

# Report of the cross-correlation study of the gamma-ray background with HSC clusters

**Daiki Hashimoto** , Atsushi J. Nishizawa,

Hiroyuki Tashiro, Kenji Hasegawa (Nagoya Univ.)

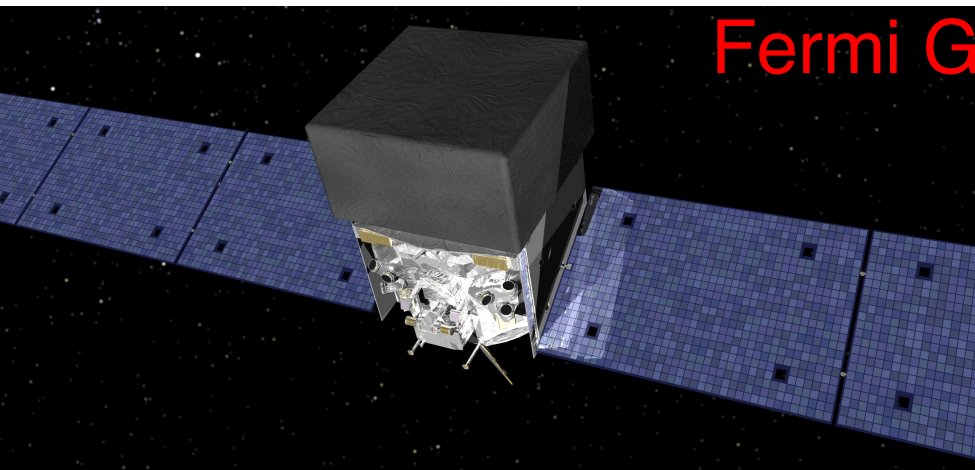
Masato Shirasaki (NAOJ), Musamune Oguri (Univ. of Tokyo)

Shunsaku Horiuchi, Oscar Macias (Virginia Tech.)

# Introduction for Gamma-ray Background

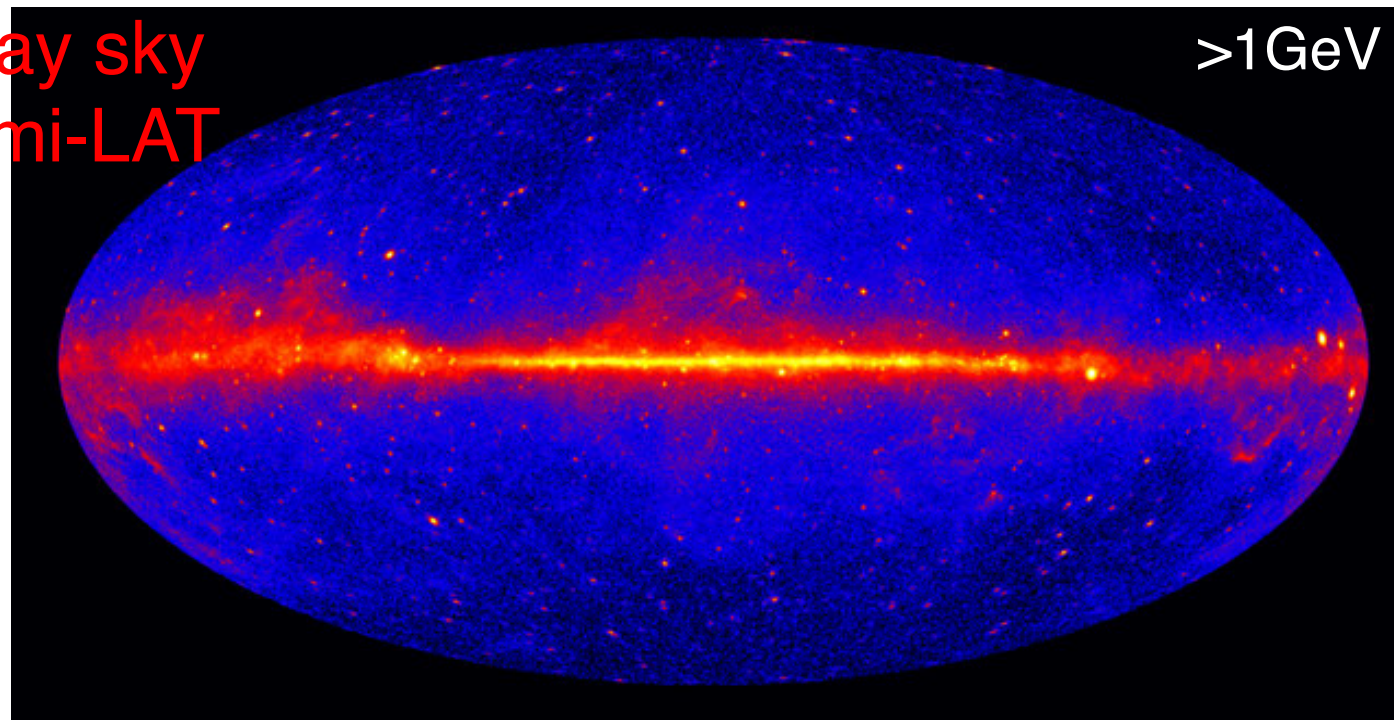
## Fermi Gamma-ray Space Telescope

(launched in 2008)



*Image Credit: NASA*

Fermi gamma-ray sky  
by Fermi-LAT

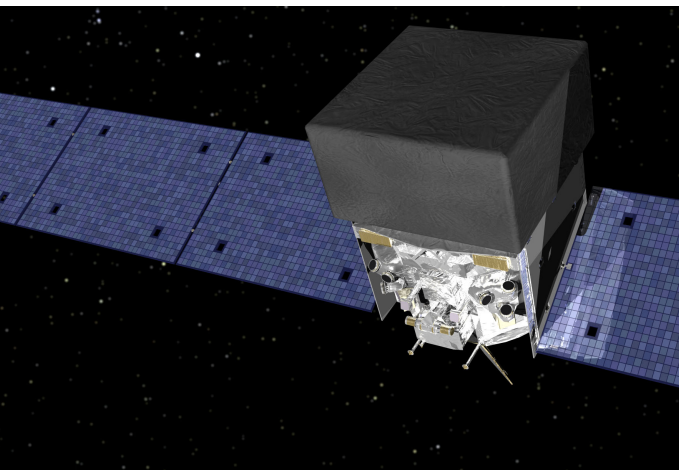


*Image Credit: NASA/DOE/Fermi LAT Collaboration*

# Introduction for Gamma-ray Background

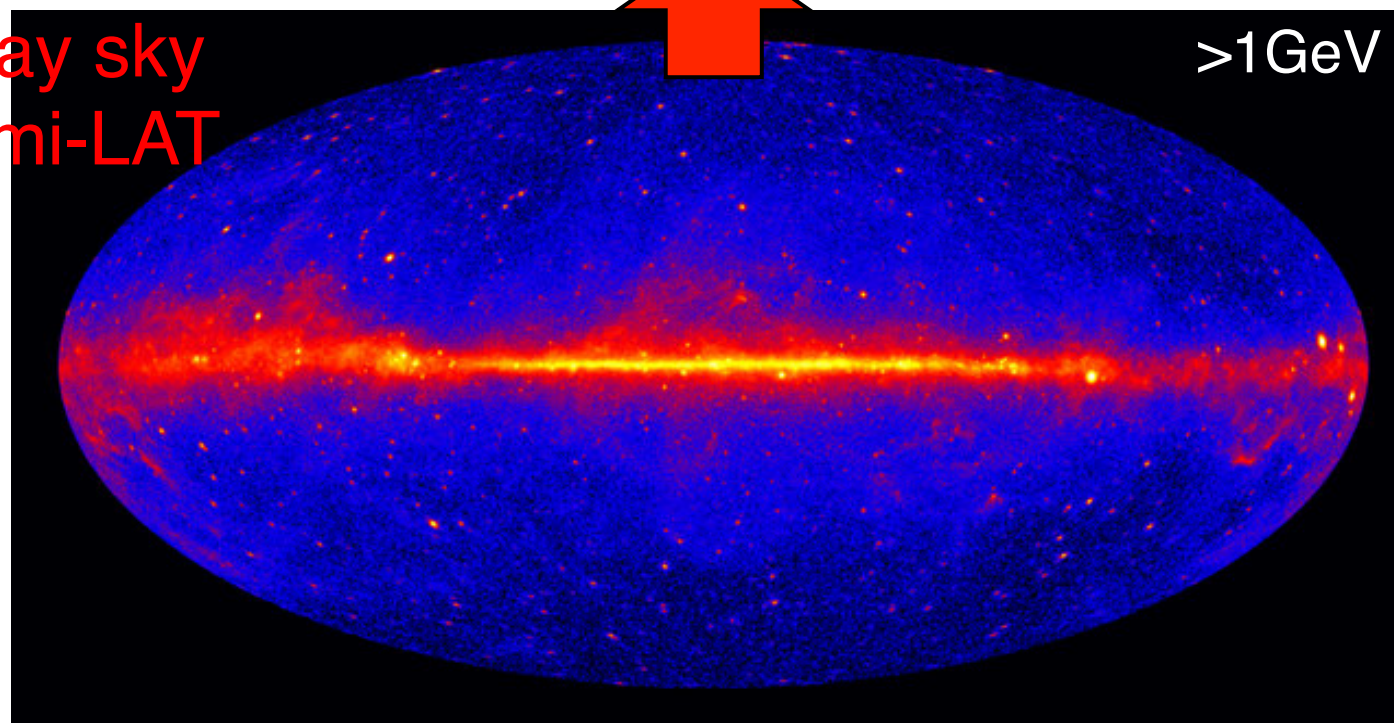
## Fermi Gamma-ray Space Telescope

Remove gamma-ray emission from  
Galactic medium  
&  
Extragalactic resolved point sources



