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# The Fermi GeV excess as a tracer of stellar mass: Results with SkyFACT

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**Emma Storm**

In collaboration with:

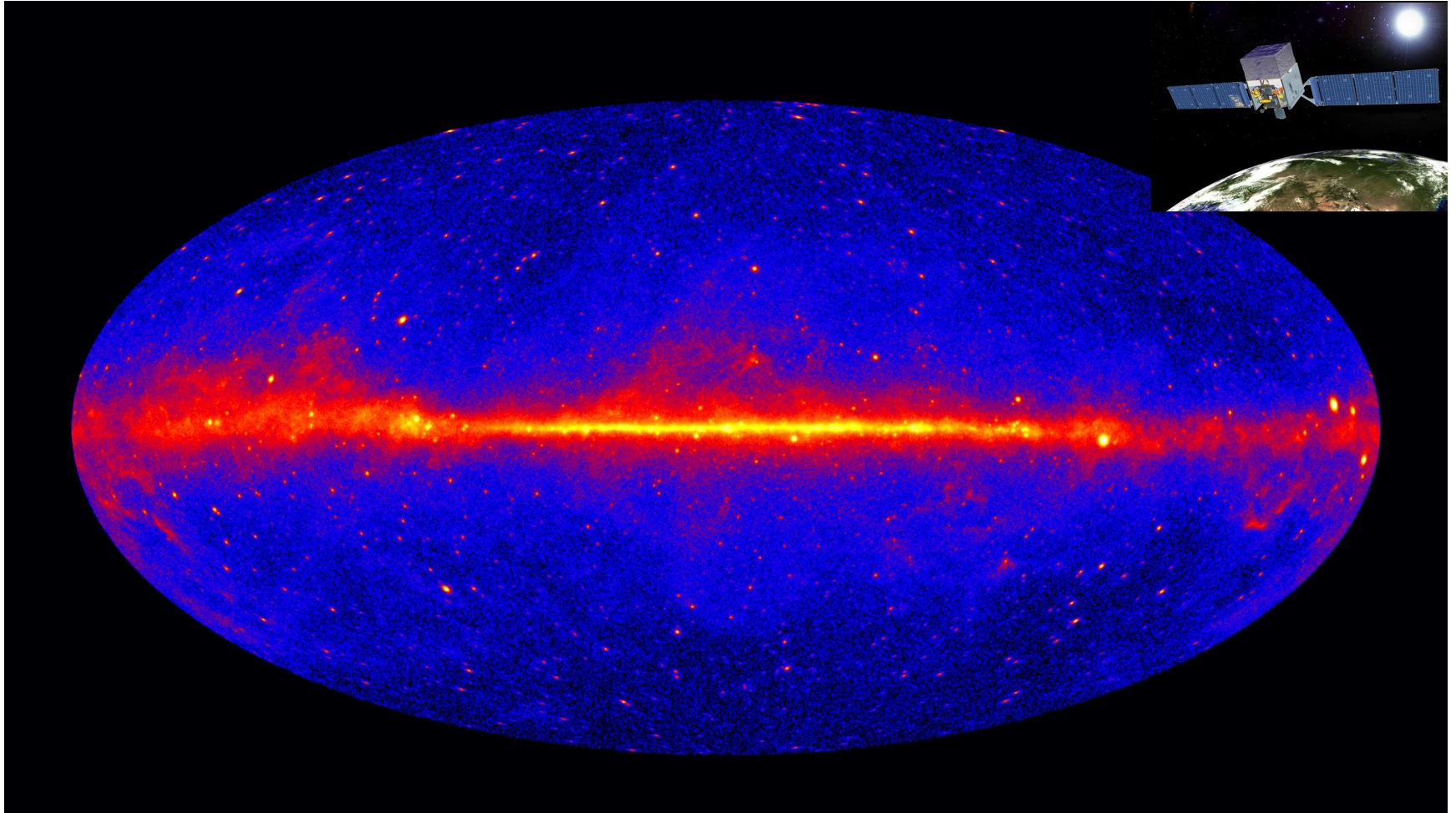
Richard Bartels, Francesca Calore, Christoph Weniger

