# WIMPS @ CTA Abhi Mangipudi, Csaba Balázs, Eric Thane



special thanks to: Torsten Bringmann (Oslo) Christopher Eckner (Annecy) Sergio Cadena Hernández (Mexico City)

image: https://www.cta-observatory.org/the-dark-side-of-the-matter/

## outline

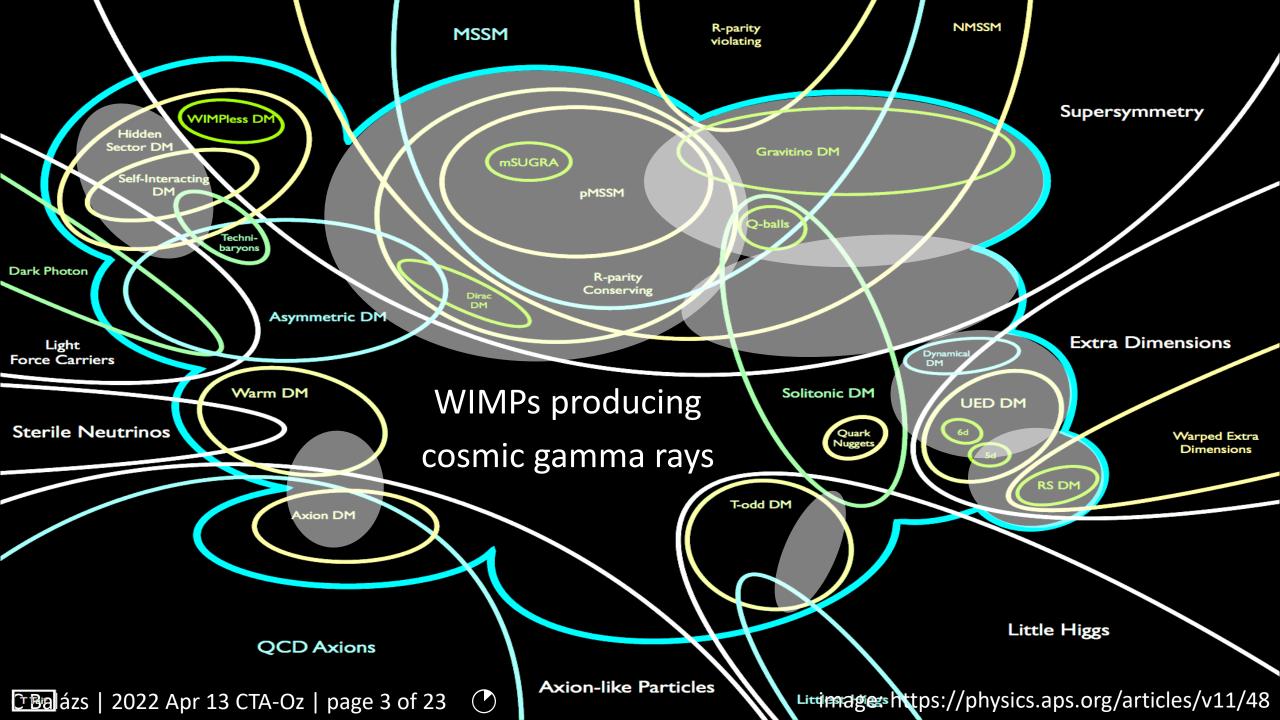
#### WIMPs as gamma ray sources

### projected CTA sensitivity for generic WIMPs

Bayesian backbone of our toolchain

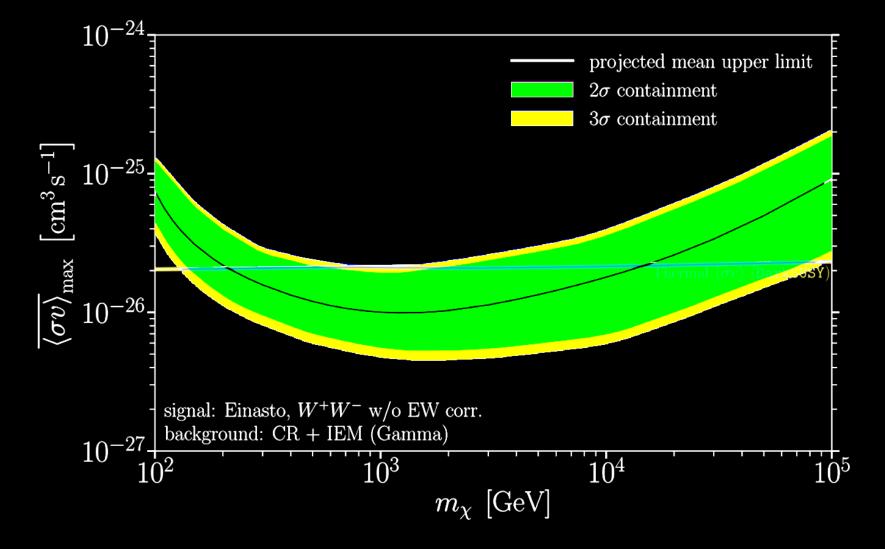
prelim results

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targeting the Galactic Centre, where most dark matter is located, CTA will search for the gamma ray signal from WIMPs

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the DM WG published sensitivity of CTA for a generic WIMP our goal is to generalize these limits for specific DM models

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plot: CTA Consortium JCAP 01 (2021) 057

## Bayesian inference – the inverse problem

hypothesis A: given dark matter model measurement B: gamma ray events in CTA prediction: 'easy' to calculate P(B|A)but CTA will give us data B and we want to infer P(A|B)we need to invert P(B|A) to obtain P(A|B)

## Bayesian inference – hierarchical inversion

measurement level B: given CTA data truth level A: true values of measured quantities calibration: 'easy' to construct instrument response P(B|A)but CTA will give us data B and we want to infer P(A|B)we need to invert P(B|A) to obtain P(A|B)

