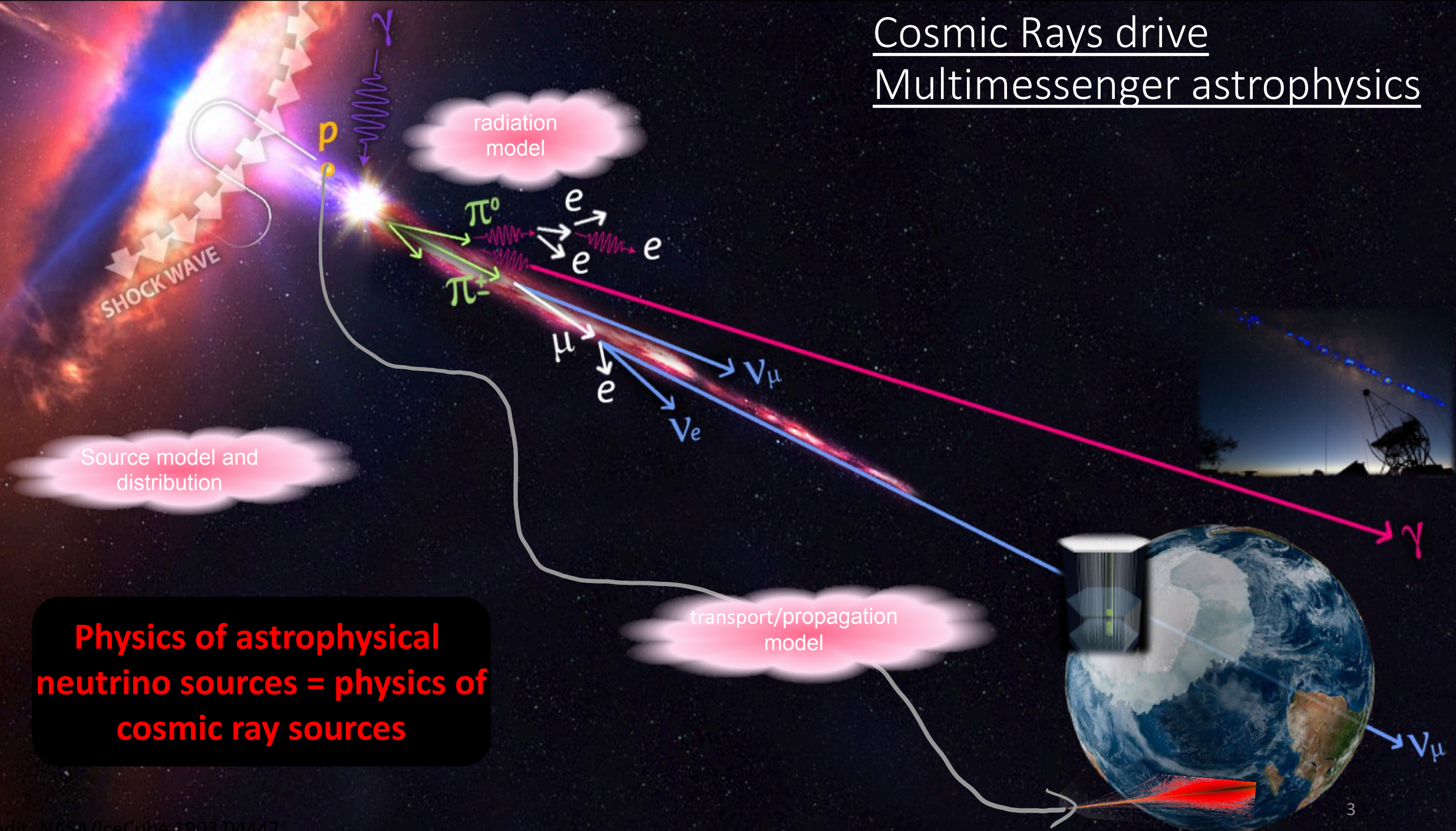
- **JSPS Fellow in TA group from 2019-2021**
- Now tenure-track faculty at Academia Sinica, Taipei
- PI of this project