*Image Credit: NASA*

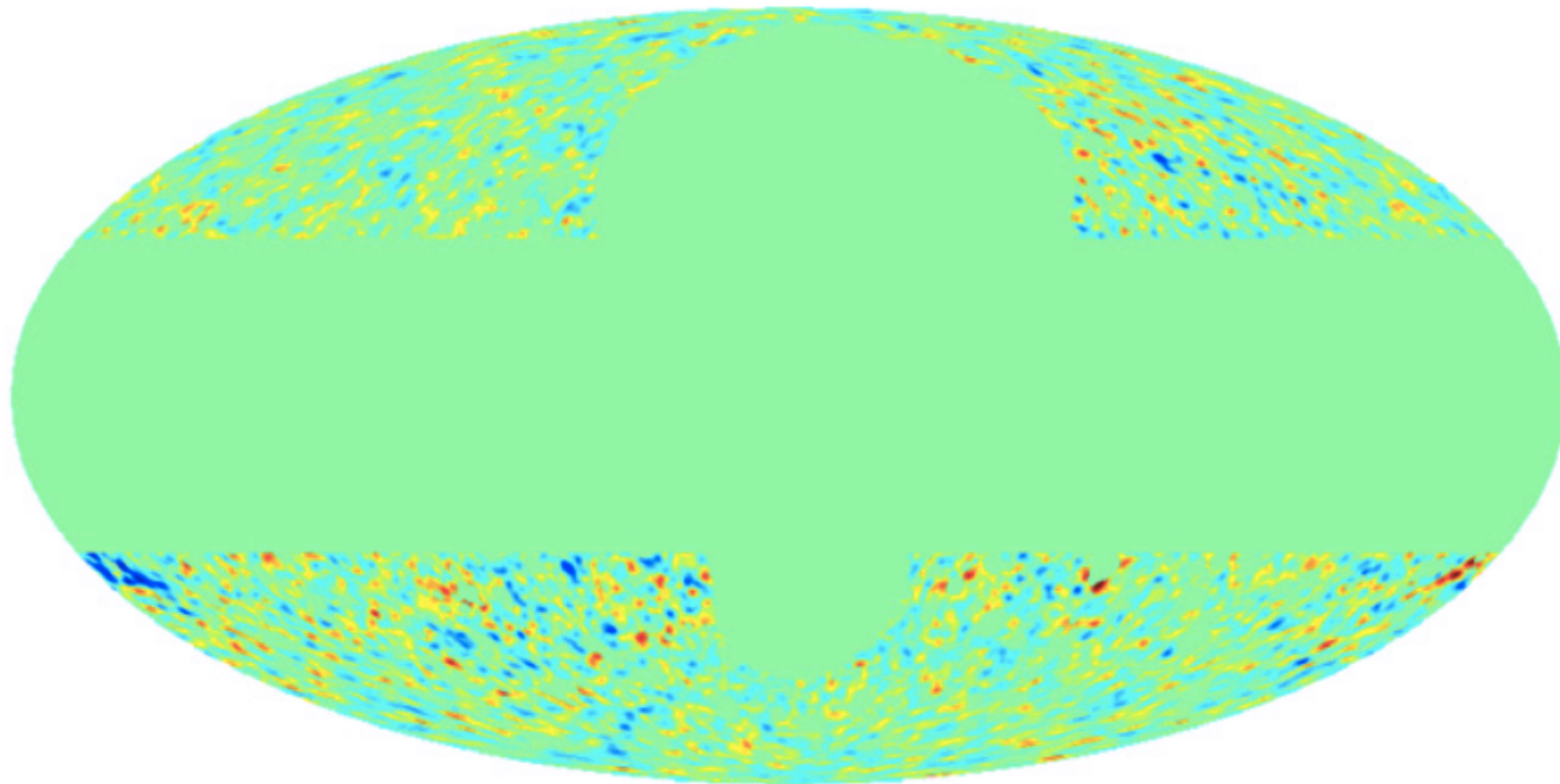
Fermi gamma-ray sky  
by Fermi-LAT



*Image Credit: NASA/DOE/Fermi LAT Collaboration*

# Introduction for Gamma-ray Background

residuals  $E > 1$  GeV

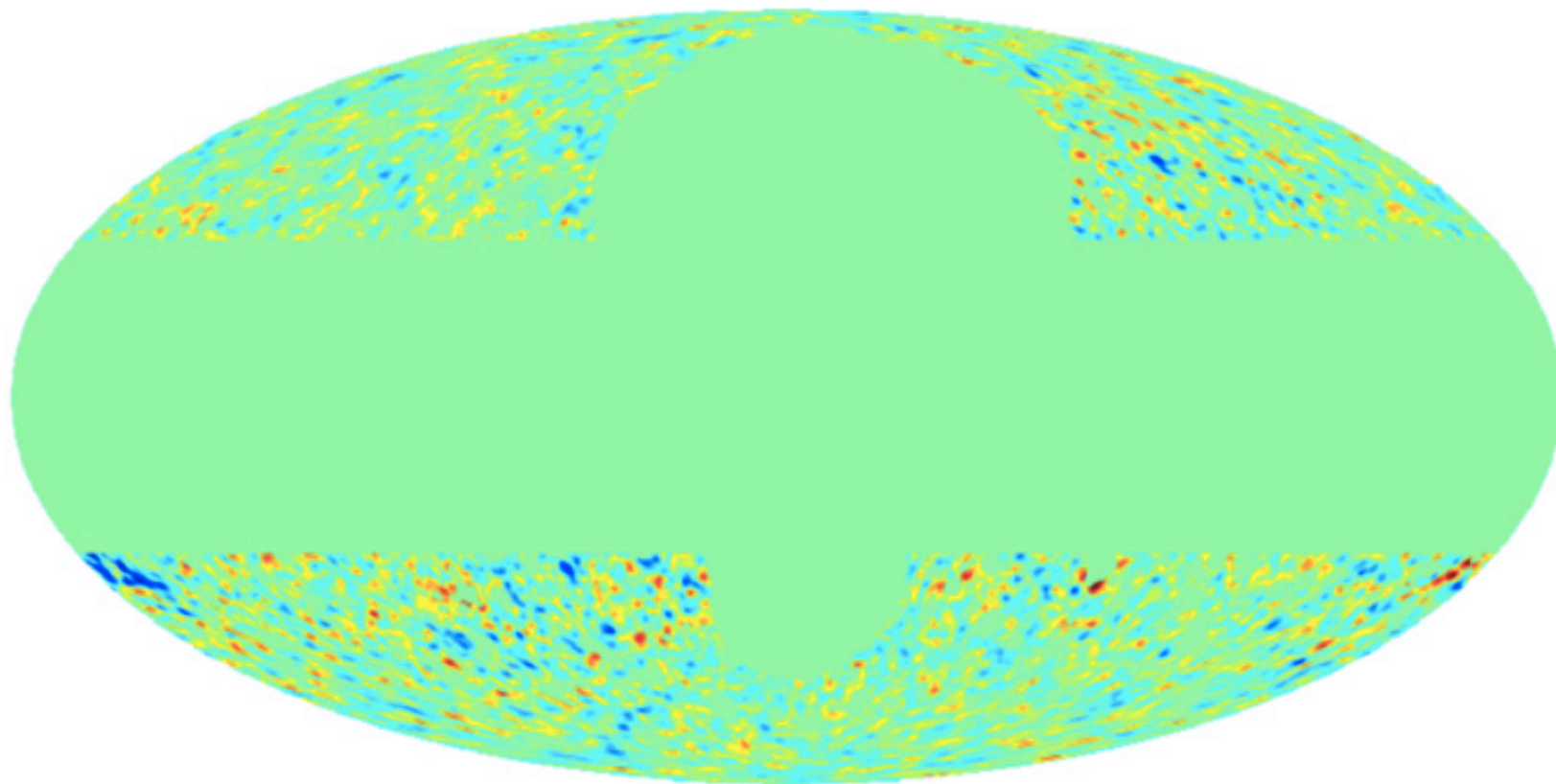


$-1.5e-07$    $1.5e-07$  ph  $\text{cm}^{-2}\text{s}^{-1}\text{sr}^{-1}$

Xia et al. 2015

# Introduction for Gamma-ray Background

residuals  $E > 1 \text{ GeV}$



$-1.5e-07$    $1.5e-07 \text{ ph cm}^{-2} \text{ s}^{-1} \text{ sr}^{-1}$

Xia et al. 2015

## Unresolved Gamma-ray Background (UGRB)

...Extragalactic emission from unresolved sources containing astronomical or unknown objects

# Introduction for Gamma-ray Background

residuals  $E > 1 \text{ GeV}$

## Motivation for probing nature or origins of UGRB:

- reveal the nature of high energy phenomena like AGN
- lead to probe exotic matters like annihilating or decaying dark matter

$-1.5e-07$    $1.5e-07 \text{ ph cm}^{-2}\text{s}^{-1}\text{sr}^{-1}$   
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## Unresolved Gamma-ray Background (UGRB)

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# Introduction for Gamma-ray Background

residuals  $E > 1$  GeV



## Motivation for probing nature or origins of UGRB:

- reveal the nature of high energy phenomena like AGN
- lead to probe exotic matters like annihilating or decaying dark matter

## What is associated with UGRB ?

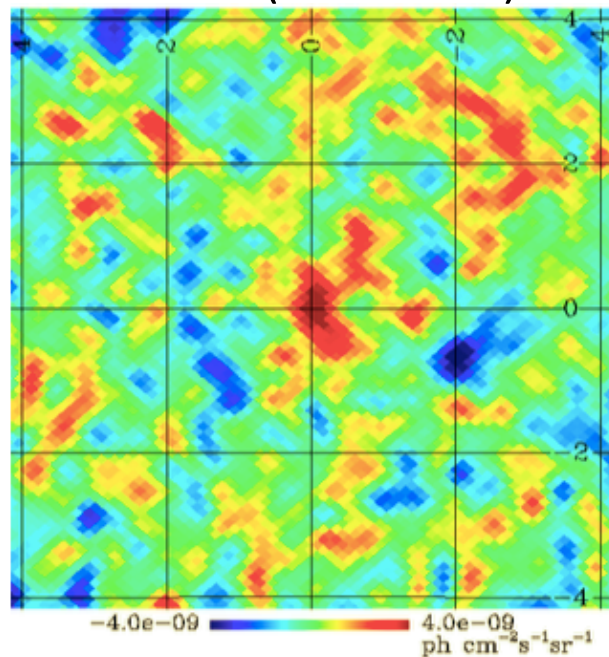
- large scale structure, galaxy cluster or galaxy

# Previous Work *Branchini et al.(2017)*

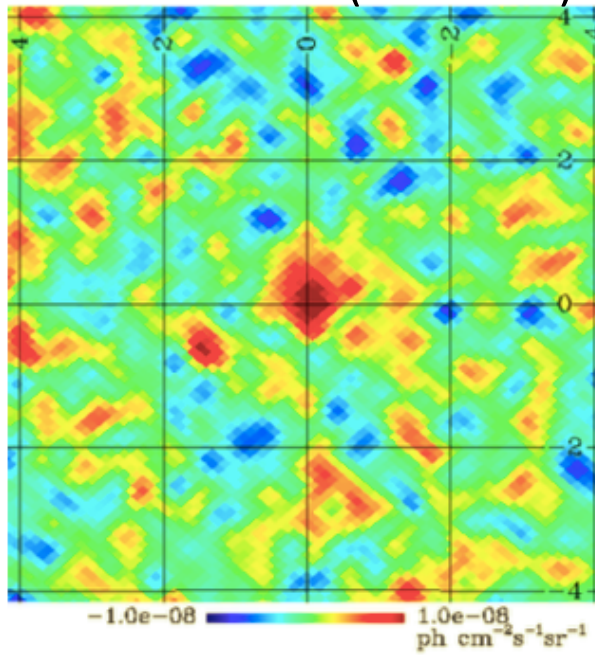
## Stacking Analysis & Cross-Correlation Analysis of UGRB with 3 galaxy cluster catalogs

### Stacked Image

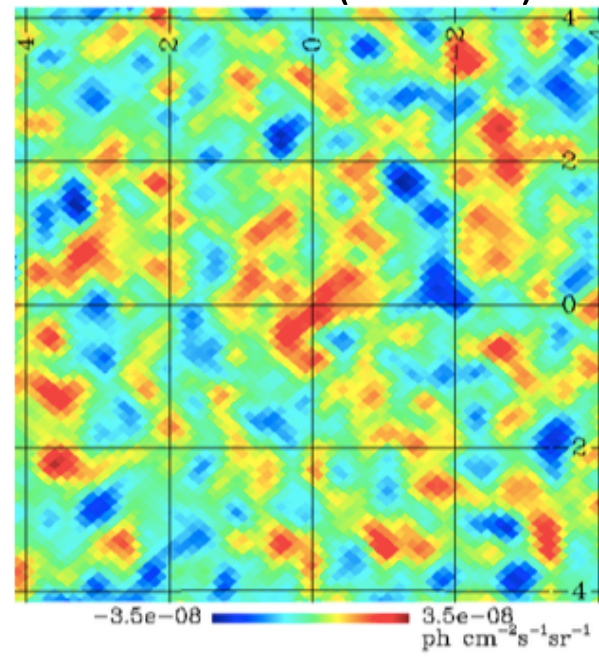
WHL12 (N=158103)



redMaPPer (N=26350)



PlanckSZ (N=1653)



gamma-ray energy : 1-10GeV

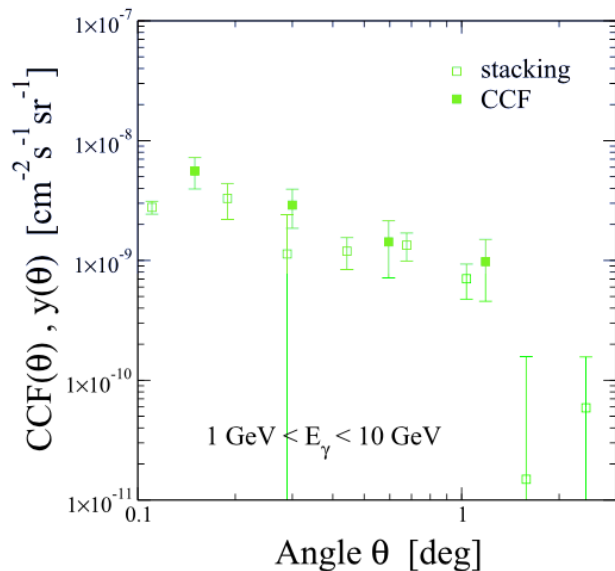


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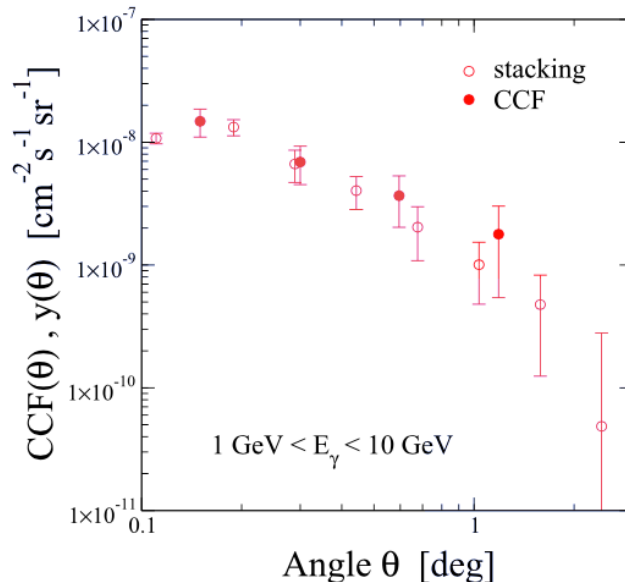
## Stacking Analysis & Cross-Correlation Analysis of UGRB with 3 galaxy cluster catalogs

### Cross-Correlation Analysis

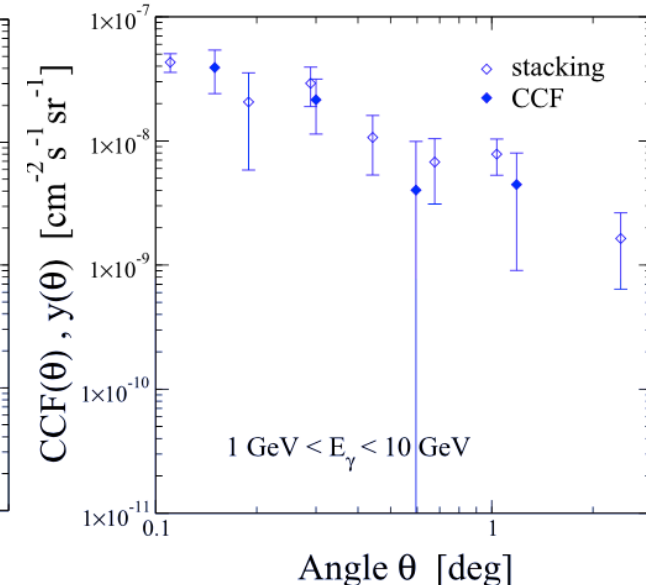
WHL12 (N=158103)



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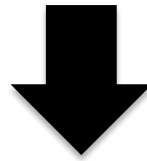


gamma-ray energy : 1-10GeV

# This Work

Probe association of UGRB with galaxy clusters

Data set : *HSC cluster catalog (CAMIRA)*  
*UGRB by Fermi-LAT*



To detect the correlation signal...