**TeVPA**

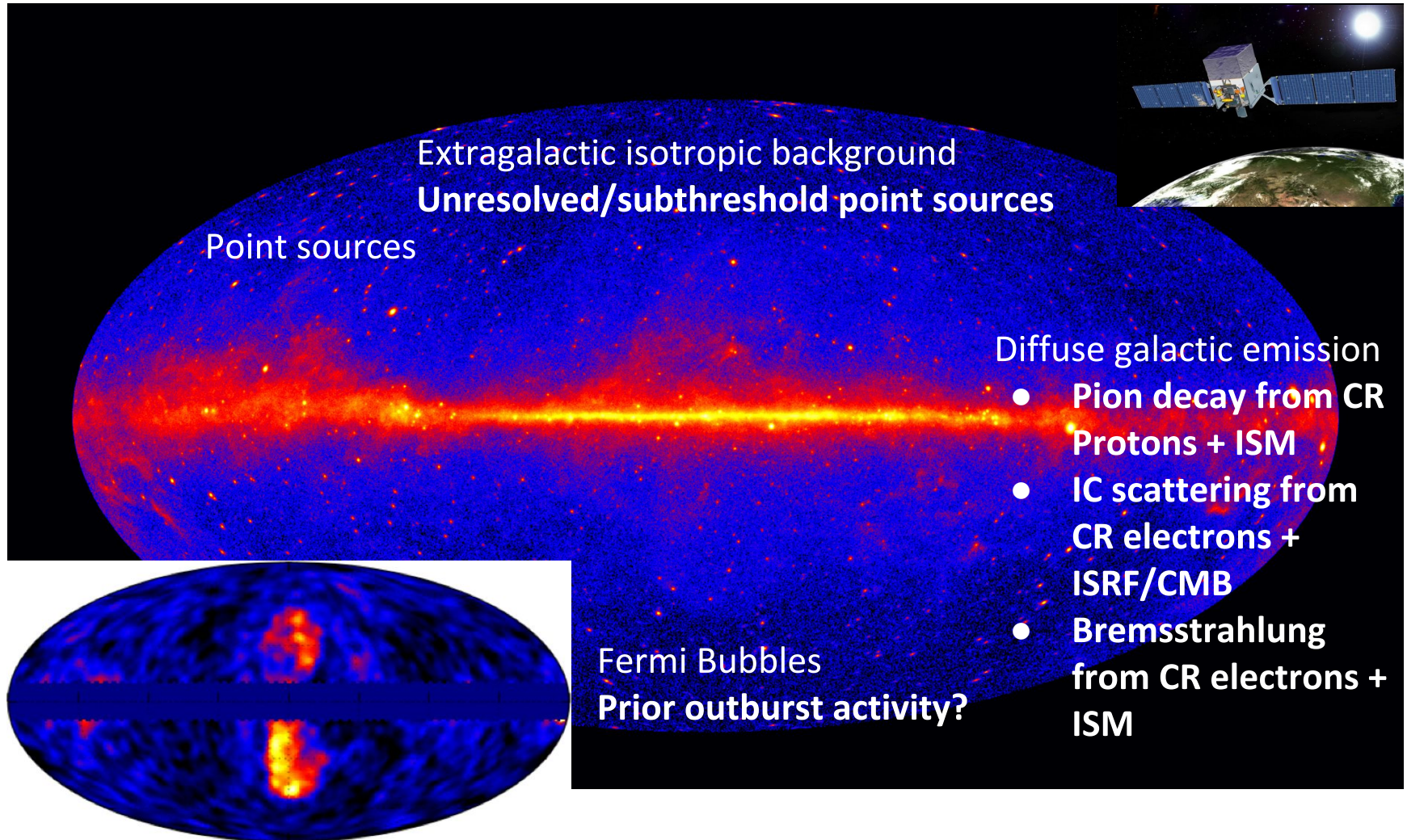
**29 August 2018**

# The gamma-ray sky

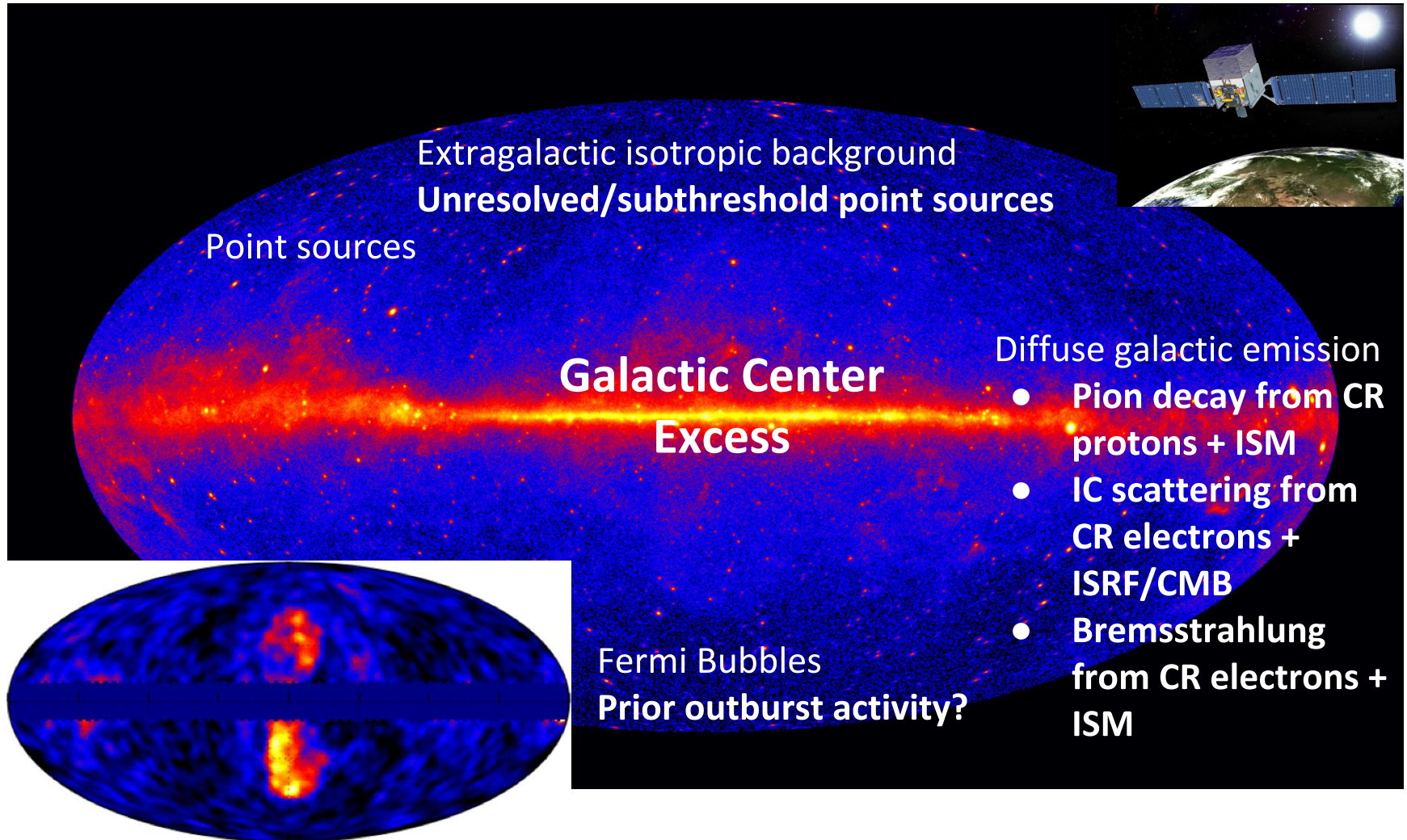
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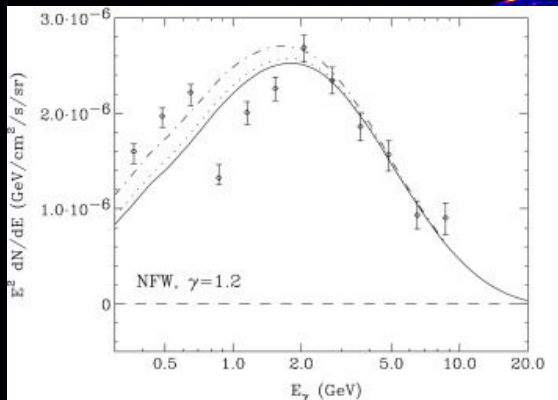
# The gamma-ray sky



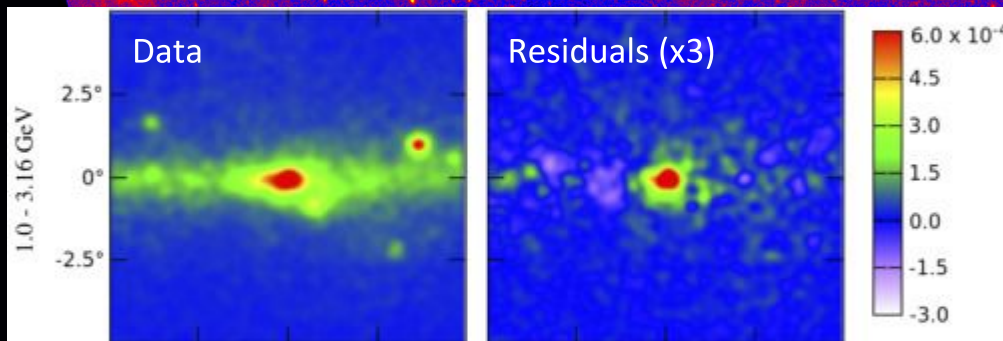
# The gamma-ray sky



# The Fermi Galactic Center Excess

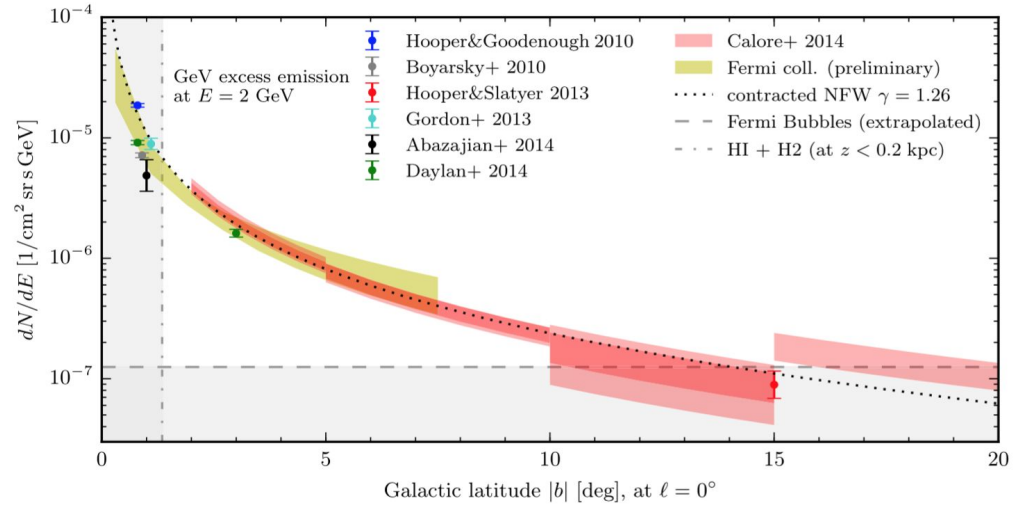
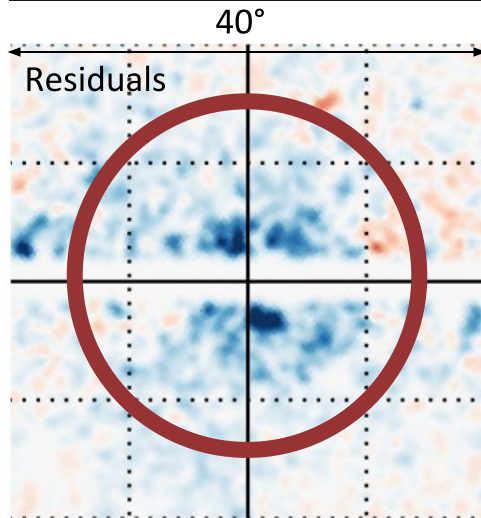


Goodenough&Hooper09[0910.2998]  
Vitale&Morselli[0912.3828]  
Hooper&Linden[1110.0006]  
Abazajian&Kaplinghat[1207.6047]  
Gordon&Macias[1306.5725]  
Daylan+[1402.6703]  
Calore+[1409.0042]  
Fermi-LAT[1511.02938]  
Fermi-LAT[1704.03910]  
etc

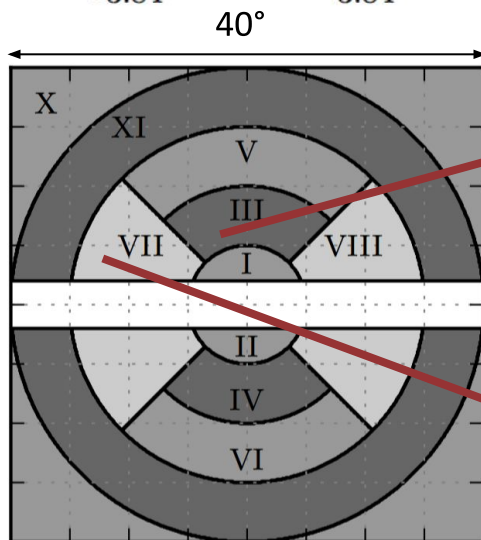


Daylan+[1402.6703](PDU)

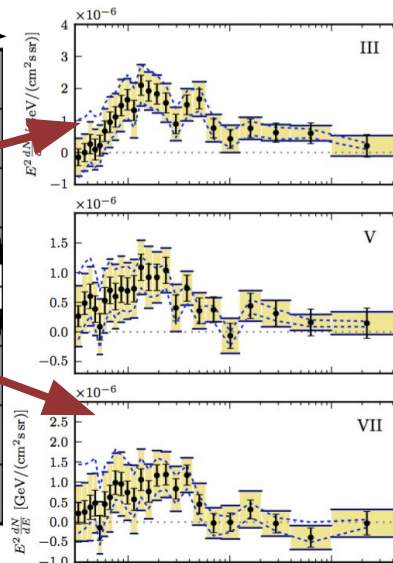
# The Fermi galactic center excess (GCE)



Calore+[1411.4647](PRD)



Calore+[1409.0042](PRL)



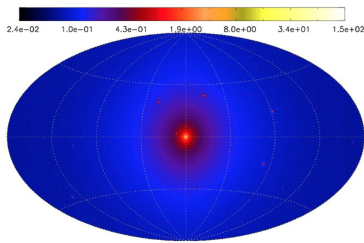
## Characteristics:

- Located at Galactic Center
- $10^\circ$  radius
- Symmetric morphology (?)
- Spectrum peaks at 2 GeV
- Uniform spectrum

# Origins of the GCE

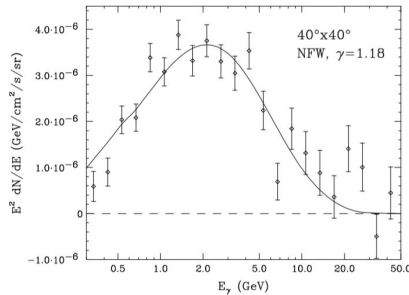
## Dark Matter Interpretation

Expected  $\gamma$ -ray counts from DM annihilation

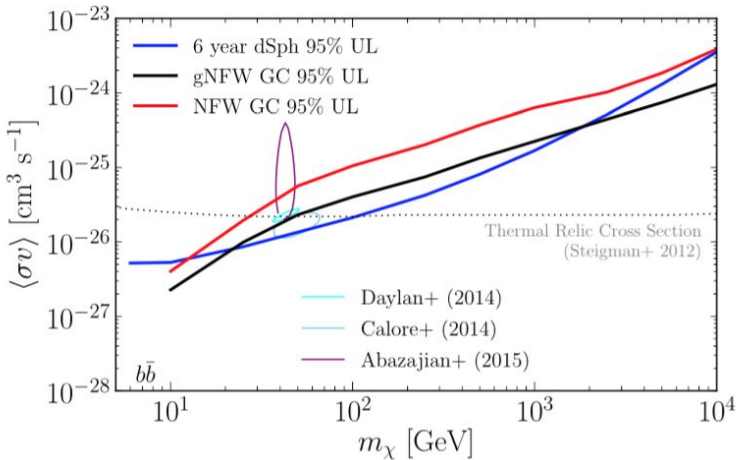


Pieri+[0908.0195](PRD)