# Bayes' theorem

we use Bayes' theorem P(A|B) = P(B|A) \* P(A)/P(B)to update our prior knowledge on A and B P(A)/P(B)with newly acquired likelihood info P(B|A)

to infer the **posterior** probability of A occurring given that B occurred

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## measurement vs truth

CTA "data": measured sky location and energy of  $i^{th}$  gamma ray event  $d_i = \{\Omega^i_m \ E^i_m\}$ 

the true sky location and energy of the event, however, is  $\{\Omega^i \; E^i\}$ 

the true and measured values are connected by likelihood functions  $\mathcal{L}(\Omega_m^i | \Omega^i E^i)$  and  $\mathcal{L}(E_m^i | E^i)$ 

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## likelihood of an event

the likelihood of CTA measuring  $E_m^i$ , given a true value of  $E^i$ , is  $\mathcal{L}(E_m^i | E^i)$ 

the likelihood of CTA measuring  $\Omega_m^i$ , given  $\{\Omega^i E^i\}$ , is  $\mathcal{L}(\Omega_m^i | \Omega^i E^i)$ 

the likelihood of CTA measuring  $\{\Omega_m^i E_m^i\}$ , given  $\{\Omega^i E^i\}$ , is  $\mathcal{L}(\Omega_m^i E_m^i | \Omega^i E^i) = \mathcal{L}(E_m^i | E^i) \mathcal{L}(\Omega_m^i | \Omega^i E^i)$ 

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## energy dispersion function

the likelihood  $\mathcal{L}(E_m^i|E^i)$ 

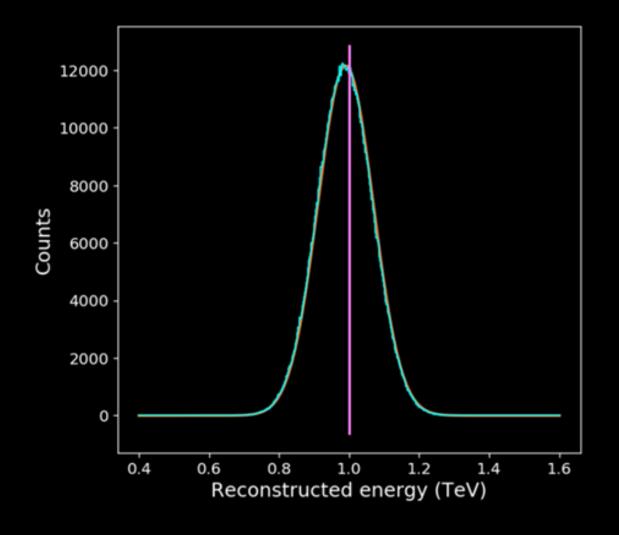
is called "energy dispersion function" (instrument response function for energy)