Analysis : *Stacking Analysis*  
*Cross-Correlation Analysis*

+ Additional study

# Data: HSC cluster & UGRB map

- HSC cluster catalog (*CAMIRA* catalog)

Number of clusters :  $\sim 4000$

Area size :  $\sim 200 \text{ deg}^2$

Redshift range :  $0.1 < z < 1.1$

- UGRB map (*Fermi-LAT*)

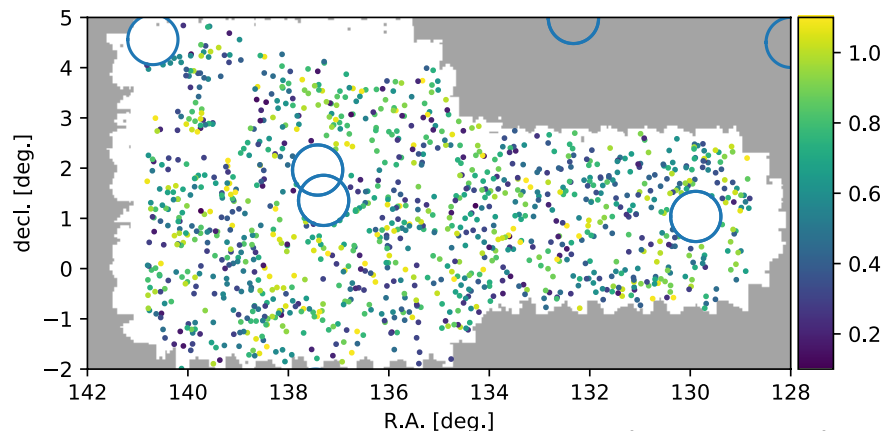
Energy range : 1-100 GeV

Fermi-PSF :

$< \sim 1.0 \text{ deg}$  ( $1 \text{ GeV} < E < 10 \text{ GeV}$ )

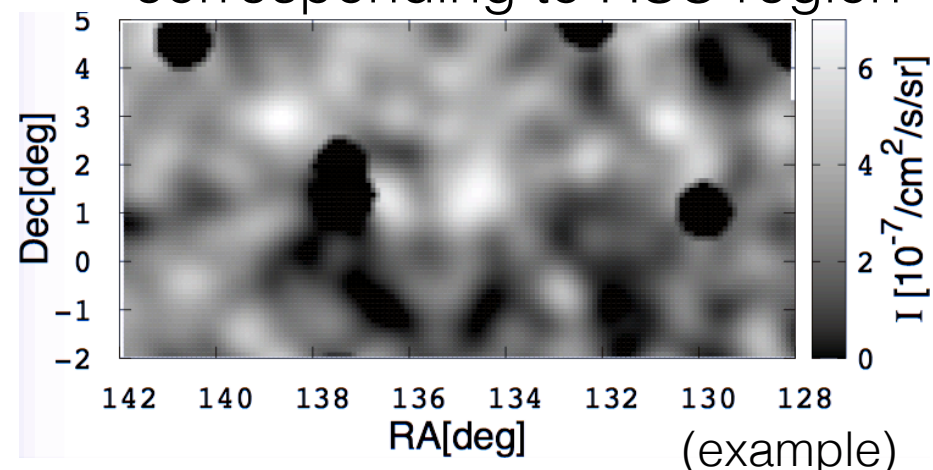
$\sim 0.2 \text{ deg}$  ( $E > 10 \text{ GeV}$ )

HSC-cluster distribution



(example)

UGRB intensity map  
corresponding to HSC region

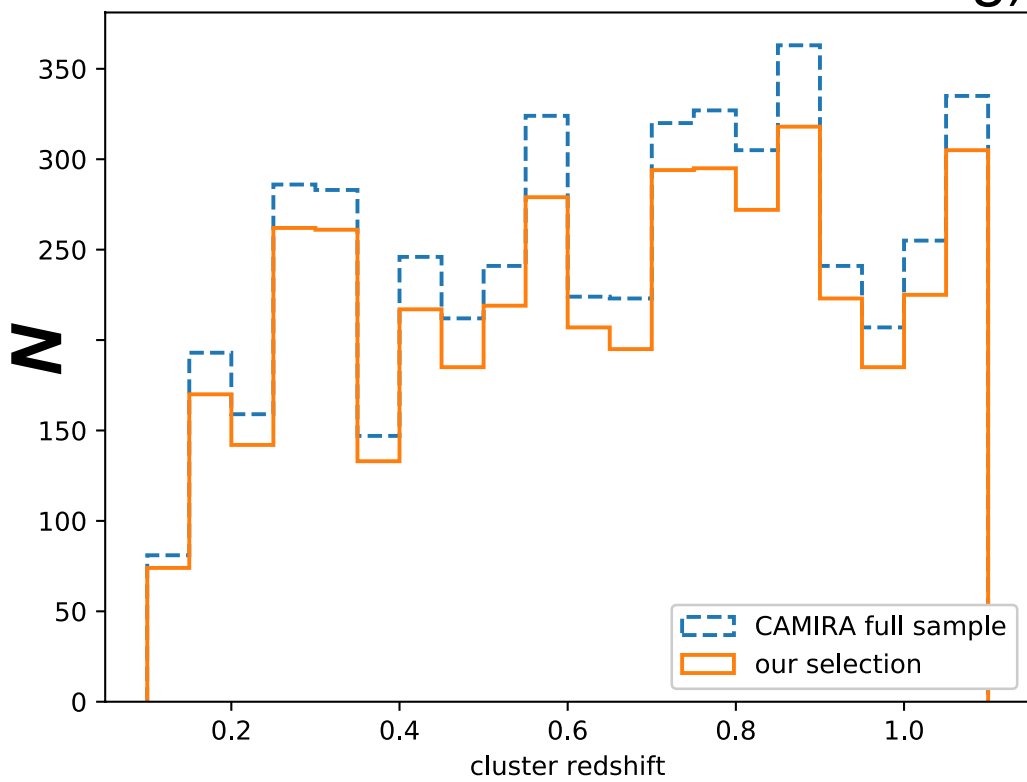


(example)

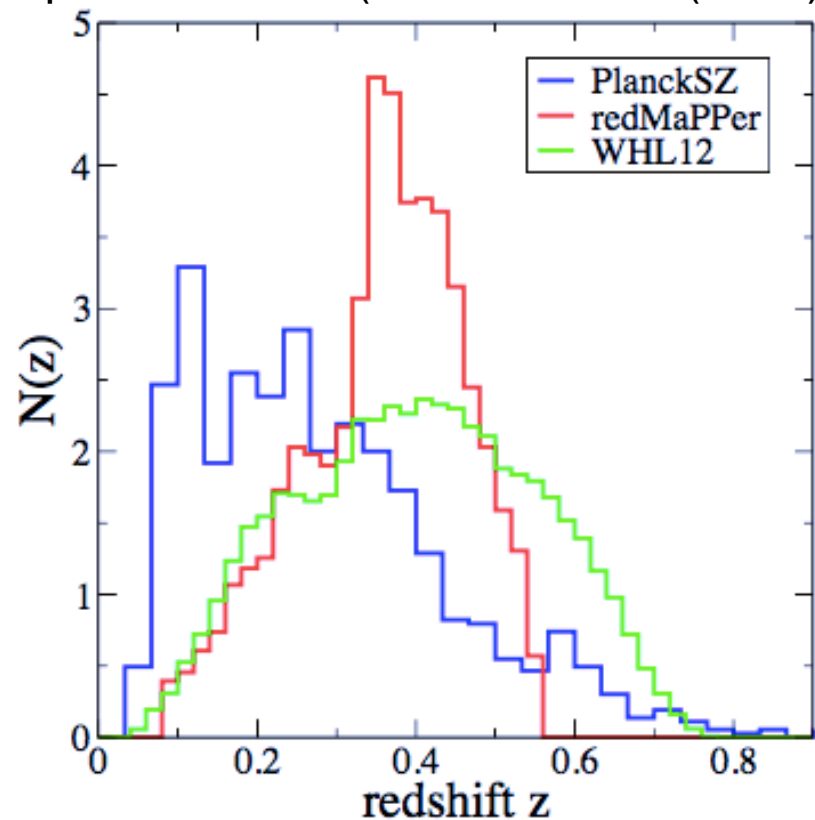
# Data: HSC cluster & UGRB map

## Redshift Distribution

This work (HSC cluster catalog)



previous work (Branchini et al.(2017))



# Data: HSC cluster & UGRB map

- HSC cluster catalog (*CAMIRA* catalog)

Number of clusters :  $\sim 4000$

Area size :  $\sim 200 \text{ deg}^2$

Redshift range :  $0.1 < z < 1.1$

- UGRB map (*Fermi-LAT*)

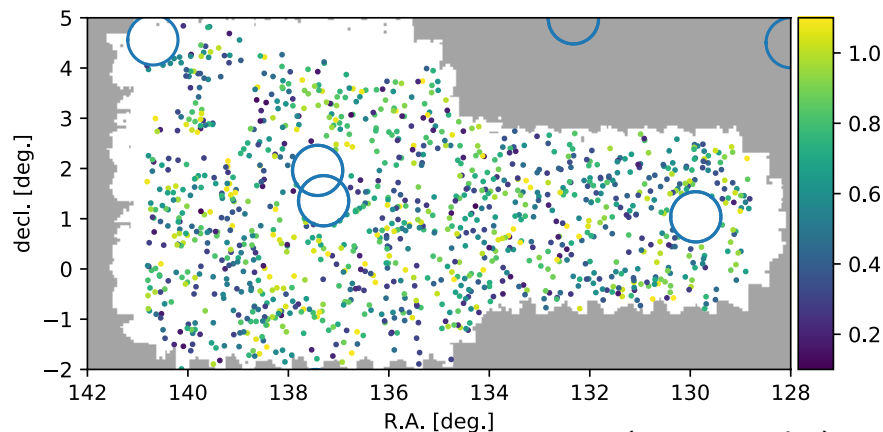
Energy range :  $1\text{-}100 \text{ GeV}$

Fermi-PSF :

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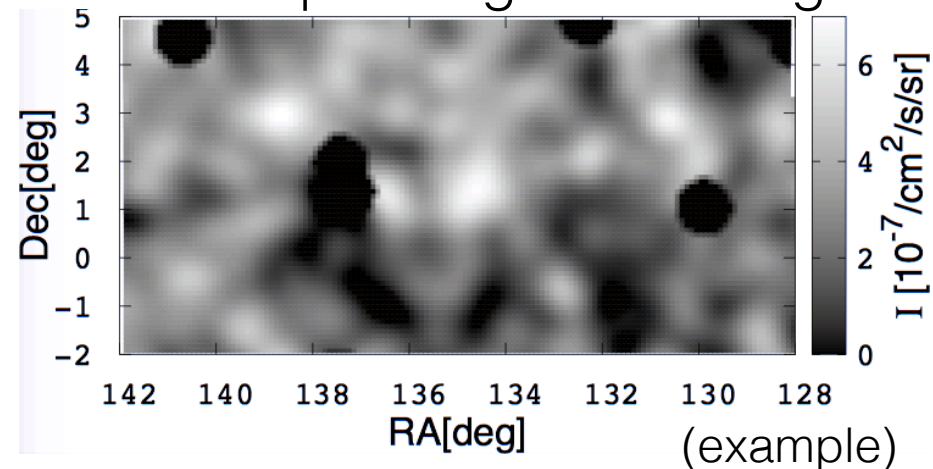
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HSC-cluster distribution



(example)

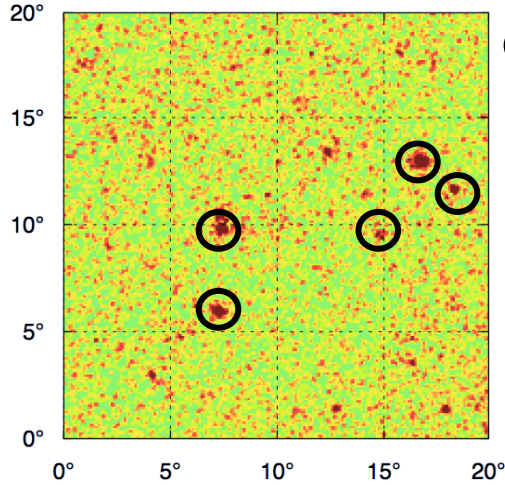
UGRB intensity map  
corresponding to HSC-region



(example)