DM  $\rightarrow$   $b\bar{b}$ ,  $m=43\text{GeV}$ ,  
 $\sigma v=2.25 \times 10^{-26} \text{ cm}^3 \text{ s}^{-1}$



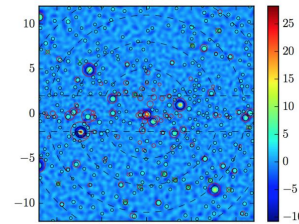
Daylan+[1402.6703](PDU)



Fermi-LAT+[1704.03910](ApJ)

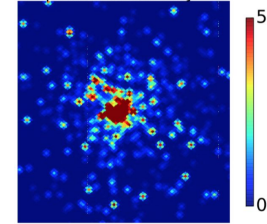
## Astrophysics Interpretation: Unresolved Point Sources

Wavelet analysis



Bartels+[1506.05104](PRL)

Non-poissonian templates



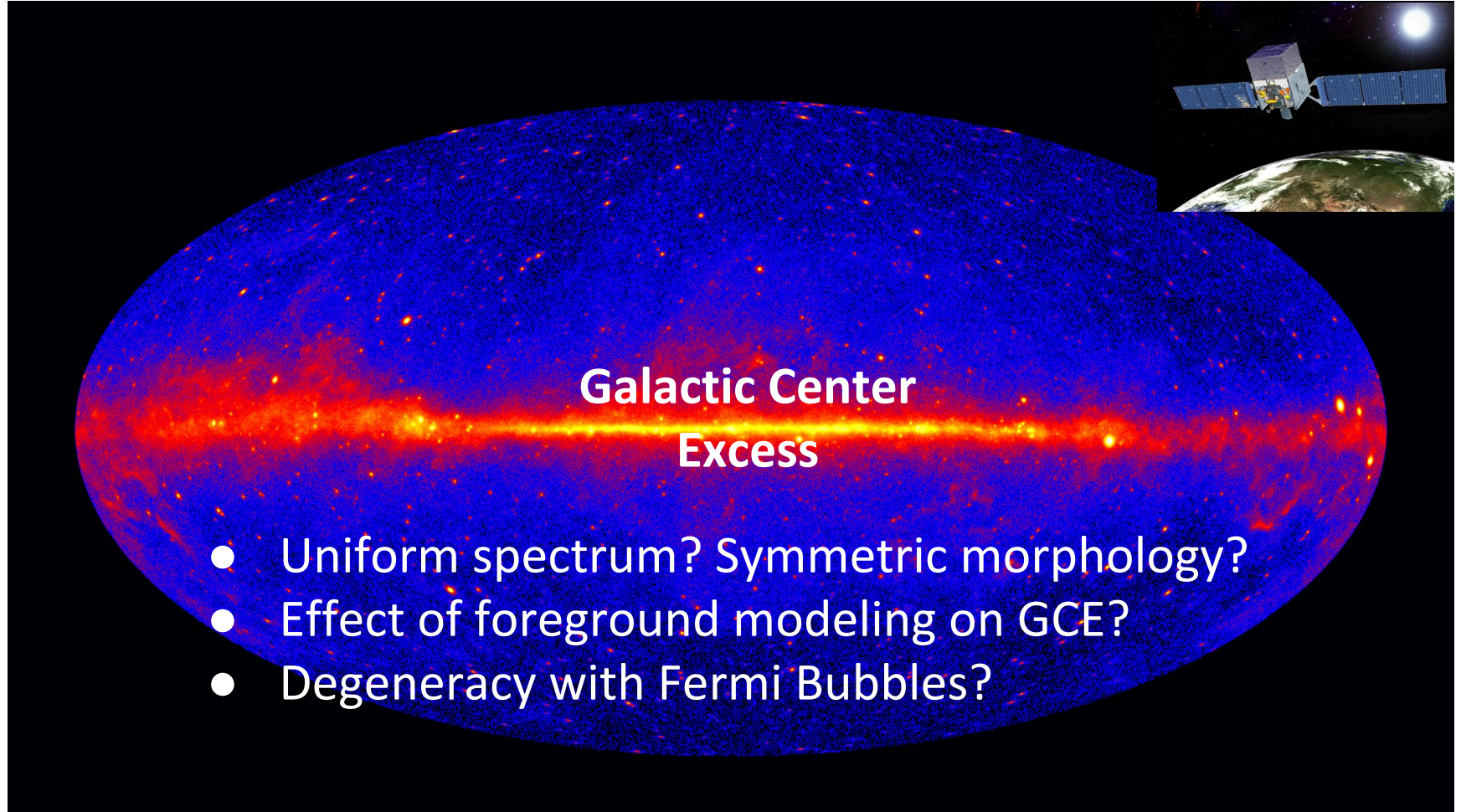
Lee+[1506.05124](PRL)

An as-yet unresolved population of **millisecond pulsars** are a good fit

**Other scenarios:** Additional CR-induced emission, SF burst(s), steady increased SF in GC/CMZ, emission from molecular clouds ...

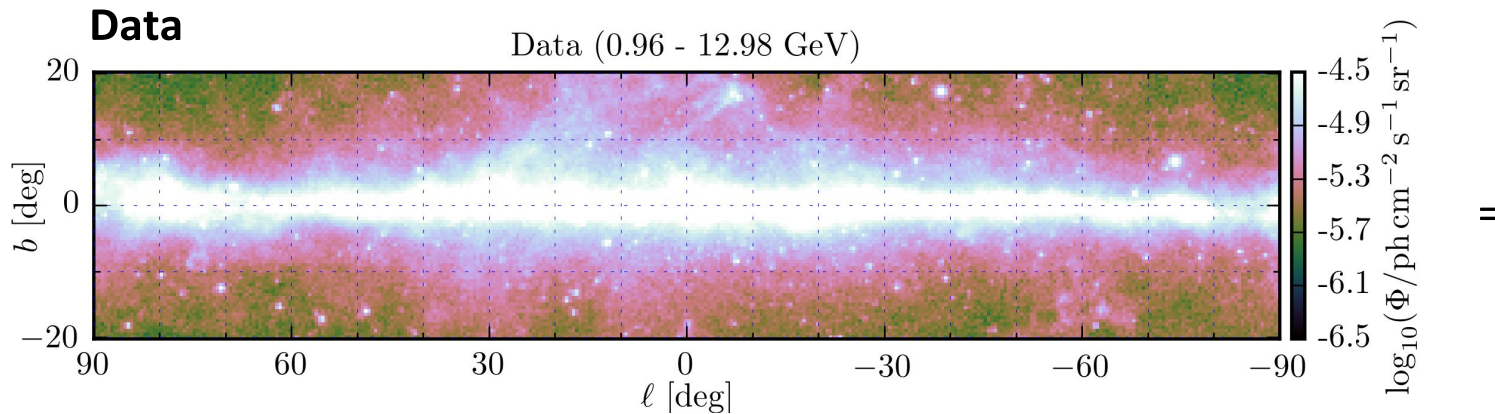
# Origins of the GCE

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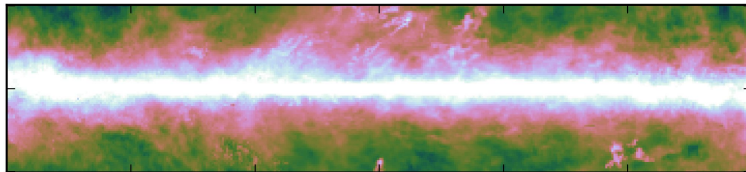


# Standard template fitting

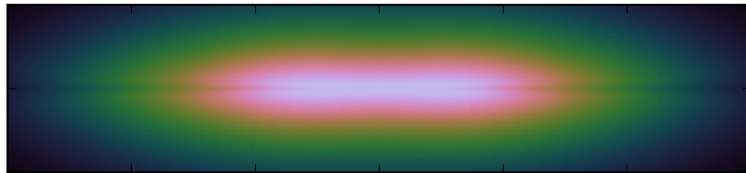


## Models for $\gamma$ -ray emission from:

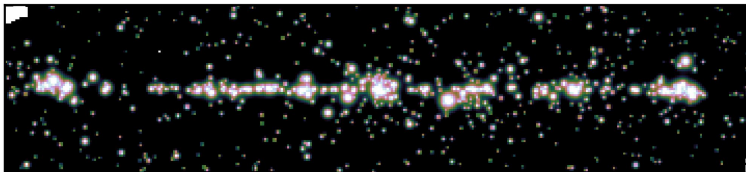
Cosmic ray  
protons



Cosmic ray  
electrons



Point  
sources



+ Other extended + diffuse components...