it relates the measured energy  $E_m^i$  to the true energy  $E^i$ 

it comes from test\_sim\_edisp of gammalib within ctools

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## energy dispersion function we use



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## point spread function

the likelihood  $\mathcal{L}(\Omega_m^i | \Omega^i E^i)$ 

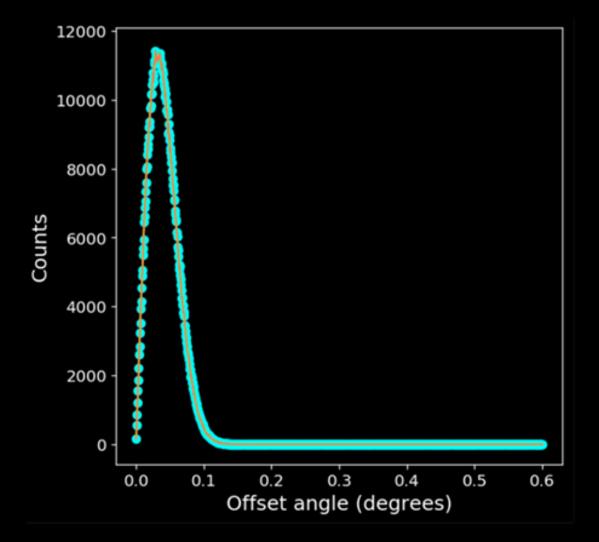
### is called "point spread function" (instrument response function in angle)

it relates the measured sky location  $\Omega_m^i$  to the true location  $\Omega^i$ 

it comes from test\_sim\_psf of gammalib within ctools

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## point spread function we use



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## posteriors

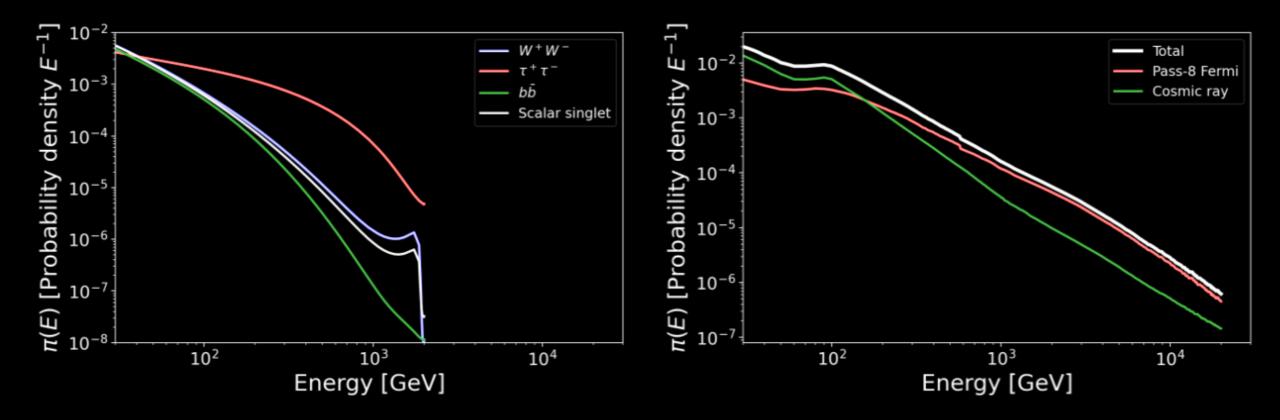
to infer the presence of dark matter particles for each event we calculate two posteriors one assuming the signal hypothesis

$$\mathcal{L}(d^{i}|\mathcal{S}) = \int d\hat{\Omega}^{i} \int dE^{i} \mathcal{L}(d_{i}|\Omega^{i}E^{i}) \pi(\Omega^{i}, E^{i}|\mathcal{S})$$

and one assuming the background hypothesis  $\mathcal{L}(d_i|\mathcal{B}) = \int d\hat{\Omega}_i \int dE_i \,\mathcal{L}(d_i|\Omega^i E^i) \pi(\Omega^i, E^i|\mathcal{B})$ 