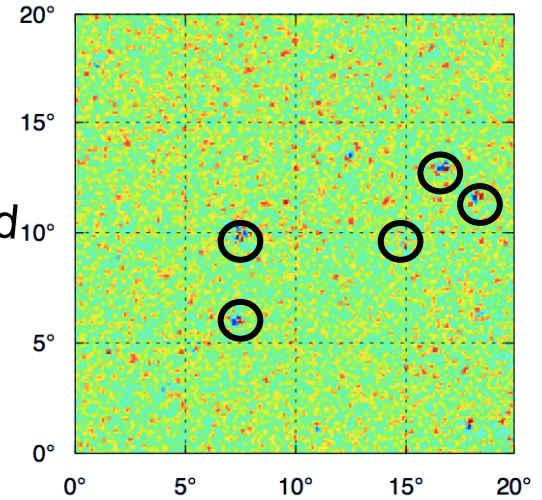
# Construction of UGRB Map

*raw data*

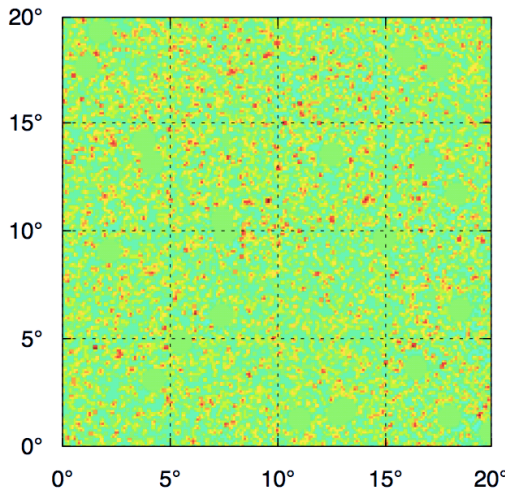


○ : point source

subtract Galactic foreground  
by 4 foreground models

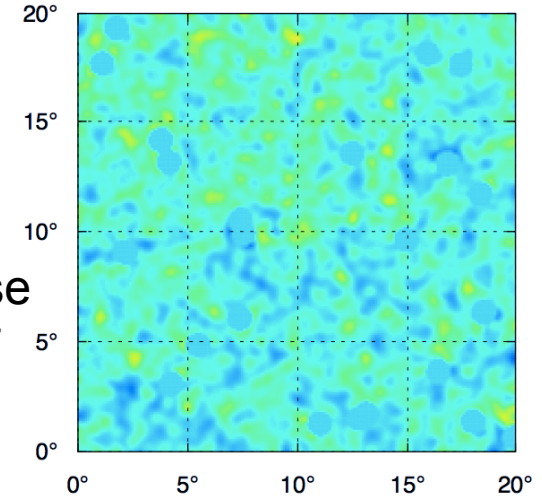


mask around point source



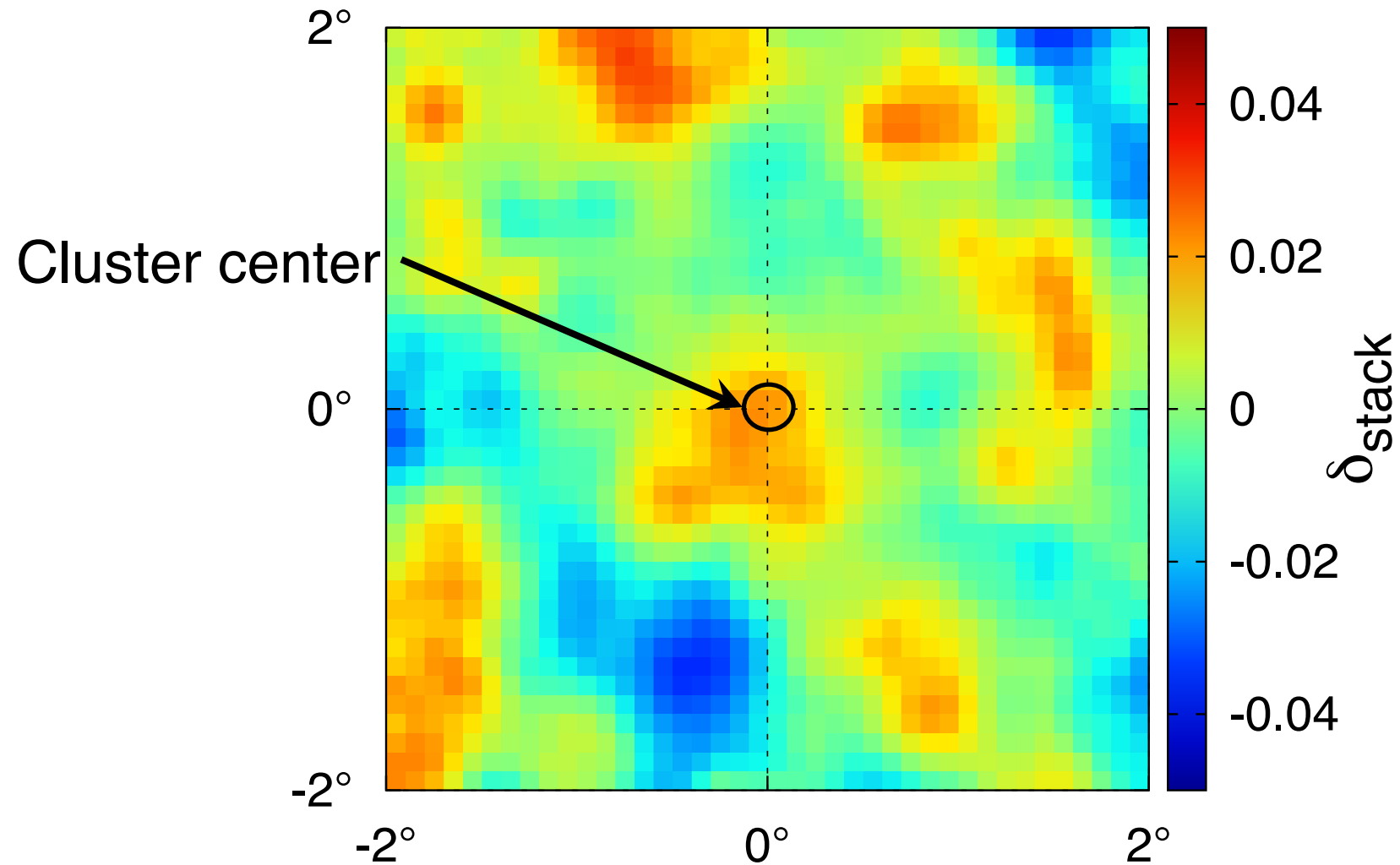
apply Gaussian smoothing  
to remove effects shot noise  
and to consider Fermi PSF

