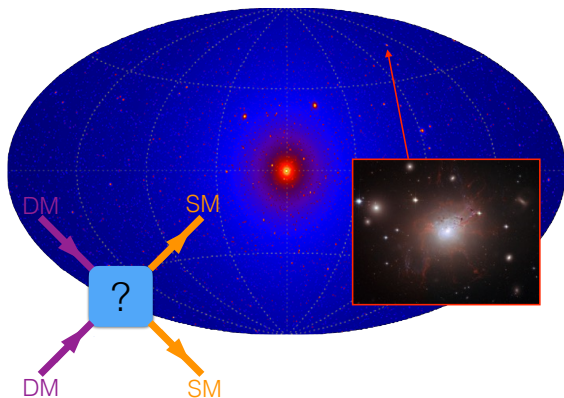


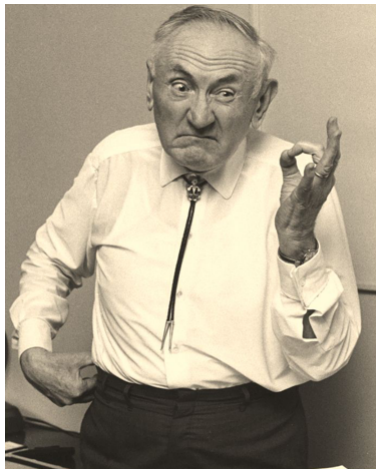
A search for dark-matter annihilation in galaxy groups



Ben Safdi

Massachusetts Institute of Technology

Dark matter exists!



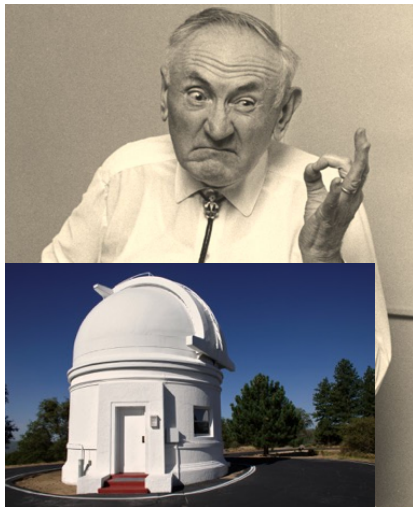
We just don't know **what** it is ...

Coma Cluster of Galaxies

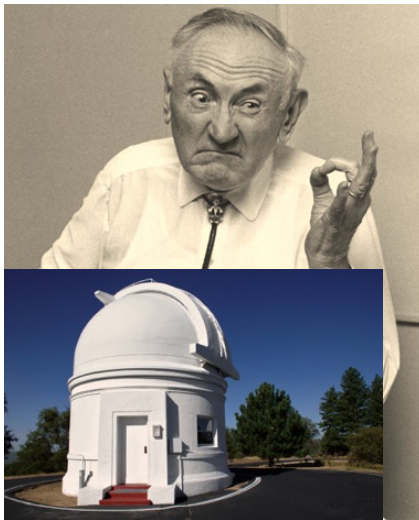


NASA, ESA, and The Hubble Heritage Team (STScI/AURA) • Hubble Space Telescope ACS • STScI-PRC08-24

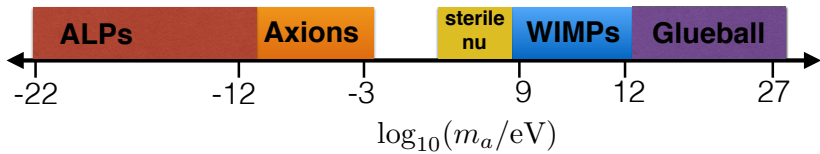
Coma: 1933 to today

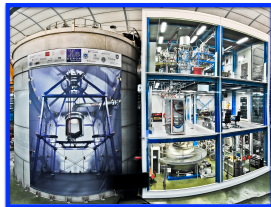
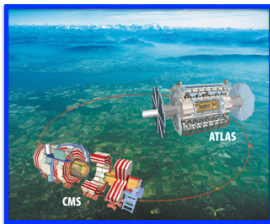
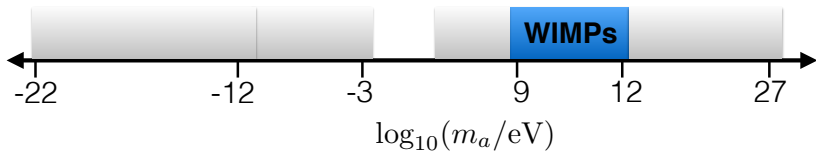


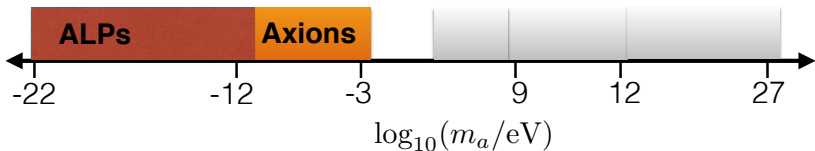
Coma: 1933 to today



Fermi (NASA)

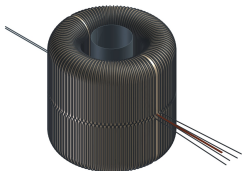






From Theory...

- ▶ **Phys. Rev. Lett.**, 117, 141801
(2016): **Yoni Kahn**, **B.S.**, **Jesse Thaler**



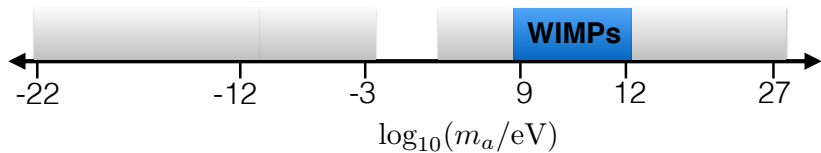
- ▶ Ultimate goal: Detect axion dark matter from GUT-scale solution to strong-CP problem

...to Experiment

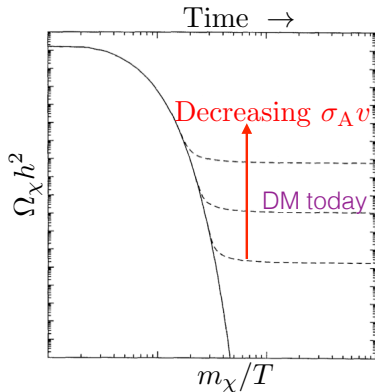
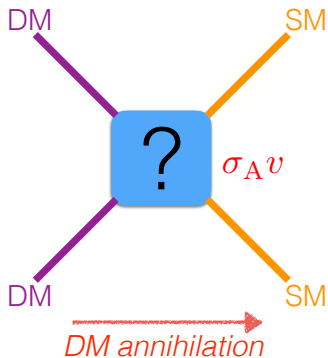
- ▶ ABRACADABRA-10 cm



