Optimal Transport Reconstruction and Peaks Theory for Energy

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Reconstruction of density and displacements Excursion set peaks in energy

Assume initial density field uniform (same for all cosmologies); solve for displacements

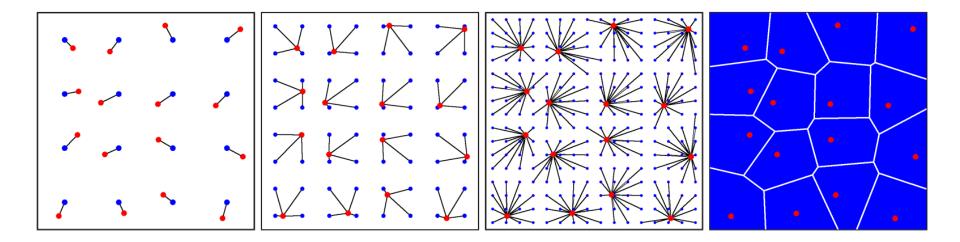
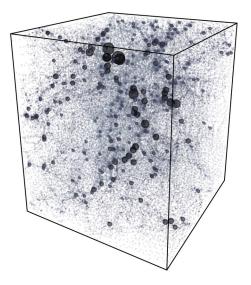


Figure 52: From discrete-discrete to semi-discrete optimal transport problem. The red points show the distribution of matter at current time and the blue points represent the initial condition by a regular grid. From left to right, we increase the precision by using a finer grid for the initial positions (Lévy et al., 2020).

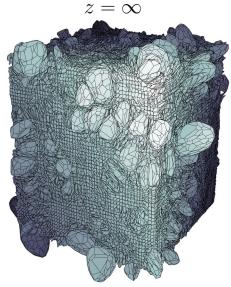
# Optimal transport (Nikakhtar et al. 2022)

z = 0

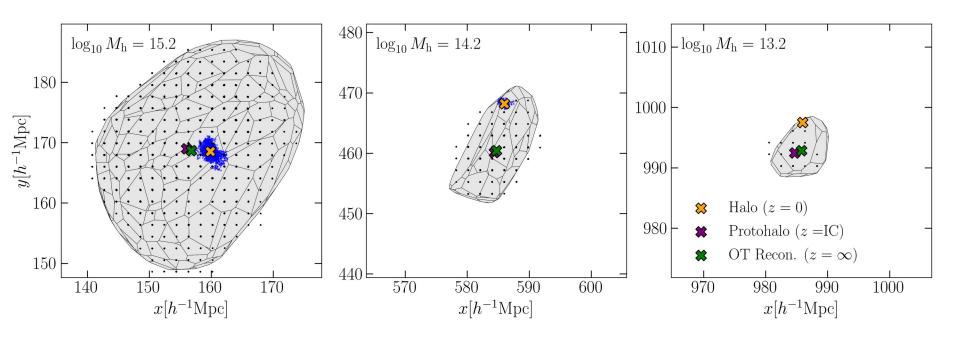


Weighted Semi-discrete OT Reconstruction: Computing Laguerre cells  $V_i^{\psi}$ 

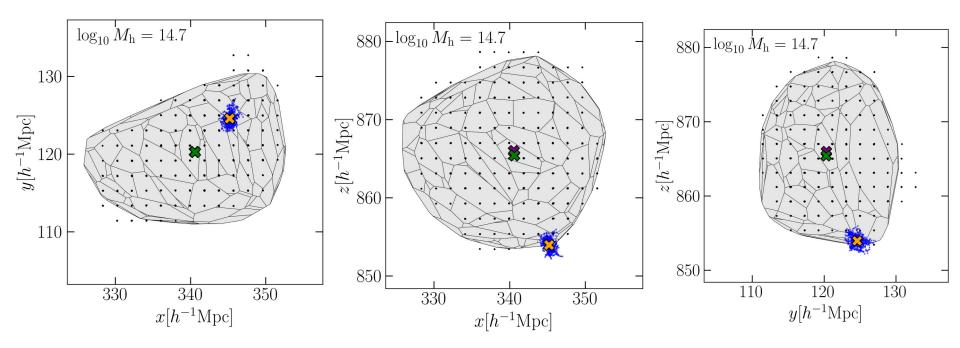
$$V_i^{\psi} = \left\{ \mathbf{q} \mid \frac{1}{2} |\mathbf{x}_i - \mathbf{q}|^2 - \psi_i < \frac{1}{2} |\mathbf{x}_j - \mathbf{q}|^2 - \psi_j, \ \forall j \neq i \right\}$$