Prof. Hiroyuki Sagawa

- **Host Professor**
- TA group leader
- Steering of scientific outcome

Cosmic Rays drive Multimessenger astrophysics



Physics of astrophysical neutrino sources = physics of cosmic ray sources

Telescope array observes Cosmic Rays by looking at particle showers in Utah

**Fluorescence
detector (FD)**

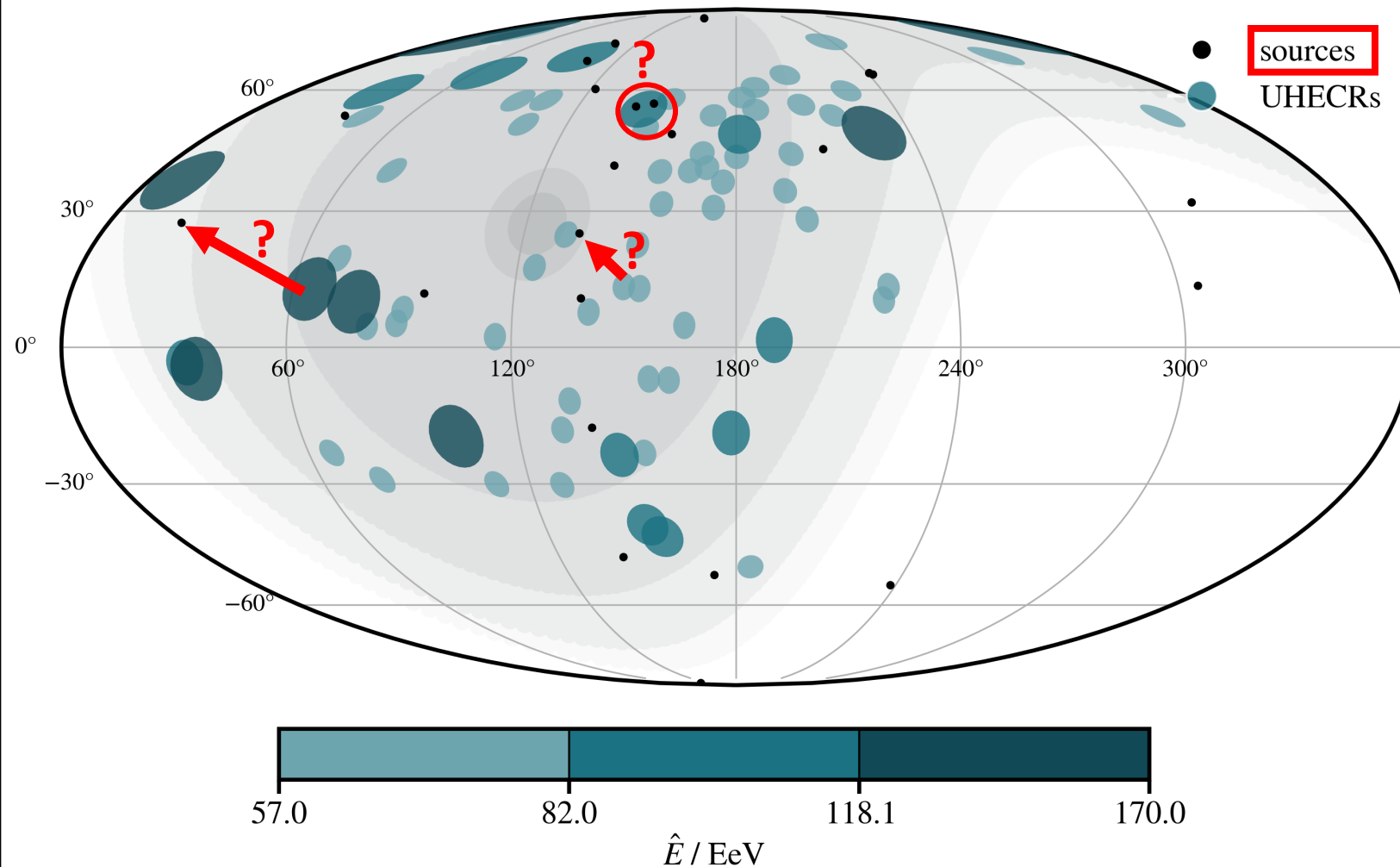


**Surface detector
(SD)**



Research goals

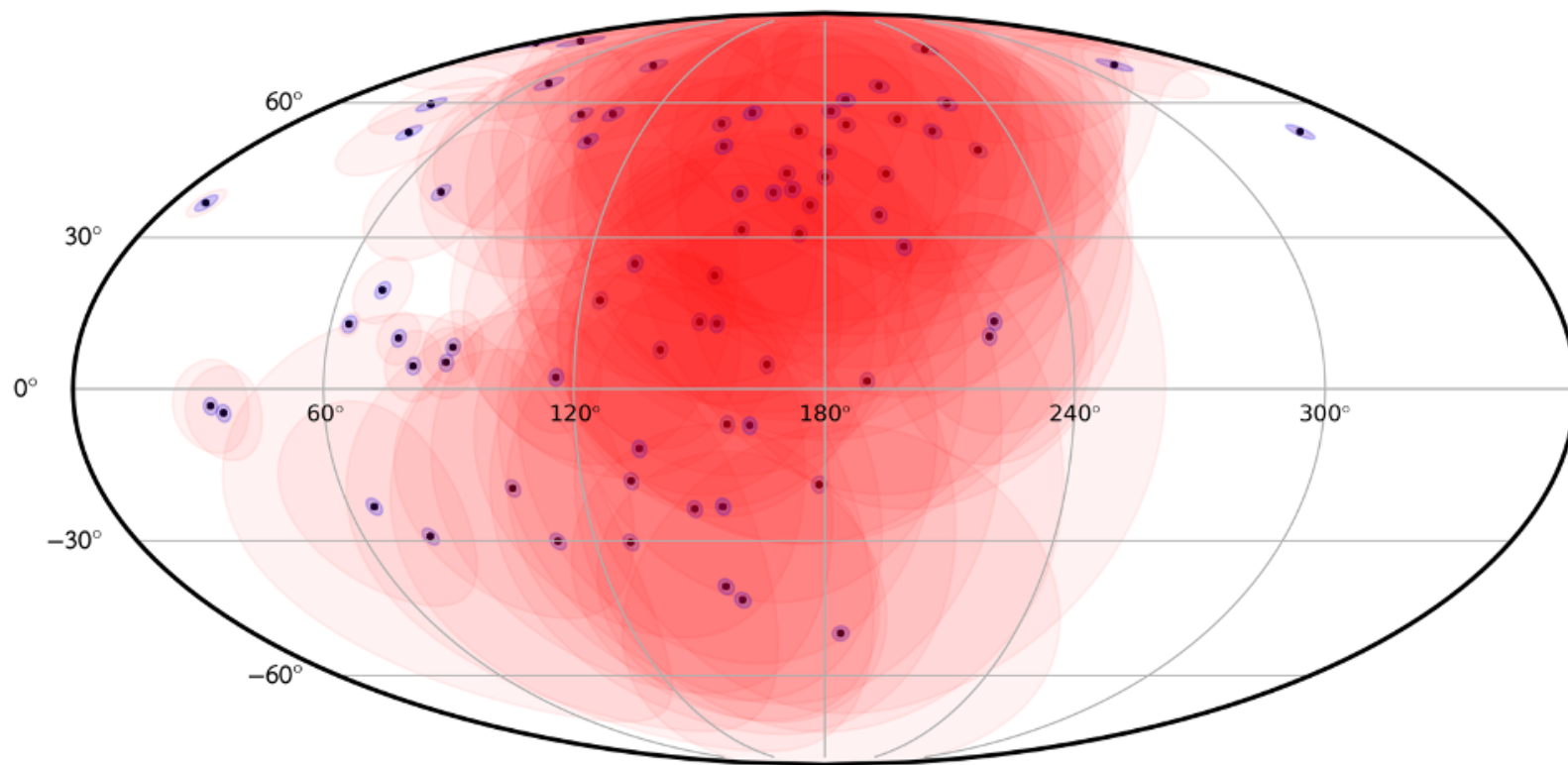
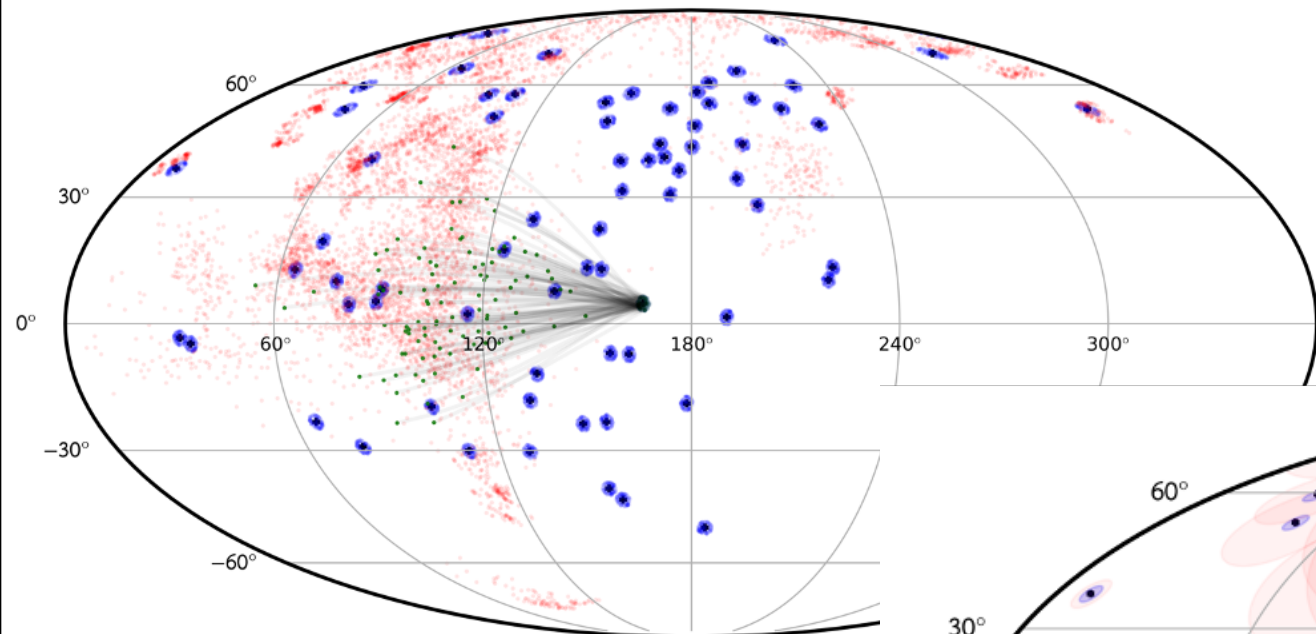
Measured Cosmic Ray events by the Telescope Array