# Standard template fitting

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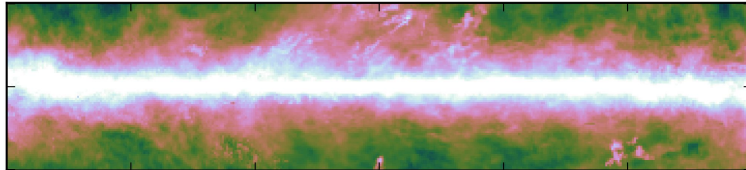
$$\text{Model} \sim \sum_k \text{Template}^{(k)} \times \text{Spectrum}^{(k)}$$

k: model component

*k* Fixed, energy-dependent spatial templates      Derived from normalizations of spatial templates

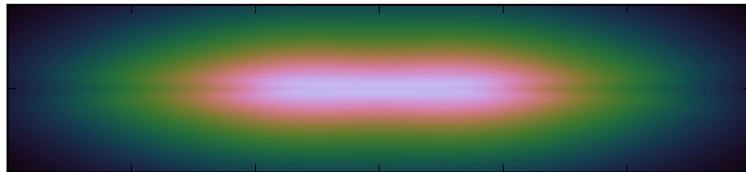
**Models for  $\gamma$ -ray emission from:** derived from CR prop codes like Galprop, Dragon

Cosmic ray protons



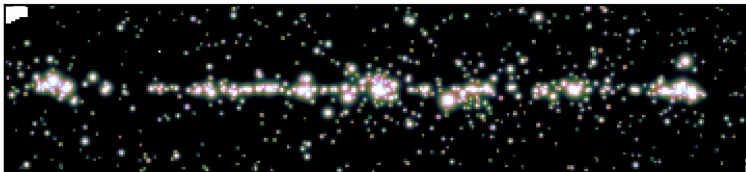
Uncertainties  $\gtrsim$  30-50%

Cosmic ray electrons



Uncertainties  $\gtrsim$  factor of 2-3

Point sources



+ Other extended + diffuse components...

# A new approach: SkyFACT

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$$\text{Model} \sim \sum_k \text{Template}^{(k)} \times \text{Spectrum}^{(k)}$$

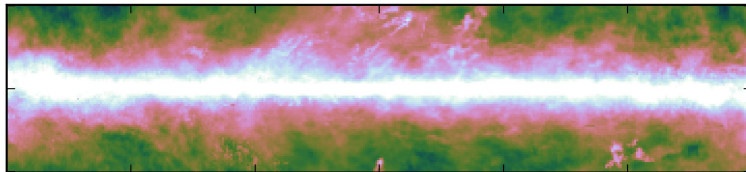
k: model component

*k* Spatial templates that allow for uncertainties at the pixel level

Spectral templates that allow for uncertainties in energy bins

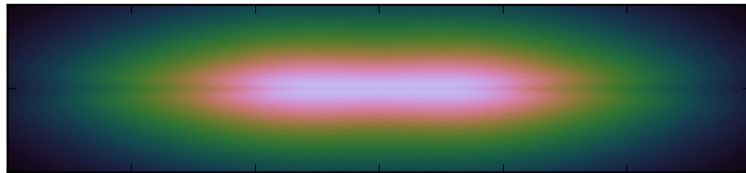
**Models for  $\gamma$ -ray emission from:** derived from CR prop codes like Galprop, Dragon

Cosmic ray protons



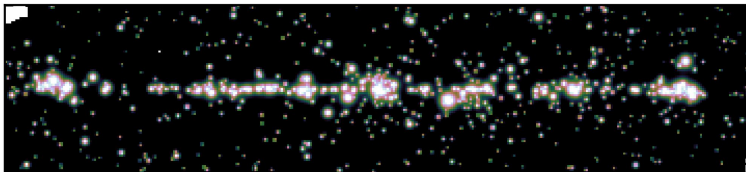
Uncertainties  $\gtrsim$  30-50%

Cosmic ray electrons



Uncertainties  $\gtrsim$  factor of 2-3

Point sources



+ Other extended + diffuse components...

# A new approach: SkyFACT

$$\text{Model} \sim \sum_k T_p^{(k)} \tau_p^{(k)} \times S_b^{(k)} \sigma_b^{(k)} \times \nu^{(k)}$$

p: spatial pixel  
b: energy bin  
k: model component

Spatial +  
spectral  
templates

Modulation parameters:

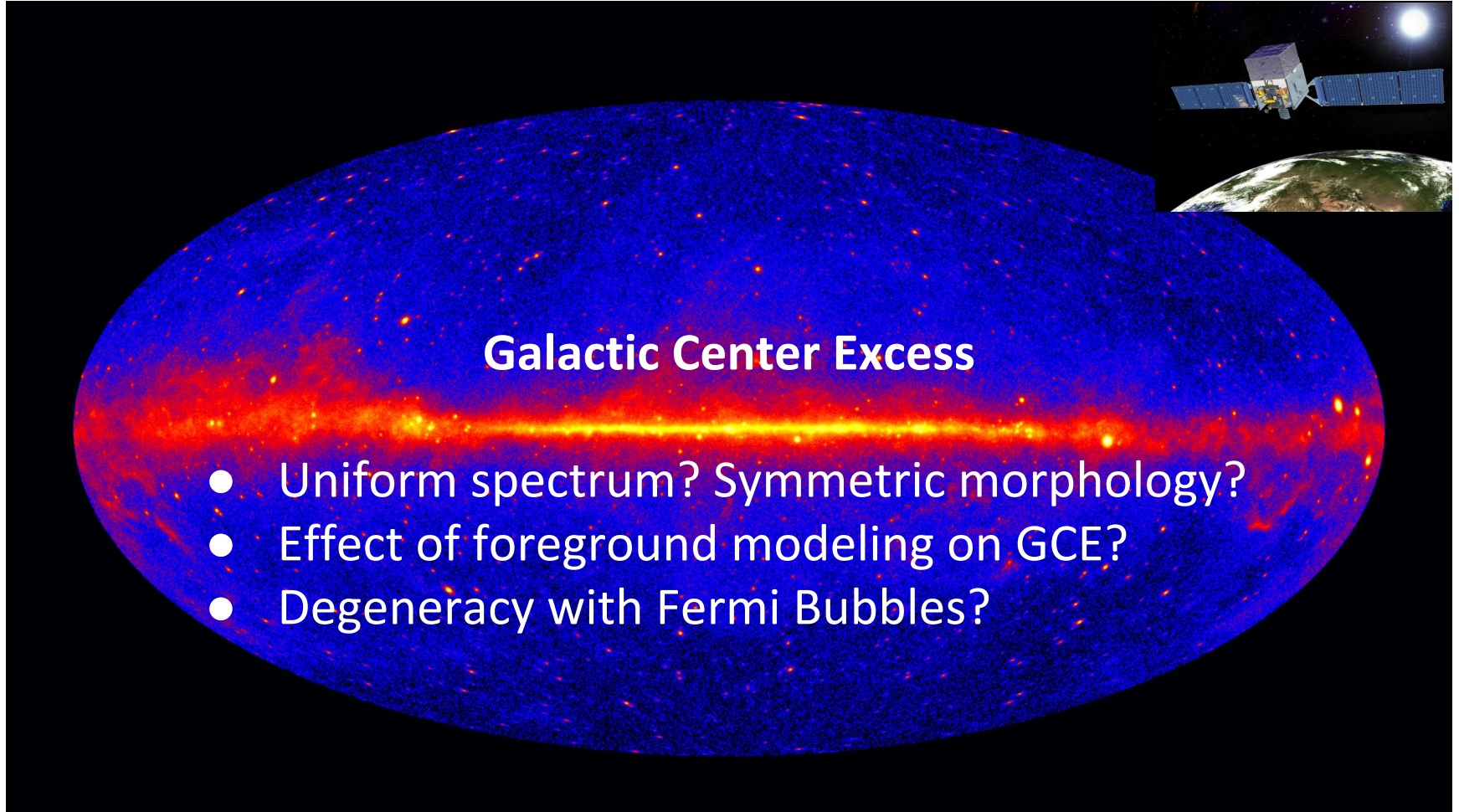
- Spatial
- Spectral
- Overall

Constraint (or regularization)  
terms in the likelihood control  
how much variation is allowed