- ▶ The team: J. Conrad, J. Formaggio, S. Heine, J. Minervini, J. Ouellet, K. Perez, A. Radovinsky, D. Winklehner, **L. Winslow**, ...
- ▶ **Funded by the NSF, data soon!**

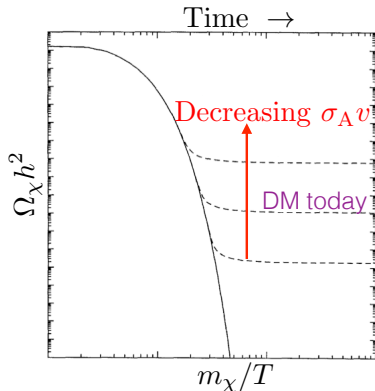
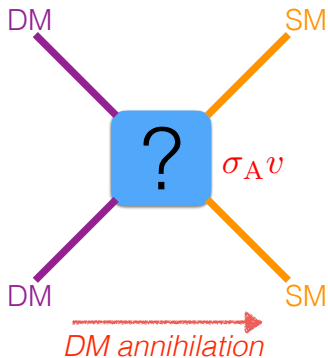


Relic abundance of thermal dark matter



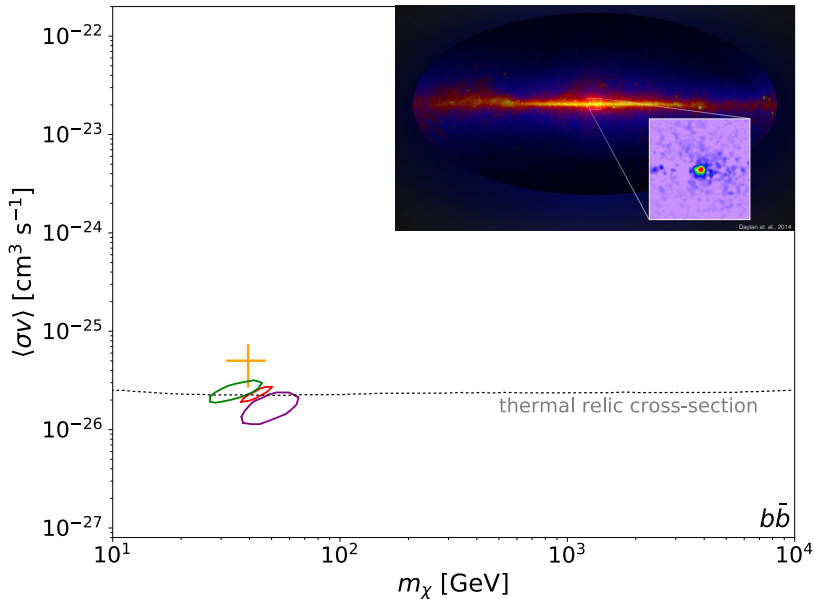
- ▶ $\Omega_\chi h^2 = 0.1199 \pm 0.0027$ (Planck + WMAP)

Relic abundance of thermal dark matter

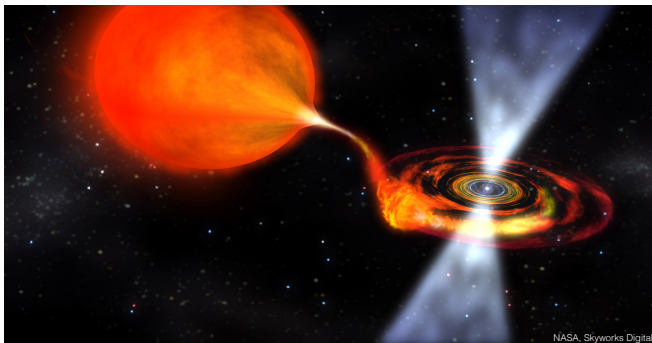


- ▶ $\Omega_{\chi} h^2 = 0.1199 \pm 0.0027$ (Planck + WMAP)
- ▶ $\Omega_{\chi} h^2 \approx 0.1 \times \frac{3 \times 10^{-26} \text{ cm}^3/\text{s}}{\langle \sigma_{A}v \rangle}$ (DM freezeout)

Hints of dark matter annihilation in *Fermi* data?

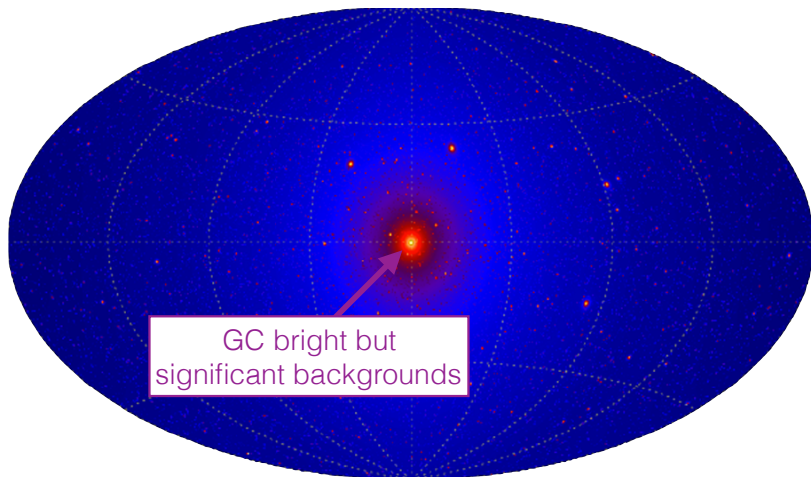


Excess may also arise from dim Point Sources



- **Non Poissonian Template Fit (NPTF)**
 - ▶ *JCAP* 2015: S. Lee, M. Lisanti, **B. S.**
 - ▶ *Phys. Rev. Lett.* 2016: S. Lee, M. Lisanti, **B. S.**, T. Slatyer, W. Xue
 - ▶ *PRD* 2016: T. Linden, N. Rodd, **B.S.**, T. Slatyer
 - ▶ *Astrophys. J.* 2016: M. Lisanti, S.M. Sharma, L. Necib, **B.S.**
 - ▶ 1612.03173: S.M. Sharma, N. Rodd, **B.S.**
- **Wavelets:** *Phys. Rev. Lett.* 2016: (R. Bartels, S. Krishnamurthy, C. Weniger)
- **Population study:** *Fermi* 2017: (1705.00009)
- **MSP model:** *Astrophys. J.* 2015: T. Brandt, B. Kocsis