- How can the observed **cosmic rays** be **attributed** to potential **sources**?
- ...as a **statistically viable**, robust answer?
- Can we incorporate **the knowledge of the physics** between the Earth and the sources into this statement?

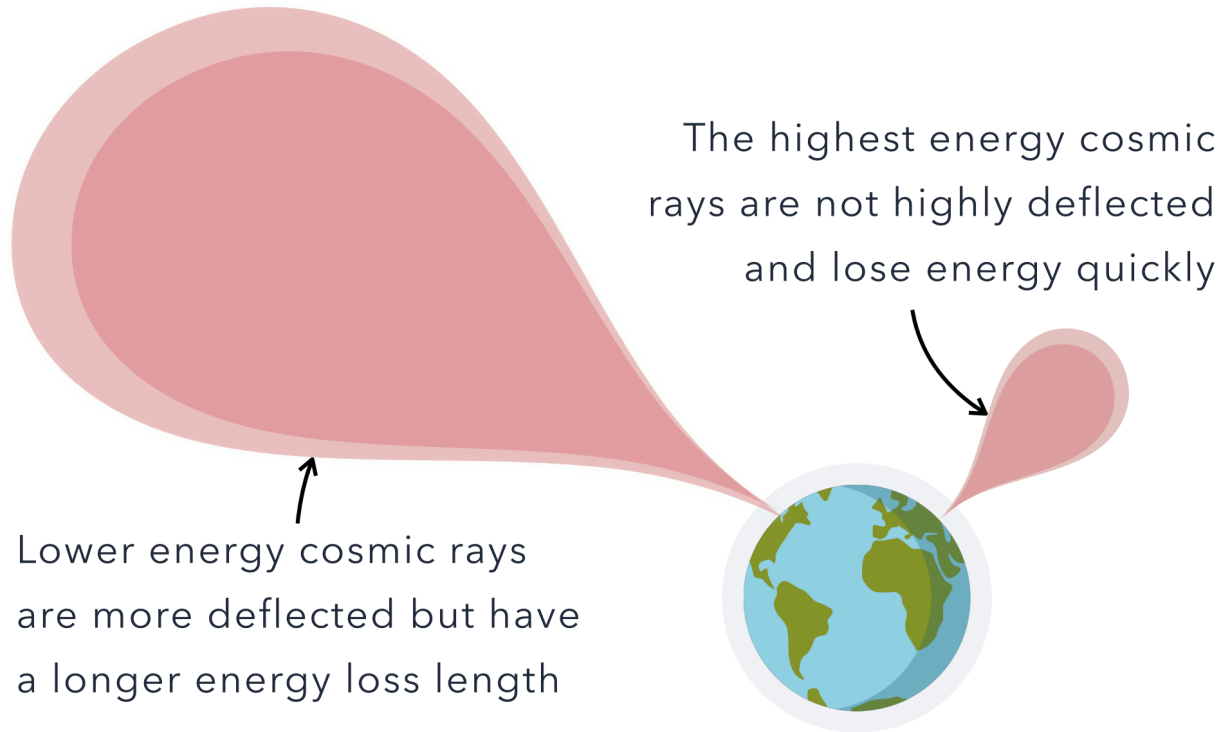
Incorporate deflections in Galactic Magnetic Fields