$$\ln \mathcal{L} = \ln \mathcal{L}_P + \ln \mathcal{L}_R$$

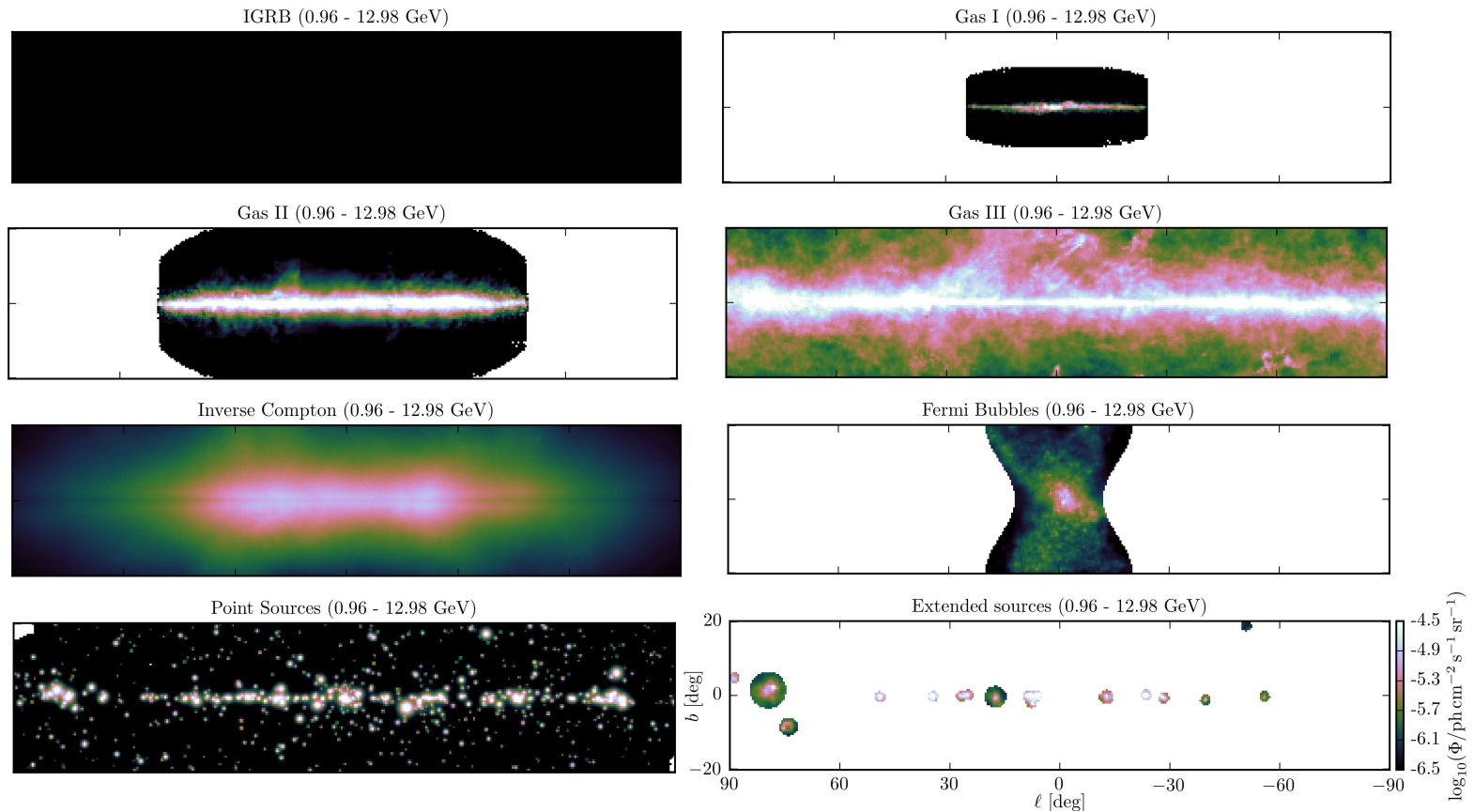
# Analyzing the GCE with SkyFACT

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# Foreground model

## Best-fit models

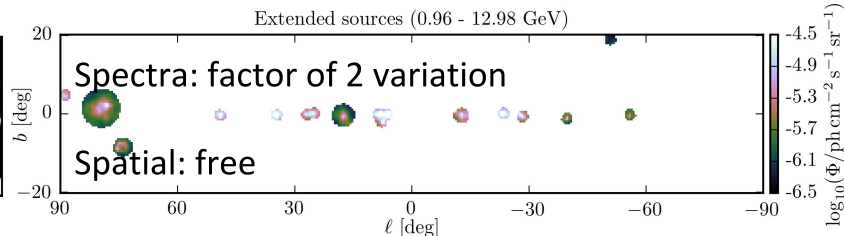
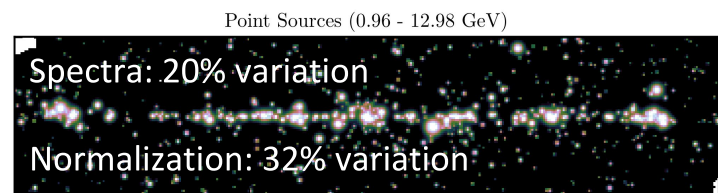
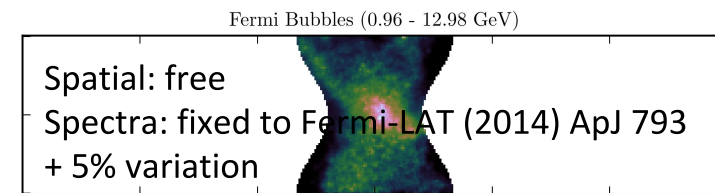
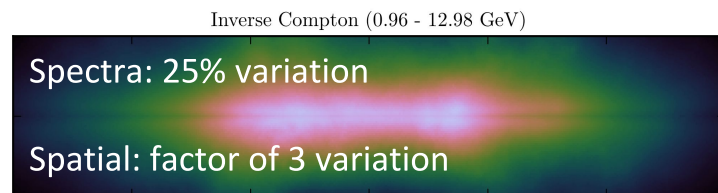
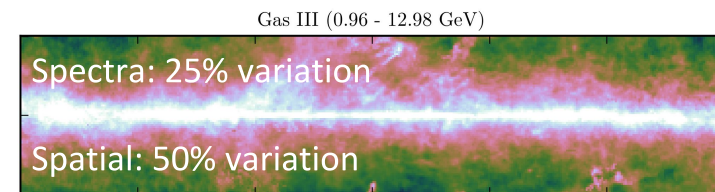
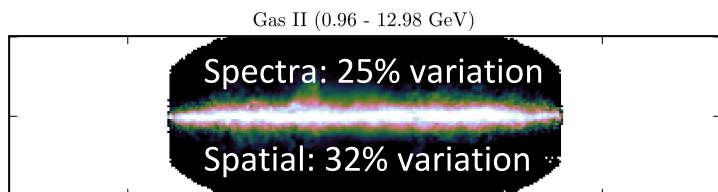
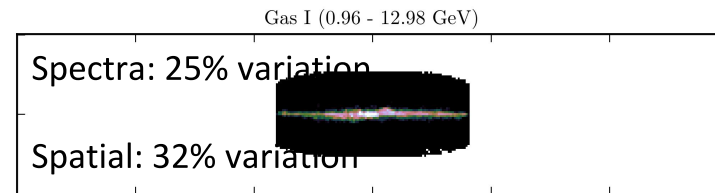


+ Various spatial templates for GCE with free spectra and fixed morphology

\*Foreground modulation similar to run5 in SkyFACT paper Storm+[1705.04065](JCAP)

# Foreground model and constraints

## Best-fit models

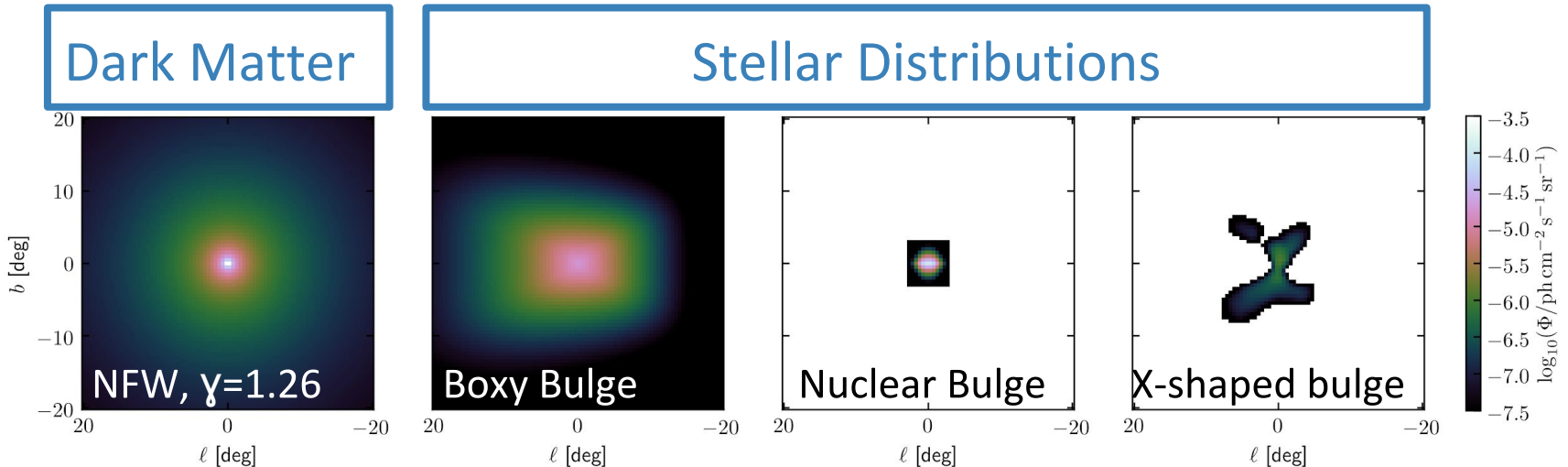


+ Various spatial templates for GCE with free spectra and fixed morphology

\*Foreground modulation similar to run5 in SkyFACT paper Storm+[1705.04065](JCAP)

# GCE spatial templates

## Best-fit models



## Other templates tested:

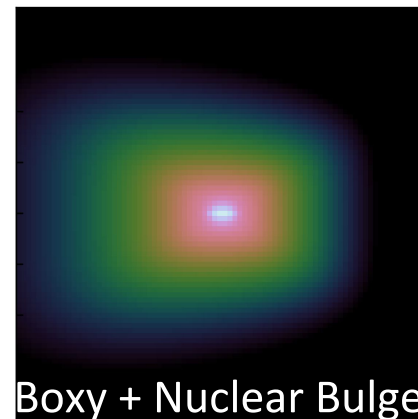
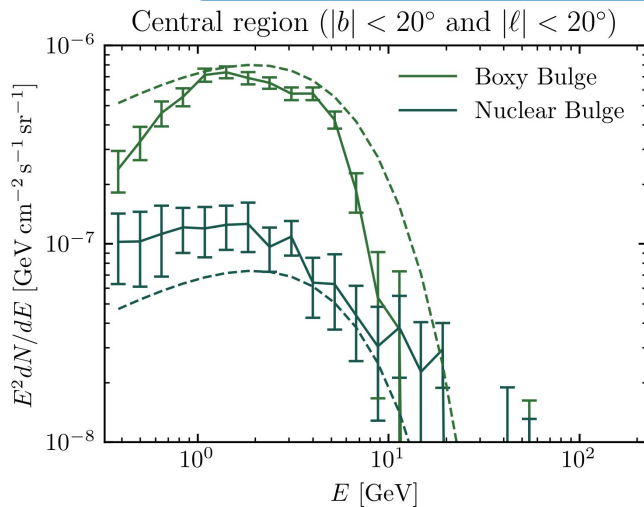
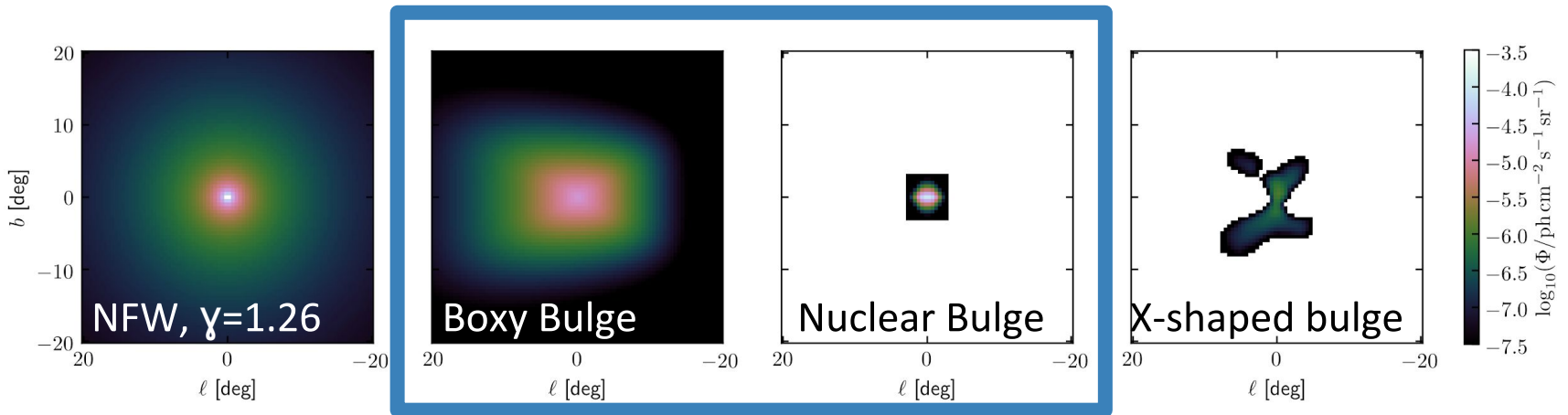
- NFW,  $\gamma=1$
- Einasto
- 511 keV emission
- Combinations