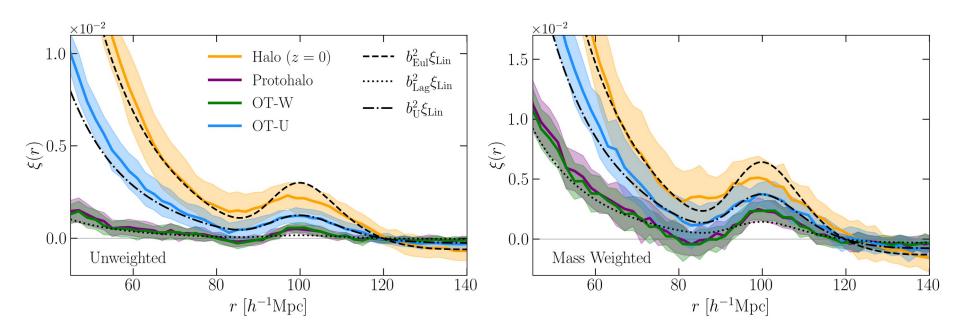
# Reconstructs displacements, hence protohalo positions, shapes



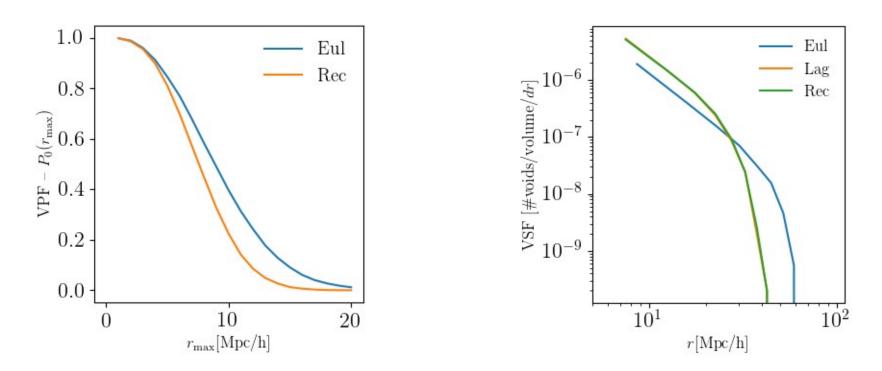
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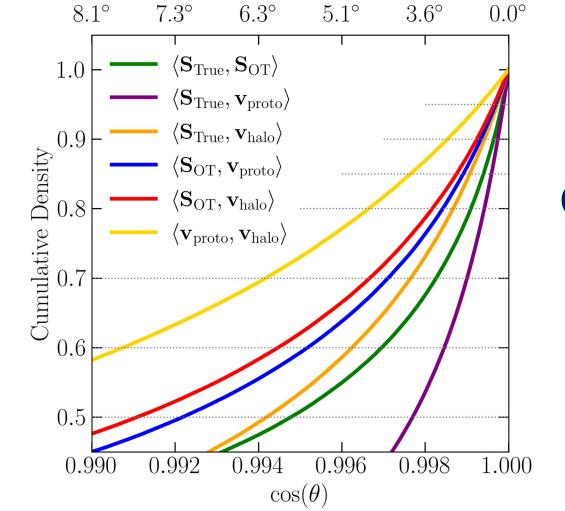
# Reconstructs displacements, hence protohalo positions, shapes



