



cherenkov  
telescope  
array

# IRFs for High-energy Astrophysics

In the context of the CTAO Data Model

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for the CTAO Data Model Group

IVOA HEIG meeting, online 2023-10-18

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# Event-counting instruments



"Events" here are detections of a single photon or background particle

≈ 10,000 / s for CTAO! (gammas + background) in the raw data

Measure many *reconstructed* properties per event:

▶ Physical:

- Position on the sky (RA/Dec, Alt/Az)
- Energy
- Arrival Time
- + uncertainty estimates on these

▶ Optional Instrumental / Shower physics

- telescope multiplicity
- Impact parameter w.r.t. telescopes
- Height of Shower-maximum
- Width of shower (Molière radius)
- "Gammaness" (probability to be signal)
- Quality of reconstruction

CTAO DL3 Data Model Specification, v1b

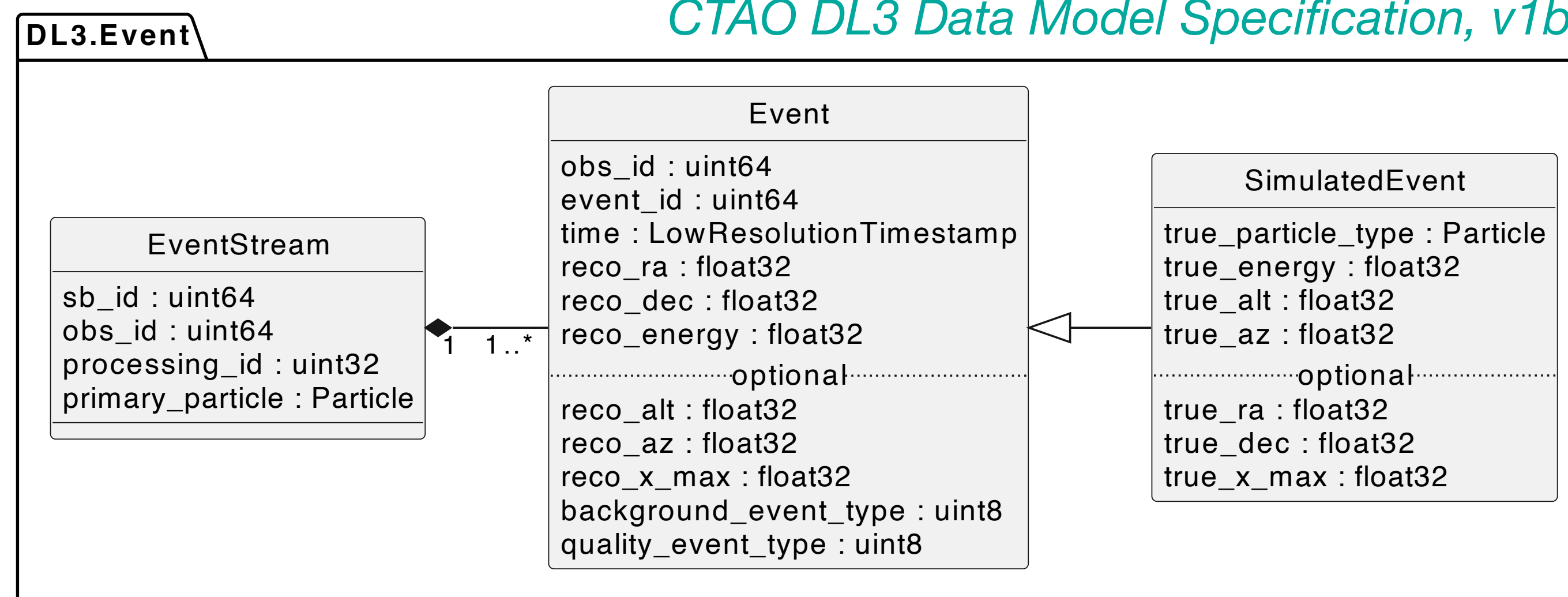


Figure 2.2 – UML Diagram of the DL3/Event Data Model.

# Event-lists *not* Photon-lists!

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(and also Water Cherenkov Telescopes):**

- ▶ **Strong irreducible background from mis-reconstructed cosmic rays**
- ▶ **Mostly isotropic (except for instrumental effects)**

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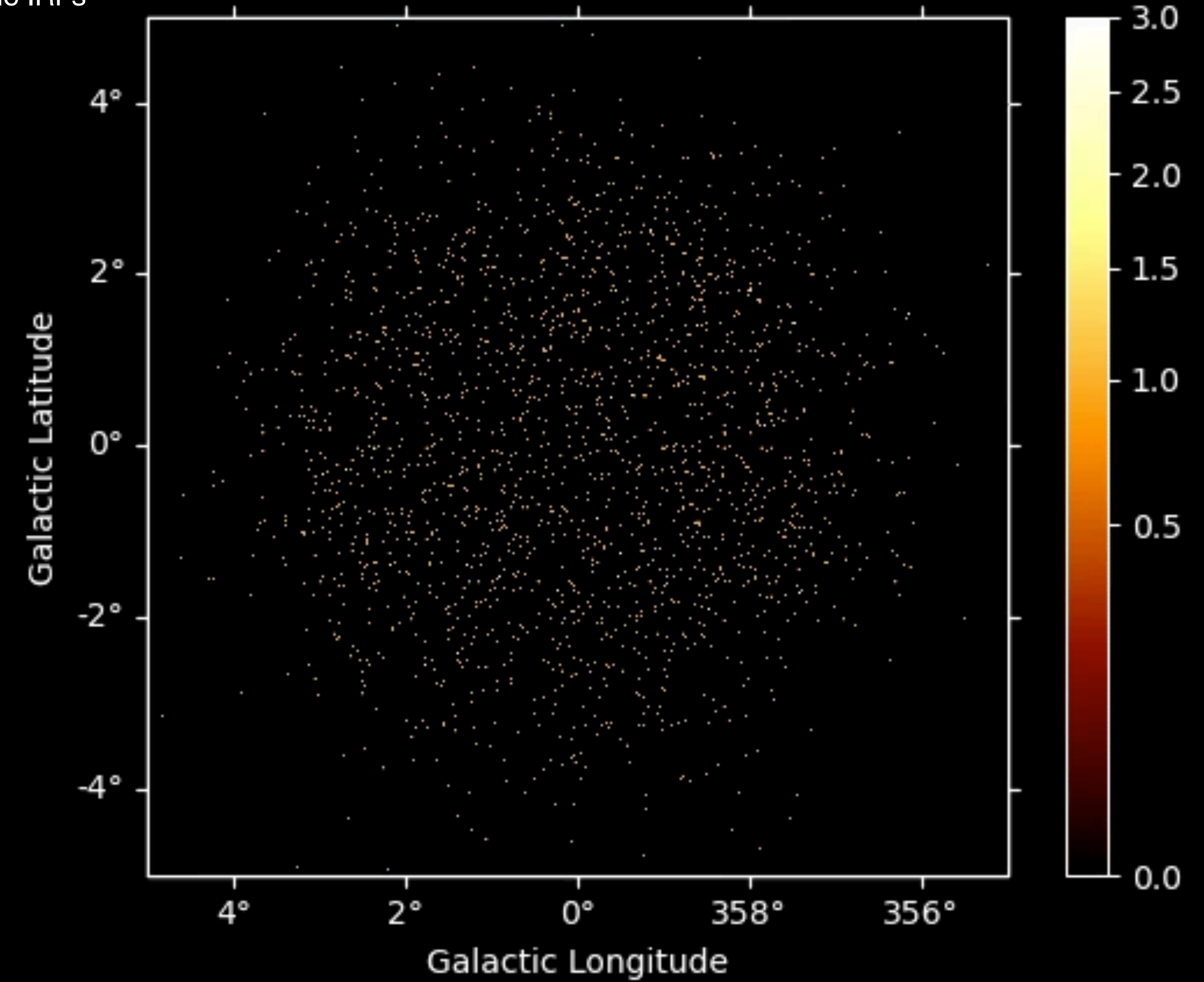
## Photons are only statistical!

- ▶ Can compute "**Excess photon-like events**" within a **region** of space/time/energy.
- ▶ Background model is needed (or off-source measurement in some cases)
- ▶ Can **never** say if an individual event is a photon or not.

**A mostly blank field of view...  
(simulated)**

observation time: 0.1 hours

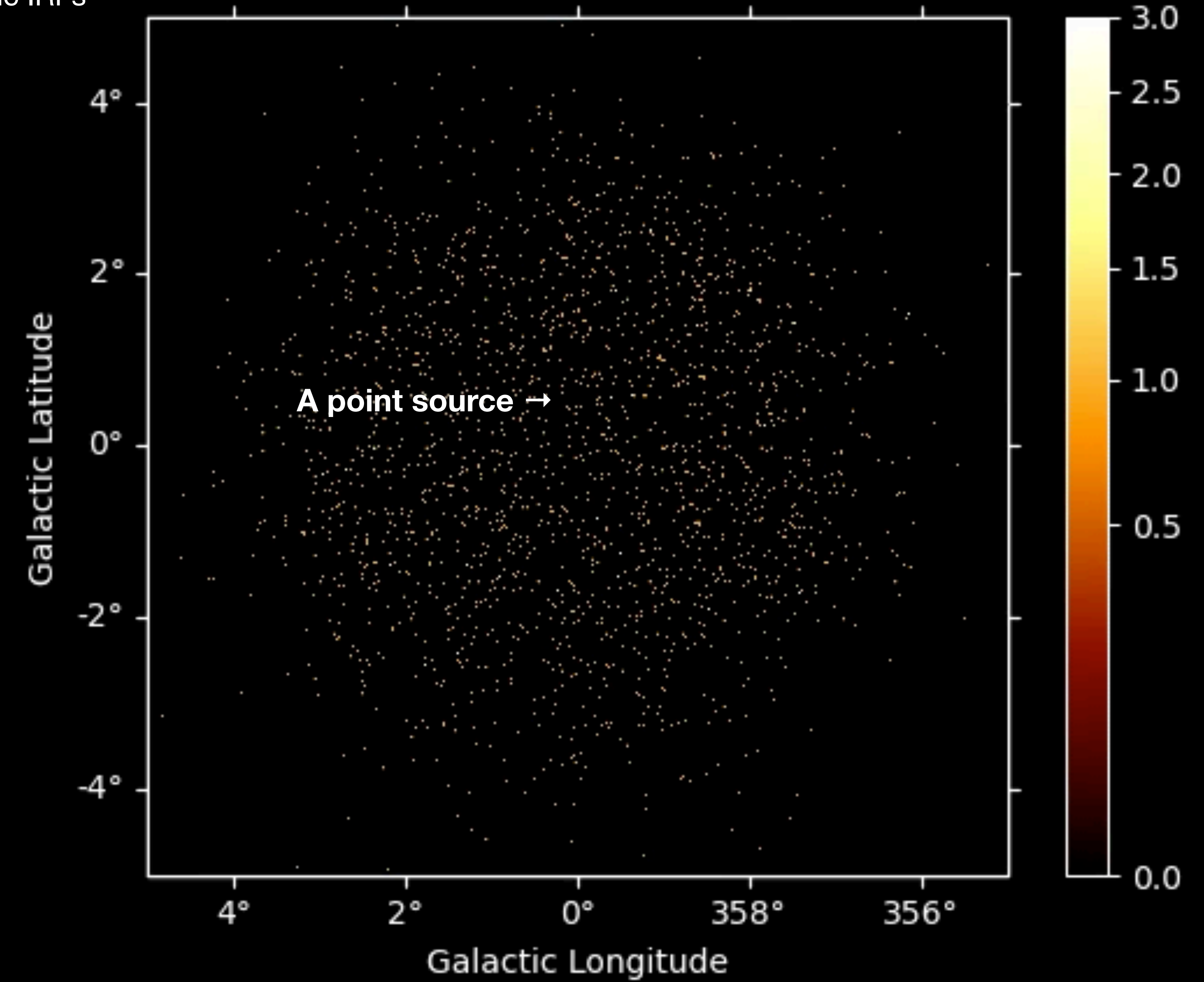
CTA-South public IRFs



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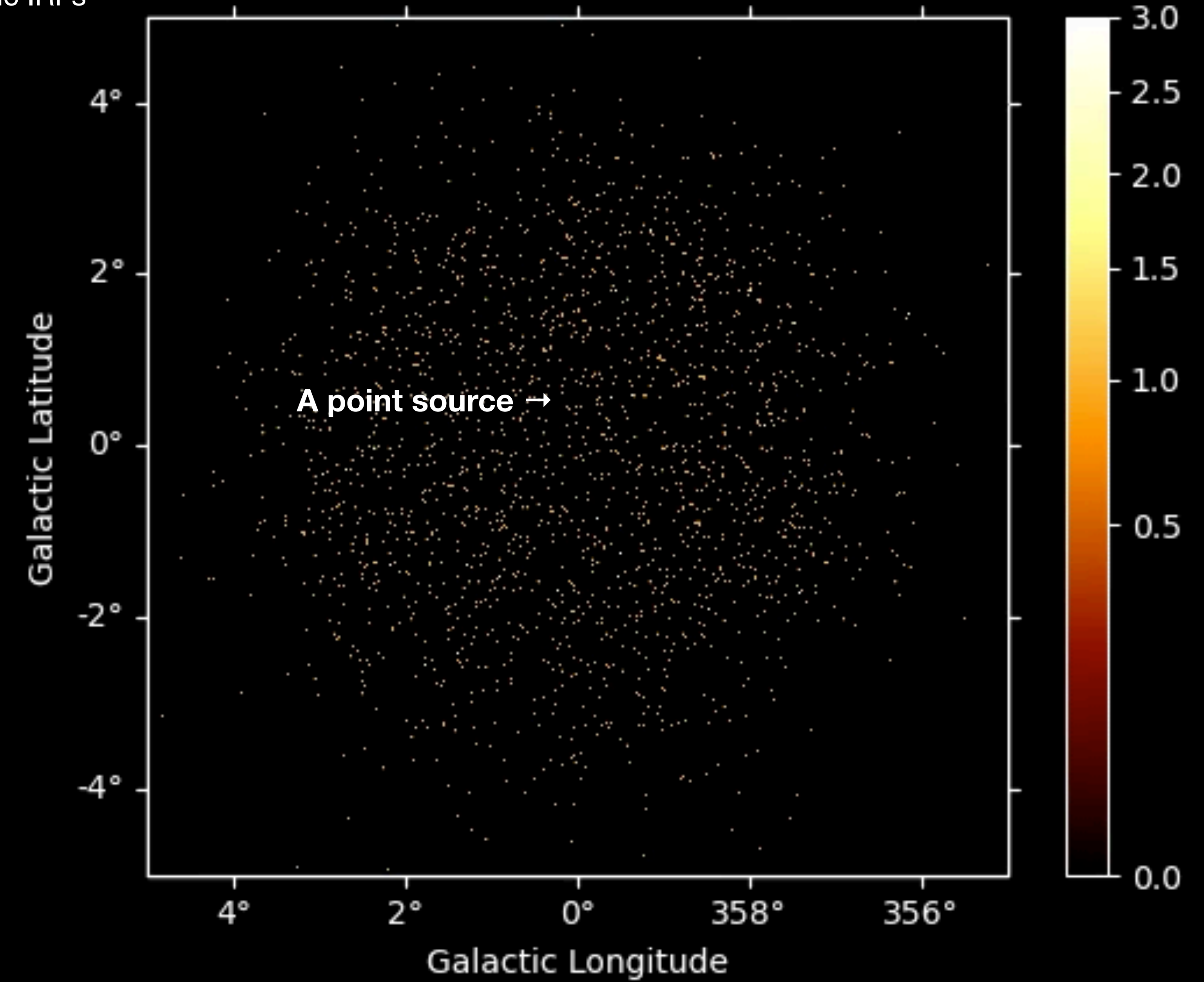