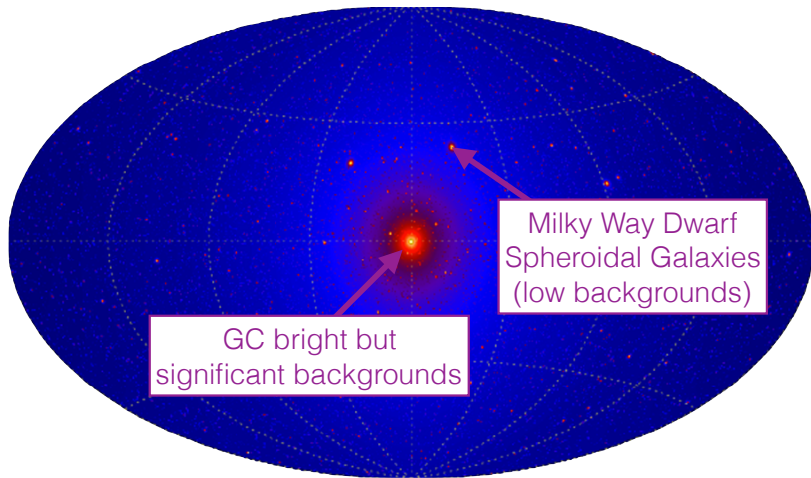
Milky Way Center: largest gamma-ray flux from DM



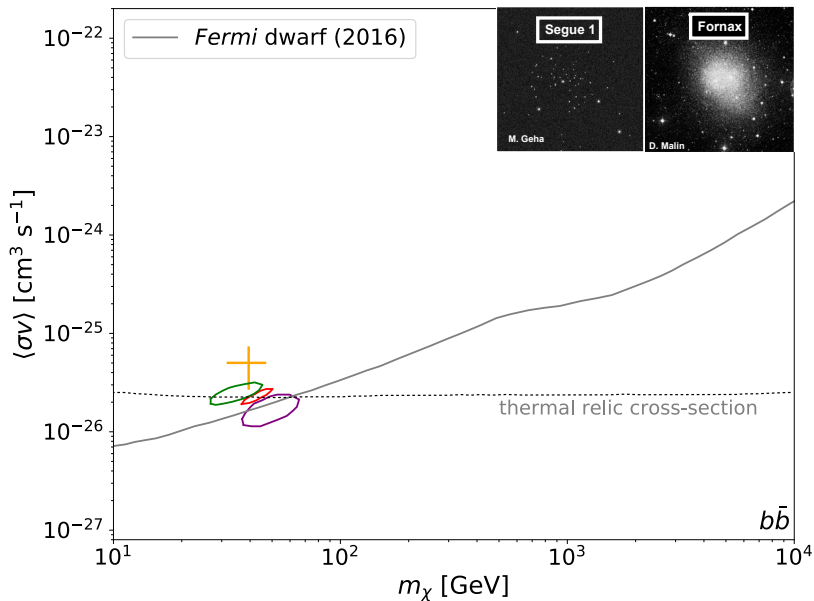
- ▶ DM-induced flux \propto to L.O.S. integral of DM density:

$$\Phi_{\text{DM}} \sim J \equiv \int dl \rho_{\text{DM}}^2$$

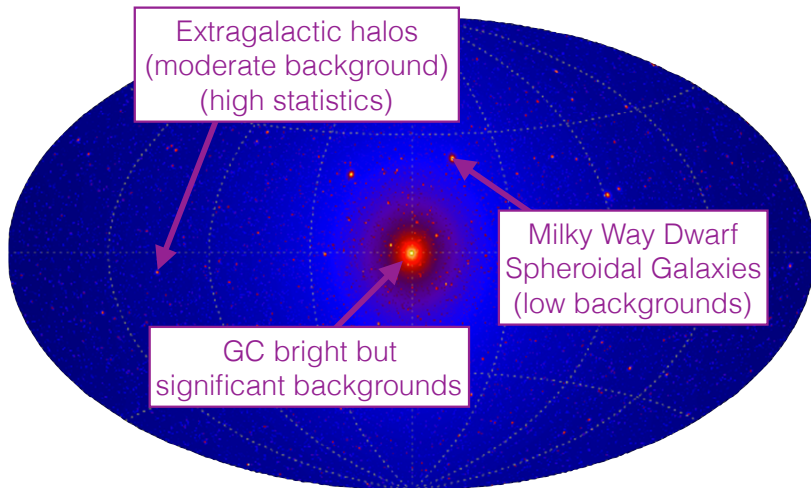
Milky Way Dwarf Spheroidal Satellites (dSphs)



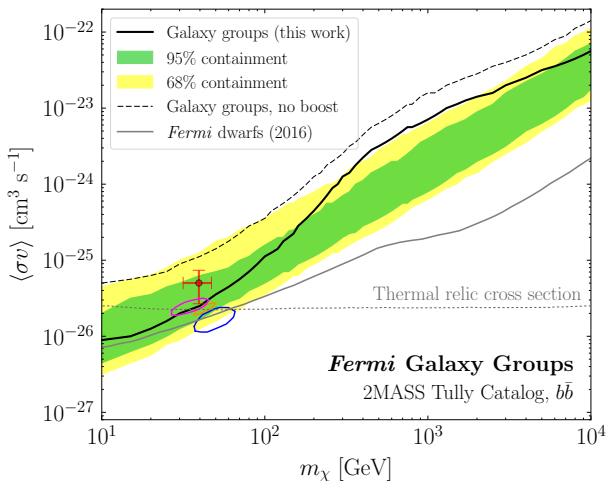
Milky Way Dwarf Spheroidal Satellites (dSphs)



Extragalactic Halos



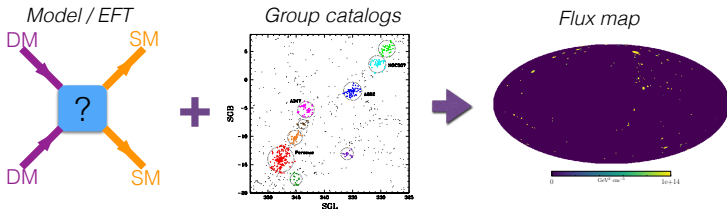
Extragalactic Halos: stacked limit ($N_H = 100$)



- ▶ **Real data:** M. Lisanti, S.M. Sharma, N. Rodd, **B.S.**, 170x.xxxxx
- ▶ **Simulated data:** M. Lisanti, S.M. Sharma, N. Rodd, **B.S.**, R. Wechsler, 170x.xxxxx