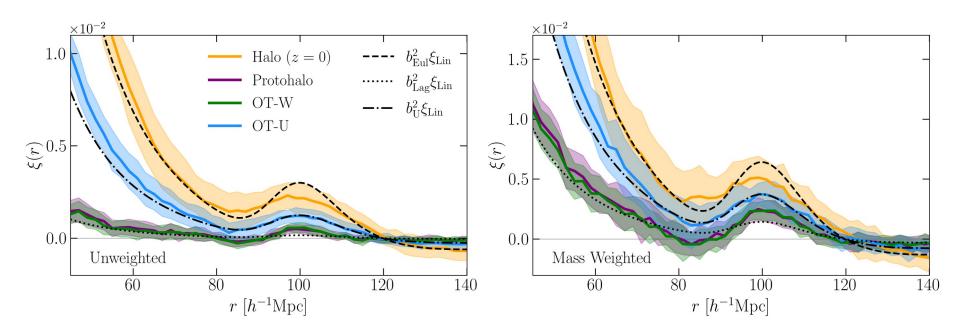
# Reconstructs two-point statistics (mass weighted ~ HOD galaxies)



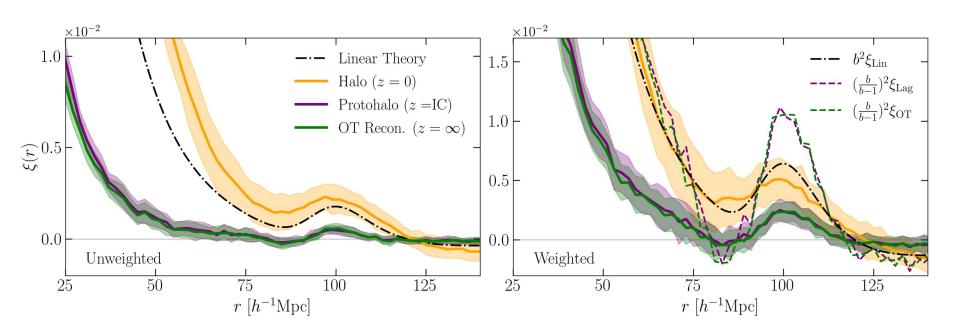
# Reconstructs n-point statistics: Void PDF (hence kNN), Void sizes



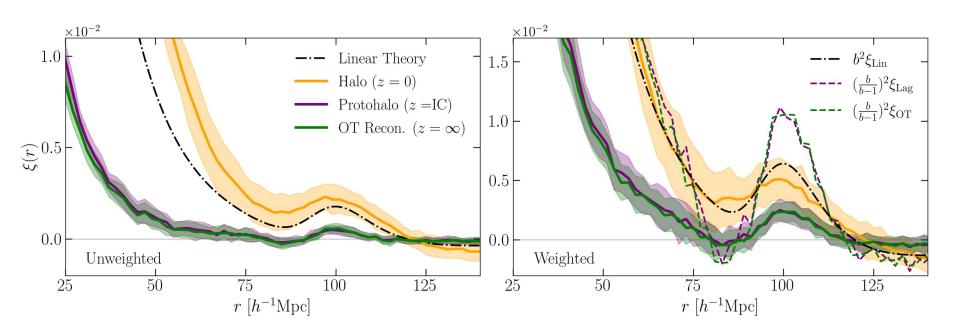
Reconstructs displacements; BAO-kSZ synergy?