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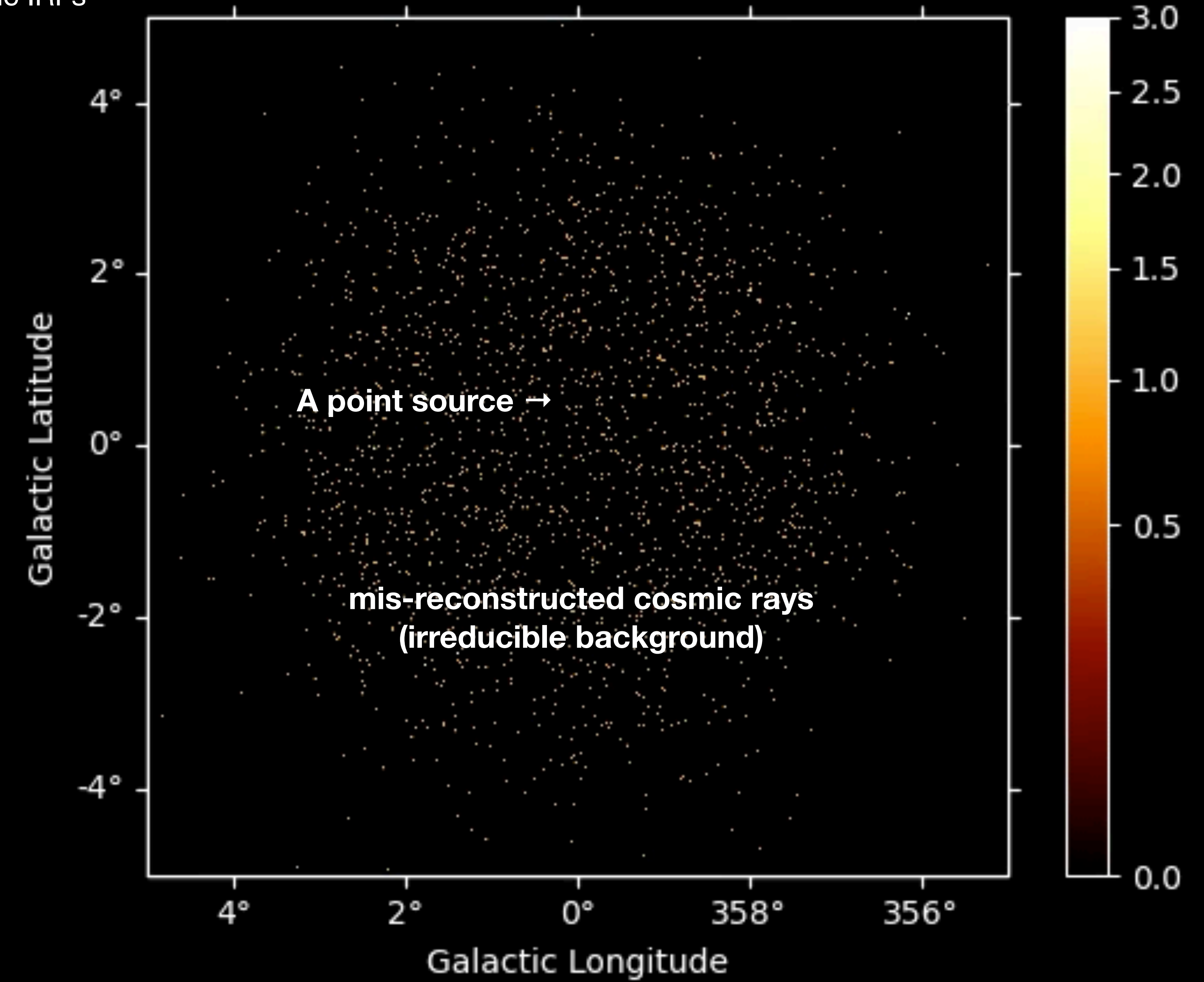
CTA-South public IRFs



**A mostly blank field of view...  
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observation time: 0.1 hours

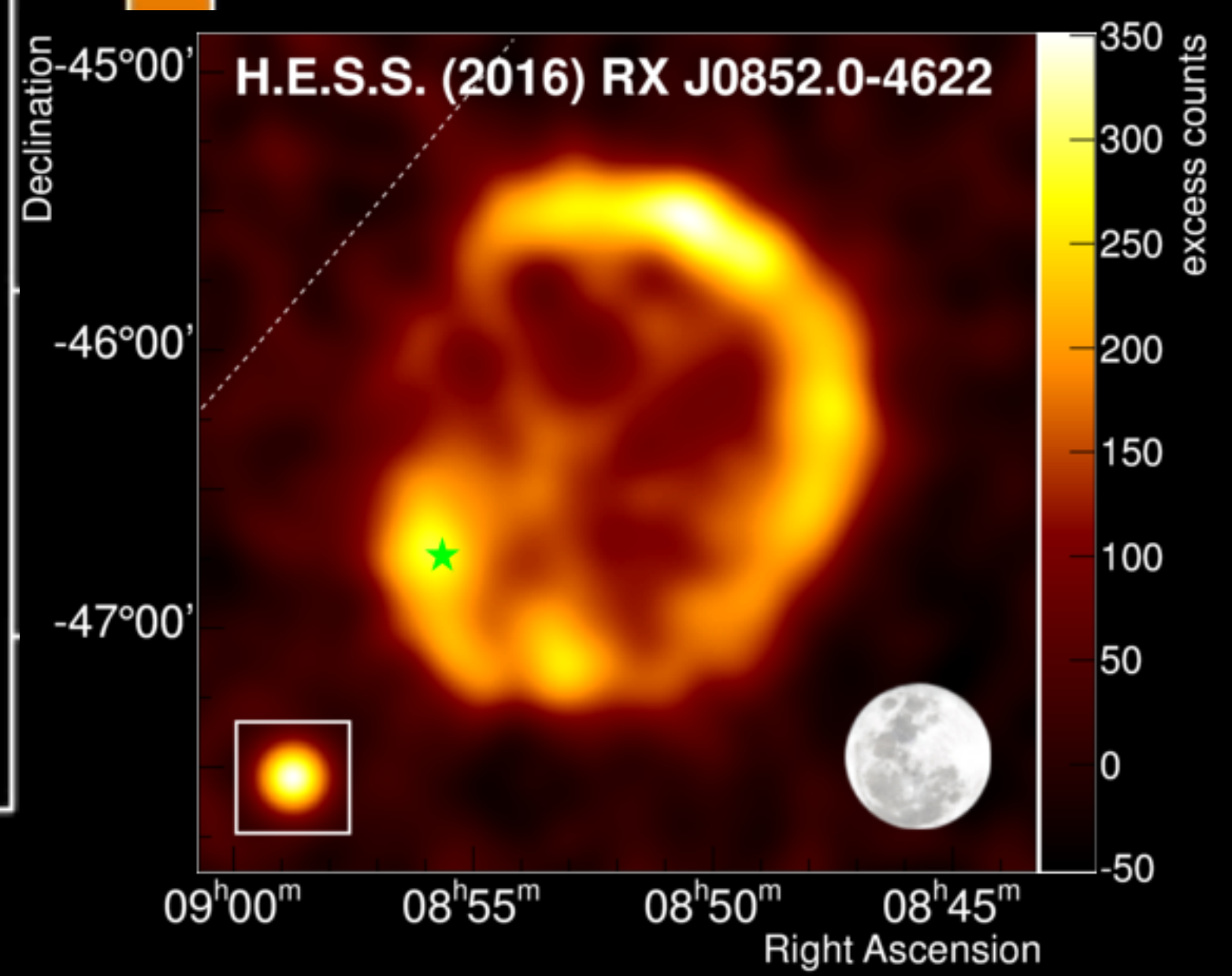
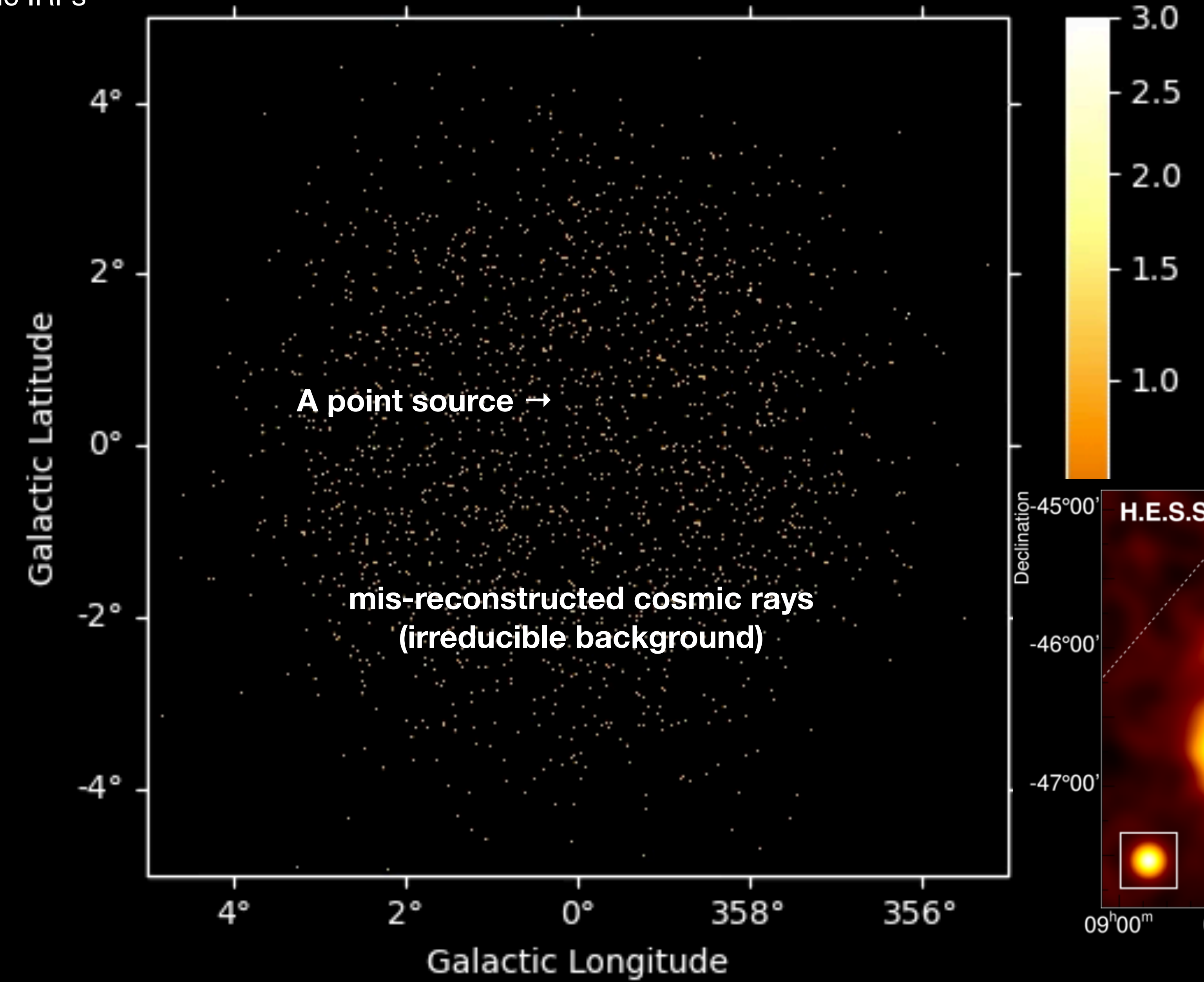
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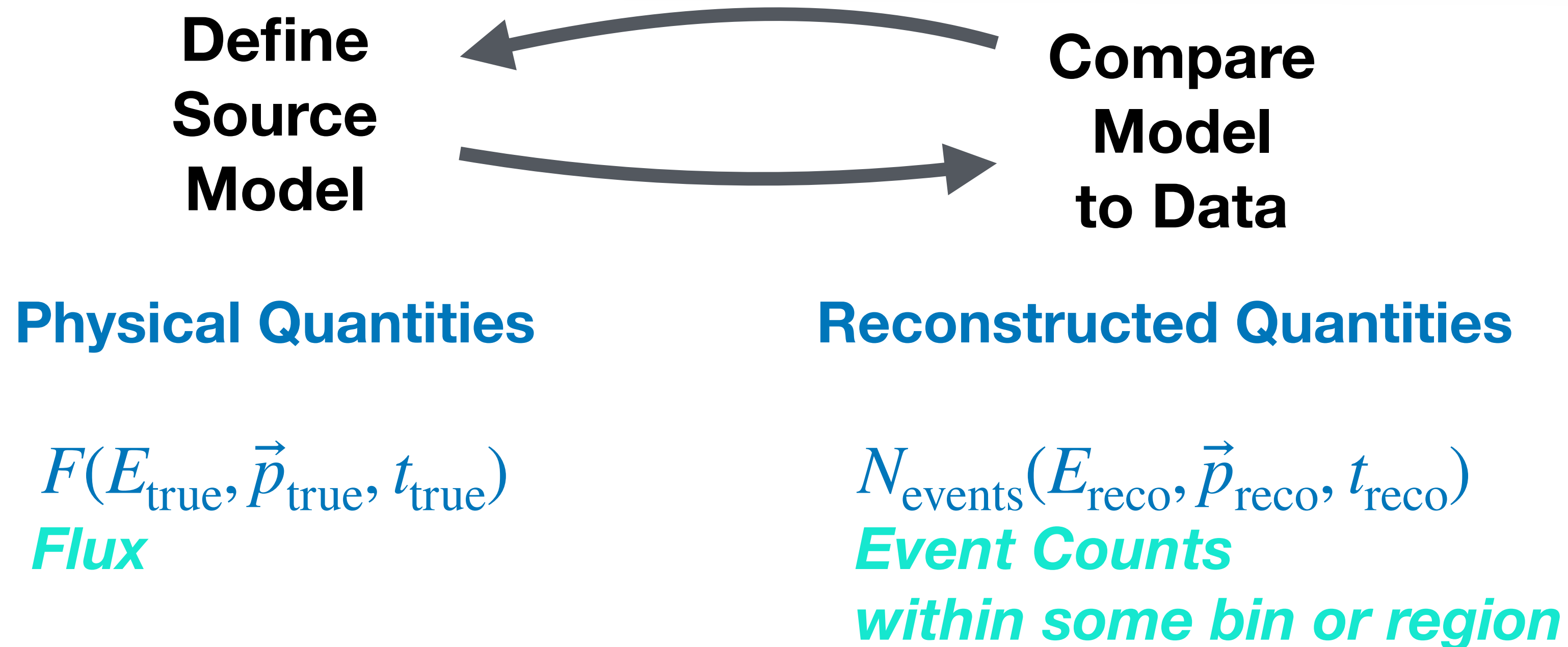
observation time: 0.1 hours