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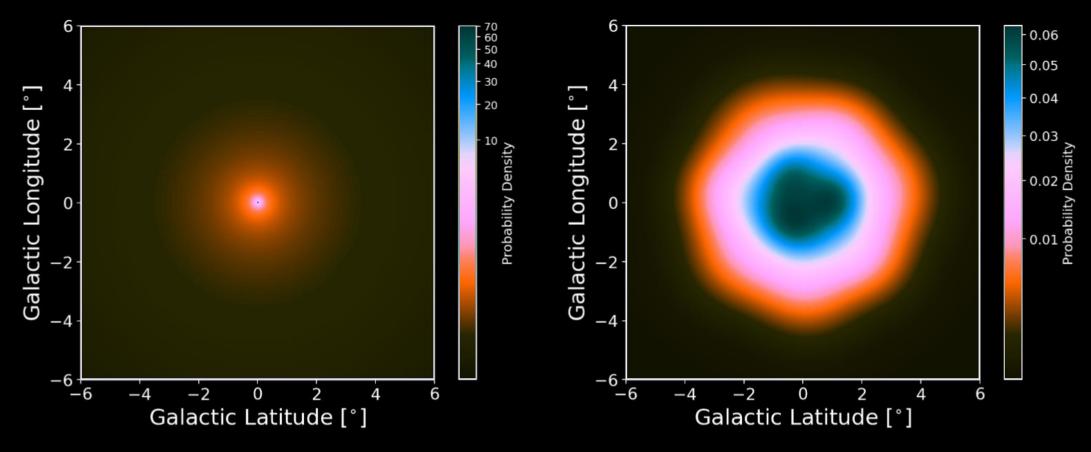
## priors for energy



energy priors for signal and background hypotheses

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## priors for sky location



sky location priors for signal and background hypotheses

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## posterior of full dataset

# the likelihood of the complete dataset is $\mathcal{L}(\vec{d}|\lambda) = \prod_{i}^{N} \lambda \mathcal{L}(d_i|\mathcal{S}) + (1-\lambda)\mathcal{L}(d_i|\mathcal{B})$

 $\lambda$  is the probability that an event is drawn from the signal population equivalently,  $\lambda$  is the proportion of events drawn from the signal

$$\lambda = \frac{N_{\mathcal{S}}}{N} \approx \frac{N_{\mathcal{S}}}{N_{\mathcal{B}}}$$

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## number of signal events

 $N_S$  is proportional to the gamma ray source flux

$$N_{\mathcal{S}} = T \int \left( \frac{d\Phi}{d\Omega dE} (E, \psi) A(E) dE d\Omega \right)$$

which is proportional to the annihilation cross section

$$\frac{d\Phi}{d\Omega dE}(E,\psi) = \frac{1}{4\pi} \int_{l.o.s} dl(\psi) \rho_{\chi}^2(\mathbf{r}) \left(\frac{\langle \sigma v \rangle}{2m_{\chi}^2} \sum B_f \frac{dN}{dE}\right)$$