TA 2015 data, nitrogen assumption, JF12



Use detailed modeling and Bayesian inference

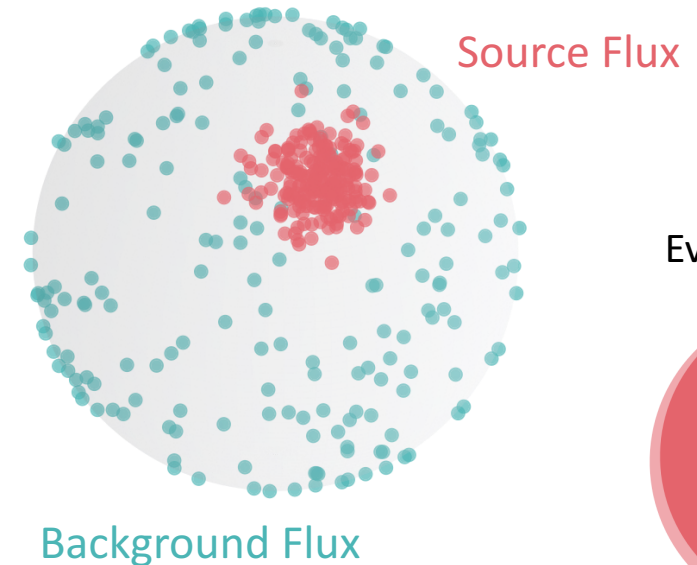
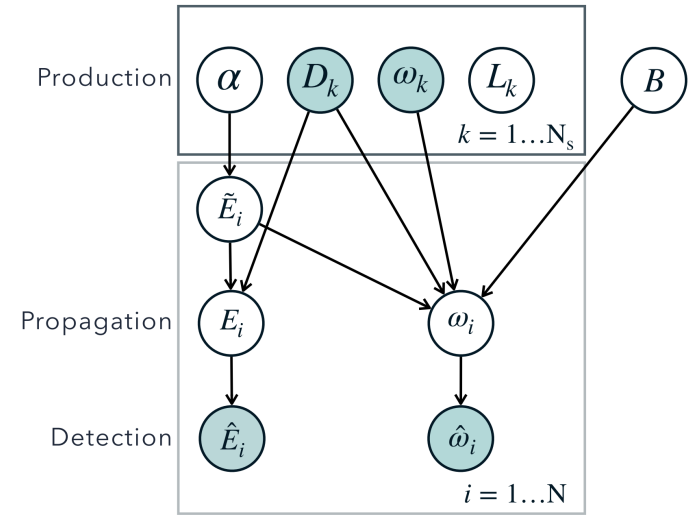
Francesca Capel & Mortlock, 1811.06464