CTA-South public IRFs



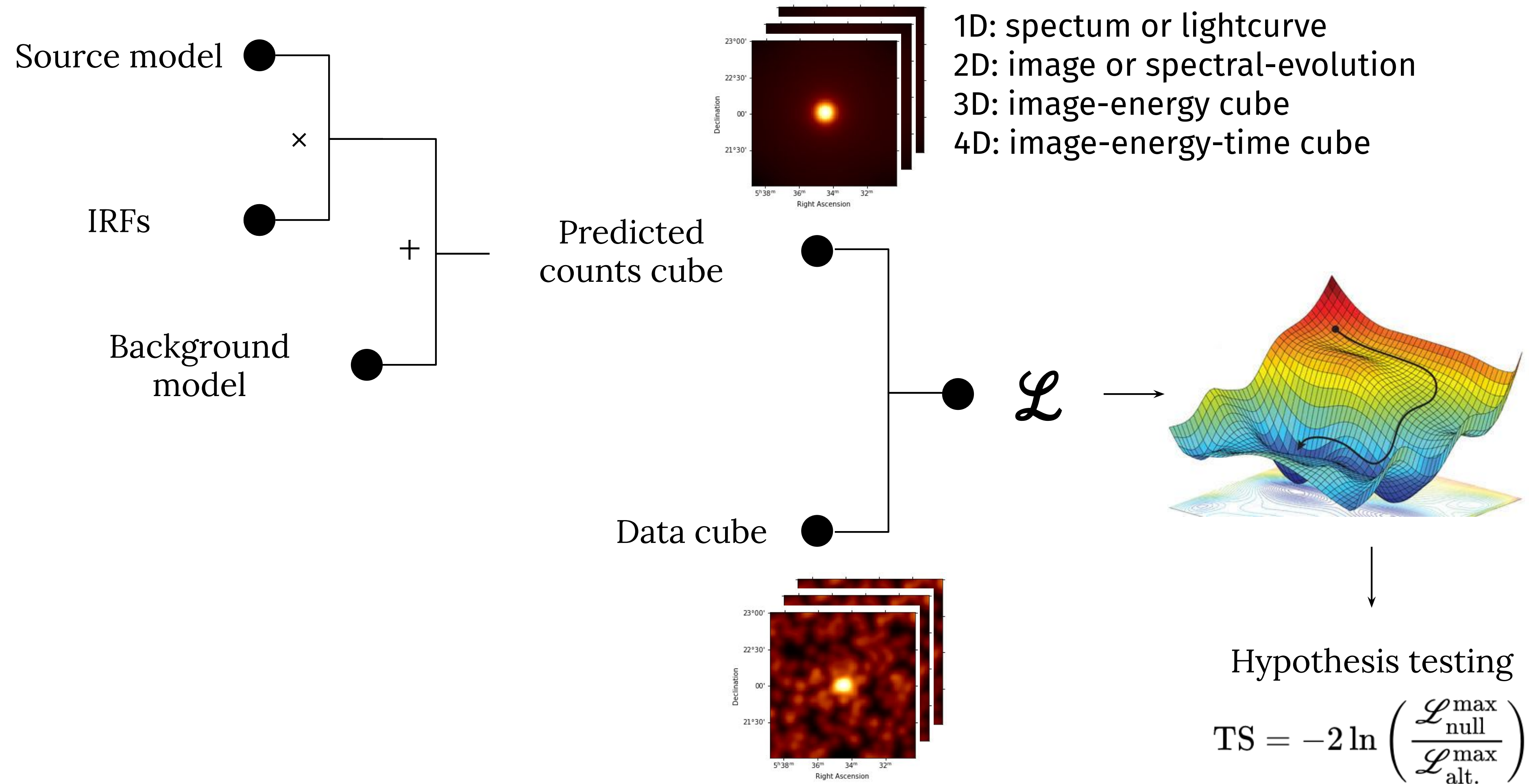
# What we *really* want:

To make a **hypothesis** about the gamma-ray emission in a region of the sky and to **test that hypothesis**.

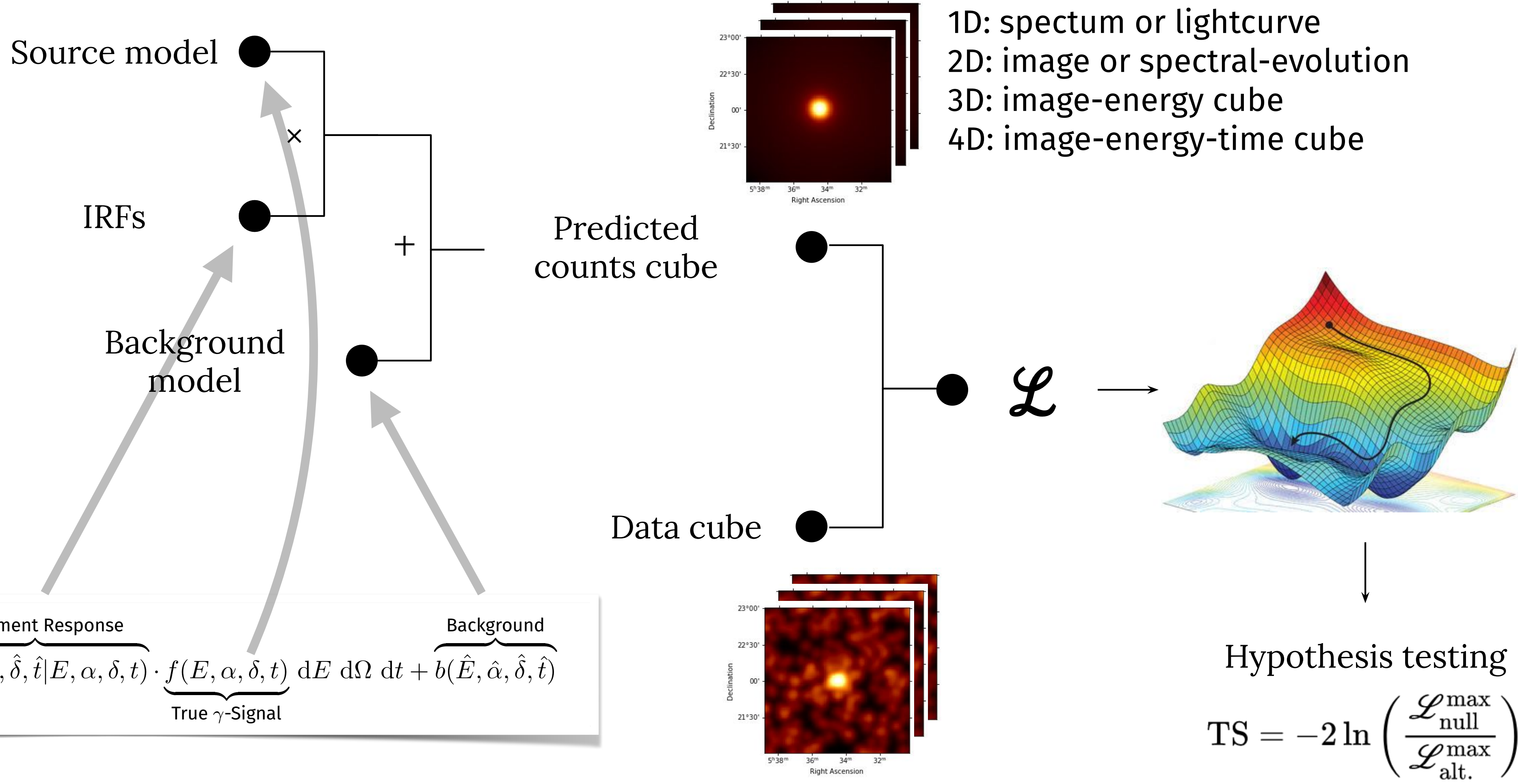


**We are missing one piece of information:**  
*how to go between true and measured (reconstructed) quantities?*

# Forward-Folded Analysis



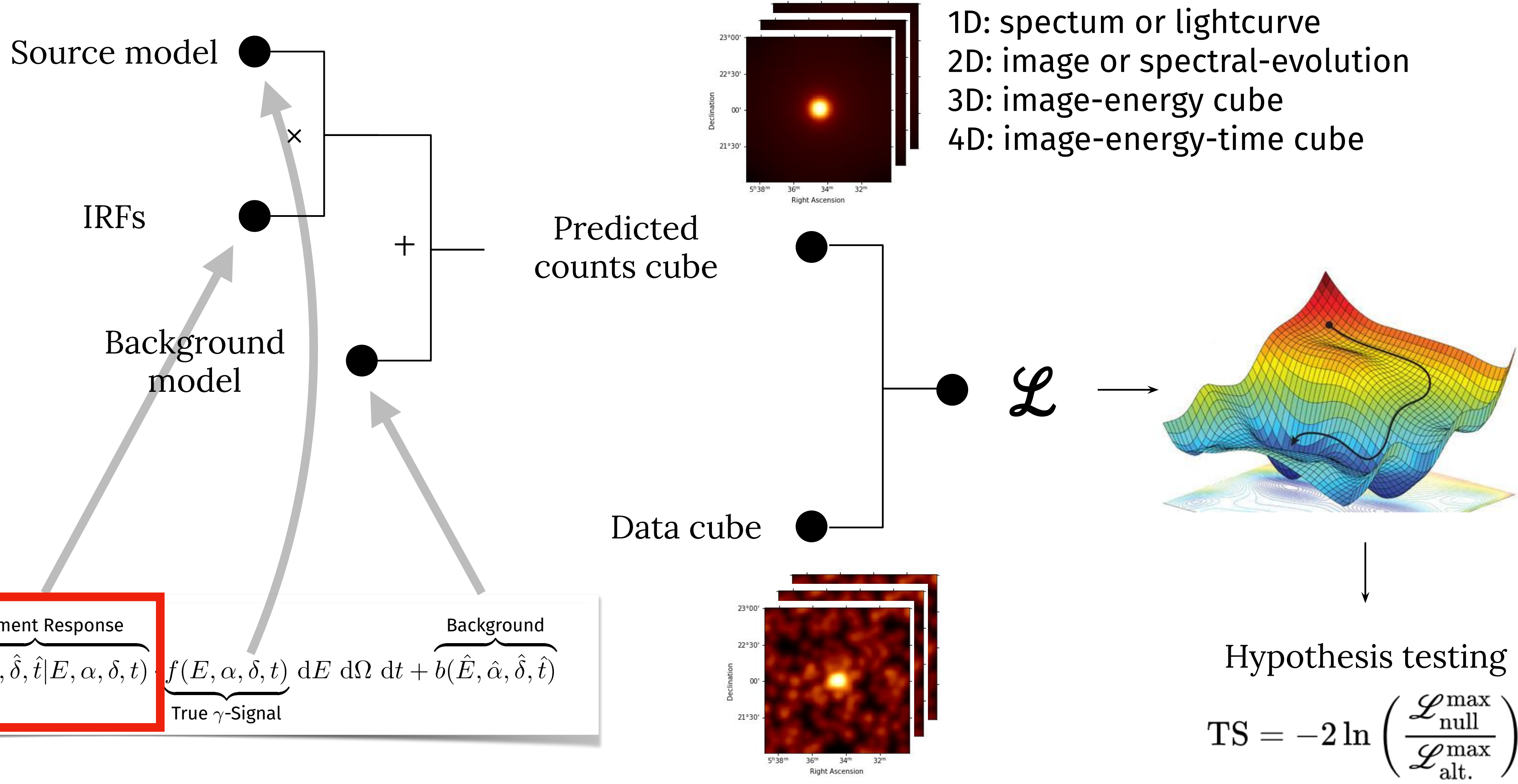
# Forward-Folded Analysis



$$g(\hat{E}, \hat{\alpha}, \hat{\delta}, \hat{t}) = \underbrace{\int \int \int R(\hat{E}, \hat{\alpha}, \hat{\delta}, \hat{t} | E, \alpha, \delta, t)}_{\text{Instrument Response}} \cdot \underbrace{f(E, \alpha, \delta, t)}_{\text{True } \gamma\text{-Signal}} dE d\Omega dt + \underbrace{b(\hat{E}, \hat{\alpha}, \hat{\delta}, \hat{t})}_{\text{Background}}$$