*UGRB map we analyze*



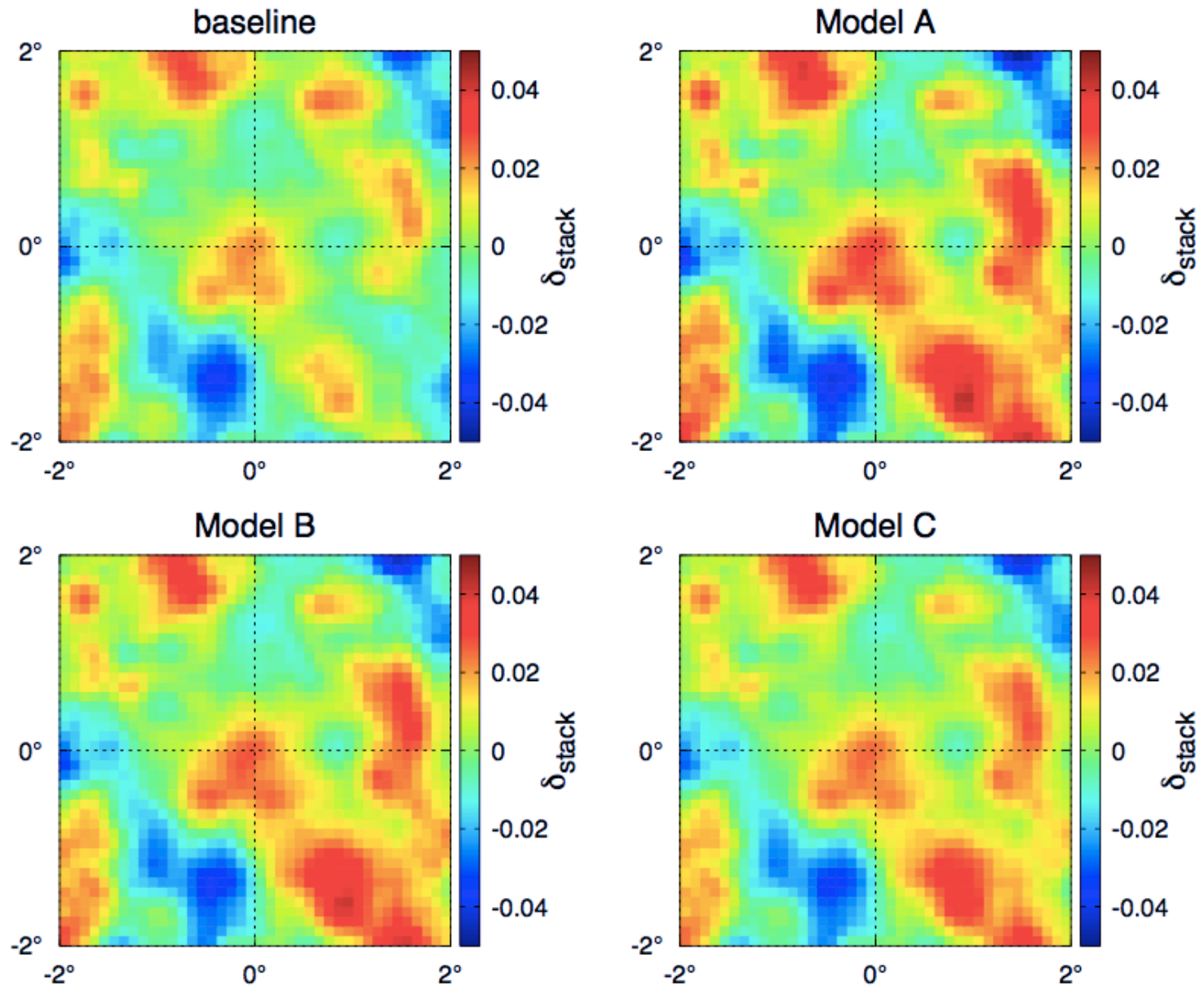
# Stacking Analysis

Fluctuation field of UGRB around cluster position



# Stacking Analysis

Fluctuation field of UGRB using different Galactic foreground models

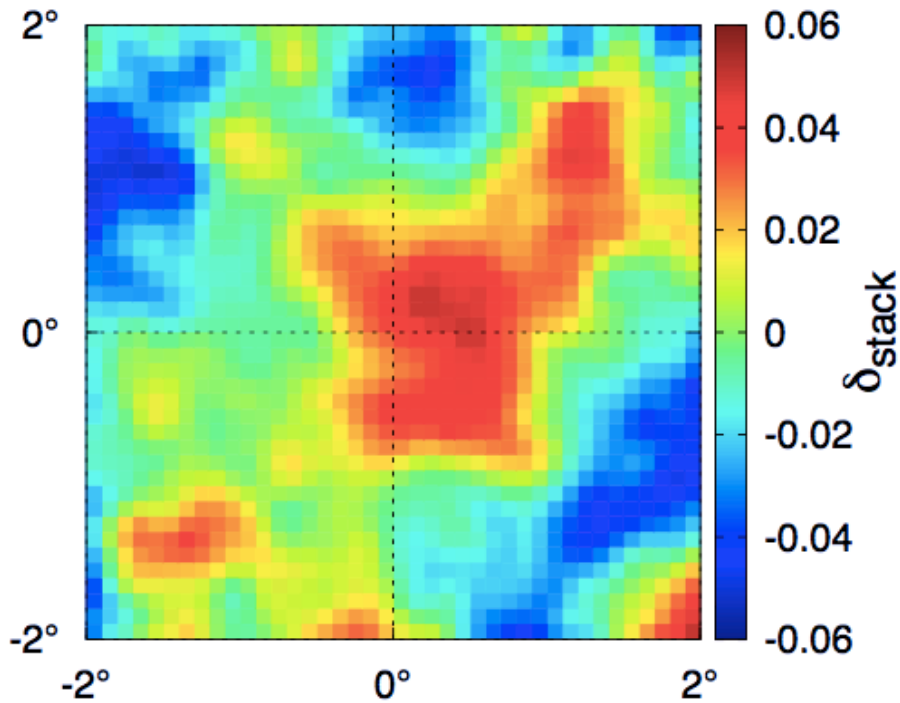




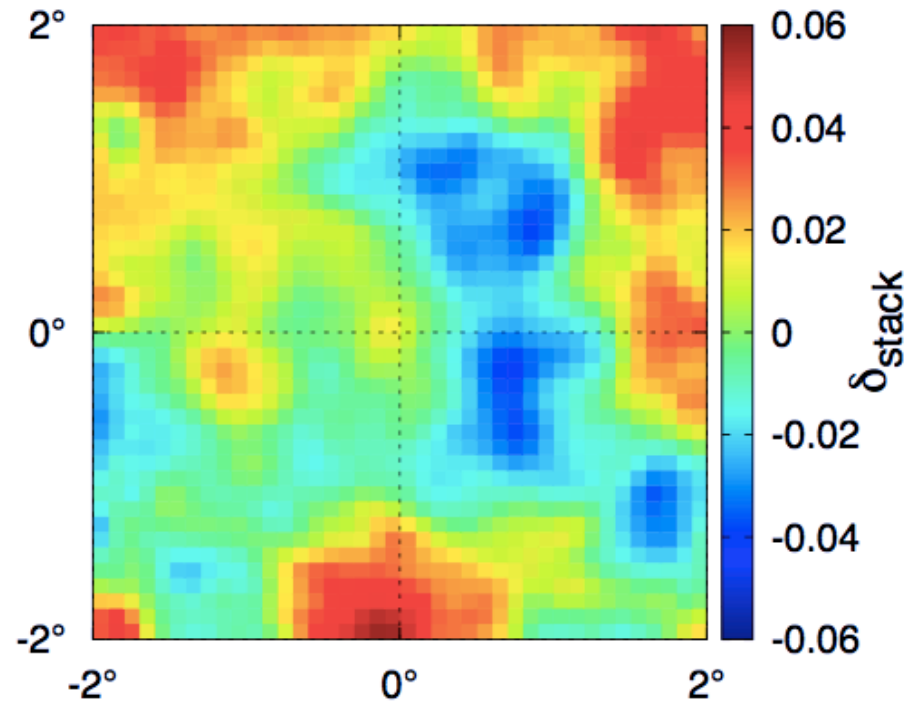
# Stacking Analysis

Fluctuation field of UGRB using low-z clusters and high-z clusters

$0.1 < z < 0.6$

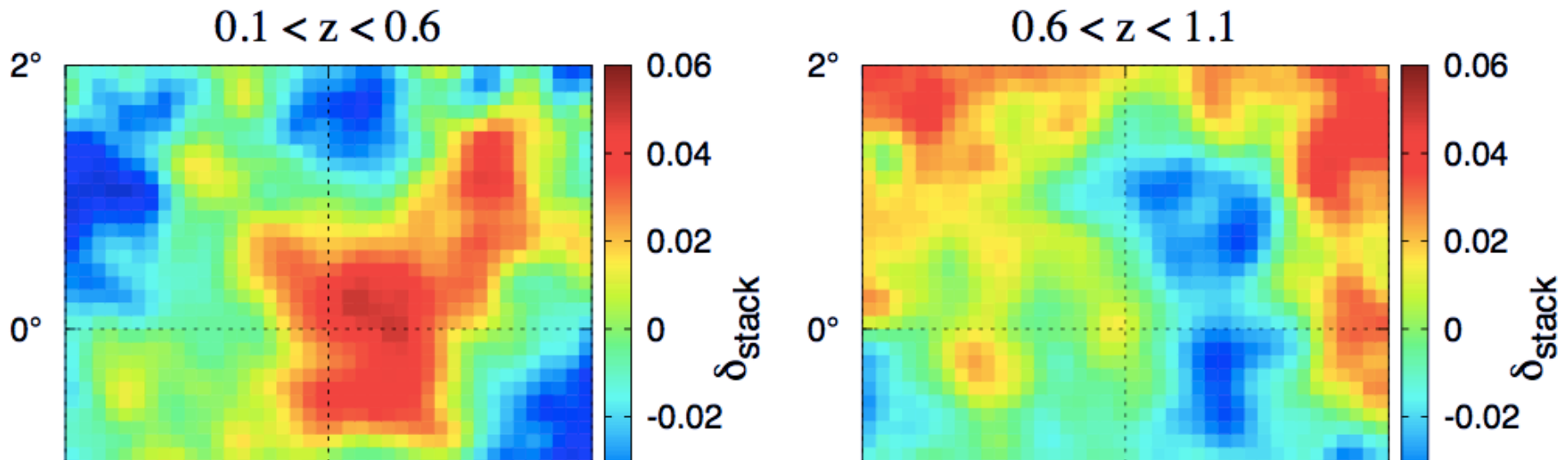


$0.6 < z < 1.1$



# Stacking Analysis

Fluctuation field of UGRB using low-z clusters and high-z clusters



The average separation of the CAMIRA clusters is  **$\sim 0.2$  degrees**.  
It is much smaller than the image size of **4 degrees**.

→ Some photons appear multiple times  
at different positions in the stacked image.

So we **NOT** perform quantitative analysis using this result.

# Cross-Correlation Analysis

**2-point angular cross-correlation function:  $\xi(\theta)$**

$\xi(\theta)$  : Correlation of UGRB intensity with cluster position  
with separation angle  $\theta$  from cluster center

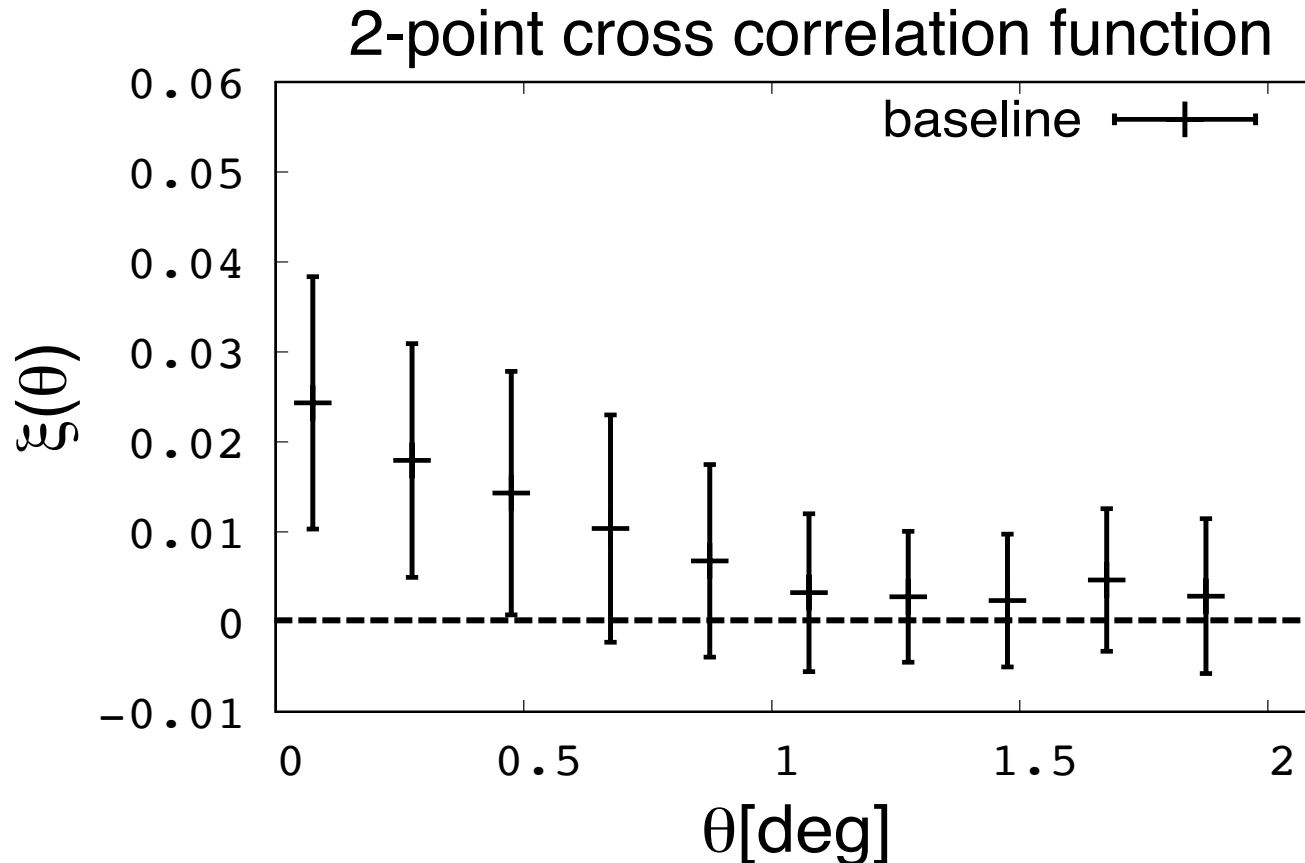
$$\xi(\theta) = \langle n_{clu}(0) \delta_\gamma(\theta) \rangle$$

$n_{clu}(0)$  : number density of clusters at  $\theta=0$  ( $\because n_{clu}(0) = 1$ )

$$\delta_\gamma(\theta) = \frac{I(\theta) - \bar{I}}{\bar{I}}$$

\* We use the Landy-Szalay estimator to compute  $\xi(\theta)$ ,  
the Jackknife method to estimate statistical errors

# Cross-Correlation Analysis

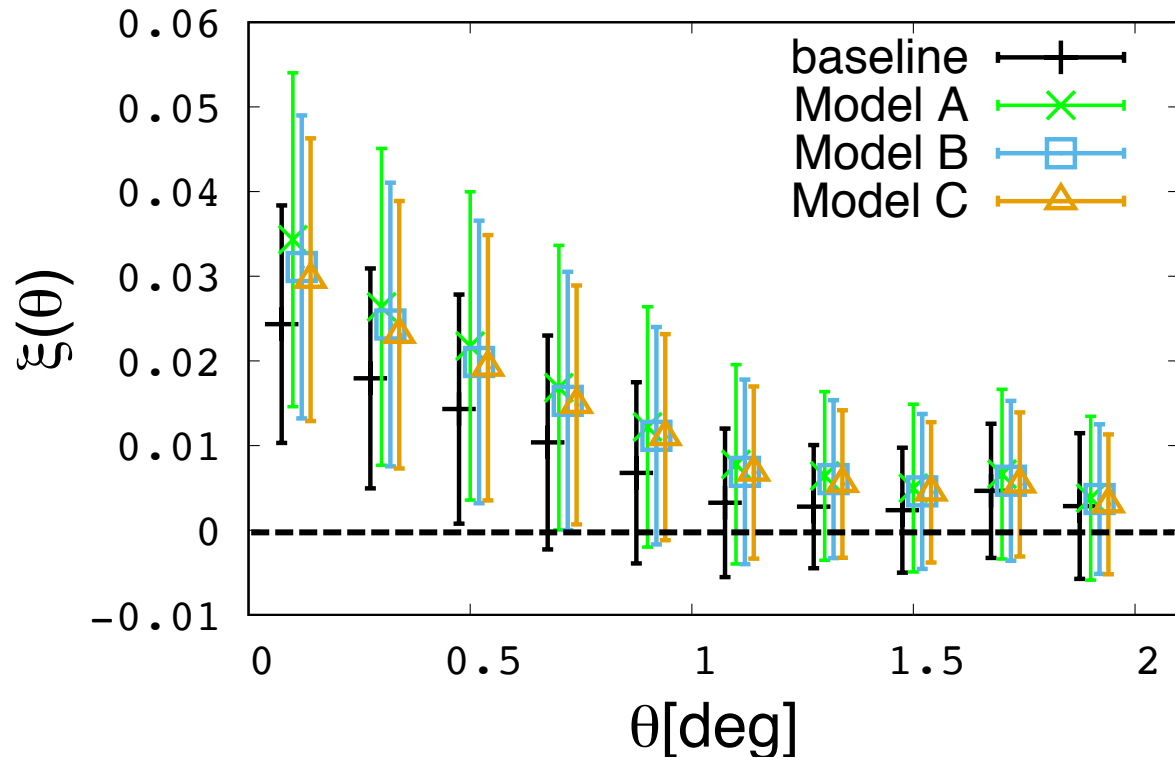


## Statistical significance

redshift range	baseline	Model A	Model B	Model C
$0.1 < z < 1.1$	2.2	2.0	2.0	2.0
$0.1 < z < 0.6$	2.2	2.1	2.1	2.3
$0.6 < z < 1.1$	1.9	1.6	1.6	1.6

# Cross-Correlation Analysis

Cross-correlation function using different Galactic foreground models



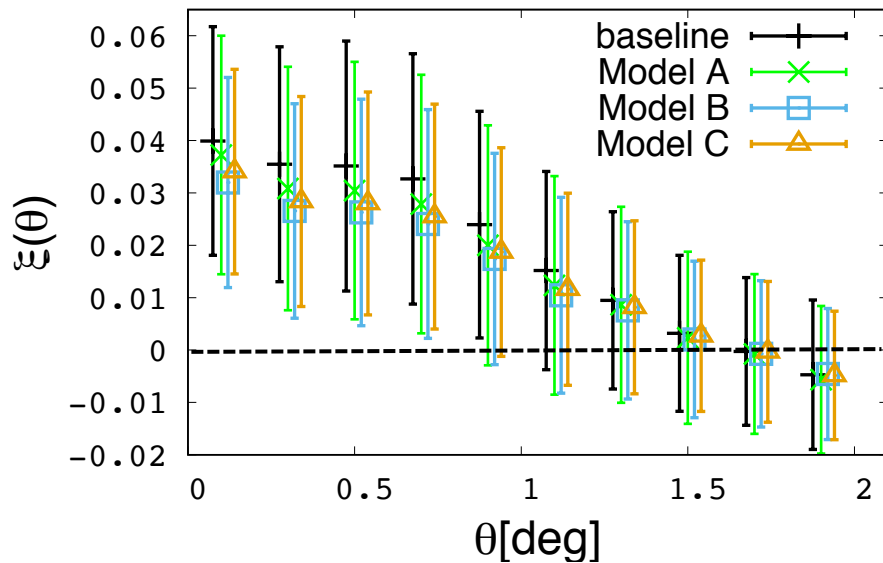
## Statistical significance

redshift range	baseline	Model A	Model B	Model C
$0.1 < z < 1.1$	2.2	2.0	2.0	2.0
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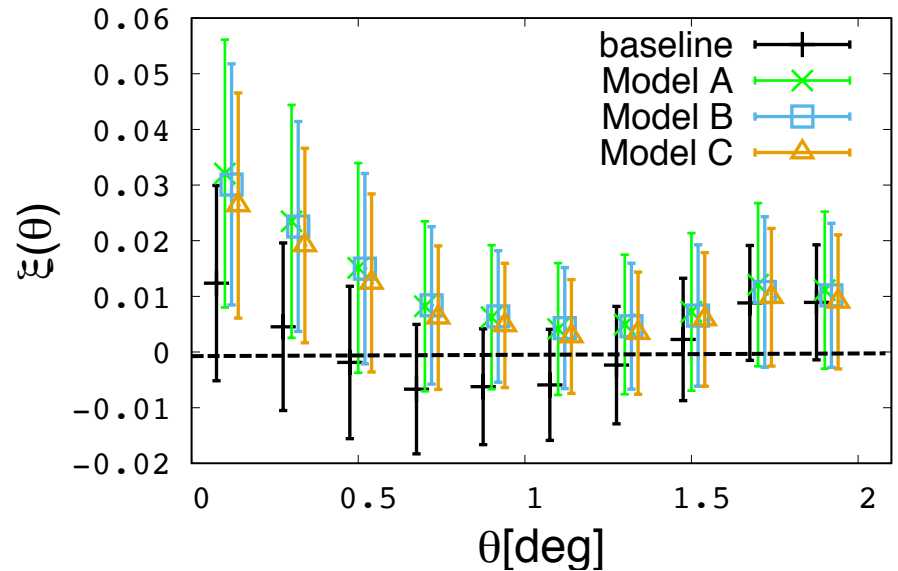
# Cross-Correlation Analysis