Source fraction:

$$f = \frac{F_s}{F_0 + F_s}$$

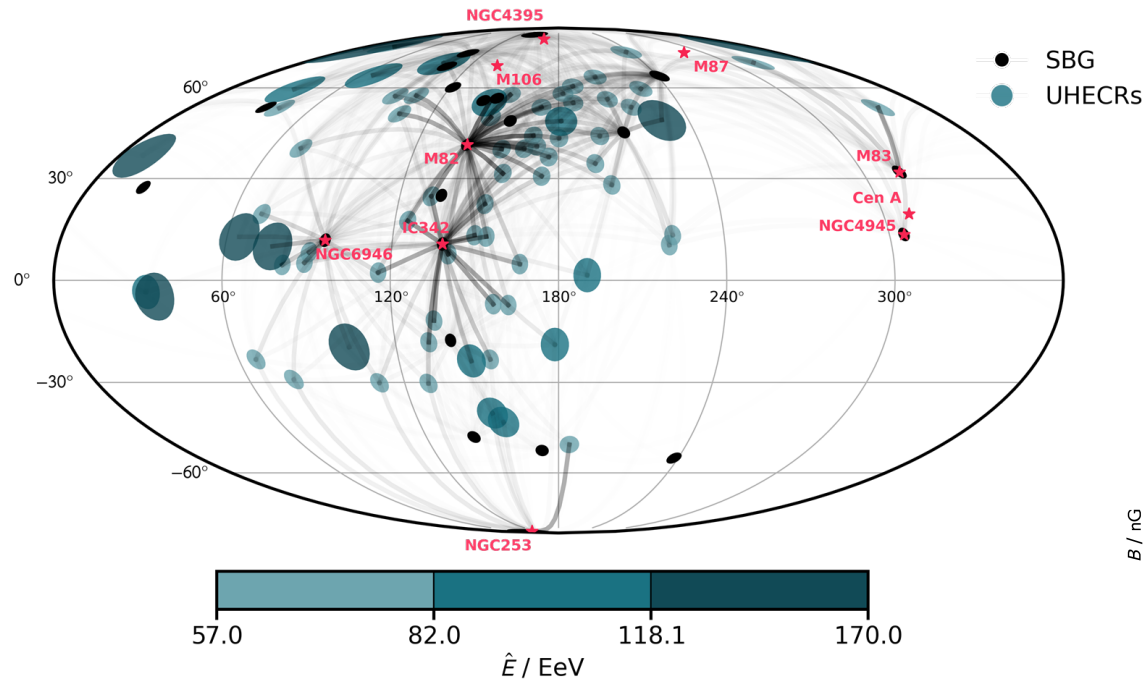
Bayesian Hierarchical Model (implemented in Python + STAN)



Evolution of:

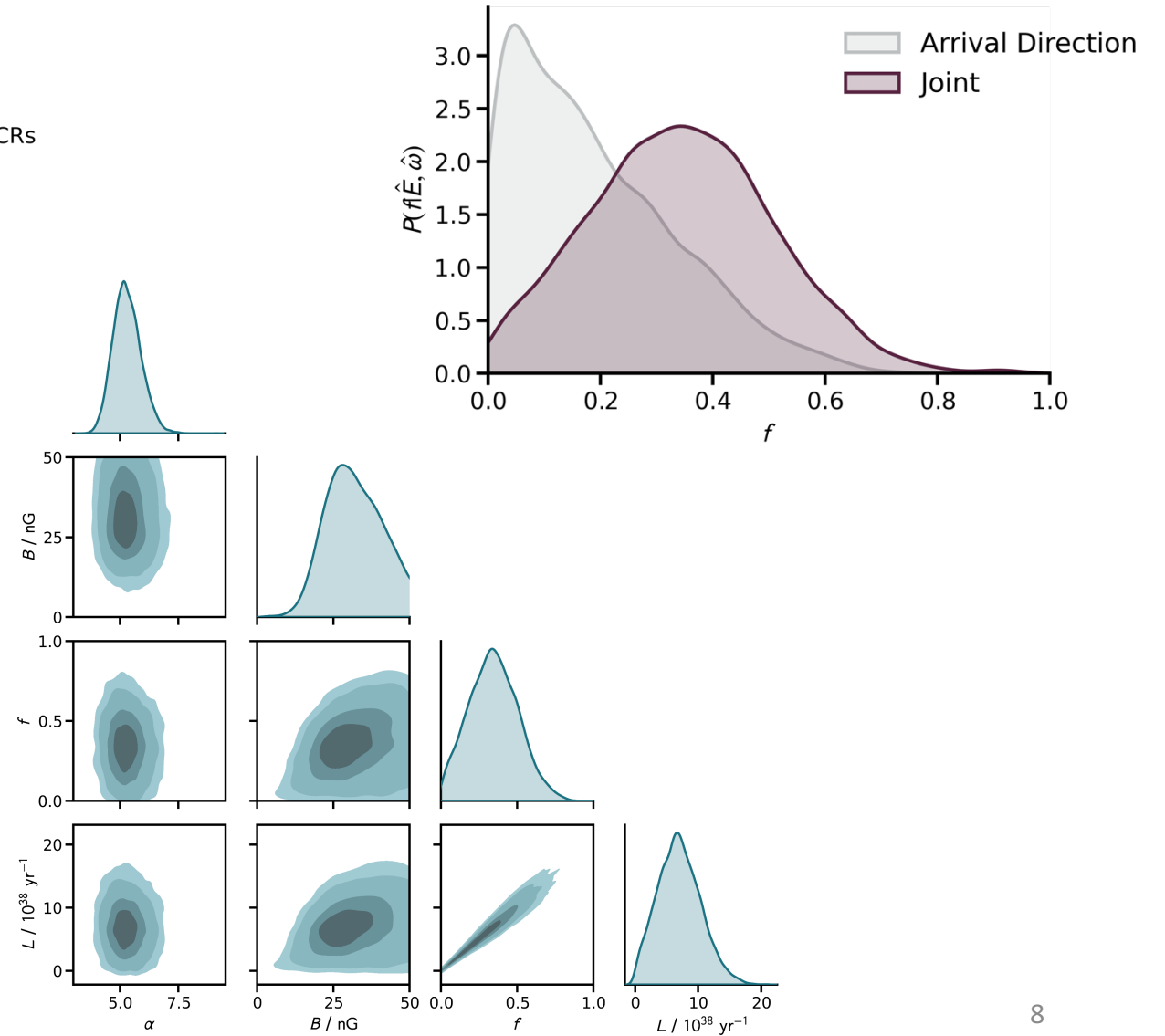
- Watson+2012
- Soiaporn+2013
- Khanin+2016

Current results for TA sky and “Auger” starburst catalog

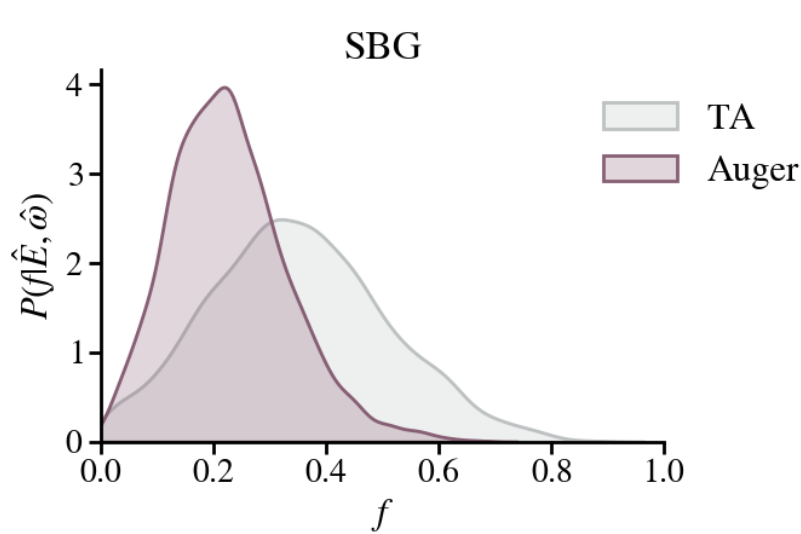


Top-3 sources (>10%)

1. M82 (3.5 Mpc)
2. IC342 (3.3 Mpc)
3. NGC6946 (7.7 Mpc)



One of the current results show that in TA more sources should be “visible” (gray bands)