Observed distribution

# Forward-Folded Analysis



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Observed distribution

# Instrumental Response Decomposition



$$R(\hat{E}, \hat{\alpha}, \hat{\delta} | E, \alpha, \delta, t) = \underbrace{A_{\text{eff}}(E, \alpha, \delta, t)}_{\text{Effective Area}} \cdot \underbrace{M(\hat{E} | E, \alpha, \delta, t)}_{\text{Energy Migration}} \cdot \underbrace{\text{PSF}(\hat{\alpha}, \hat{\delta} | E, \alpha, \delta, t)}_{\text{Point Spread Function}}.$$

**+ cross terms!**  
Currently not treated

**Treat components independently:**

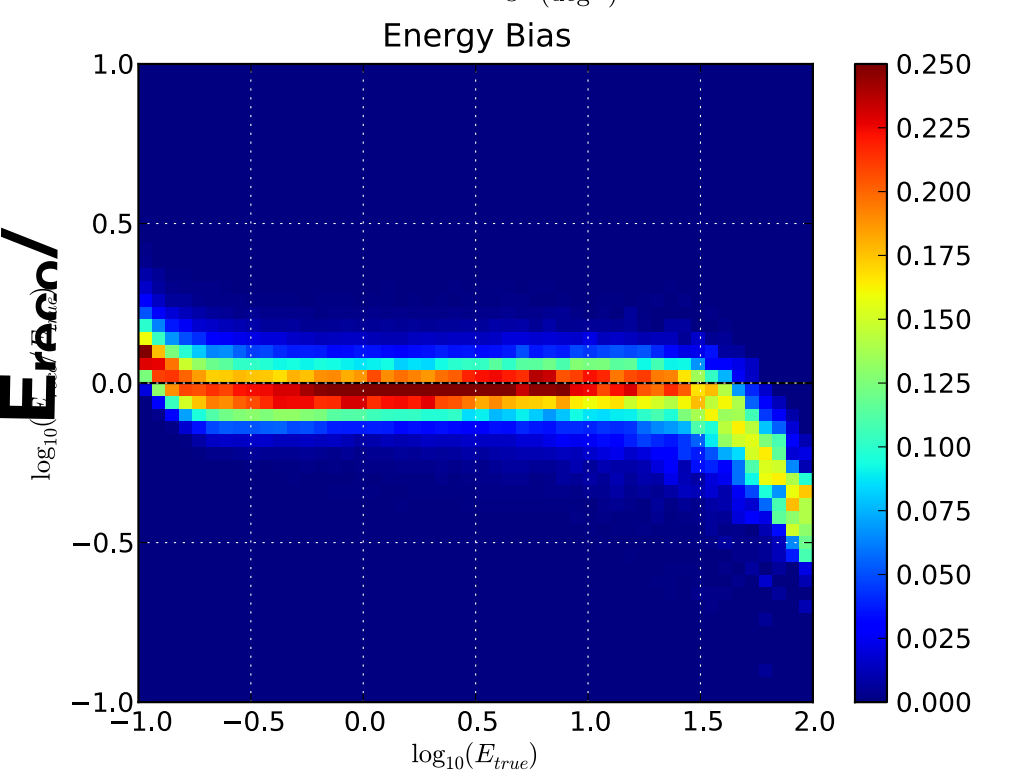
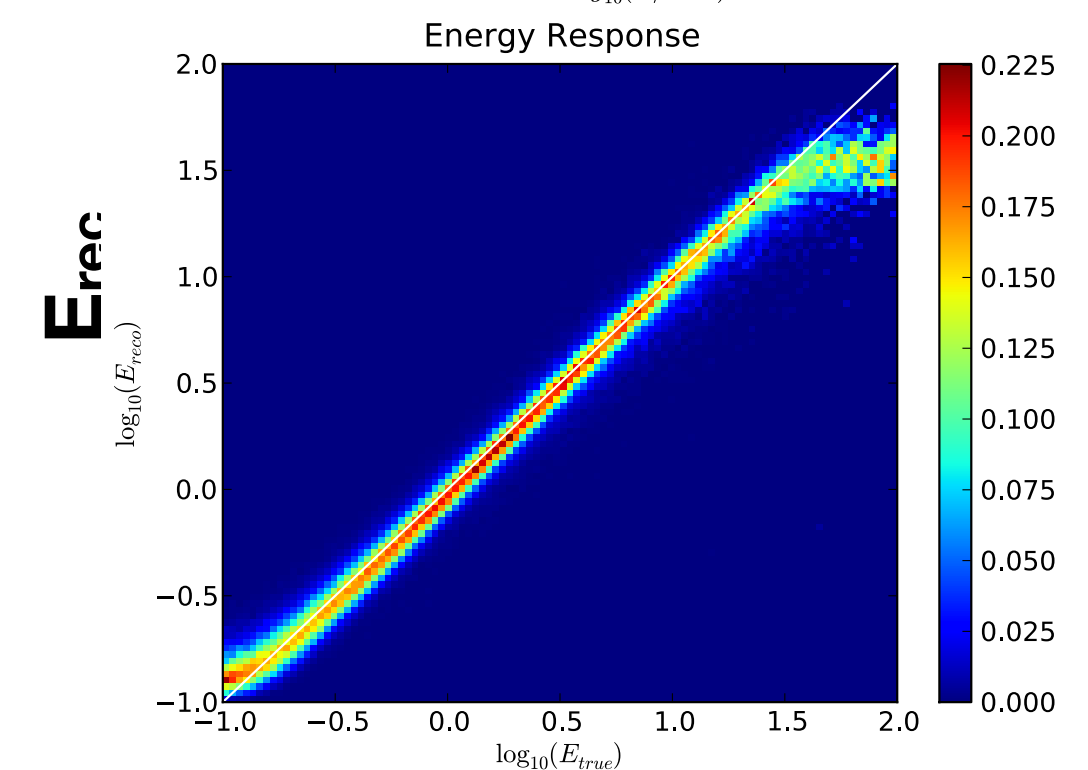
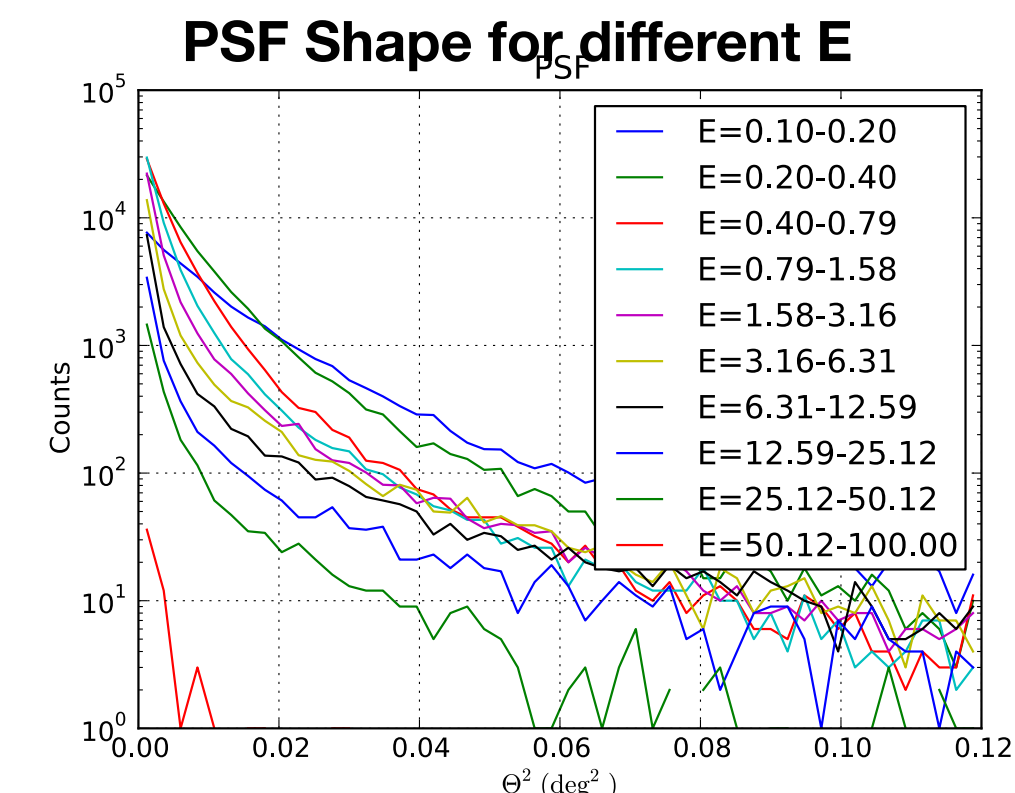
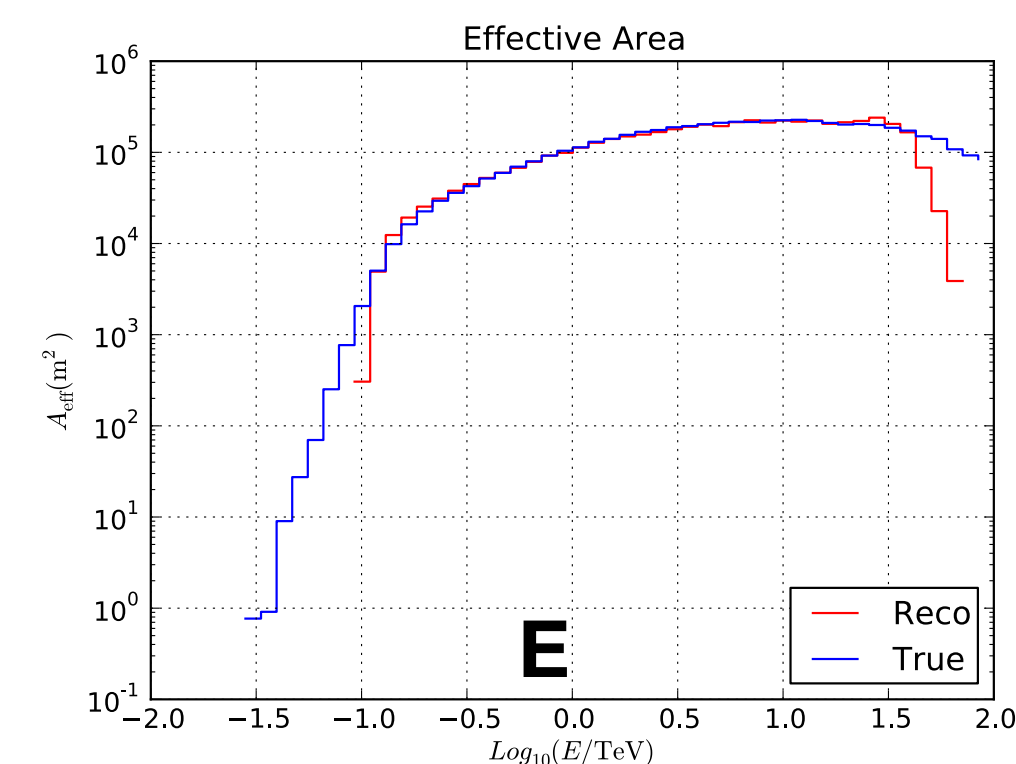
- ▶ **Effective Collection Area ( $A_{\text{eff}}$ ):** combines optical effective area and efficiency of detection of photons

$$A_{\text{eff}} = \frac{N_{\text{det}}}{N_{\text{sim}}} A_{\text{sim}}$$

- ▶ **Point-Spread function (PSF):** probability of reconstructing event at position  $\mathbf{p}'$  given true position  $\mathbf{p}$  and true energy  $E$ .

- ▶ **Energy Dispersion/Migration ( $E_{\text{disp}}$ ):** Probability of reconstructing energy  $E'$  given true energy  $E$

- ▶ **Background Rate:** rate of expected background at reconstructed position  $P'$  and reconstructed energy  $E'$





# Examples

Outputs from gammapy

## Event List

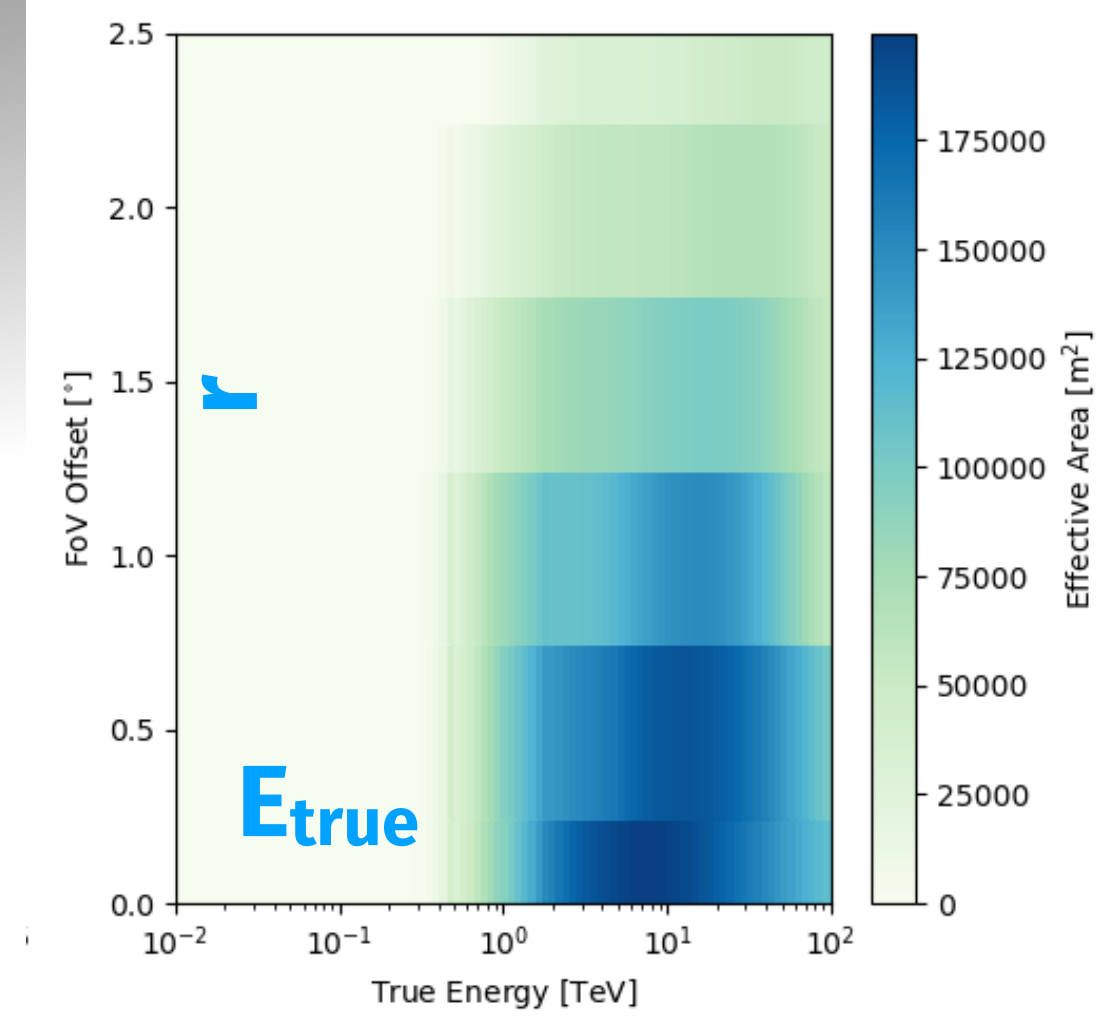
```
[5]: tab = Table.read('hess_events_005500.fits.gz')
```

```
[6]: tab
```

```
[6]: Table length=499
```