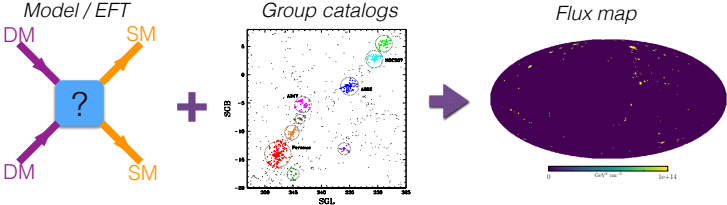
DM annihilation with group catalogs

- ▶ 1. DM model + group catalog \rightarrow gamma-ray flux map

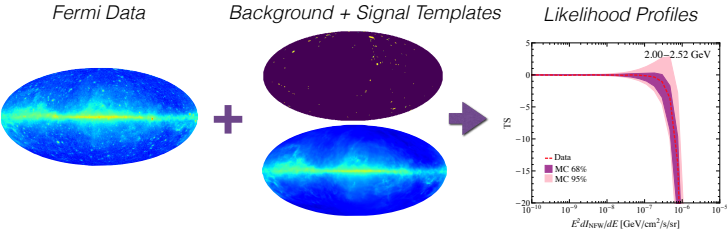


DM annihilation with group catalogs

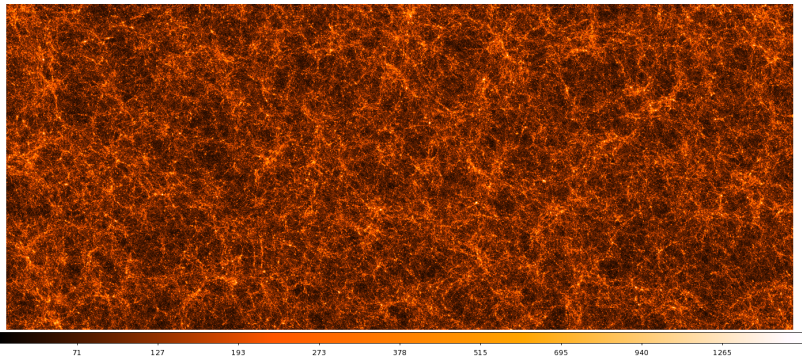
- ▶ 1. DM model + group catalog → gamma-ray flux map



- ▶ 2. How do we search for that flux in *Fermi* data?

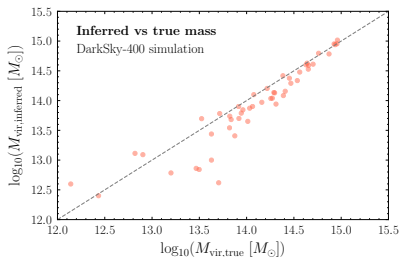
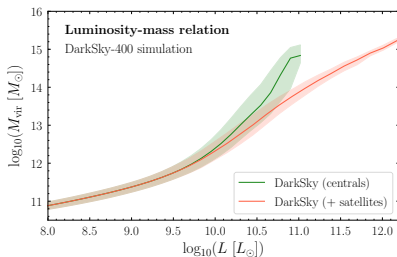


DarkSky (2014) N -body simulation



- ▶ 4096^3 particles, $m \sim 7.6 \times 10^7 M_{\odot}$
- ▶ 400 Mpc h^{-1} per-side box, $z \leq 93$
- ▶ galaxy-halo connection: populate with galaxies
- ▶ Halo catalog generated with `Rockstar` group finder

DarkSky: galaxy-halo connection



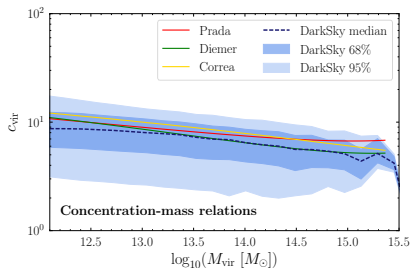
- ▶ J -factor depends on M_{vir} , c , $b_{\text{sh}}(M_{\text{vir}})$, and z :

$$J = (1 + b_{\text{sh}}(M_{\text{vir}})) \int \rho_{\text{NFW}}^2(s, \Omega) ds d\Omega$$

- ▶ Navarro-Frenk-White (NFW) profile:

$$\rho_{\text{NFW}}(r) = \frac{\rho_s}{r/r_s(1+r/r_s)^2}, \quad c_{\text{vir}} = r_{\text{vir}}/r_s$$

DarkSky: concentration-mass relation

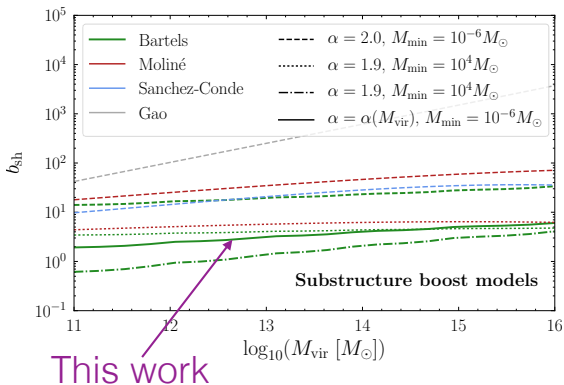
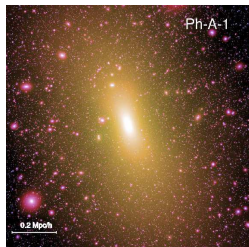


- ▶ J -factor depends on M_{vir} , c , $b_{\text{sh}}(M_{\text{vir}})$, and z :

$$J = (1 + b_{\text{sh}}(M_{\text{vir}})) \int \rho_{\text{NFW}}^2(s, \Omega) ds d\Omega$$

$$J \approx (1 + b_{\text{sh}}(M_{\text{vir}})) \frac{M_{\text{vir}} c^3}{d(z)^2}$$

Boost factor from DM sub-halos



- ▶ J -factor depends on M_{vir} , c , $b_{\text{sh}}(M_{\text{vir}})$, and z :

$$J = (1 + b_{\text{sh}}(M_{\text{vir}})) \int \rho_{\text{NFW}}^2(s, \Omega) ds d\Omega$$

Boost factor from DM sub-halos

- ▶ Boost-factor given by integral over sub-halo population
 $dN/dm \sim m^{-1.9}$ (for field halos)

$$b_{\text{sh}}(M_{\text{vir}}) = \frac{1}{L_{\text{host}}(M_{\text{vir}})} \int dm \frac{dN}{dm} L_{\text{sh}}(m)$$

Boost factor from DM sub-halos

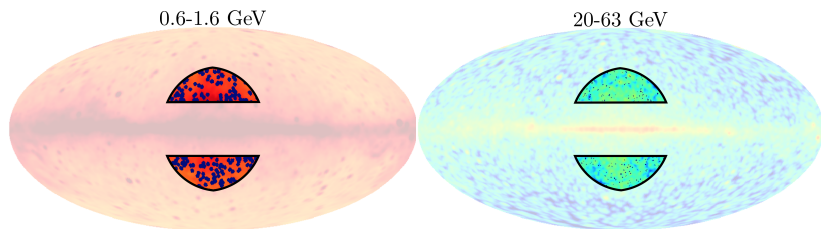
- ▶ Boost-factor given by integral over sub-halo population
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$$b_{\text{sh}}(M_{\text{vir}}) = \frac{1}{L_{\text{host}}(M_{\text{vir}})} \int dm \frac{dN}{dm} L_{\text{sh}}(m)$$

- ▶ Sub-halo luminosity $L_{\text{sh}}(m)$

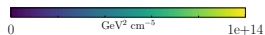
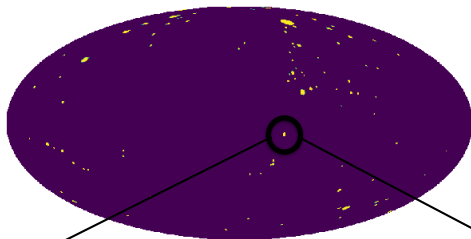
$$L_{\text{sh}}(m) \sim m c^3$$