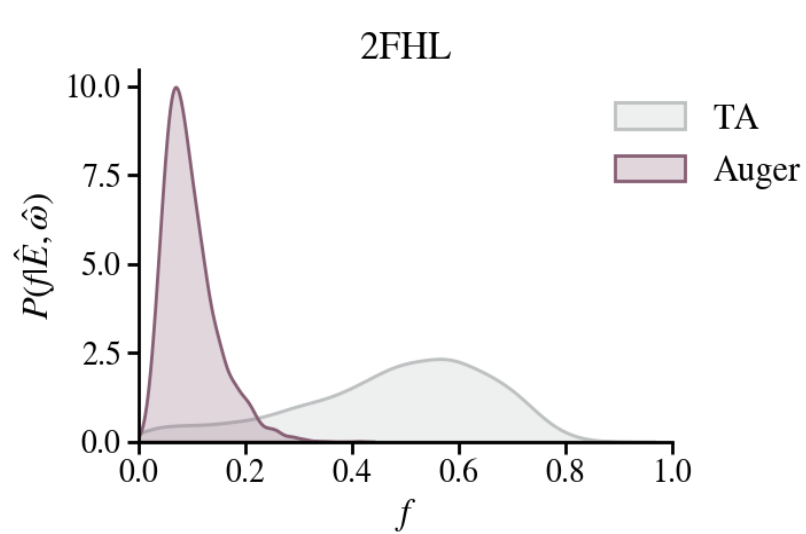


Top-3 TA

1. M82 (3.5 Mpc)
2. IC342 (3.3 Mpc)
3. NGC6946 (7.7 Mpc)

Top-3 Auger

1. NGC253 (3.5 Mpc)
2. NGC4945 (3.6 Mpc)
3. M83 (4.5 Mpc)

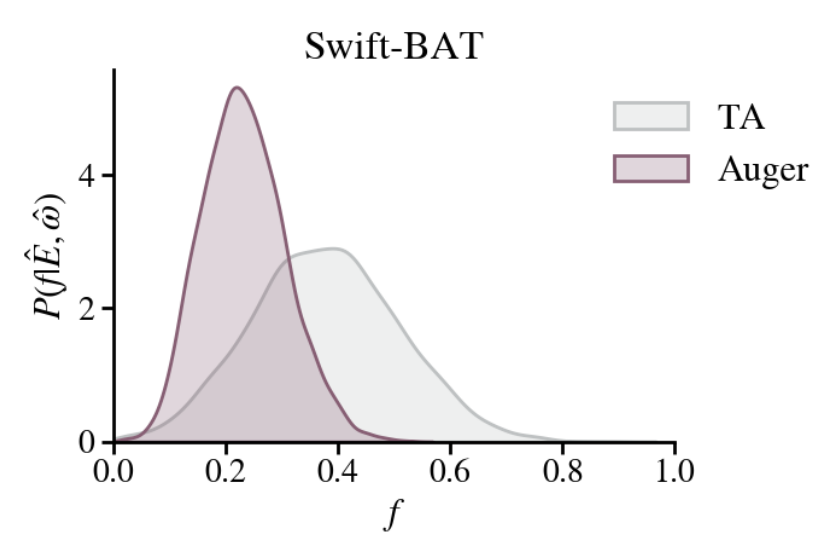


Top-3 TA

1. M87 (16.4 Mpc)
2. Centaurus A (3-5 Mpc)

Top-3 Auger

1. Centaurus A (3-5 Mpc)



Top-3 TA

1. NGC4395 (4.2 Mpc)
2. M106 (7 Mpc)

Top-3 Auger

1. Circinus (4.3 Mpc)
2. Centaurus A (3.5 Mpc)
3. NGC4945 (3.6 Mpc)

Project status and summary

1. Project somewhat delayed:

- Keito and Francesca could not come to Japan because the borders were closed until Oct 2022 and prices increased shortly after
- Finding a semi-analytical energy loss parameterization for nuclei was a challenge and it we recently (~1 month ago found a solution)
- I could visit ICRR and collaborate with Sagawa-sensei due to close distance to Taiwan
- **Everything in place to complete the project around ICRC 2023**

2. (Tentitatively) **Invited Keito and Francesca to ICRR** who both will come to the ICRC, so the **proposed mini-workshop** including other TA members and students can be conducted around this time

3. I will continue to collaborate with Sagawa-sensei beyond at the end of FY2022, who continues as Senior Fellow. Also, I will continue collaborating with Ogio-sensei and Sako-sensei on other topics regarding the data analysis methods