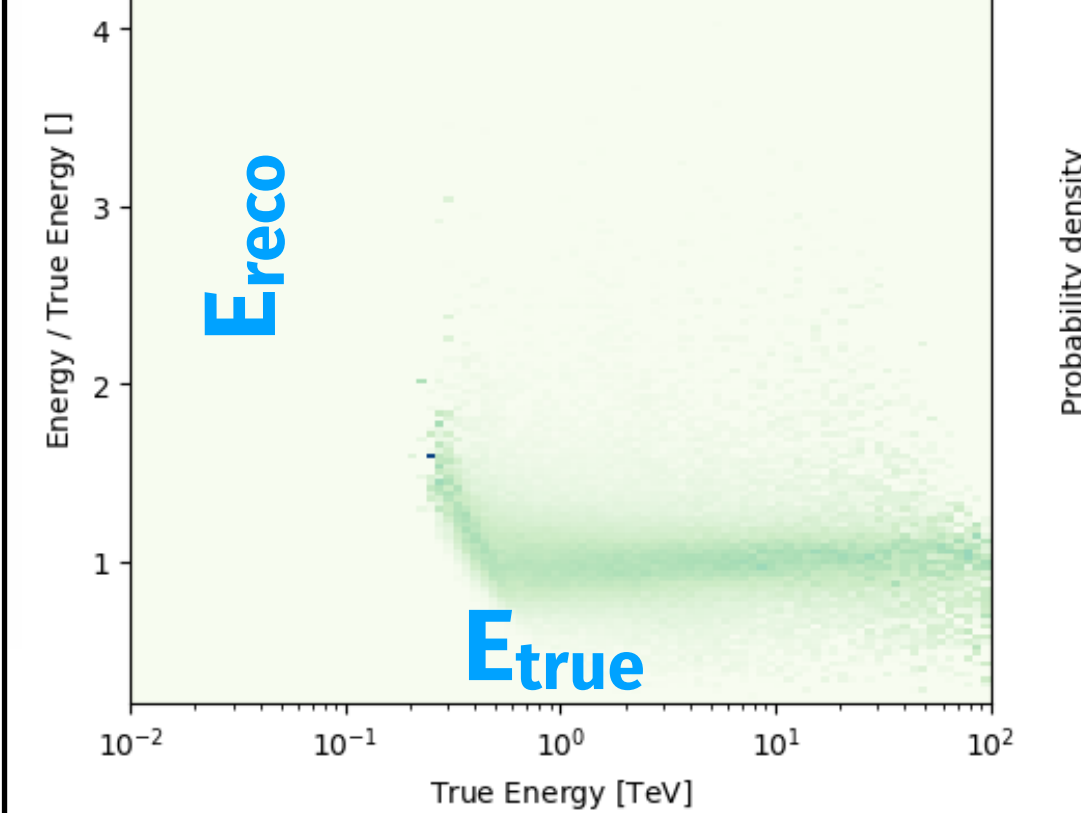
EVENT_ID	OBS_ID	TIME	MULTIP	RA	DEC	DIR_ERR	SKYX_RADEC	SKYY_RADEC
		s		deg	deg	deg	deg	deg
int64	uint32	float64	int16	float32	float32	float32	float32	float32
24189255811677	85356	392695107.16595197	3	329.76013	-28.378927	0.0	-0.8467294	0.03804477
24193550778756	85356	392695109.406718	2	329.7613	-28.11467	0.0	-1.1110648	0.03915714
24197845746261	85356	392695114.1640556	2	329.71042	-28.54954	0.0	-0.6760932	-0.0056832614
24202140713433	85356	392695117.68513155	2	329.14612	-26.46658	0.0	-2.7600195	-0.5115584
24206435680287	85356	392695119.8251052	2	330.07318	-30.546444	0.0	1.3215607	0.30692154
24210730647732	85356	392695124.4254937	2	331.64767	-29.174904	0.0	-0.03684649	1.6862341
24215025615341	85356	392695129.84283924	2	328.74268	-28.294678	0.0	-0.927548	-0.85798883
24215025615494	85356	392695130.539845	2	330.48044	-27.899296	0.0	-1.3244383	0.6749976
24215025615622	85356	392695131.2239411	3	327.54605	-29.050547	0.0	-0.15758944	-1.8983405

## Effective Area

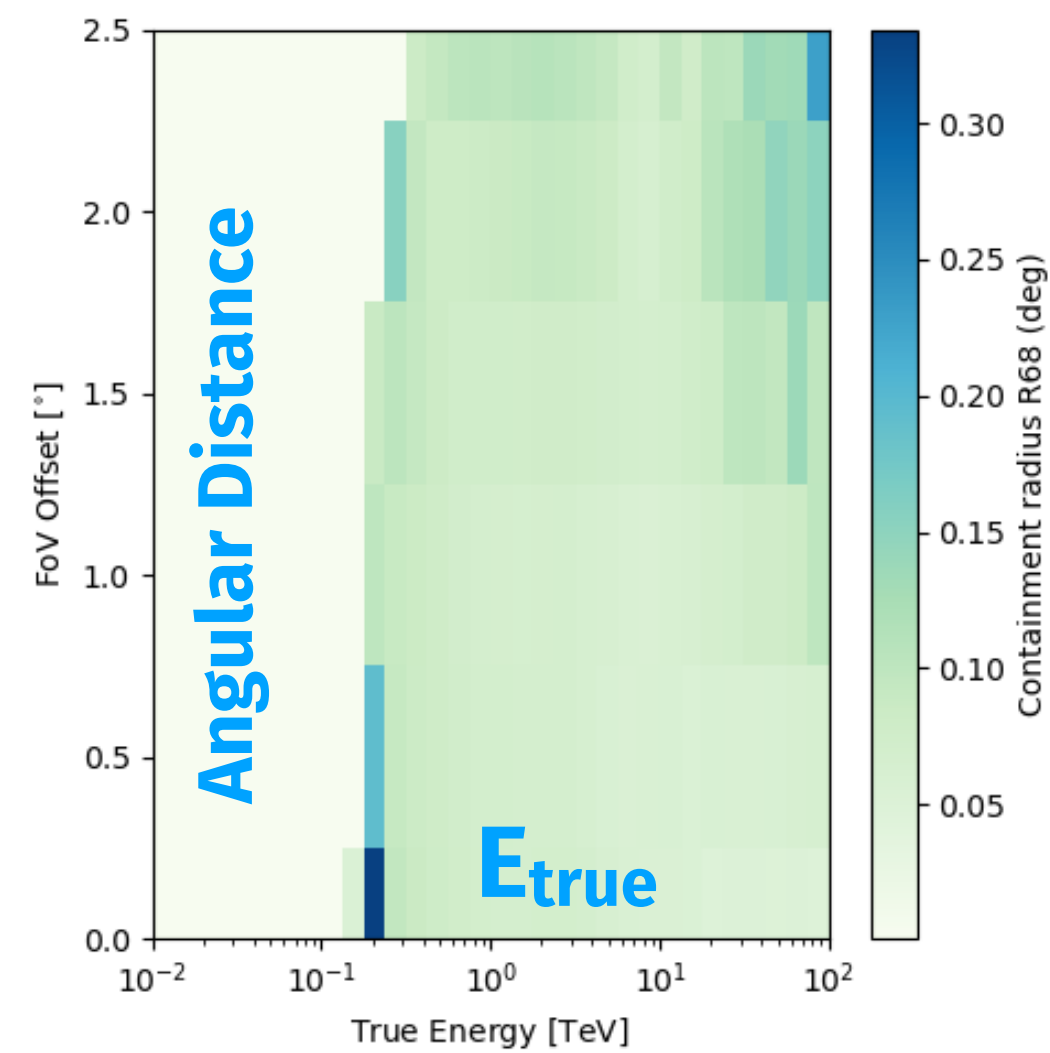


## Energy Dispersion

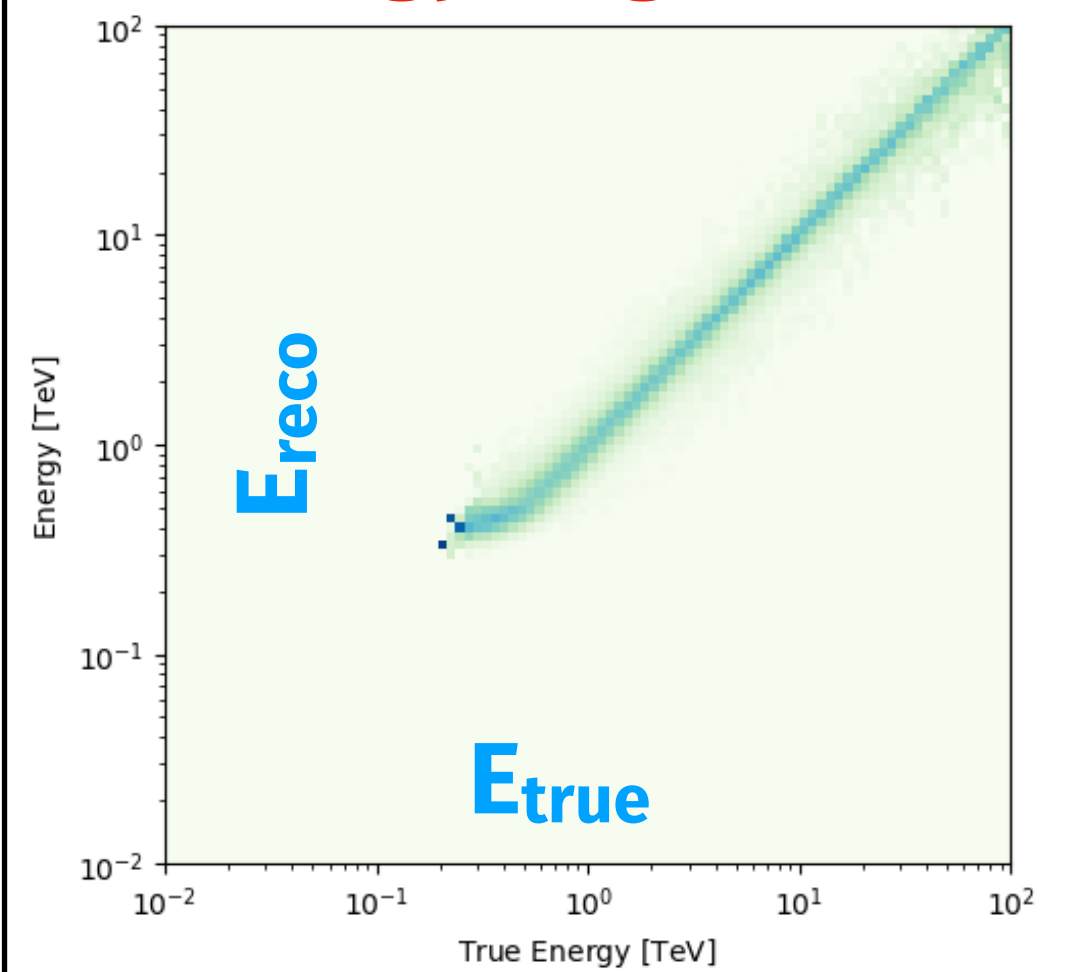
(energy migration in a different representation)