Step 2: *Fermi* data selection

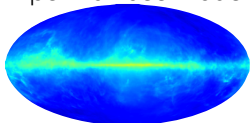


- ▶ 40 log-spaced bins between 200 MeV - 2 TeV
- ▶ 423 weeks Pass 8 UltracleanVeto
- ▶ mask: large-scale structures, $|b| \leq 5^\circ$

Profile likelihood in 10° halo ROIs



p8r2 diffuse model



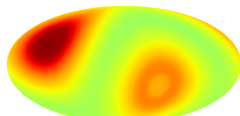
λ_i

Fermi bubbles

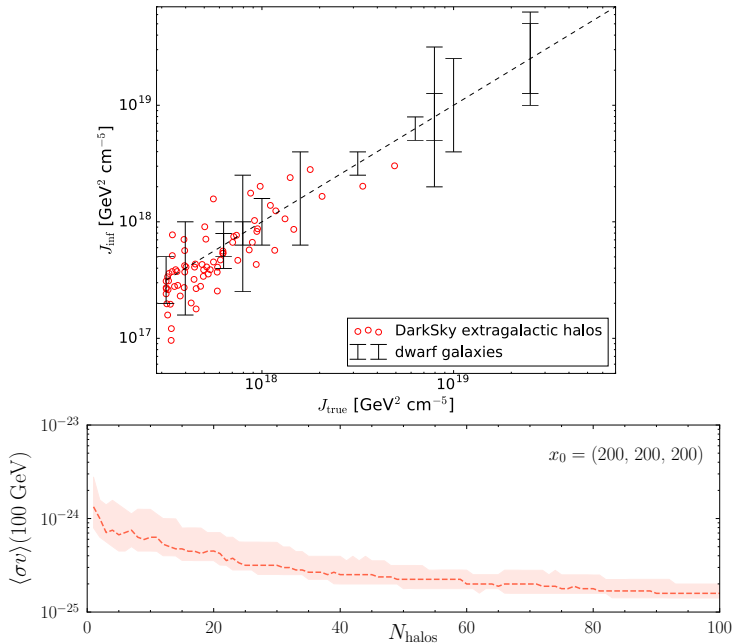


+ 3FGL PSs

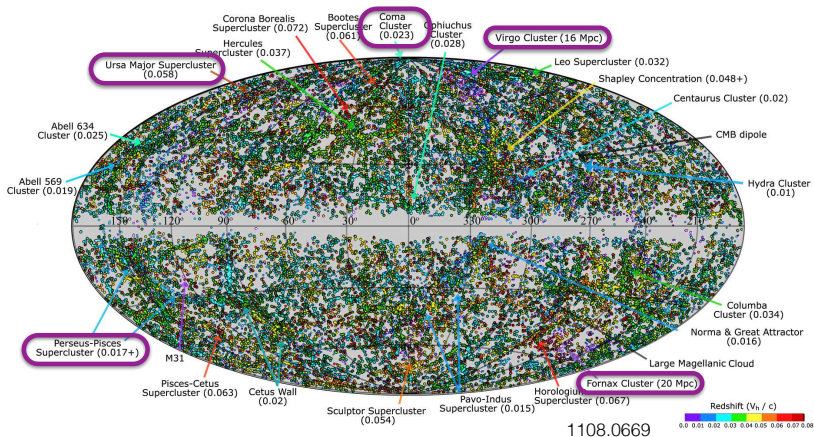
Isotropic emission



DarkSky: top ~ 100 halos



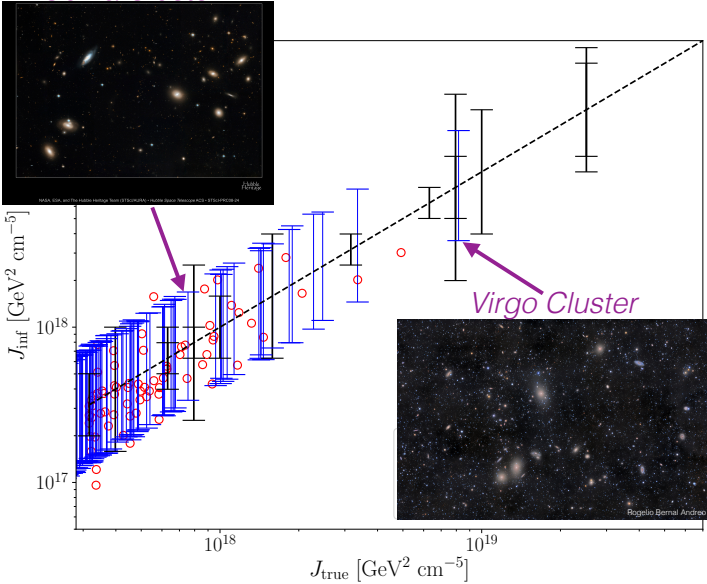
Real data: 2MASS redshift survey



- ▶ 2MASS: 1997 - 2001 infrared survey ($K_s \leq 13.5$ mag)
- ▶ 2011: spectroscopic followup survey (CFA)
- ▶ 44,599 2MASS galaxies with $K_s \leq 11.75$ mag
- ▶ Tully 2015: group catalog

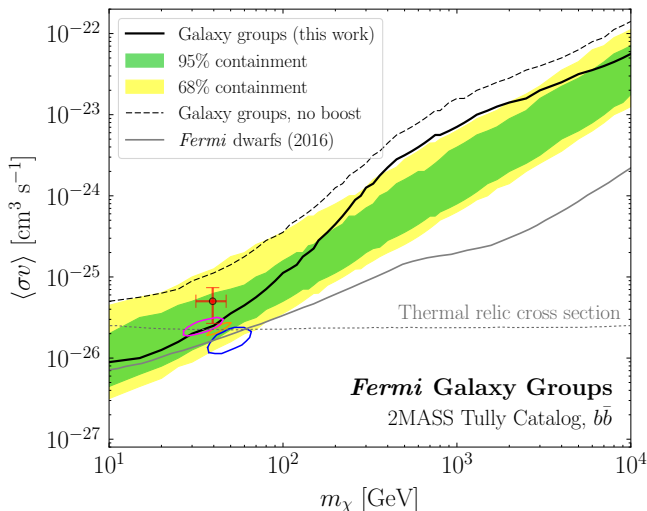
DarkSky N -body simulation vs real data

Coma Cluster



Real Data limit consistent with DarkSky

- ▶ Remove handful of halos with large cosmic-ray emission ($TS > 5$, $\sigma_A v > 10 \times$ best indiv. limit)

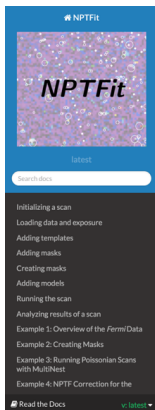


Extragalactic annihilation summary

- ▶ **First** systematic **search** for DM annihilation from **extragalactic halos**
- ▶ **Fermi future: combines datasets** (e.g., *Fermi* data + galaxy group catalogs, DES for dSphs)
 - ▶ **Combined EG + dSphs** with Alex Drlica-Wagner in the works
- ▶ **In progress:** *Fermi* data + galaxy group catalogs for **astrophysical source**
- ▶ Galaxy-group J -factor catalog (**to be released**) likely useful elsewhere (e.g., HAWC, NuSTAR, ...)
- ▶ **WIMP DM is on the run:** may detect soon, but should take seriously alternate proposals (e.g., **axions**, heavy DM, ...)

