# Bullet-proof tests for indirect signals of dark matter

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arXiv:1502.03824 (to appear in PRD) with Peter Graham, Surjeet Rajendran, and Ken Van Tilburg

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• 511 keV line in GC (SNe?)• 1–10 GeV broad excess in GC (Pulsars?)• 3.55 keV line in clusters  $(ICM \ emission \ lines?)$ Energy spectrum is not enough! What else do we know?Gravitational interactions  $\implies$  lensing maps of DM

# Merging Clusters

Lensing maps often reveal separation of DM and ICM:

Bullet Cluster

- Dramatic proof of collisionless particle DM
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- Not a very dramatic cluster (old and pretty relaxed)
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- Merging cluster!

Lensing: Clowe et al., X-ray: XMM-Newton





### Statistical Methods from Lensing Maps

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Paper: 2 tests ("Method A" for decays; "Method B" for (e.g.) annihilations) and 1 boost ("Method C")

This talk: Method A (simplest, relevant for 3.55 keV)

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- Simplest case: discriminate between two spatial distributions (DM and astrophysical alternative)
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  - Lensing measures surface mass density  $\kappa$
  - DM decay flux:  $\frac{dN}{d\Omega} \propto \int_{\text{l.o.s.}} \rho \, dl = \kappa$
- Typical astrophysical alternatives distributed like the intracluster medium (ICM), not galaxies
  - X-ray: ICM emission lines
  - $\gamma$  ray: cosmic ray–ICM scattering (not yet observed)

#### Test Statistic

#### Likelihood ratio test: favor DM over ICM when

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- $\bullet\,$  Independent spatial bins, indexed by i
- Known, normalized spatial distributions:  $f_i$  of ICM,  $g_i$  of DM, and  $b_i$  of background

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- $x_i$  photons per bin, N total photons
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$$\implies \Lambda = \frac{1}{2N^{3/2}} \sum_i \frac{(g_i - f_i)}{b_i^2} x_i^2$$

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#### Power of Test

Expected value of  $\Lambda$  depends on spatial profile of excess

$$T = \sqrt{\sum_{i} \frac{(g_i - f_i)^2}{b_i}}$$
 "discrimination factor"

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3.55 keV line is visible in Coma+2 others at  $>_{\Box}4\sigma$ ...(Bulbul et al.)

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  - Small enough to resolve DM structures
- Power of test (T) determined only by *geometry* of cluster (DM and ICM)
- Robust against uncertainties in spatial distributions
  - For Coma cluster, lensing uncertainty important only for excesses  $\sim 15\sigma$

#### Conclusions

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• Can check 3.55 keV line in Coma with data on tape

#### A brief advertisement for the rest of our paper

- Method B: Fit excess to linear combination of templates (good for annihilating DM; retains good sensitivity)
- Method C: Reweight to strengthen limits on DM (optimal reweighting gains about 20% in Coma)

Questions?

Backup Slides

## T values

		X-ray	gamma ray
DM decay signal	$g_i$	lensing map $\kappa$	
alternative	$f_i$	$n_{ m ICM}^2$	$n_{\mathrm{CR}}n_{ICM}$
background	$b_i$	$n_{ m ICM}^2$	uniform
	$\delta \theta$	T	
	12''	0.79	0.67
Bullet Cluster	30''	0.74	0.62
	2.5'	0.12	0.11
Coma Cluster	4'	0.68	0.59

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Backup Slides

#### Angular resolutions



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Backup Slides

# Method B: Annihilating DM

DM annihilations are another important case, but the spatial distribution of the signal is unknown (not measured by lensing)

$$\frac{dN}{d\Omega} \propto \int_{\rm l.o.s} \rho^2 \, dl \neq f(\kappa)$$

Take some inspiration from simulations:

- Flux = smooth (NFW) + clumpy (substructure)
- Relative contribution unknown  $\left(\frac{\text{clumpy}}{\text{smooth}} \sim 2-1000\right)$
- Relate spatial profiles of each to surface mass density using simulations
- Extrapolate relation to merging clusters

Then *fit* the profile of observed excess to linear combination of smooth + clumpy + ICM (our "Method B")

Backup Slides

#### Method B: Results for Coma