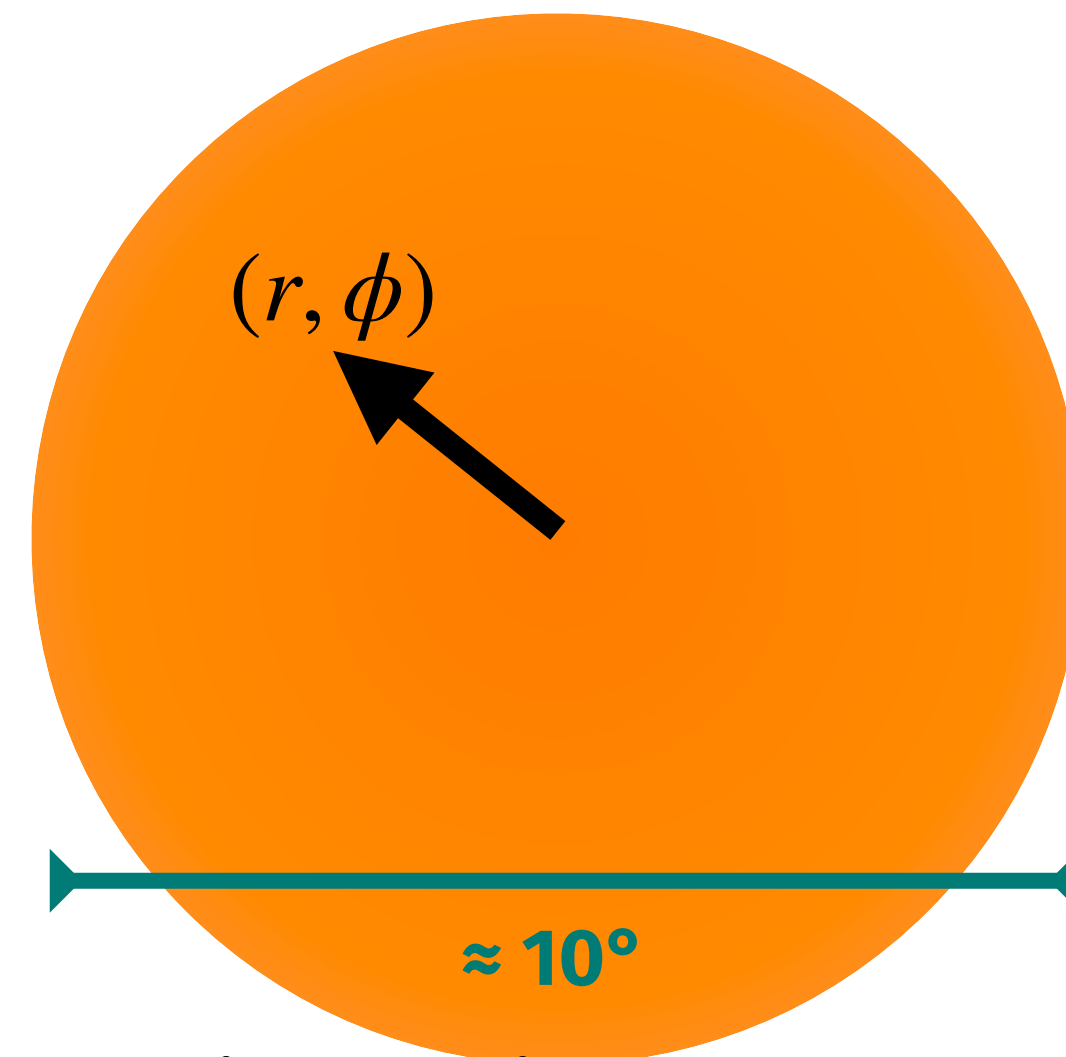
## Point-Spread



## Energy Migration



# IRF Dimensionality



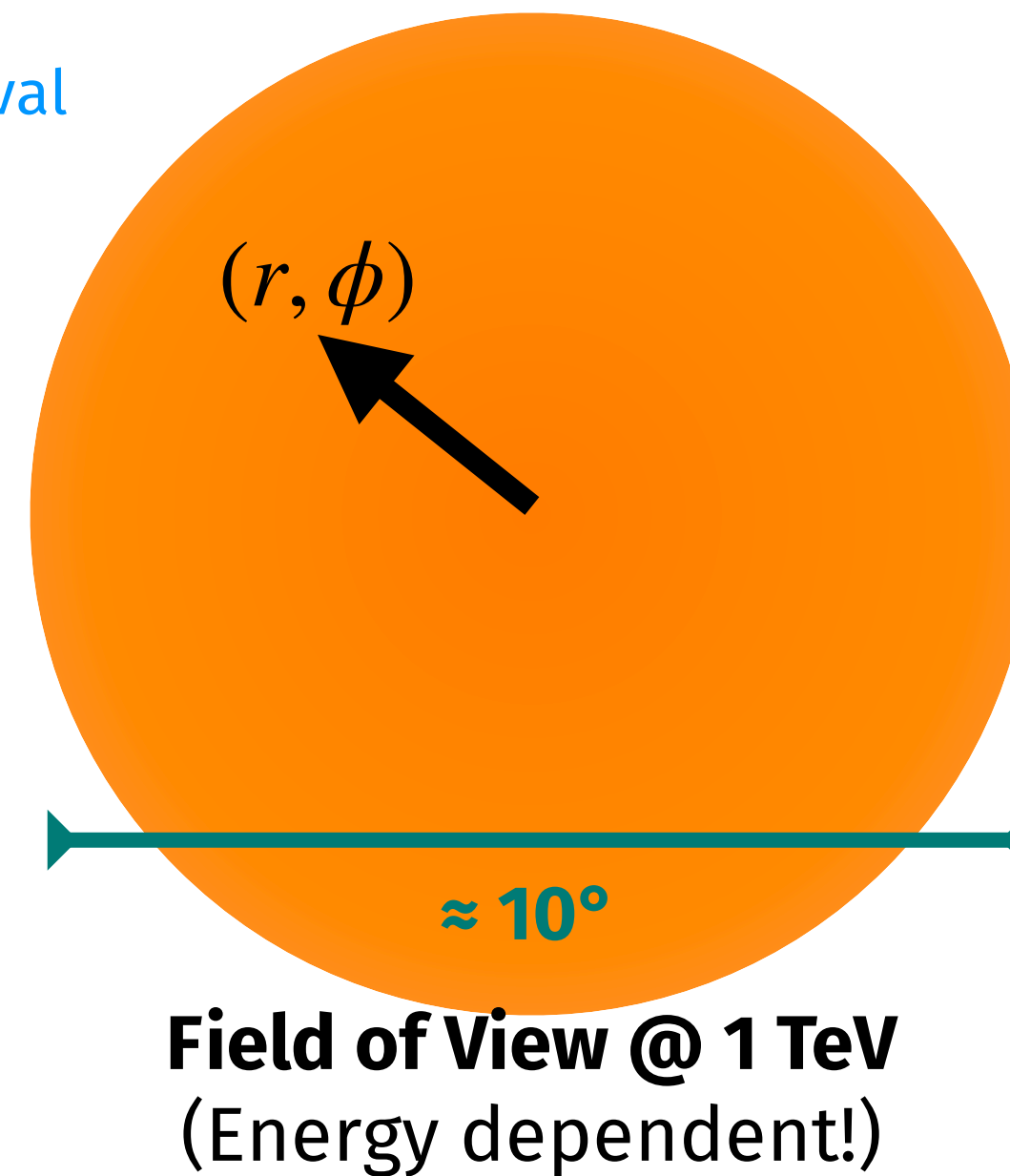
**Field of View @ 1 TeV**  
(Energy dependent!)

# IRF Dimensionality



## Internal Dimensionality (3D):

- ▶ **Position** in Field-of-View ( $r, \phi$ )
- ▶ **Energy** → large differences! even for FOV!
- ▶ **Time** → Usually taken into account by using 1 IRF per short time interval



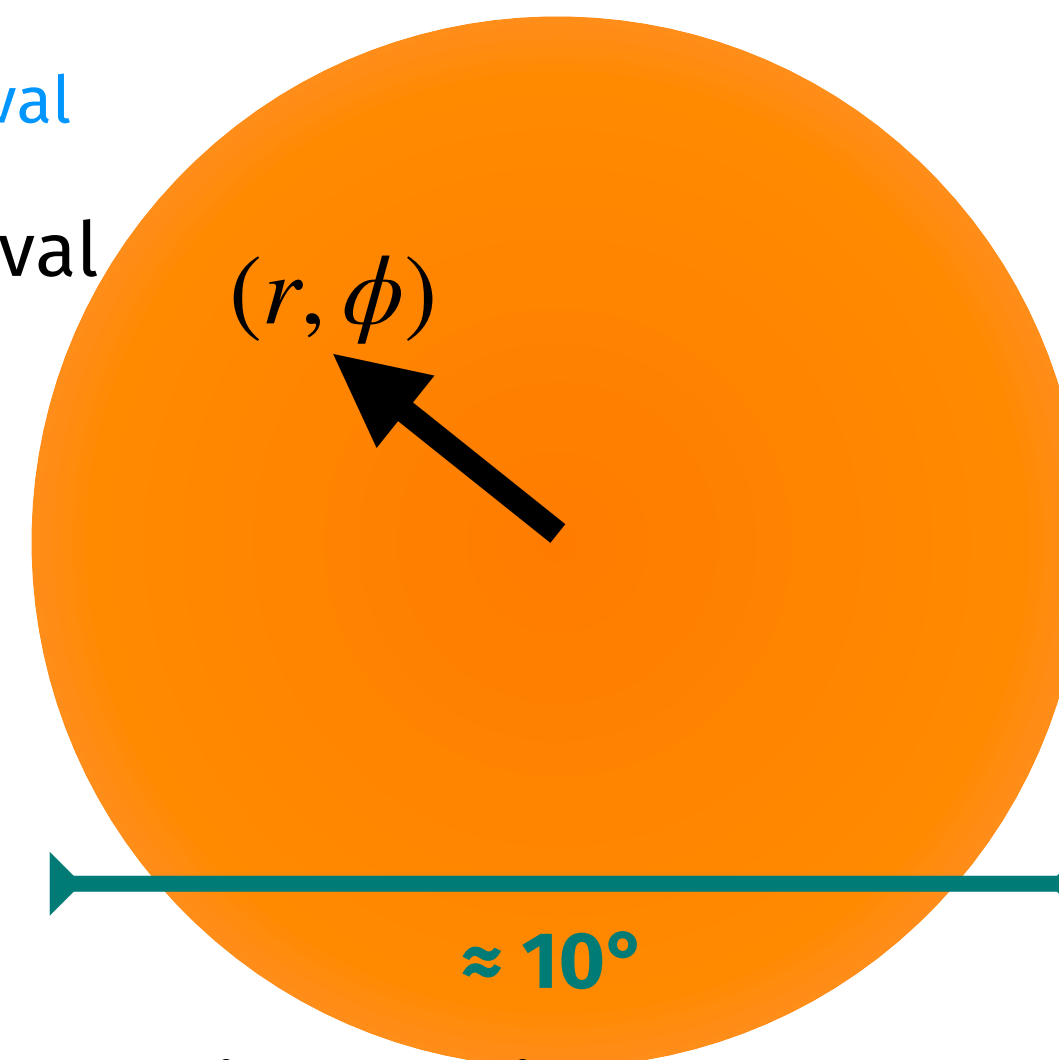
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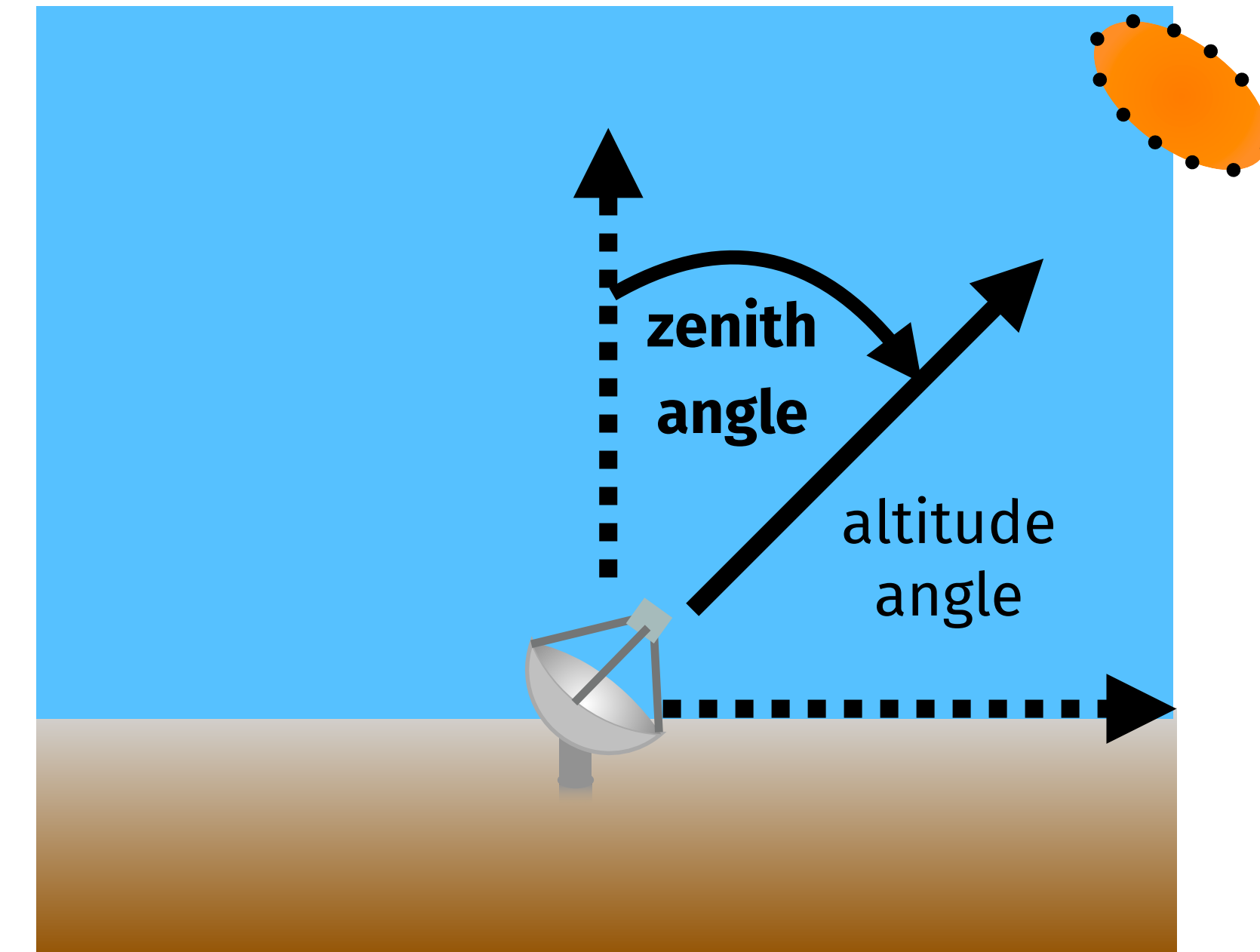
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**External Dimensionality** assumed constant within a stable interval ( $\approx 30\text{min}$ ):

- ▶ **Pointing direction** on AltAz mount ( $\alpha, \zeta$ ) \*:
  - altitude angle (atmosphere density)
  - azimuthal angle (magnetic field orientation)
- ▶ **Night-Sky-Background** light intensity/distribution
  - Galactic Plane variations, stars (field-rotation!)
  - Zodiacal light
  - Human sources (cities, etc)
- ▶ **Seasonal atmosphere** changes, instrumental **aging**