Template fitting code available

- ▶ <https://github.com/bsafdi/NPTFit>: S. M.-Sharma, N. Rodd, **B.S.**, 1612.03173. Open-source code for performing template analysis



Docs » NPTFit Documentation

[Edit on GitHub](#)

NPTFit Documentation

NPTFit is a specialized Python/Cython package that implements Non-Poissonian Template Fitting (NPTF), originally developed for characterizing populations of unresolved point sources. The main features of the package are

- Fast evaluation of likelihoods for NPTF analyses
- Easy-to-use interface for performing non-Poissonian (as well as standard Poissonian) template fits using MultiNest or other inference tools
- Ability to include an arbitrary number of point source templates, with an arbitrary number of degrees of freedom in the modeled flux distribution
- Modules for analyzing and plotting the results of an NPTF

The most up-to-date version of the code can be found at <https://github.com/bsafdi/NPTFit>.

Installation

Out of the box, NPTFit relies on [MultiNest](#) for Bayesian inference, which must be installed and linked prior to use.

NPTFit supports both Python 2 and 3, specifically 2.7 and 3.5. It may work with earlier 3.* versions, although this has not been tested.

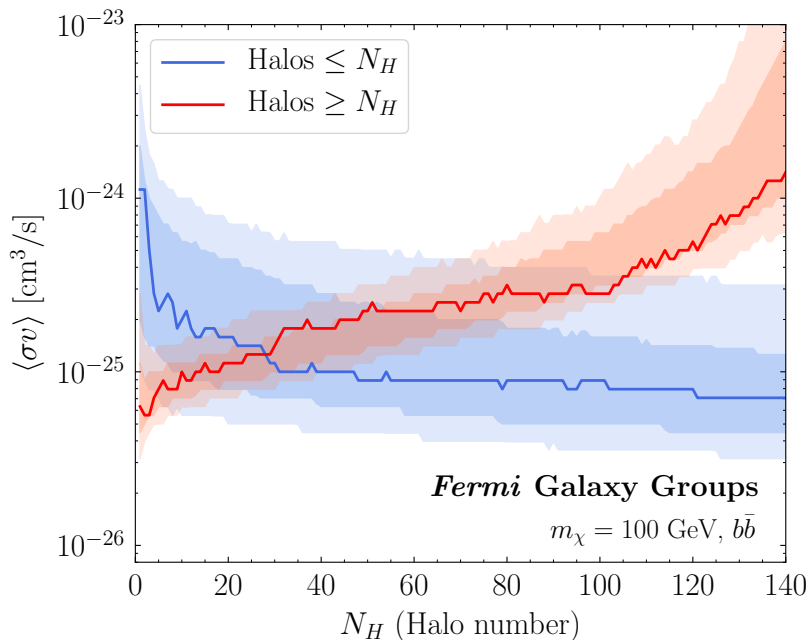
Make sure Cython is installed (e.g. `pip install Cython`). NPTFit along with its dependent Python packages can then be installed with

```
$ python setup.py install
```

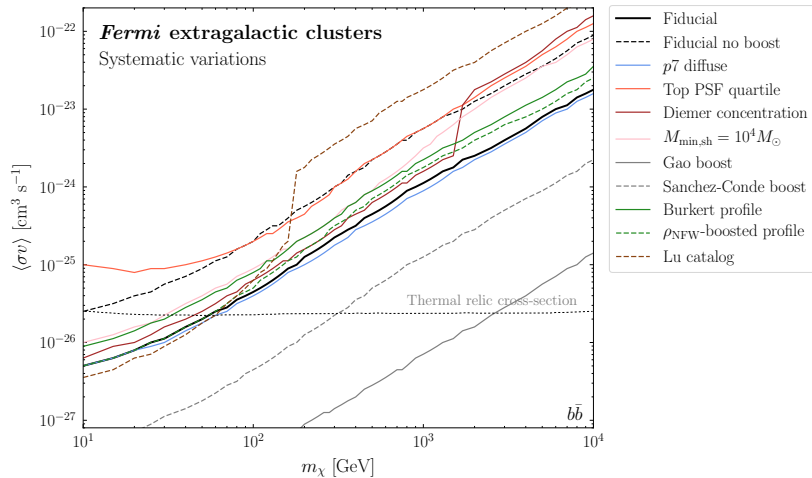
Questions?