Cross-correlation function using low-z clusters and high-z clusters

**low-z** ( $0.1 < z < 0.6$ )



**high-z** ( $0.6 < z < 1.1$ )



## Statistical significance

redshift range	baseline	Model A	Model B	Model C
$0.1 < z < 1.1$	2.2	2.0	2.0	2.0
$0.1 < z < 0.6$	2.2	2.1	2.1	2.3
$0.6 < z < 1.1$	1.9	1.6	1.6	1.6

# Implication

*What are the components of the cross-correlation signal ?*

Possible gamma-ray emitters :

**Blazar, Star-forming Galaxy, Radio galaxy**

$$P_{c\gamma}(\ell) = \sum_X \int \frac{d\chi}{r(\chi)^2} W_{\gamma,X}(\chi) W_{\text{clu}}(\chi) P_{hX}^{(3D)} \left( \frac{\ell}{r(\chi)}, z(\chi) \right)$$

$W_{\text{clu}}(\chi)$  : the effective window function for CAMIRA clusters

$W_{\gamma,X}(\chi)$  : the window function for population X

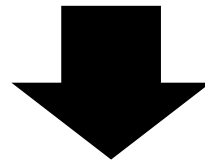
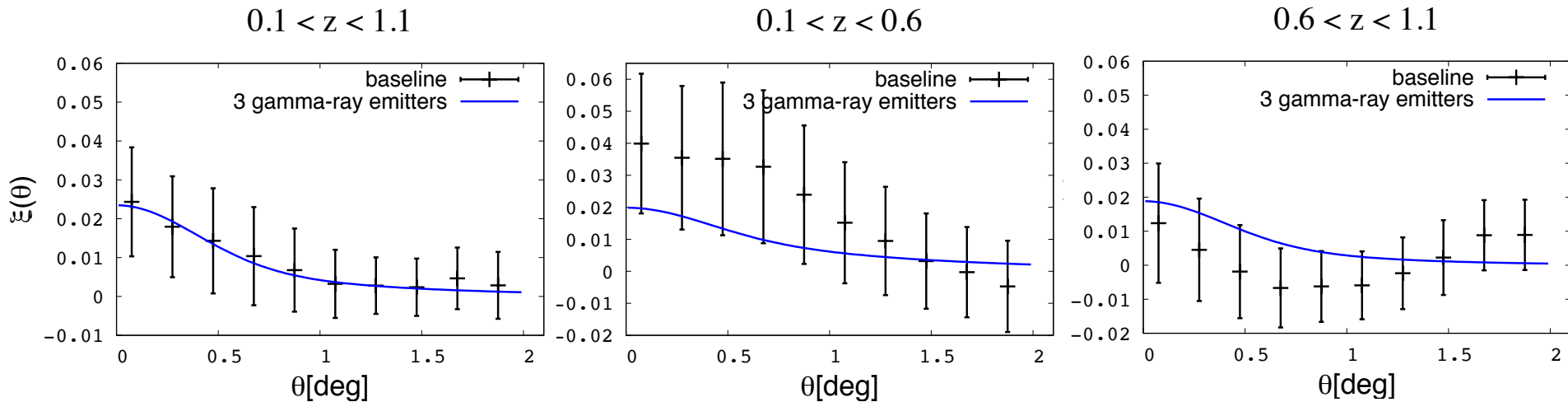
$P_{hX}^{(3D)}$  : three dimensional cross power spectrum between cluster and X

$$\xi(\theta) = \frac{1}{\langle n_{\text{clu}} \rangle \langle I_{\gamma} \rangle} \int \frac{d^2\ell}{(2\pi)^2} \exp[i\ell \cdot \theta] P_{c\gamma}(\ell) \hat{W}(\ell, \theta_G)$$

$\hat{W}(\ell, \theta_G)$  : Gaussian smoothing

# Implication

Cross-correlation signals using Baseline foreground model and model predictions with 3 gamma-ray emitters



This simple model for 3 gamma-ray emitters can explain the signal so far.



# Summary

Probe cross correlation of UGRB intensity map with HSC clusters position:

## ✓ Cross-correlation signal

- Significance level :  $0.1 < z < 1.1$  and  $0.1 < z < 0.6$  : **2.0-2.3  $\sigma$** ,  
 $0.6 < z < 1.1$  : **1.6-1.9  $\sigma$** .
- Confirm the consistency for correlation signal between:  
*Cross-Correlation Analysis & Stacking Analysis.*

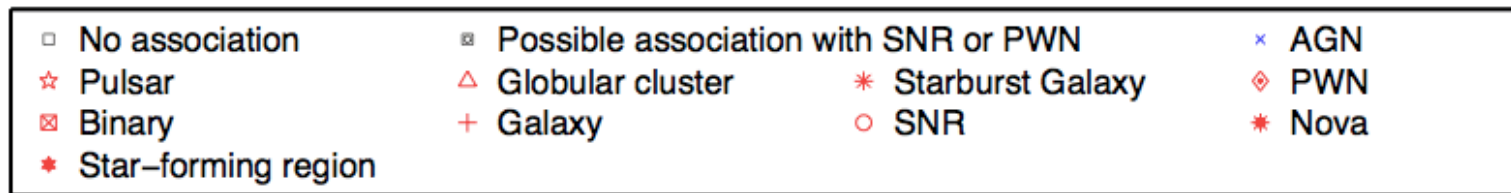
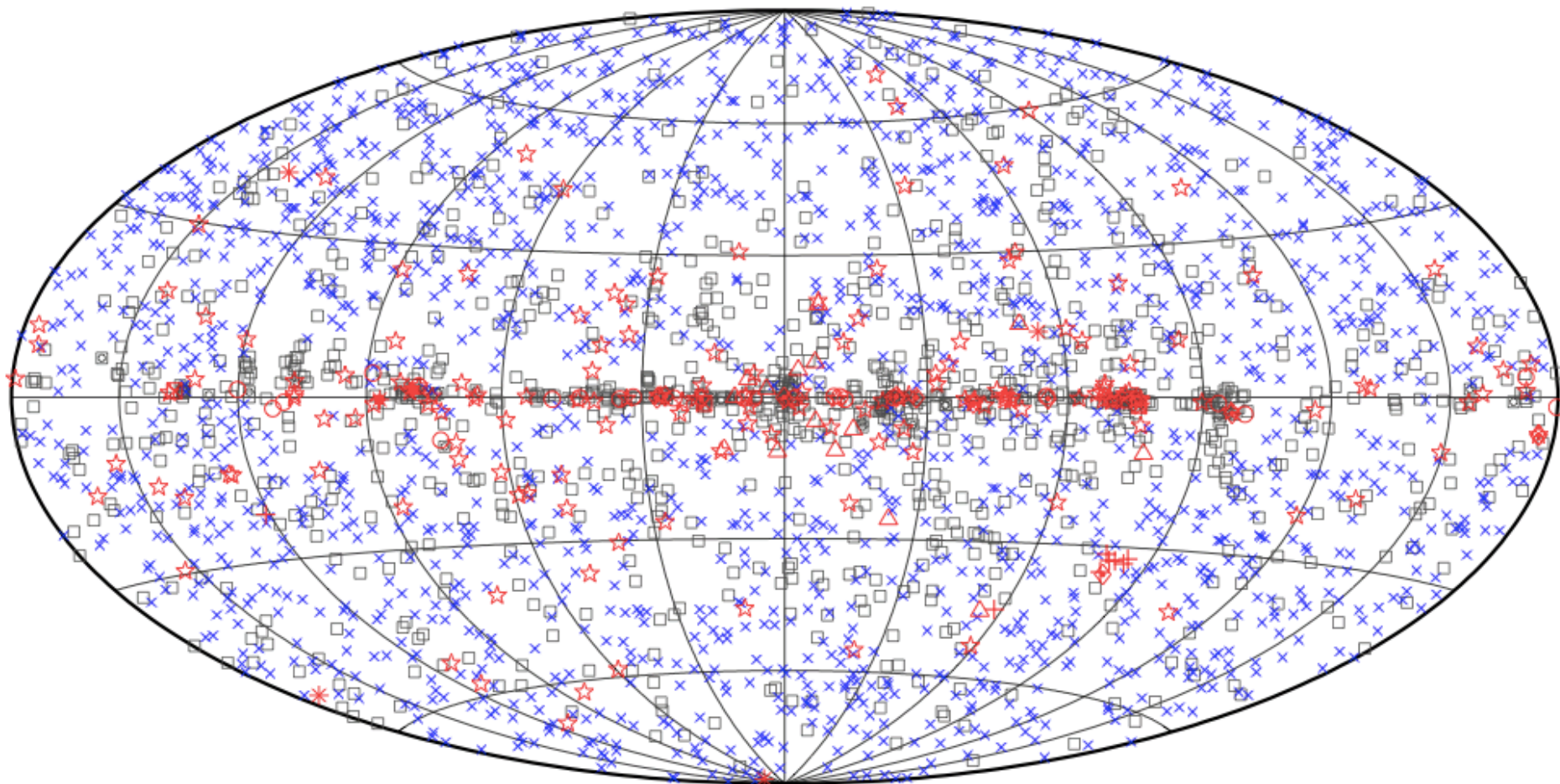
## ✓ Implication for the signal

- Assume 3 gamma-ray emitters to model cross-correlation signal:  
*Blazar, Star-Forming Galaxy, Radio Galaxy.*
- The detected signal is  
*consistent with the theoretically predicted model.*

## ✓ In the future ...

- HSC observation area will increase by *at least 3 times*,  
statistical error can be reduced by *a factor of  $1/\sqrt{3}$* .
- This leads to further probe of gamma-ray emitters  
or exotic matters such annihilating or decaying dark matter.

# Gamma-ray Point Source



# Cross-Correlation Analysis

**How to estimate** two point cross-correlation

Calculate the cross-correlation functions  $\xi(\theta)$  in sub regions  
by using **the Landy-Szalay estimator**

$$\xi(\theta) = \frac{D_{\text{cluster}}(0)D_{\gamma}(\theta) - D_{\text{cluster}}(0)R_{\gamma}(\theta) - R_{\text{cluster}}(0)D_{\gamma}(\theta) + R_{\text{cluster}}(0)R_{\gamma}(\theta)}{R_{\text{cluster}}(0)R_{\gamma}(\theta)}$$

$D_{\text{cluster}}(0)$  : count of CAMIRA cluster's numbers in the cluster's position,  
so  $D_{\text{cluster}}(0) = 1$  at all time

$R_{\text{cluster}}(0)$  : count of cluster's numbers in random clusters catalog  
in the cluster's position, so  $R_{\text{cluster}}(0) = 1$  at all time

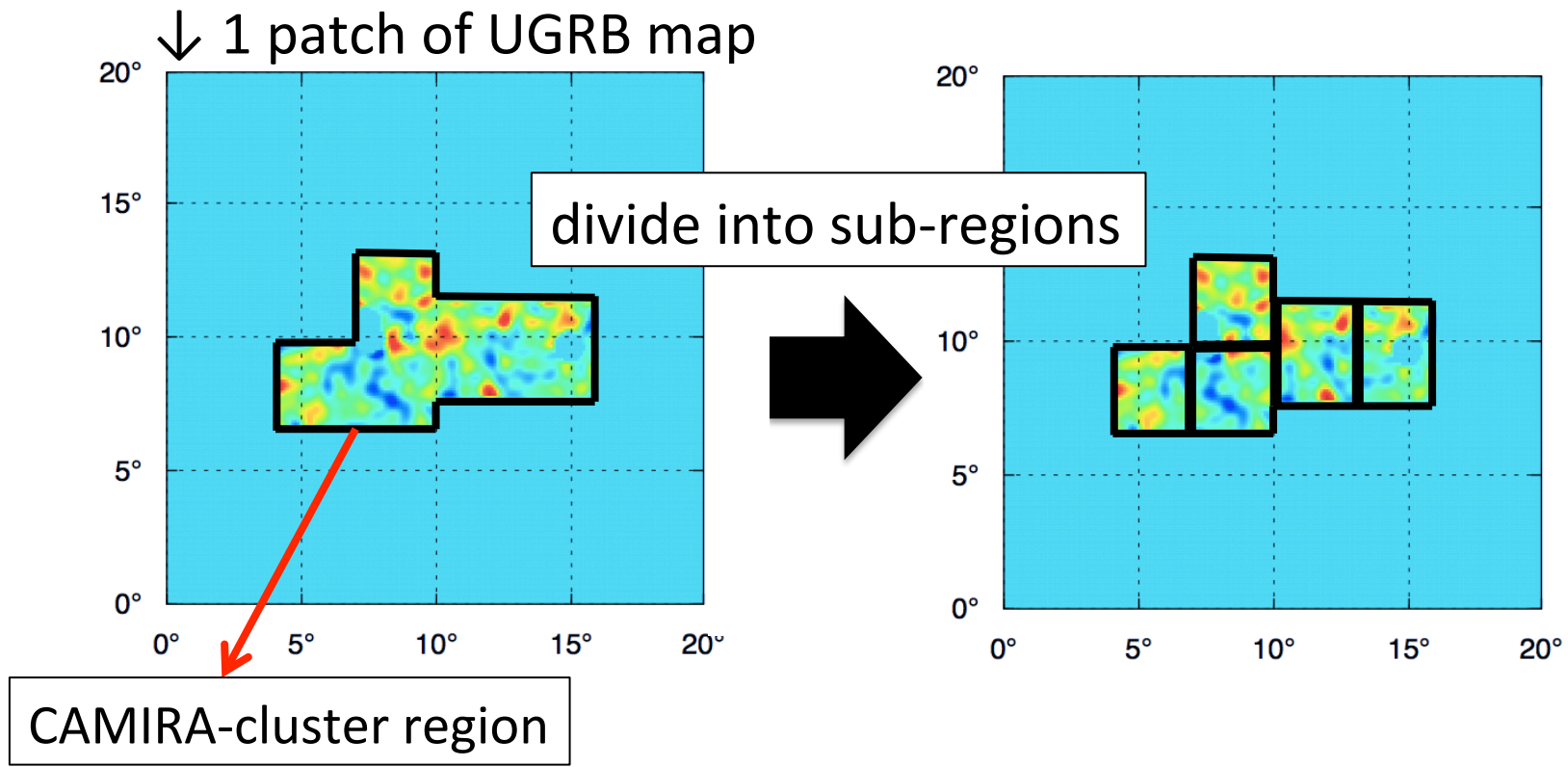
$D_{\gamma}(\theta)$  : count of photon numbers in Fermi map  
separation  $\theta$  from cluster