**Field of View @ 1 TeV**  
(Energy dependent!)



\* this works fine for HESS/  
MAGIC/VERITAS with smallish  
FOV, but for CTAO ( $>10^\circ$ ) and  
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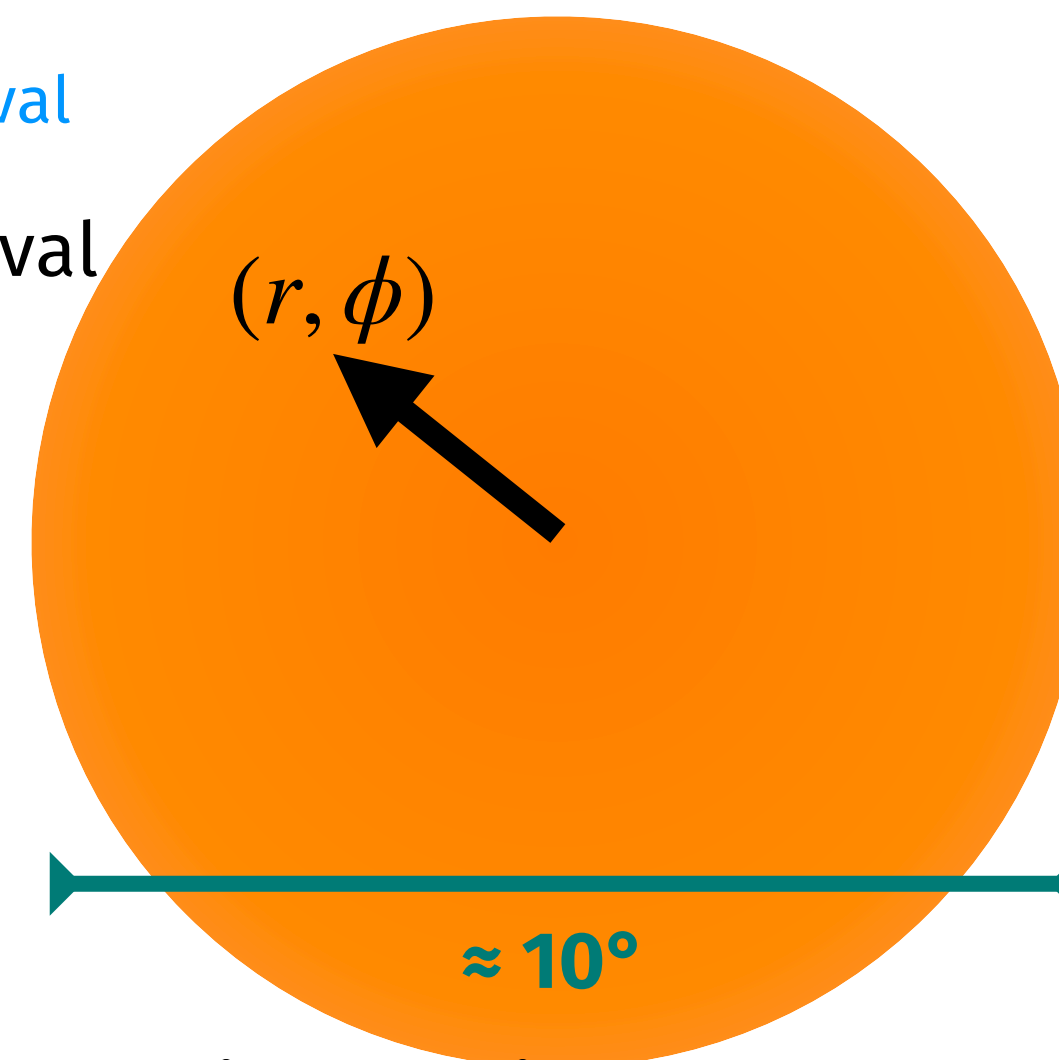
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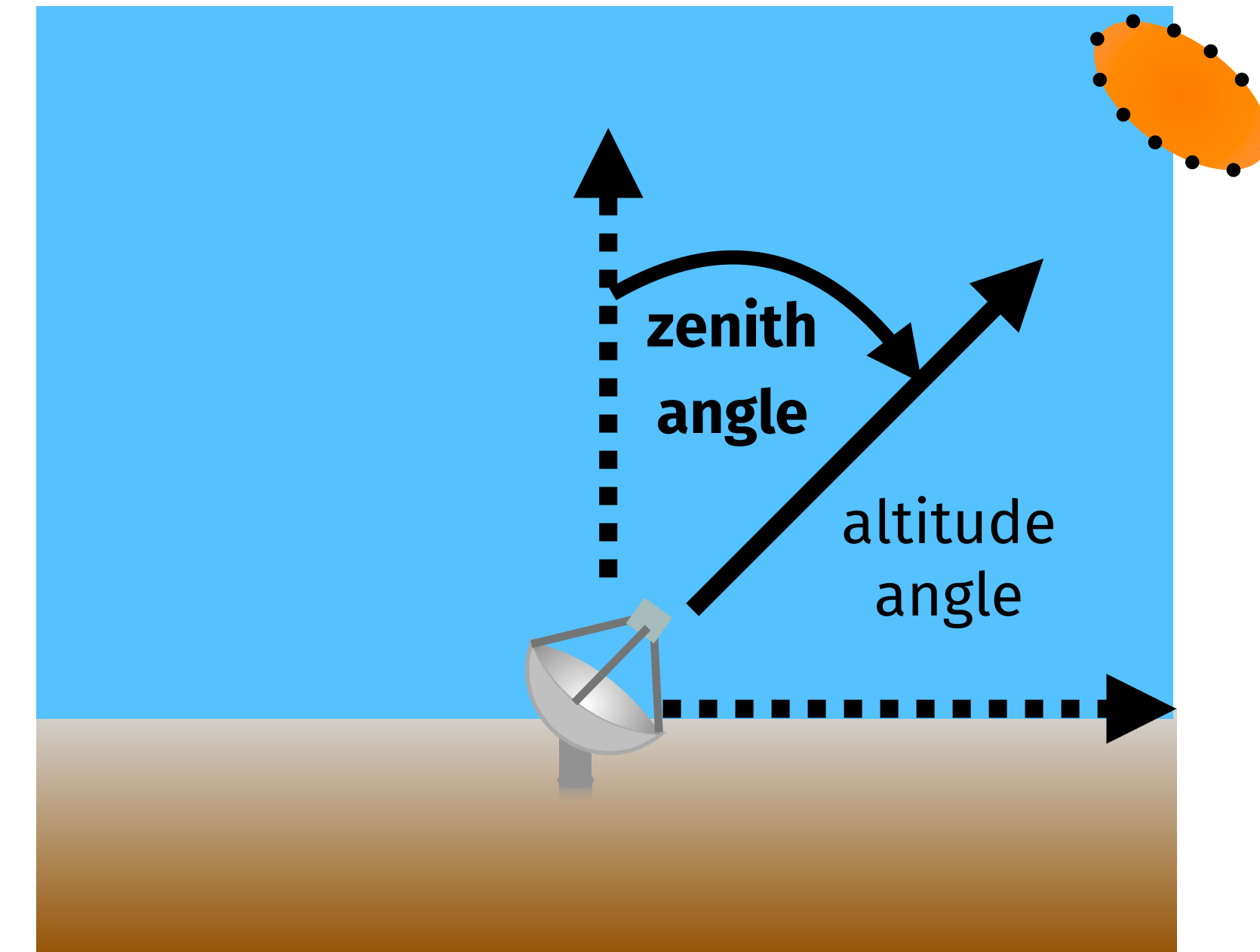
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## Non-continuous Dimensions

- ▶ **Event Type** (reconstruction quality, background quality)
- ▶ **Subarray Choice**
- ▶ **pointing mode** (tracking, drifting, moon)



**Field of View @ 1 TeV**  
(Energy dependent!)



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# Important note:



## X-ray analysis also uses forward-folding

- ▶ PI channel  $\approx E_{\text{reco}}$
- ▶ ARF  $\approx$  1D effective area IRF (with assumed source region), ours more like *instmap*?
- ▶ RMF  $\approx$  energy dispersion IRF, but we often store as  $\log(E_{\text{true}}/E_{\text{reco}})$  vs  $E_{\text{true}}$  to reduce sparsity
- ▶ No instrumental background model needed (?)

## For Gamma rays we often **simultaneously** model a combination of:

- ▶ Energy (energy-only == 1D spectra)
- ▶ Morphology (position-only point-source == 2D image)
- ▶ Time (time-only == 1D light-curve)

## "Data Cubes" are important:

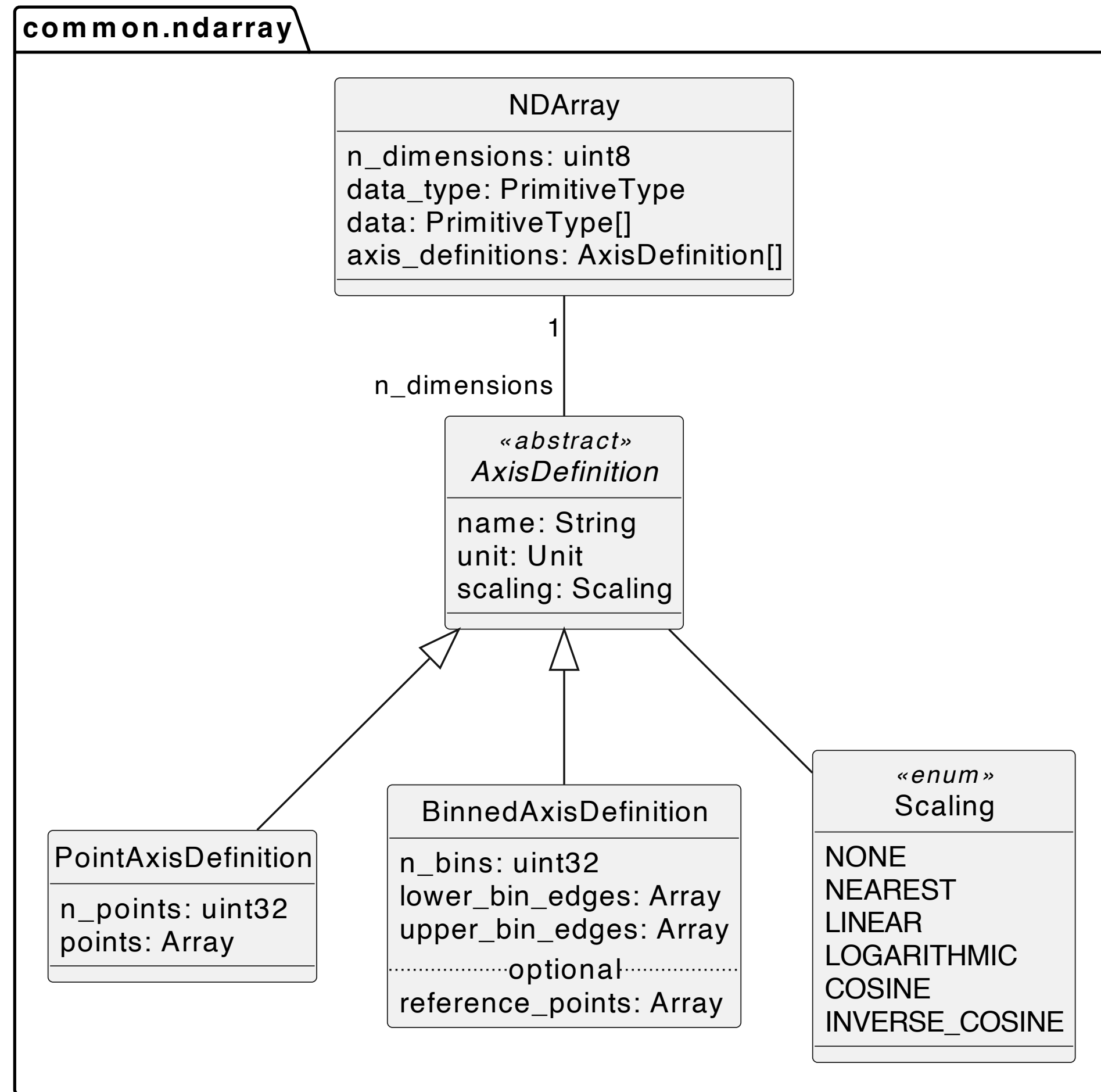
- ▶ **Binned** data in Space/Time/Energy (and also instrumental dimensions like event-type!)
- ▶ *We do not use the term "Cube"* to talk about event lists (re: proposed Cube data model) as event-lists are not constrained in bins or boundaries.