which means that  $\lambda$  is a linear function of the cross section

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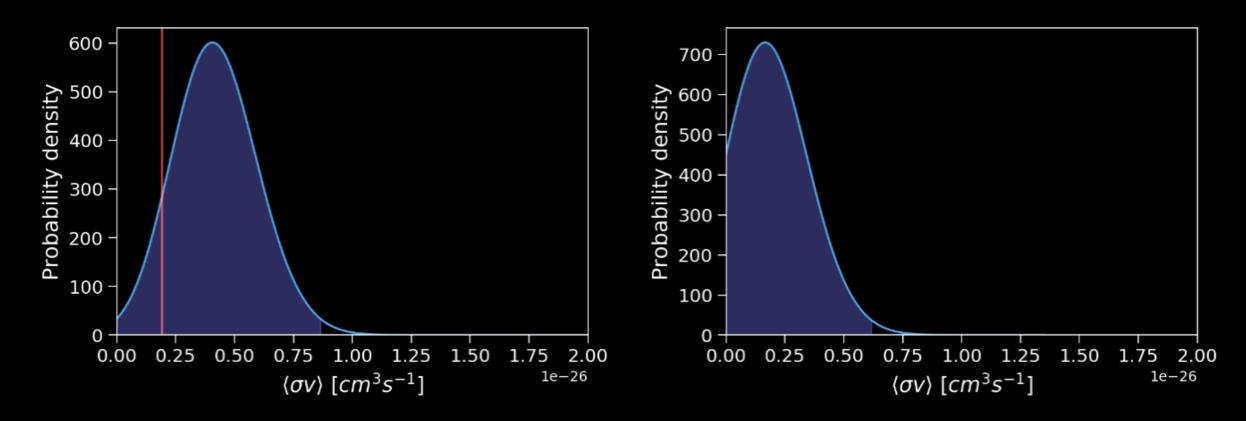
## Posterior for annihilation cross section

using Bayes theorem, we can invert the likelihood 
$$\mathcal{L}(\vec{d}|\lambda) = \prod_{i}^{N} \lambda \mathcal{L}(d_i|\mathcal{S}) + (1-\lambda)\mathcal{L}(d_i|\mathcal{B})$$

to obtain a probability distribution for the annihilation cross section

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## Posterior for annihilation cross section

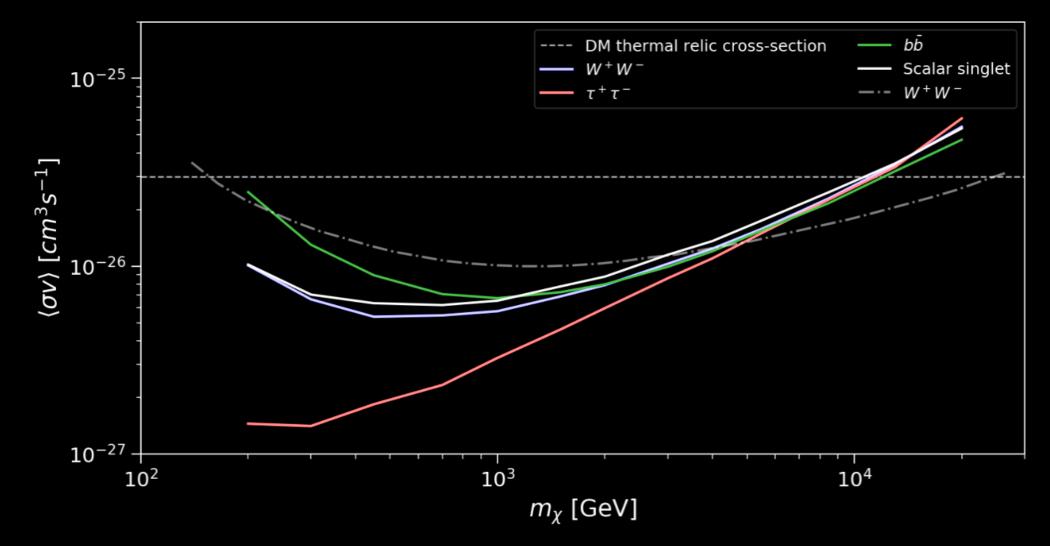


sample detection (left) and exclusion (right) at 99% C.L.

shaded region indicating credible interval (vertical line at true value)

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## limits for annihilation cross section



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#### CTA will be a powerful tool to hunt for WIMPs.

### It will be able to discover or rule out various WIMP candidates.

# We're working on a generic numerical framework to determine the sensitivity of CTA for various WIMP models.

Interesting results are coming soon!

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