$R_{\gamma}(\theta)$  : count of photon numbers in random map  
separation  $\theta$  from cluster

# Cross-Correlation Analysis

## How to estimate statistical error

- We use **the Jackknife method** to estimate the error:



(actually, all cluster regions are divided into 21 regions.)

# Cross-Correlation Analysis

## How to compute statistical significance

- Covariance matrix  $C_{\theta\theta'}^{\text{JK}}$

$$C_{\theta\theta'}^{\text{JK}} = \frac{M-1}{M} \sum_{k=1}^M [\xi_k^{\text{obs}}(\theta) - \xi^{\text{mean}}(\theta)] \times [\xi_k^{\text{obs}}(\theta') - \xi^{\text{mean}}(\theta')] \quad \text{Scranton \& Johnston (2002)}$$

M : number of jackknife-subsamples

$\xi_k^{\text{obs}}(\theta)$  : correlation function in k-th subsample

$\xi^{\text{mean}}(\theta)$  : averaged correlation function over all  $\xi_k^{\text{obs}}(\theta)$

- $\chi^2$

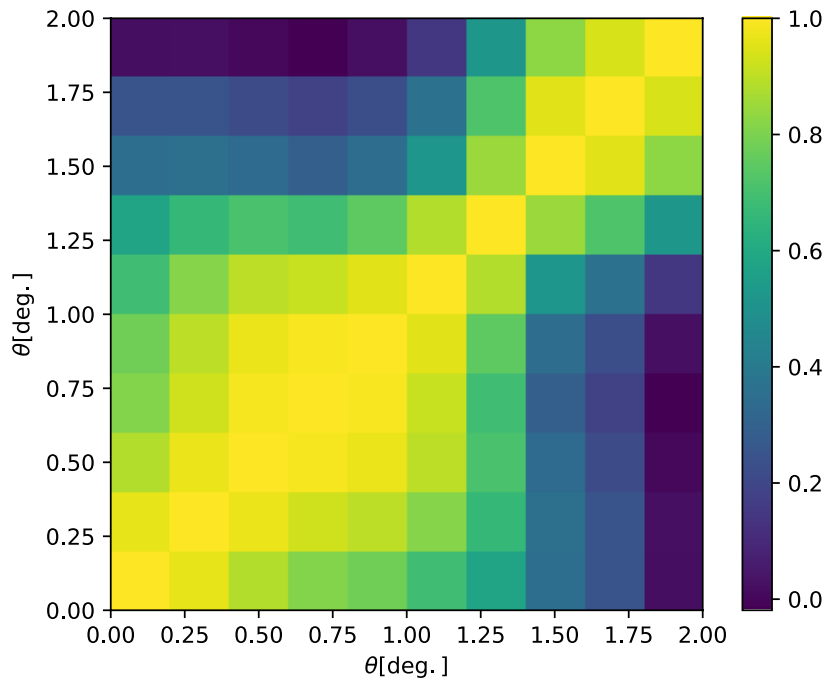
$$\chi^2 = \sum_{i,j} (\xi^{\text{mean}}(\theta_i) - m_i) C_{ij}^{-1} (\xi^{\text{mean}}(\theta_j) - m_j)$$

$m_i$  : correlation with certain model (null correlation  $\rightarrow m_i = 0$ )

$\rightarrow$  the significance  $\sigma$  is represented by  $\chi$

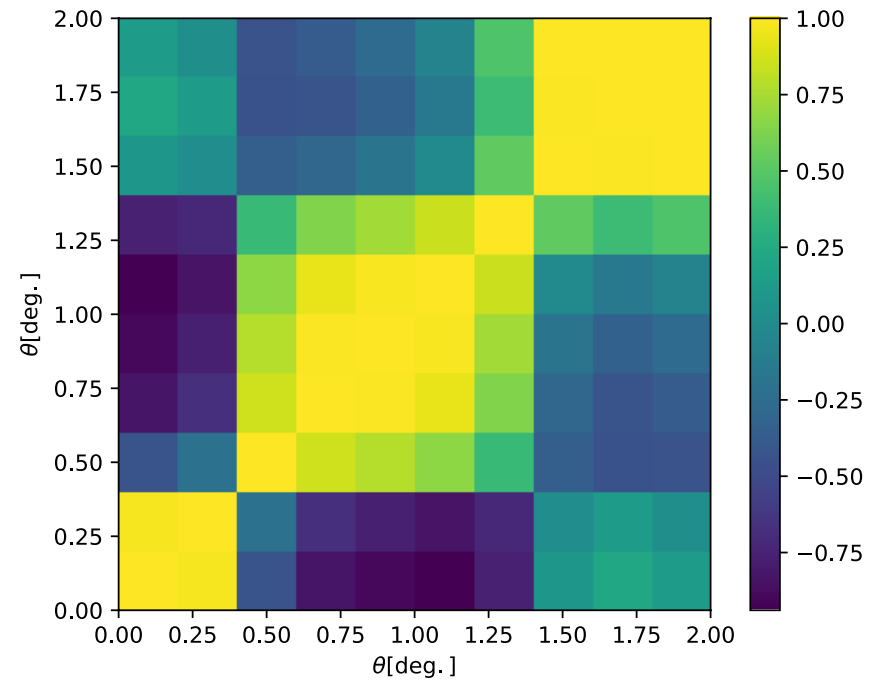
# Covariance Matrix

Number of eigen value : 10



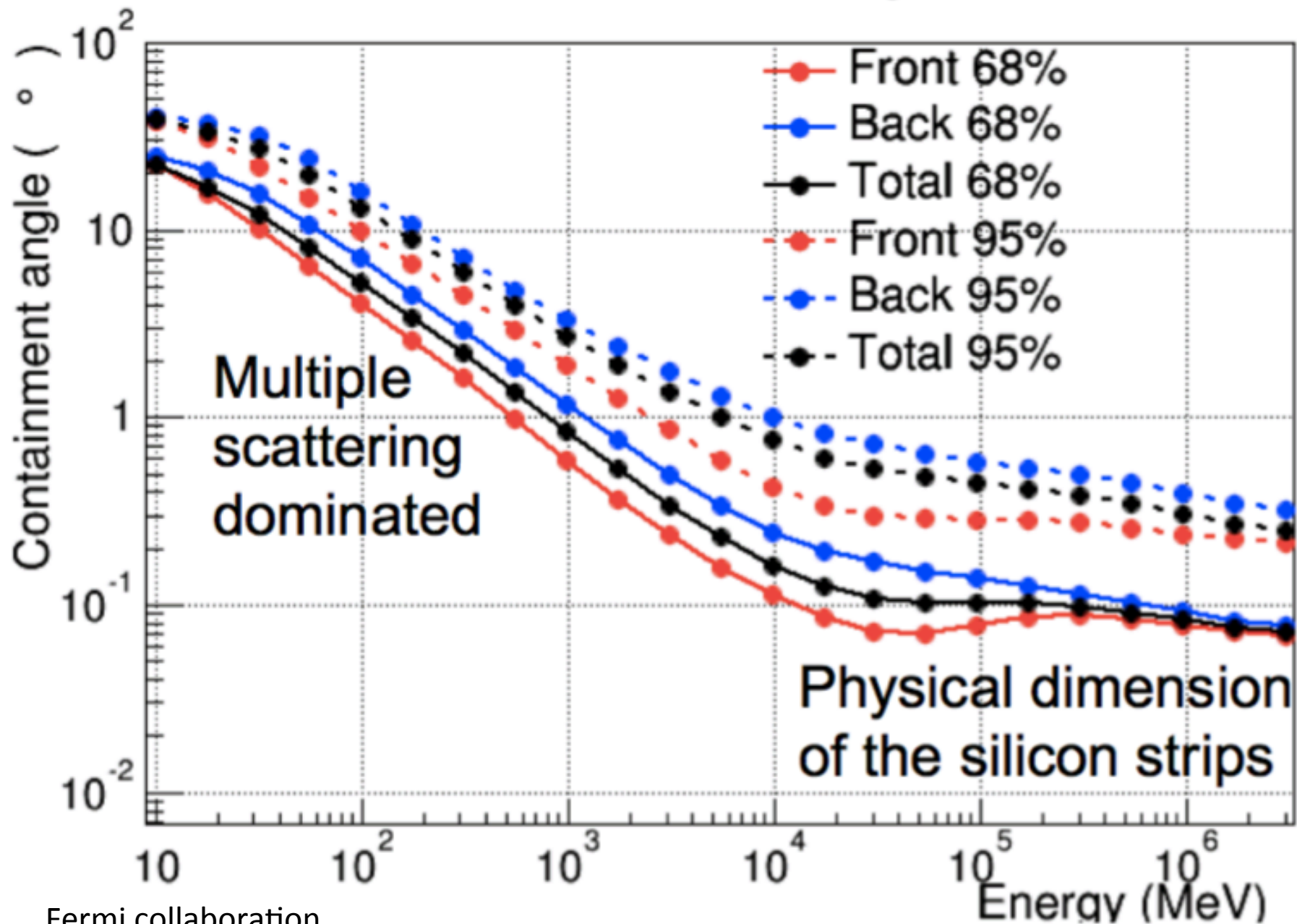
SVD  
➔

Number of eigen value : 4

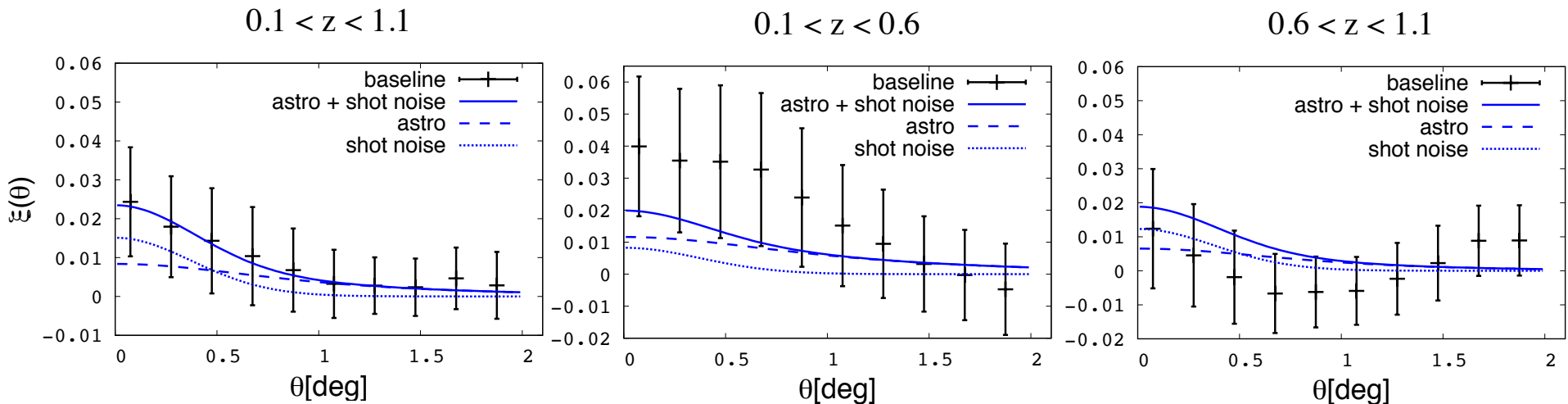


↑ Angular bins has a strong correlation with other bins.