Extragalactic backup

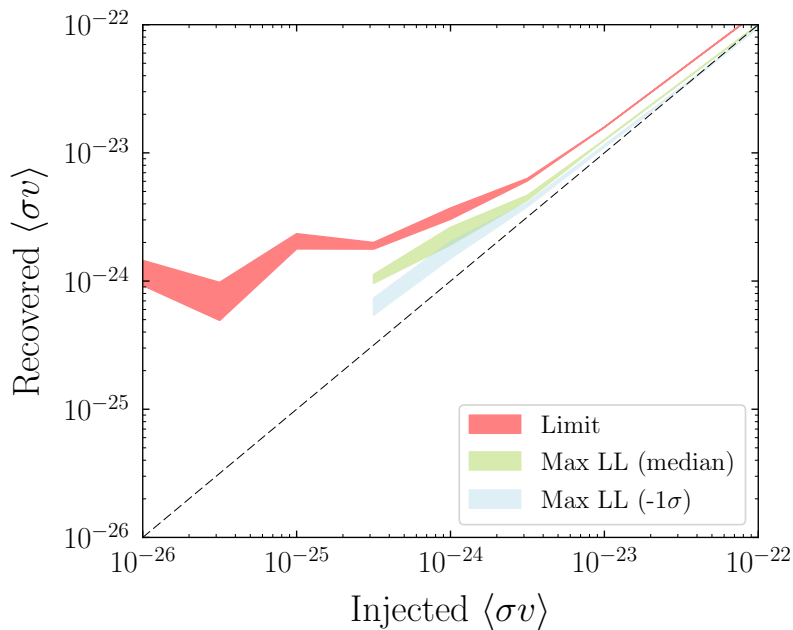
Top few halos dominate limit



Systematics



Recover Injected with DarkSky

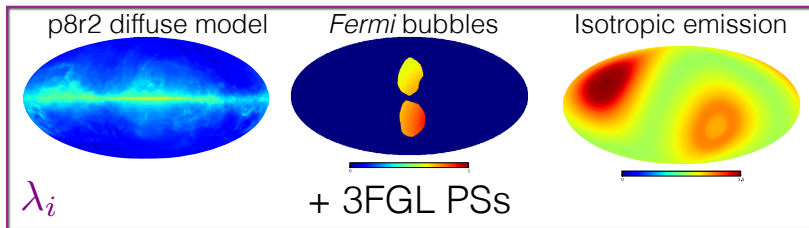


Poissonian template fit: stacking halos halo

- ▶ Sum log-likelihood ($p_h(d|\psi_{\text{DM}})$) of individual halos

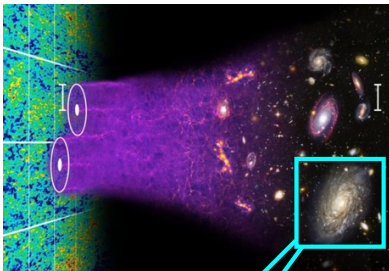
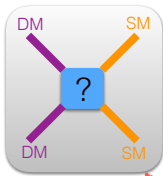
$$\log p(d|\psi_{\text{DM}}) = \sum_h \log p_h(d|\psi_{\text{DM}})$$

- ▶ Construct **likelihood profiles** for σv at fixed m_{DM}



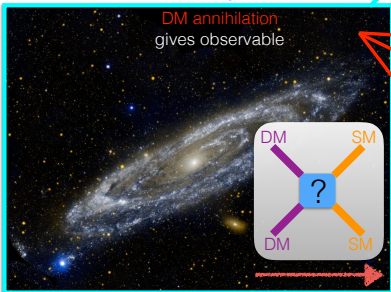
WIMP Indirect Detection

Early Universe
DM annihilation
sets DM abundance



Today

DM annihilation
gives observable



e^+, e^-, \bar{p}, \dots



γ

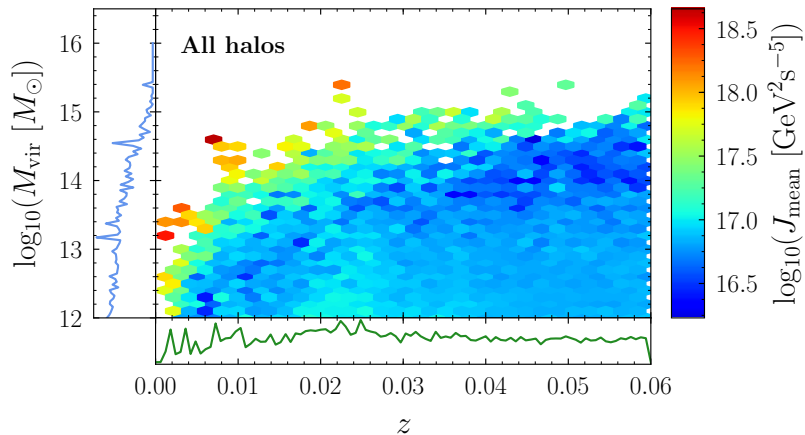
FERMI

$\nu, \bar{\nu}$

ICE CUBE



DarkSky: compute J -factors for halos



Poissonian template fit: individual halo

- ▶ Model params.: $\theta = \{\psi_{\text{DM}}, \lambda_{\text{nuisance}}\}$ ($\psi_{\text{DM}} = \{m_{\text{DM}}, \sigma_{\text{Av}}\}$)

Poissonian template fit: individual halo

- ▶ Model params.: $\theta = \{\psi_{\text{DM}}, \lambda_{\text{nuisance}}\}$ ($\psi_{\text{DM}} = \{m_{\text{DM}}, \sigma_{AV}\}$)
- ▶ Likelihood in energy bin i with pixelated data $d_i = \{n_i^p\}_p$:

$$p_i(d_i|\theta) = \prod_p \frac{\mu_i^p(\theta)^{n_i^p} e^{-\mu_i^p(\theta)}}{n_i^p!}$$

Poissonian template fit: individual halo

- ▶ Model params.: $\theta = \{\psi_{\text{DM}}, \lambda_{\text{nuisance}}\}$ ($\psi_{\text{DM}} = \{m_{\text{DM}}, \sigma_{Av}\}$)
- ▶ Likelihood in energy bin i with pixelated data $d_i = \{n_i^p\}_p$:

$$p_i(d_i|\theta) = \prod_p \frac{\mu_i^p(\theta)^{n_i^p} e^{-\mu_i^p(\theta)}}{n_i^p!}$$

- ▶ maximize over nuisance parameters: $\lambda = (\{\lambda_i\}, J)$

$$\log p(d|\psi_{\text{DM}}) = \max_J \left(\sum_{i=0}^{39} \max_{\lambda_i} \log p_i(d_i|\theta) - \frac{(\log J - \log \bar{J})^2}{2\sigma_{\log J}^2} \right)$$

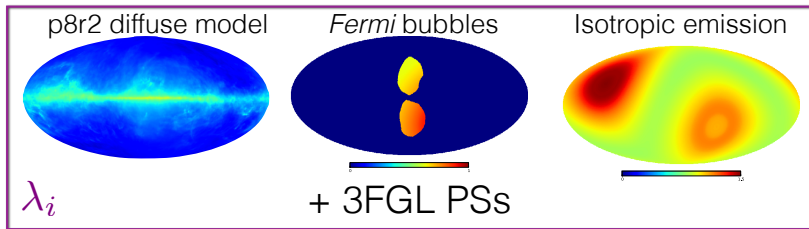
Poissonian template fit: individual halo

- ▶ Model params.: $\theta = \{\psi_{\text{DM}}, \lambda_{\text{nuisance}}\}$ ($\psi_{\text{DM}} = \{m_{\text{DM}}, \sigma_{Av}\}$)
- ▶ Likelihood in energy bin i with pixelated data $d_i = \{n_i^p\}_p$:

$$p_i(d_i|\theta) = \prod_p \frac{\mu_i^p(\theta)^{n_i^p} e^{-\mu_i^p(\theta)}}{n_i^p!}$$

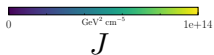
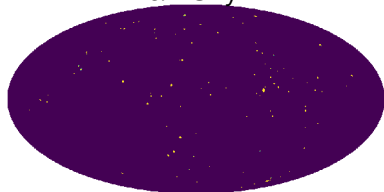
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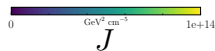
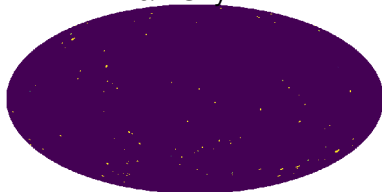


DarkSky N -body simulation vs real data

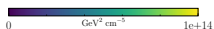
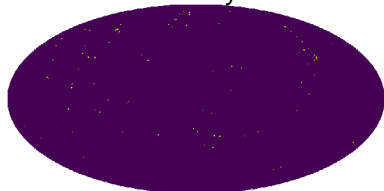
DarkSky 1