Correlation between  
GCE and X-shaped  
bulge:  
Macias+[1611.06644]  
(Nat Astro)



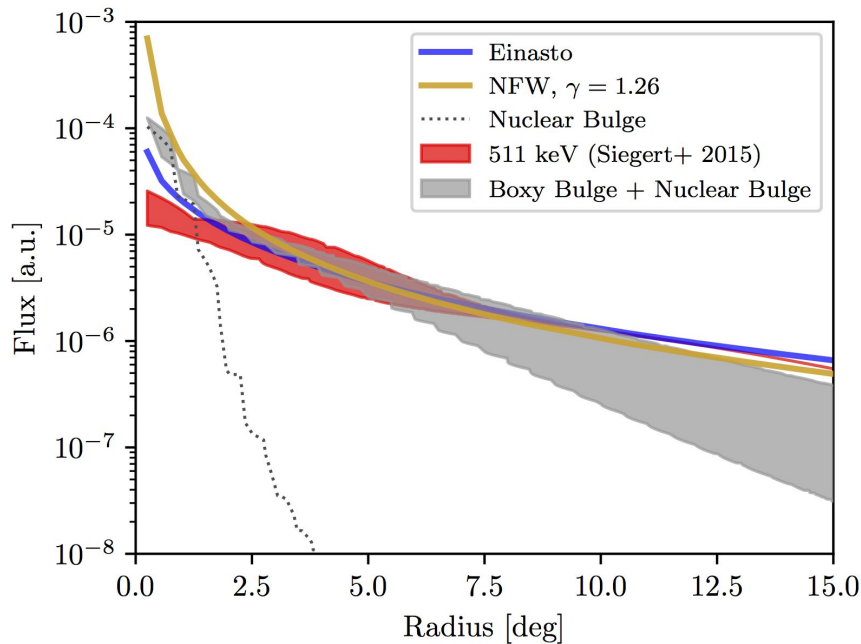
# GCE spatial templates

Best-fit combination  
Preferred over DM at  $16\sigma$

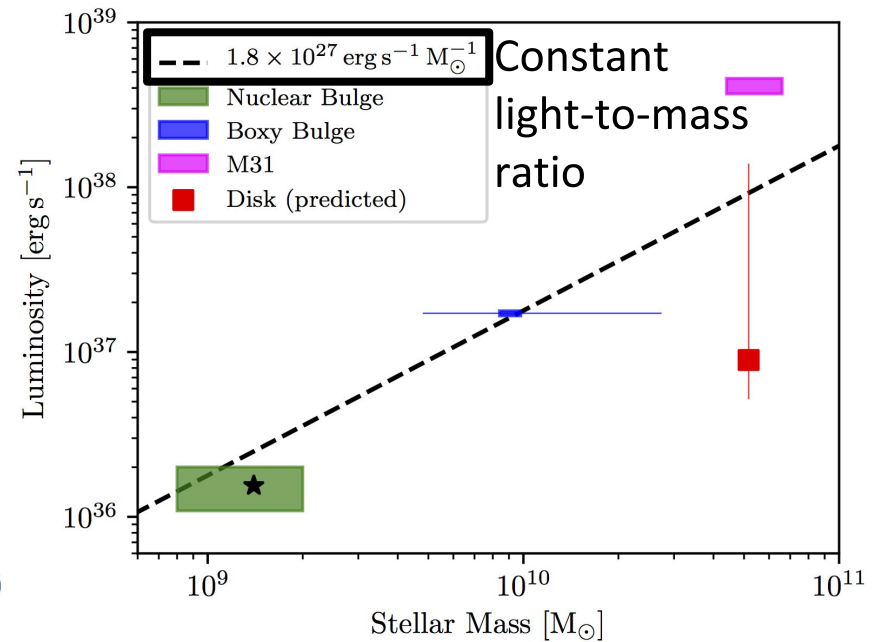


Bartels+[1711.04778](Nat Astro)

# The GCE as a tracer for stellar mass

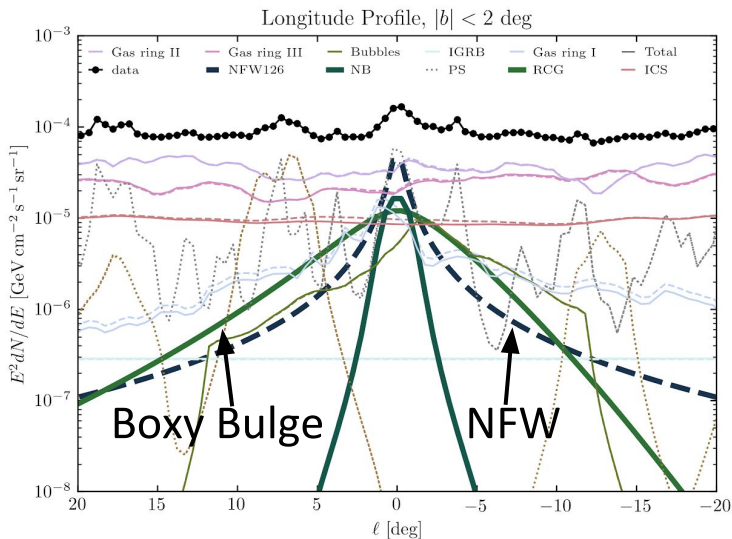
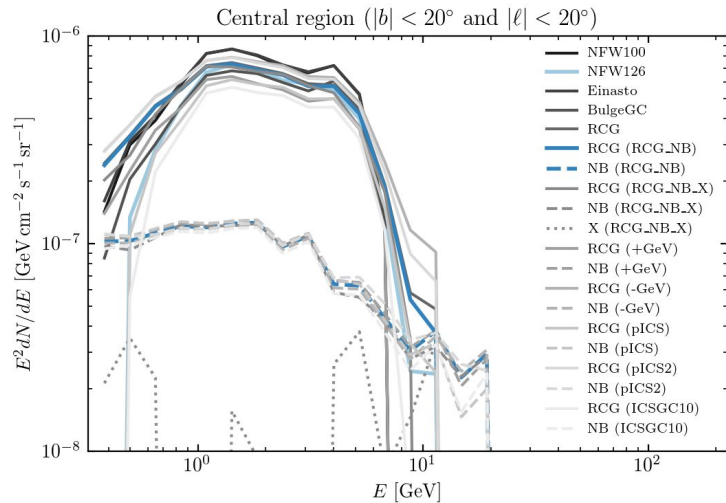


Morphology of the GCE is more oblate



The GCE luminosity scales with stellar mass

# Systematic checks



Bartels+[1711.04778](Nat Astro)

## Results robust to:

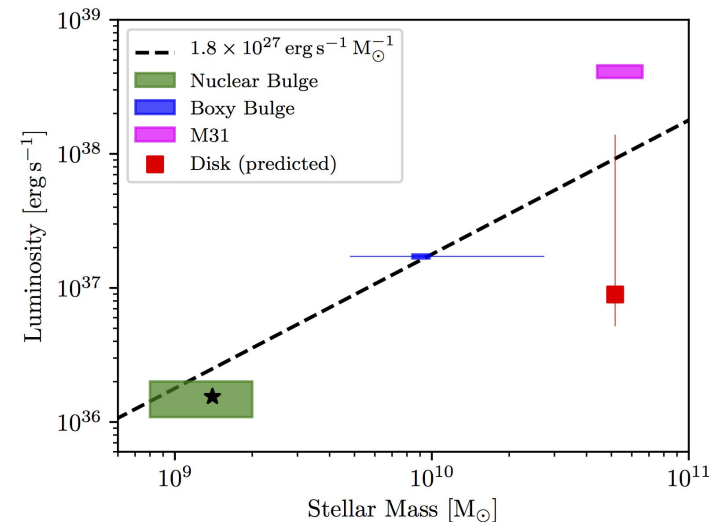
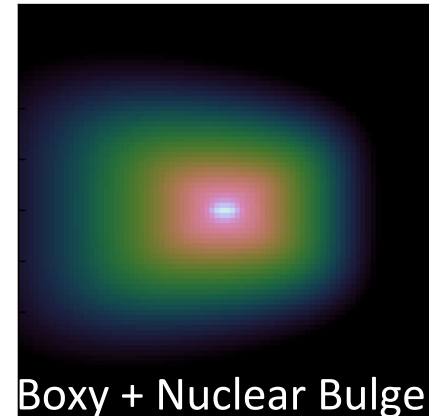
- Inclusion of more point sources (from the 2FIG catalog)
- Changes to the Fermi bubbles spectrum and template
- Additional templates for the CMZ, ICS emission from a central source
- Splitting gas rings into separate HI and CO templates
- Varying the modulation on foreground components

## Stable results require:

- Large enough ROI to discriminate foreground components
- Sufficient spatial modulation to account for intrinsic uncertainty in foreground models