# P8R2\_SOURCE\_V6 acc. weighted PSF



# Implication



$\chi_{\text{clu}}^2 - \chi_{\text{mod}}^2$  (degree of freedom = 3)

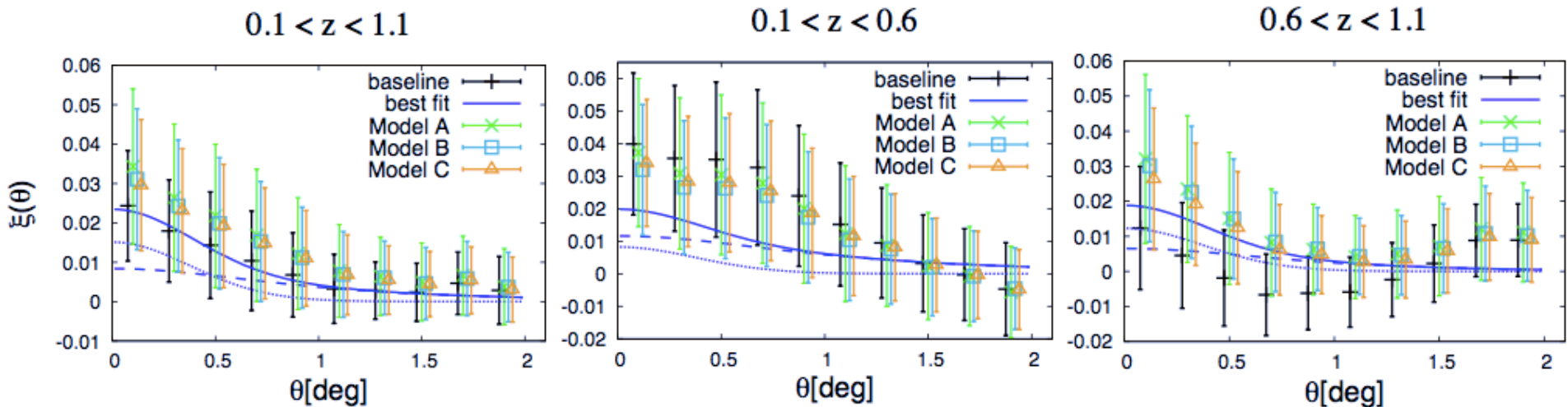
redshift range	Baseline	Model A	Model B	Model C
$0.1 < z < 1.1$	0.30	0.29	0.28	0.27
$0.1 < z < 0.6$	2.2	1.9	1.8	2.2
$0.6 < z < 1.1$	2.5	0.79	0.76	0.78

Shot-noise amplitude ( $10^{-9} \text{cm}^{-2} \text{s}^{-1} \text{sr}^{-1}$ )

redshift range	Baseline	Model A	Model B	Model C
$0.1 < z < 1.1$	5.1	6.3	5.6	5.2
$0.1 < z < 0.6$	2.8	4.4	3.6	3.6
$0.6 < z < 1.1$	4.2	6.9	6.3	5.6



# Implication



$$\chi_{\text{clu}}^2 - \chi_{\text{mod}}^2 \quad (\text{degree of freedom} = 3)$$

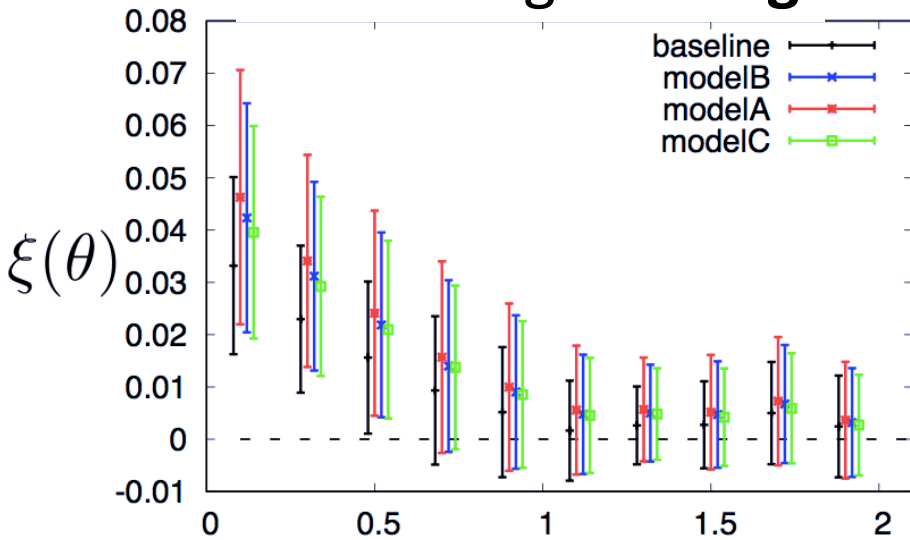
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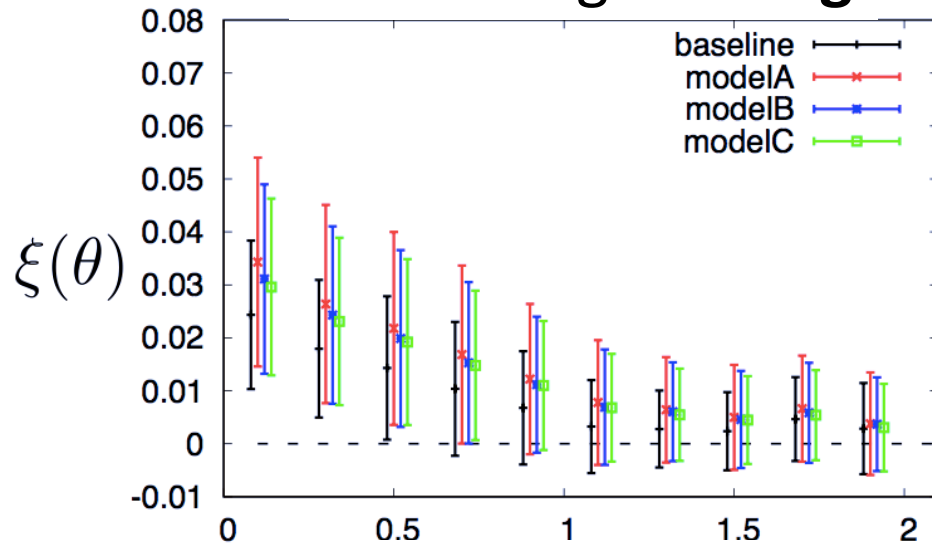
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# Cross-Correlation Analysis

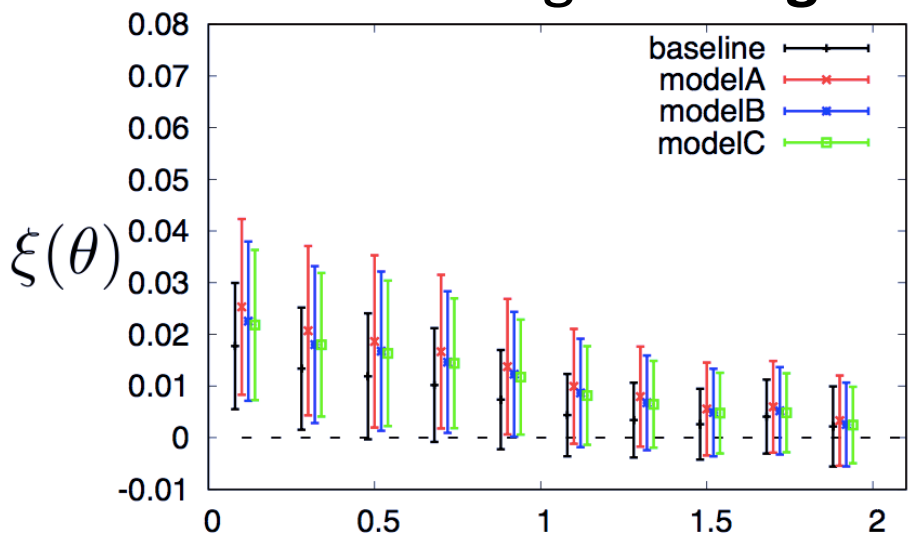
smoothing : **0.3deg**



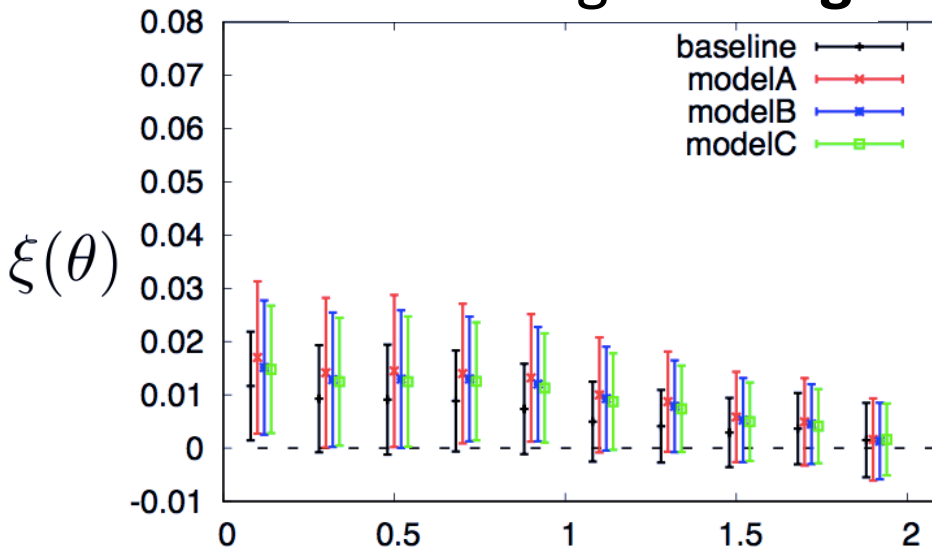
smoothing : **0.5deg**



smoothing : **0.7deg**



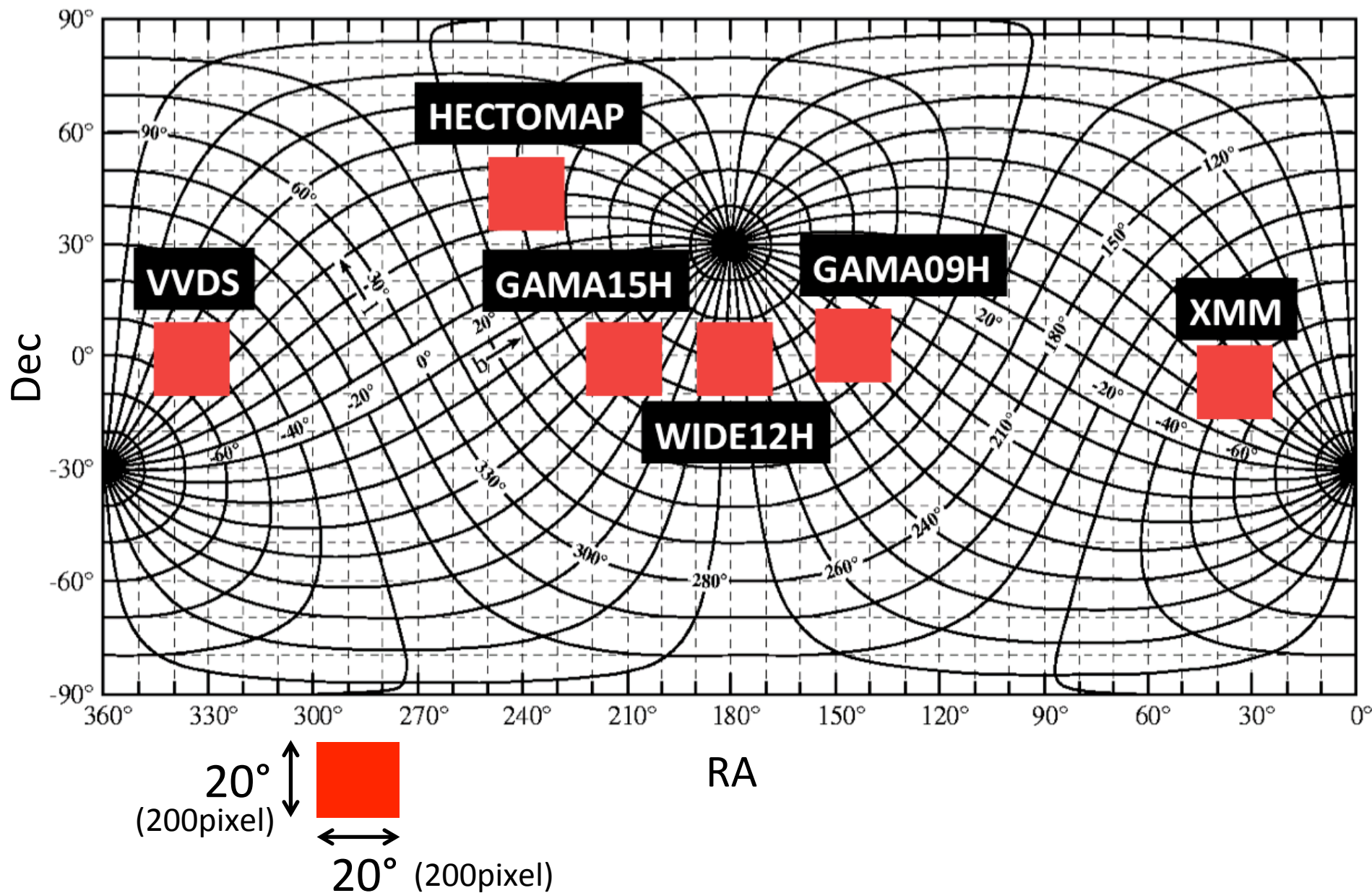
smoothing : **1.0deg**



degree

degree

# Distribution of Fermi observation area we use



# Cross-Correlation Analysis

Cross-correlation function  $\times$  mean intensity of gamma-rays