# Data Model

**Observation**  $\approx$  30 min exposure

**Stable Observation Interval (SOI)**  $\approx$  1-few per observation

**One IRF per SOI**, decomposed into multiple components.



**Figure 3.1** – UML Diagram of the NDArray data model.  
*CTAO Common Data Model Specification, v1a*

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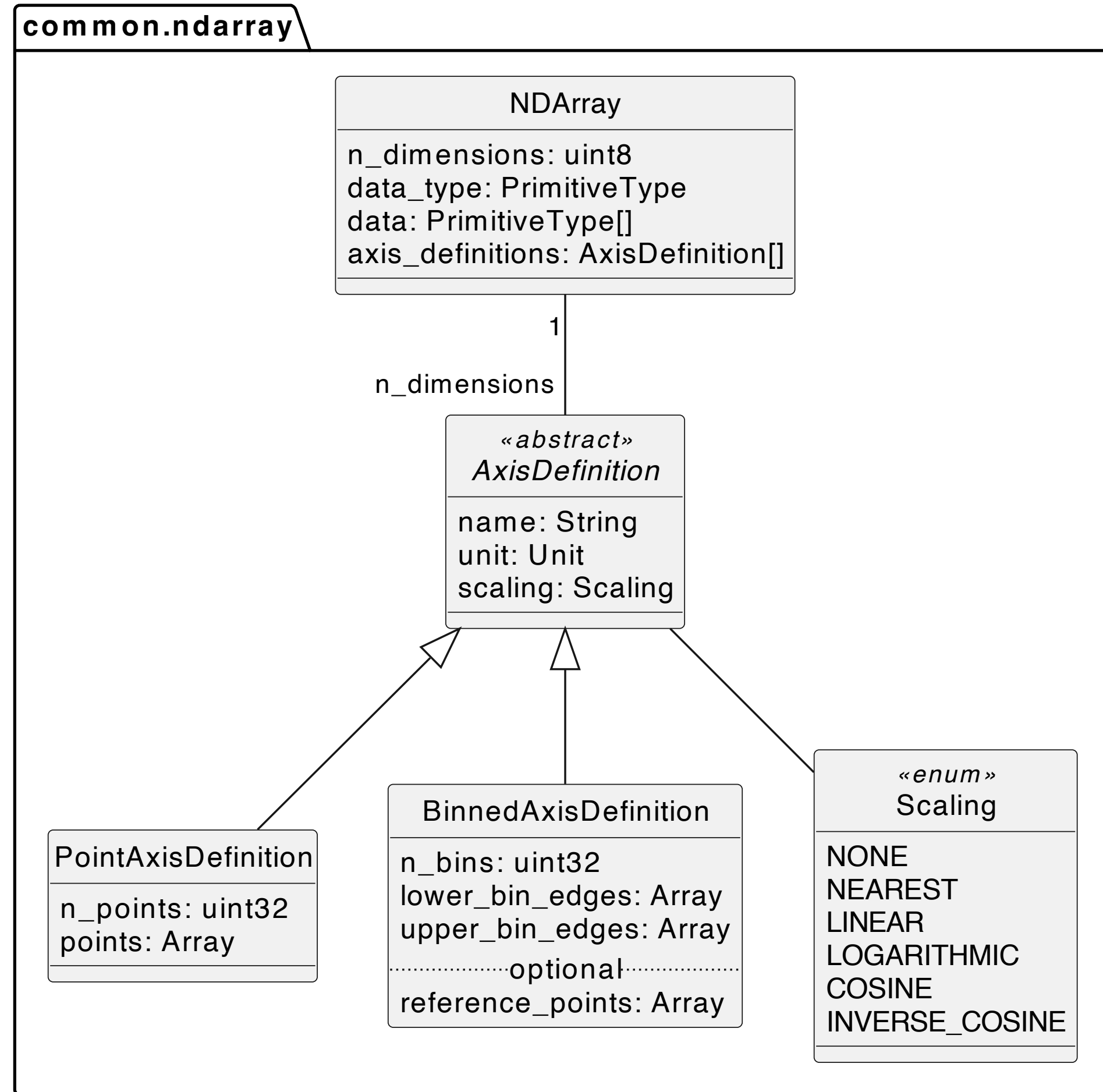


Figure 3.1 – UML Diagram of the NDAarray data model.  
 CTAO Common Data Model Specification, v1a

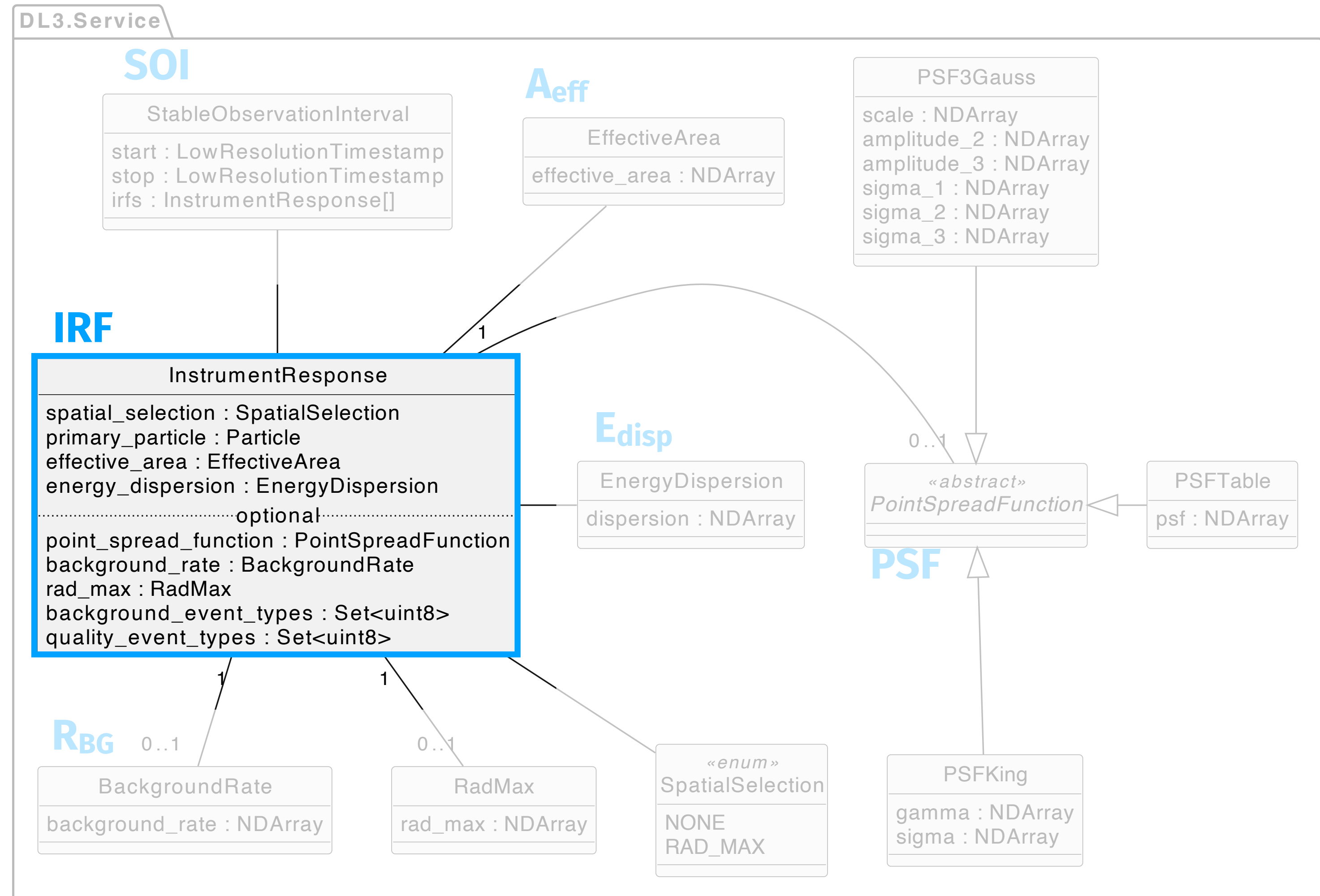


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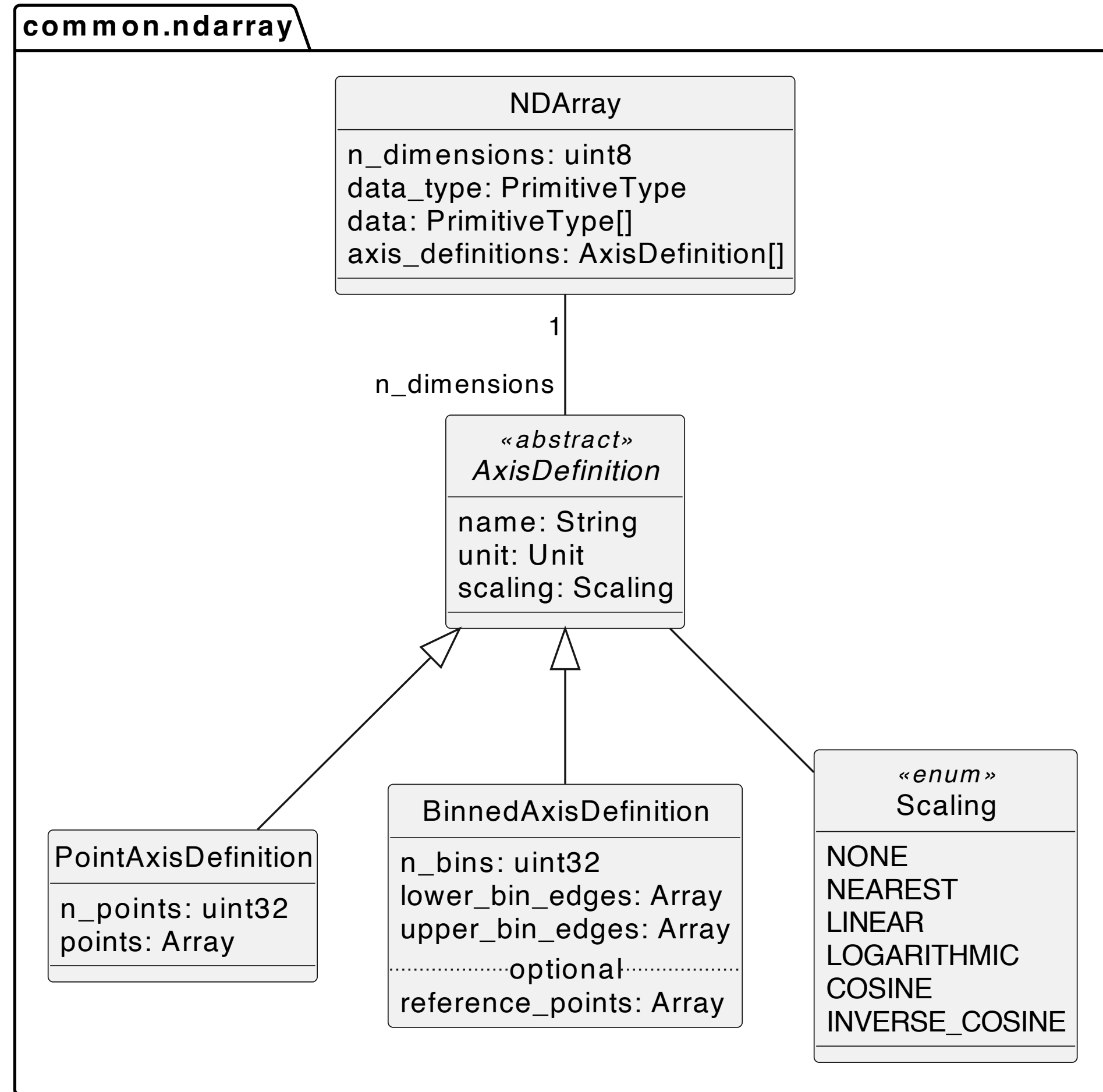


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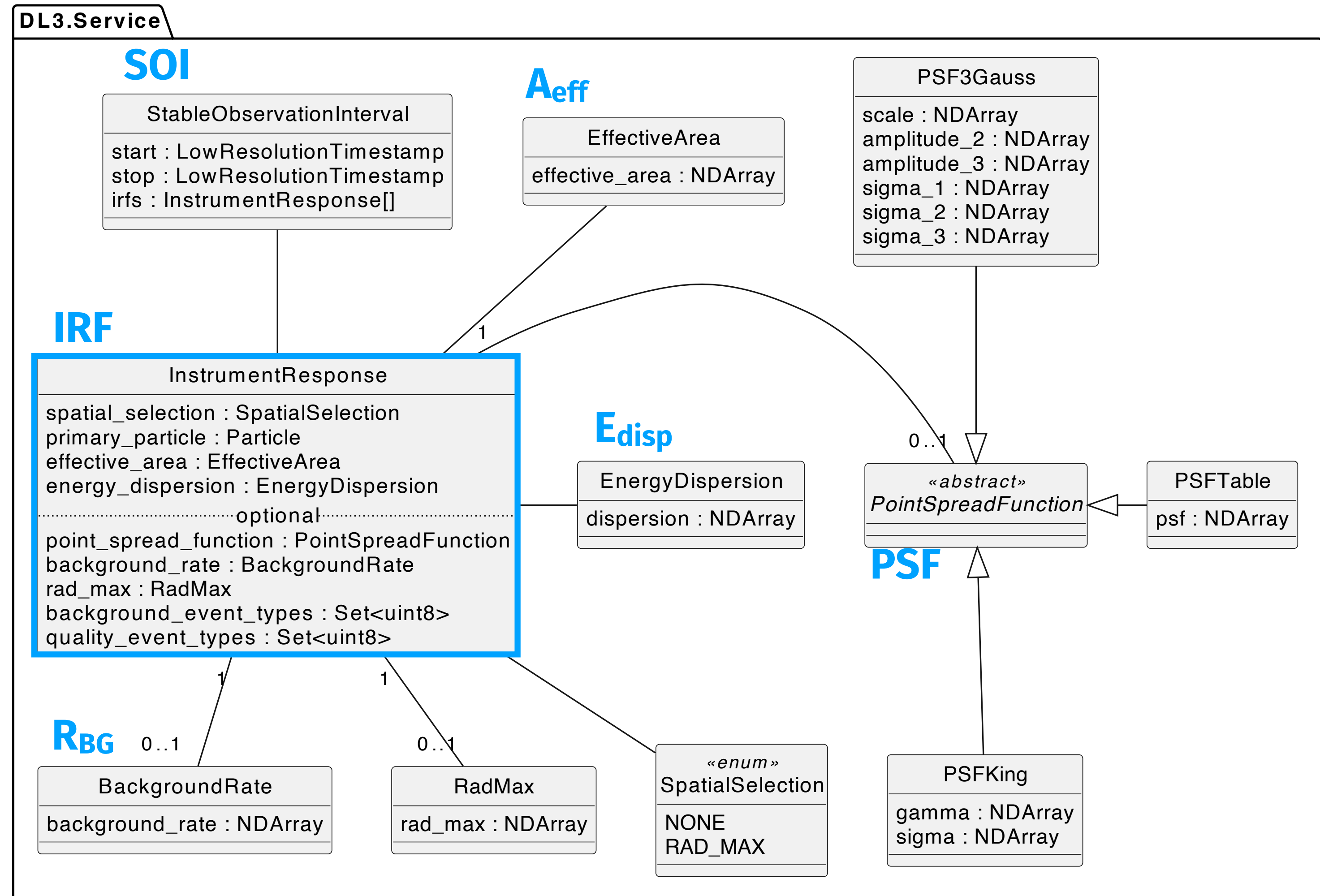


Figure 2.3 – UML Diagram of the DL3/Service/IRF Data Model.

# A Caveat: Point-like vs General IRFs



**For some science cases, cut away background by selecting events near to source, optimized by the PSF: "Point-Like IRFs"**

- ▶ Assumes a **point-like source model** with known test position
- ▶ PSF effects (spillover of flux outside of region) taken into account in other IRFs
- ▶ Simpler analysis: no need to model PSF or source position/morphology
- ▶ BUT: is not general (extended emission, simultaneous fit of position and spectrum not supported)

**We support this "type" of IRF as well:**

- ▶ include a table of "spatial cut" vs energy
- ▶ other IRFs are generated with this cut already applied.
- ▶ User must select which type to use, based on their analysis case.