# The GCE as a tracer of stellar mass

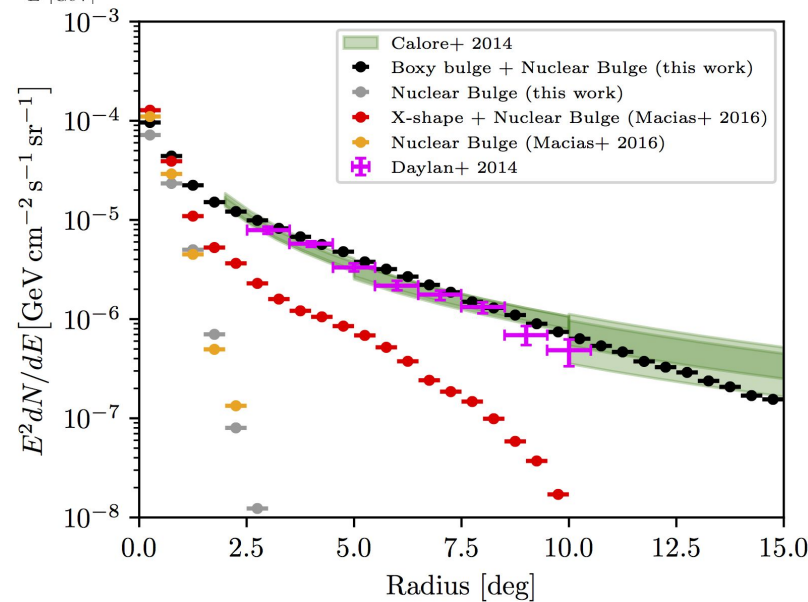
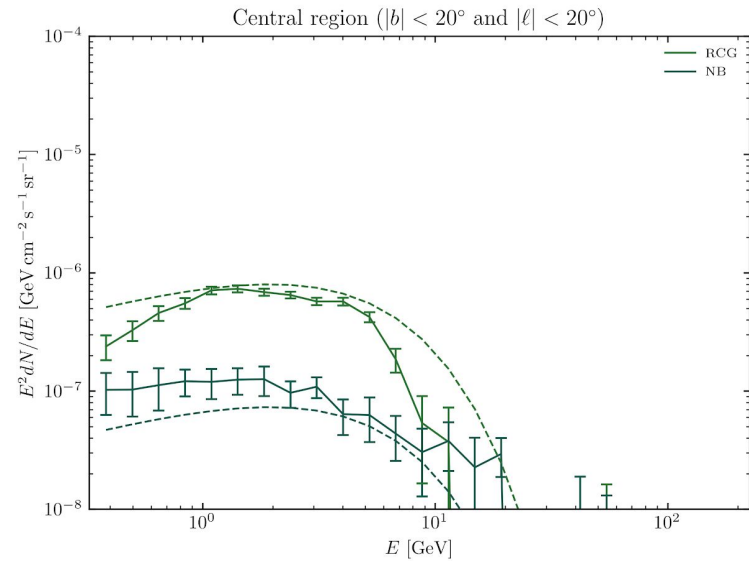
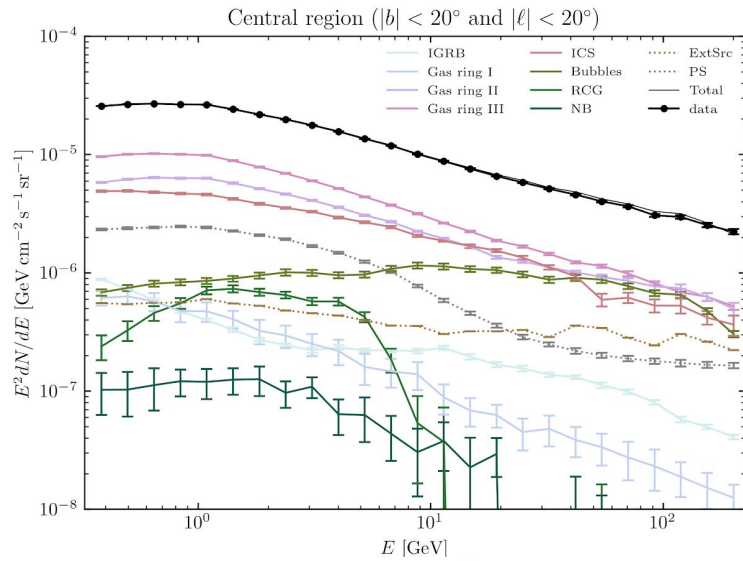
- SkyFACT allows for incorporation of intrinsic uncertainties through adjustable modulation parameters
- GCE traces stellar mass in the Galactic bulge
- Provides further support for point source origin of the GCE
- Future radio/MW surveys will conclusively test this scenario



# Backup Slides

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# Spectra + profile comparison for GCE



# SkyFACT: likelihood + regularization

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Poisson Likelihood:  $\ln \mathcal{L}_P = \sum_{pb} c_{pb} - \mu_{pb} + c_{pb} \ln \frac{\mu_{pb}}{c_{pb}}$

Regularization Likelihood Terms:

$$\begin{aligned} -2 \ln \mathcal{L}_R = & \sum_k \lambda_k \mathcal{R}_X(\tau^{(k)}) + \lambda'_k \mathcal{R}_X(\sigma^{(k)}) + \lambda''_k \mathcal{R}_X(\nu^{(k)}) + \eta_k \mathcal{S}_1(\tau^{(k)}) + \eta'_k \mathcal{S}_2(\sigma^{(k)}) \\ & + \sum_s \lambda'_s \mathcal{R}_X(\sigma^{(s)}) + \lambda''_s \mathcal{R}_X(\nu^{(s)}) + \eta'_s \mathcal{S}_2(\sigma^{(s)}) \end{aligned}$$

Regularization Definitions

$$\lambda \mathcal{R}_{MEM}(x) = 2\lambda \sum_i 1 - x_i + x_i \ln x_i$$

$$\eta \mathcal{S}_1(x) = \eta \sum_{(p,p') \in \mathcal{N}} (\ln x_p - \ln x_{p'})^2 \quad \eta \mathcal{S}_2(x) = \eta \sum_b (\ln x_{b-1} - 2 \ln x_b + \ln x_{b+1})^2$$

# SkyFACT: model

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## Model Definition

$$\theta \equiv (\tau^{(k)}, \sigma^{(k)}, \nu^{(k)}, \sigma^{(s)}, \nu^{(s)})^T \quad \phi^D \equiv (\phi_{bp})$$

$$(\phi^D)_i = (A^{(1)}\theta)_i (A^{(2)}\theta)_i (A^{(3)}\theta)_i$$

A1,A2,A3 = spatial, spectral, normalization

## Expected counts

$$\mu^D = \sum_j P_{ij} (\phi^D)_j (E)_j$$



# SkyFACT: statistics definitions

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Naively:

$$N_{\text{data}} = N_{\text{pix}} \times N_{\text{ebin}} = 360 \times 81 \times 25 = 729000$$

$$N_{\text{DOF}} = N_{\text{data}} - N_{\text{param}}$$

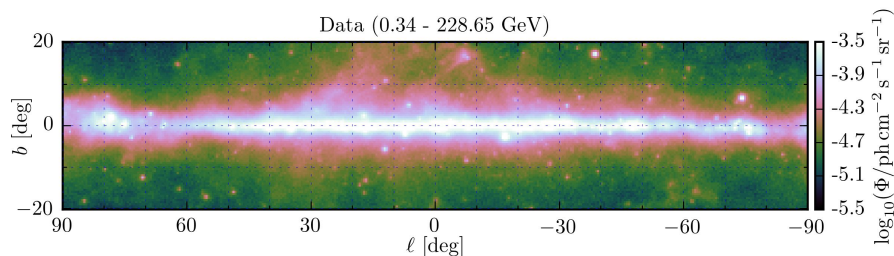
But: non-gaussianity, regularization constraints,  
parameter degeneracies:

$$N_{\text{data}}^{\text{eff}} \equiv \langle -2 \ln \mathcal{L}_P(\theta) \rangle_{\mathcal{D}(\theta)}$$

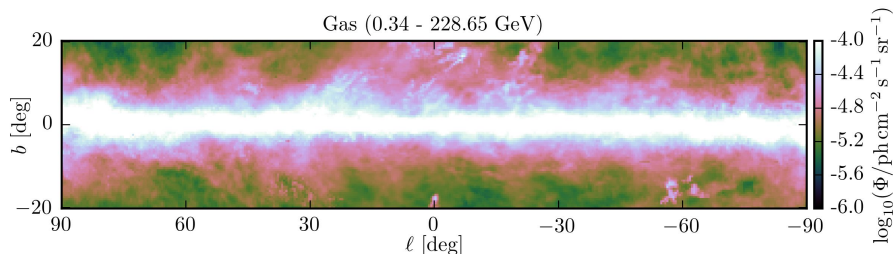
$$N_{\text{DOF}}^{\text{eff}} \sim \langle -2 \ln \mathcal{L}_P \rangle_{\text{mock}}$$

# Example fit with SkyFACT

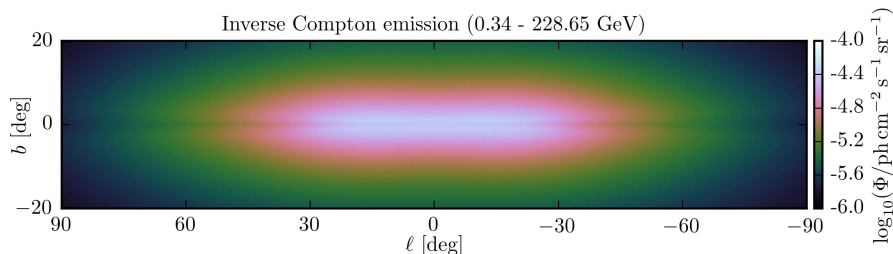
Data:



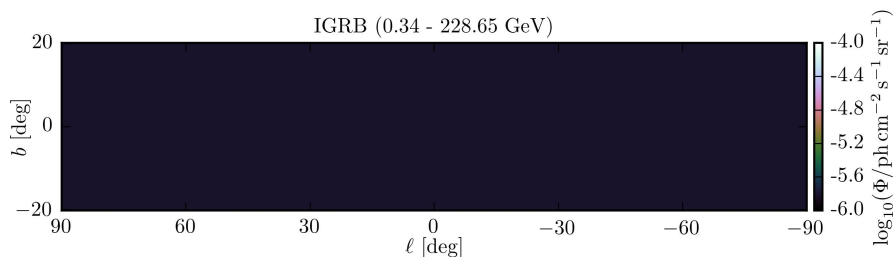
Model:



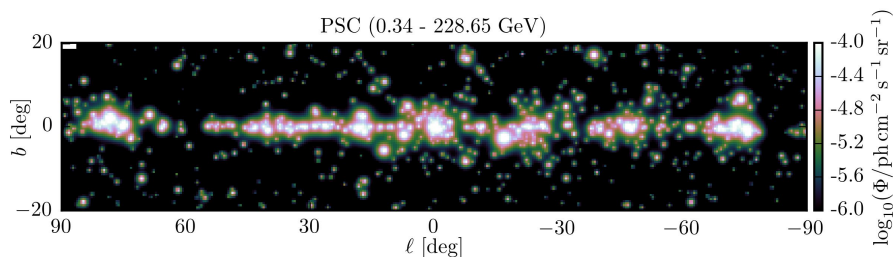
Template: sum of HI and H2 column densities from GALPROP; no dark gas correction  
Spectrum: Fermi-LAT (2012) ApJ 750



Template: ISRF from GALPROP, propagation with DRAGON  
Spectrum: Fermi-LAT (2012) ApJ 750



Spectrum: Fermi-LAT (2015) ApJ 799



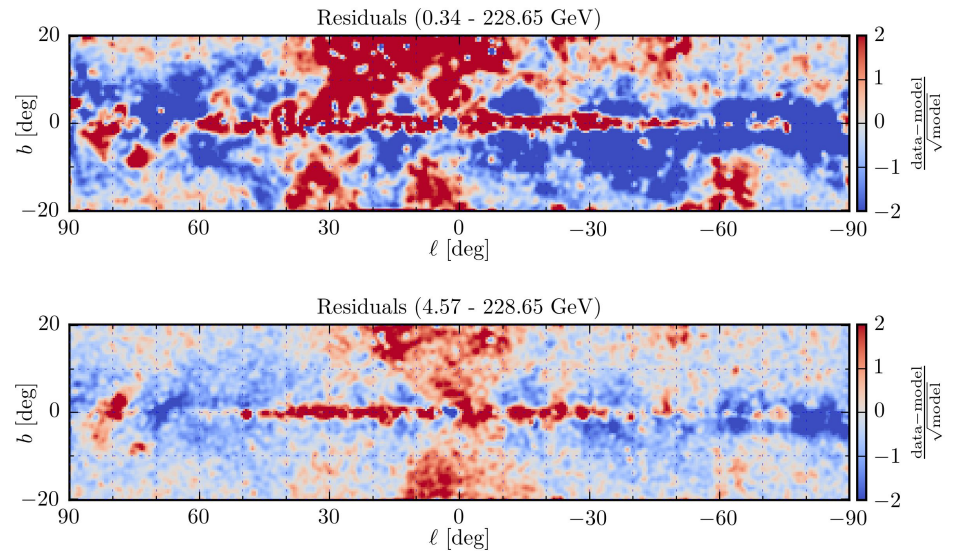
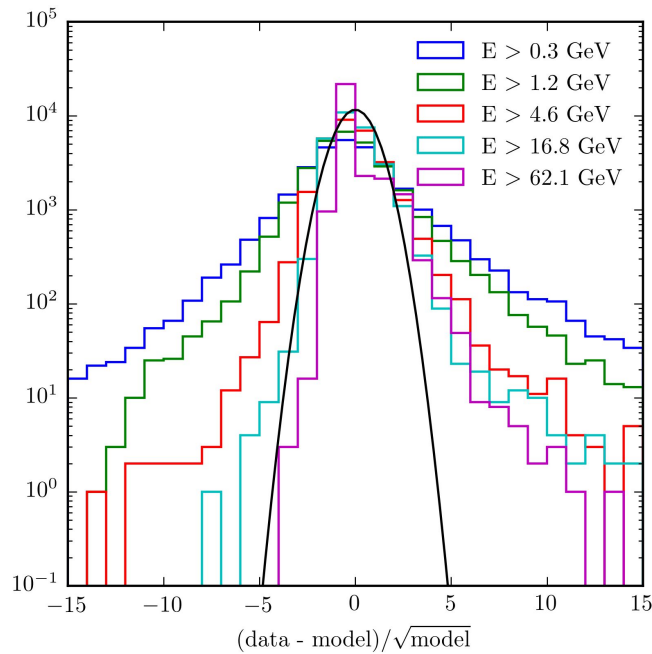
Locations and spectra: 3FGL catalog

# SkyFACT vs the traditional approach

## Fixed templates + constrained spectra

No spatial modulation allowed

~25% variations allowed



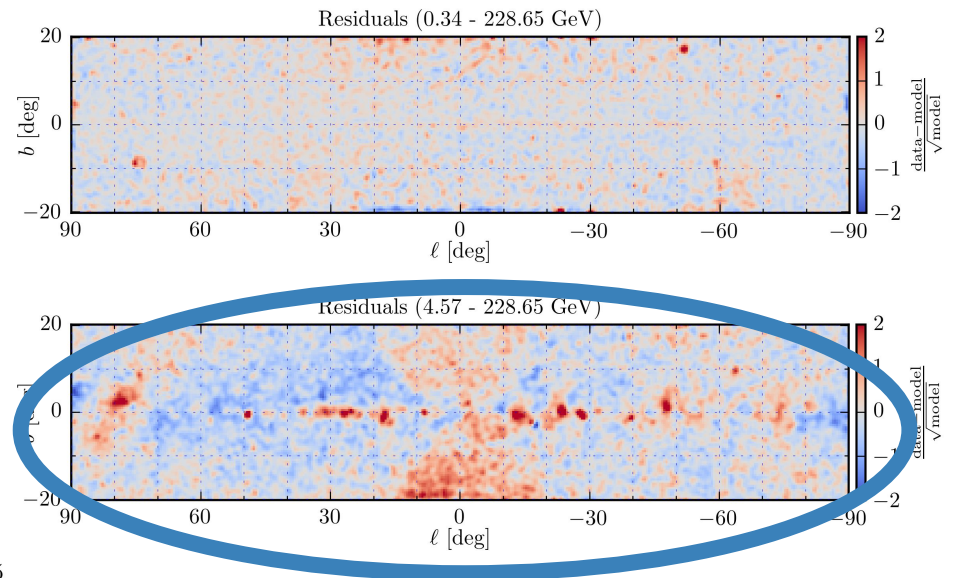
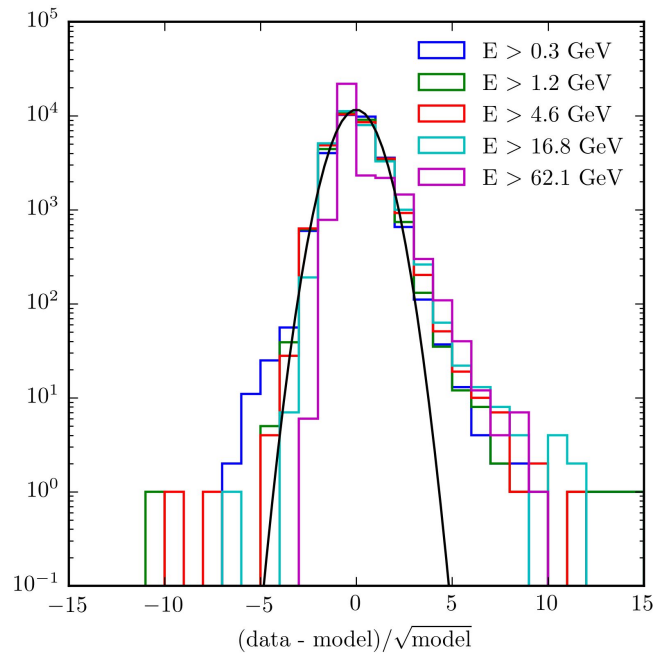
The traditional approach

# Additional necessary components

## Constrained templates + spectra

Spatial modulation: 25% for gas, x2 for ICS

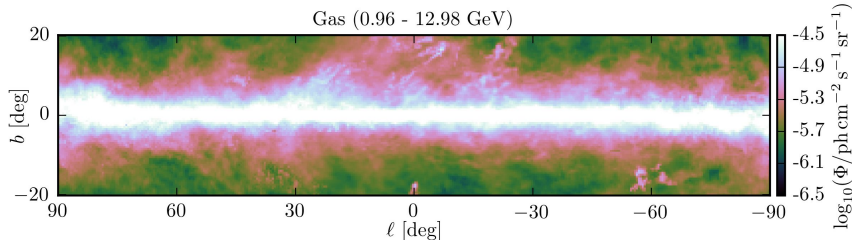
Spectral modulation: 20-25%



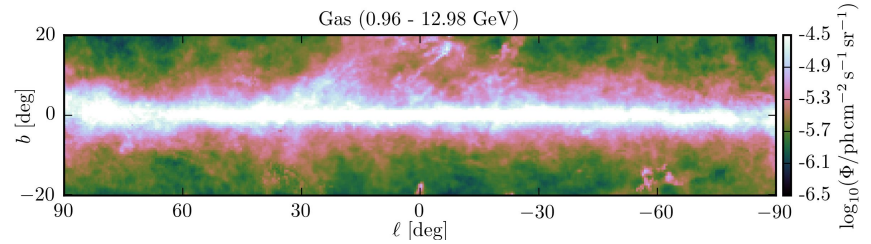
Irreducible residuals  $\rightarrow$  add new components

# SkyFACT: modulation parameters

Original Template



Best-fit Template



Template and Spectra Modulation