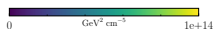
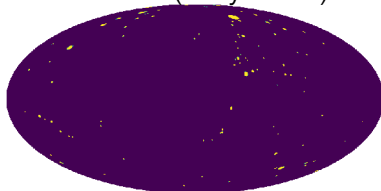
DarkSky 2



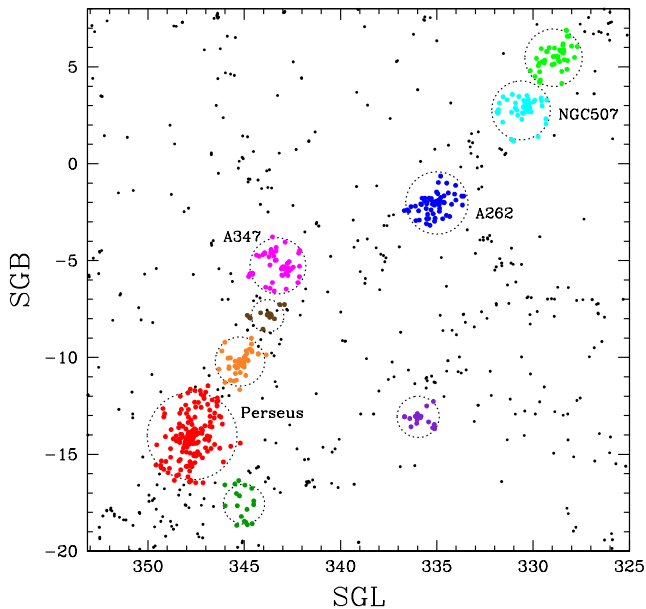
DarkSky 3



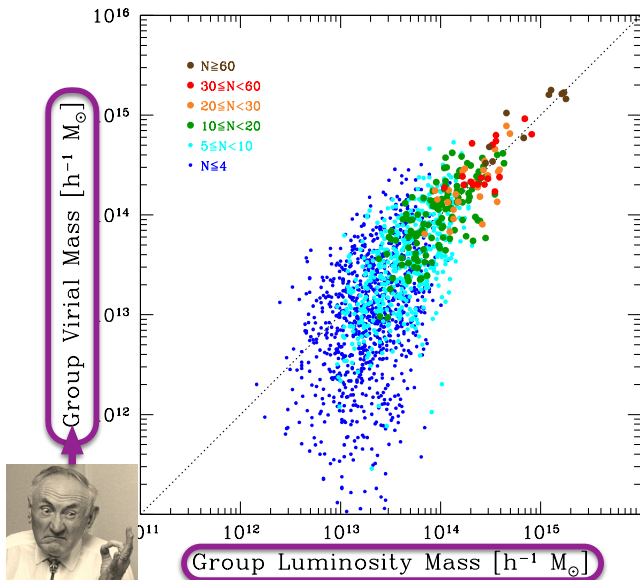
Real Data (Tully 2015)



Real data: 2MASS group catalog (Tully 2015)

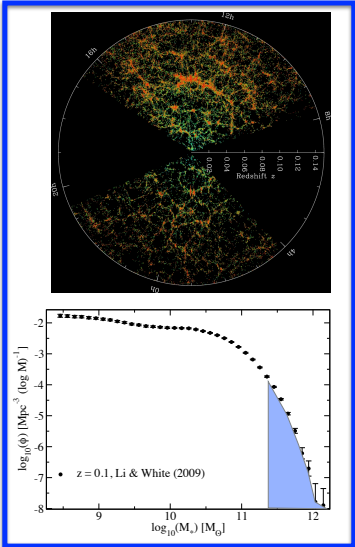


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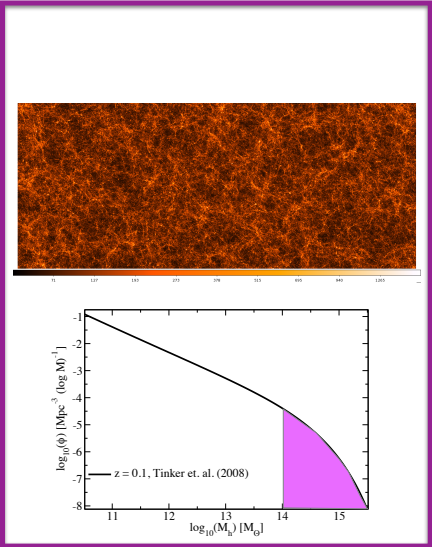
DarkSky (2016): mock galaxy catalog

Stellar Mass



Galaxy Surveys (SDSS)

Dark Matter Mass



Simulations

Boost factor from DM sub-halos

- ▶ Boost-factor given by integral over sub-halo population
 $dN/dm \sim m^{-1.9}$ (for field halos)

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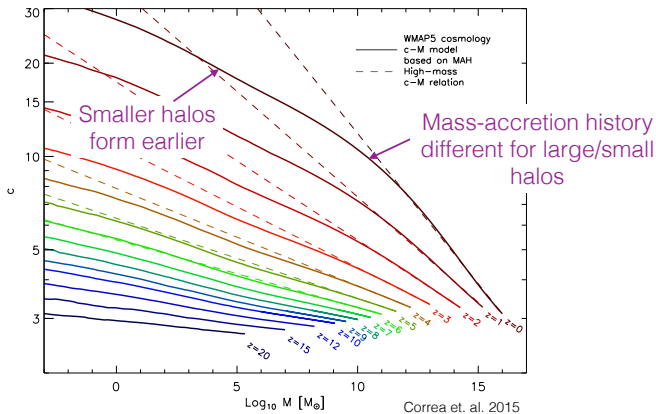
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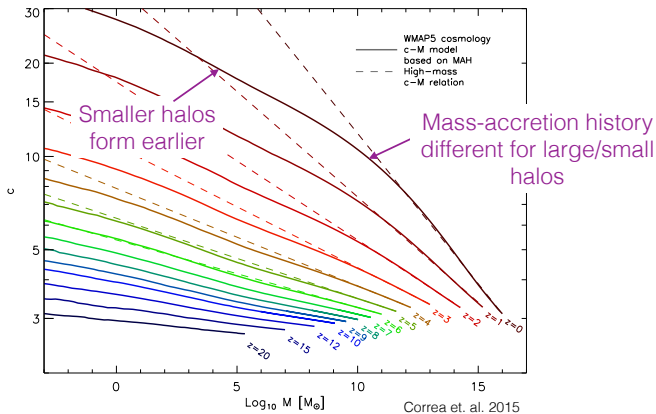
- ▶ Kinetic decoupling depends on elastic-scattering with SM

$$T_{\text{kd}} \sim 50 \left(\frac{m_{\chi}}{50 \text{ GeV}} \right)^{3/4} \text{ MeV}$$

Boost factor: importance of $c(M)$, dN/dM



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- ▶ $c(M)$ steepens at low m from tidal stripping
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 - ▶ Low-mass halos tidally stripped (Bartels et. al. 2015)

DarkSky: top ~ 100 halos