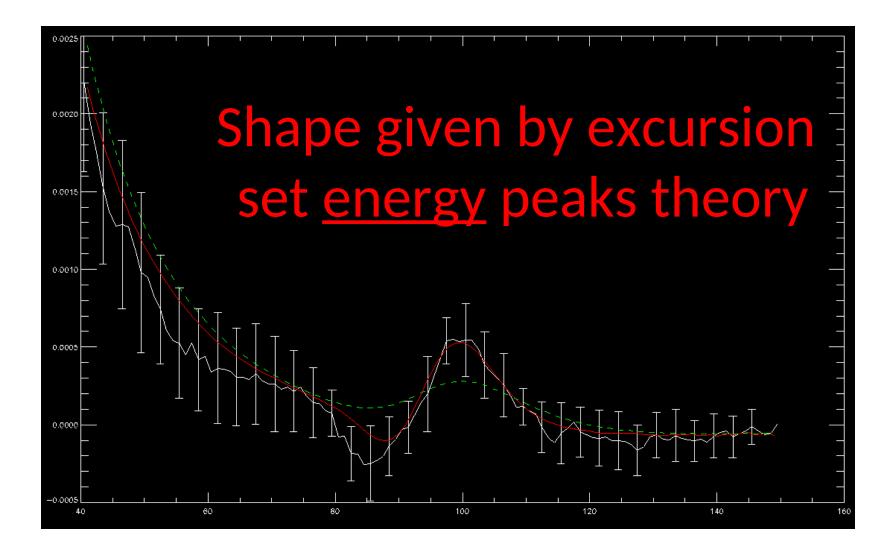
# Reconstructs 2-point statistics (mass weighted ~ HOD)



Reconstructed 2-point statistics scale as expected – enables determination of bias factor b



Reconstructed 2-point statistics scale as expected – but shape different from pure linear theory!



#### Excursion set peaks

Spherical evolution model suggests initial overdensity determines subsequent evolution

Peaks in smoothed density field tractable but

- <u>What smoothing filter</u>? <u>What smoothing scale</u>?

Set scale by additional **'multiscale'** requirement that density is smaller on larger smoothing:

dn/dlnR ~  $p(\delta_R = \delta_c, \partial_i \delta_R = 0, \partial_{ij} \delta_R < 0, y_R > 0)$ 

where  $y_R = - d\delta_R / dlnR$ . Each extra constraint shifts mean and variance of Gaussian pdf.

#### In principle: M~R<sup>3</sup> so dn/dlnM = (dn/dlnR)/3 Cosmology constraints because pdf depends on P(k)

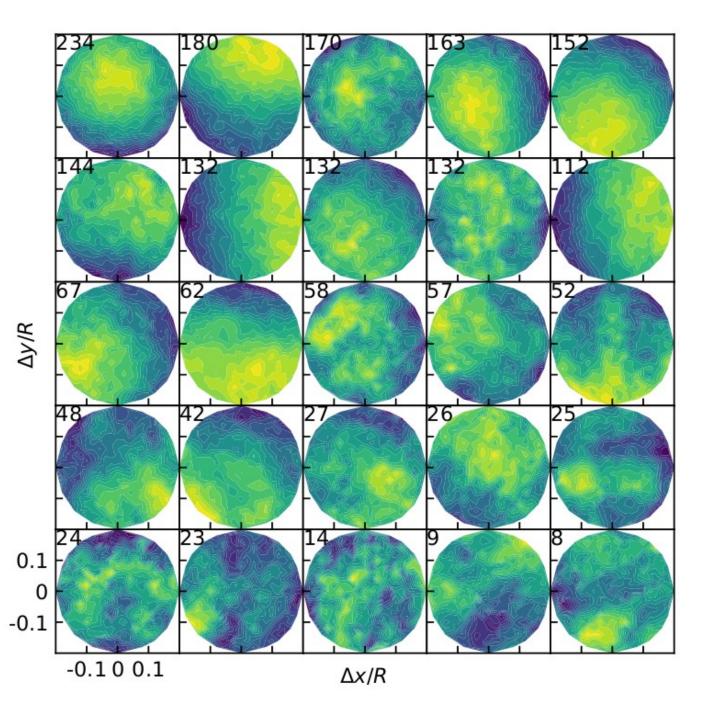
# Problem in practice:

For a tophat smoothing filter, some integrals

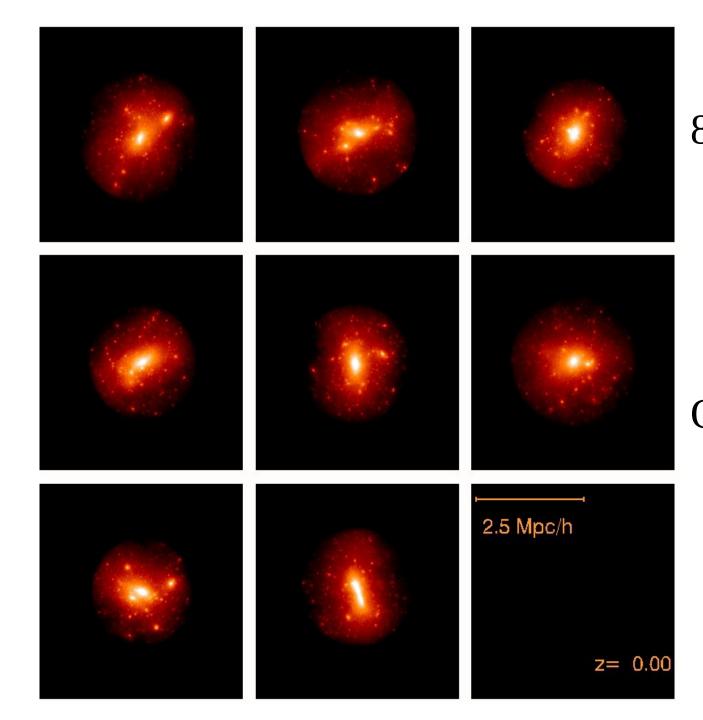
which define the relevant variances diverge.

So one plays games with the tophat smoothing filter (typically 'smooth' its edges).

Is there a more principled way out?

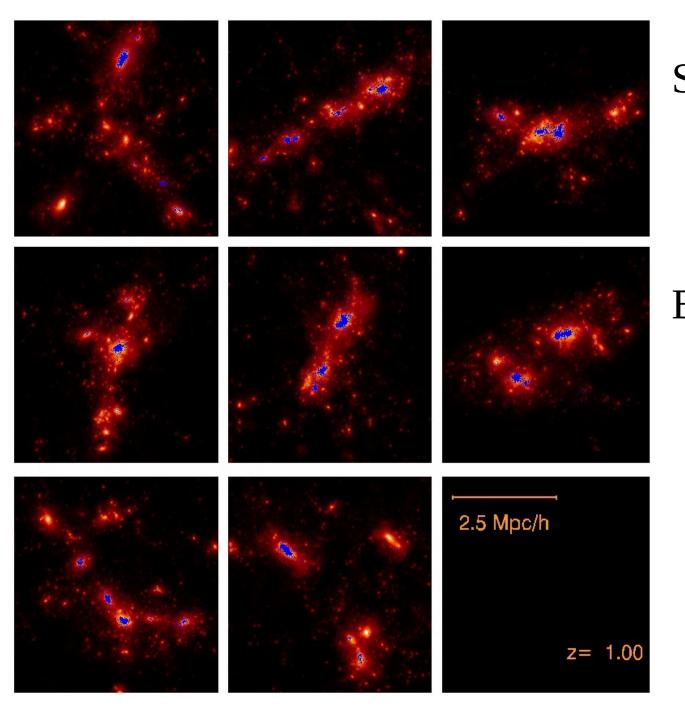


Density smoothed within patch centered on protohalo is noisy, miscentered, especially at lower mass



#### 8 halos, $10^{15}M_{sun}$ at z=0 in $\Lambda CDM$

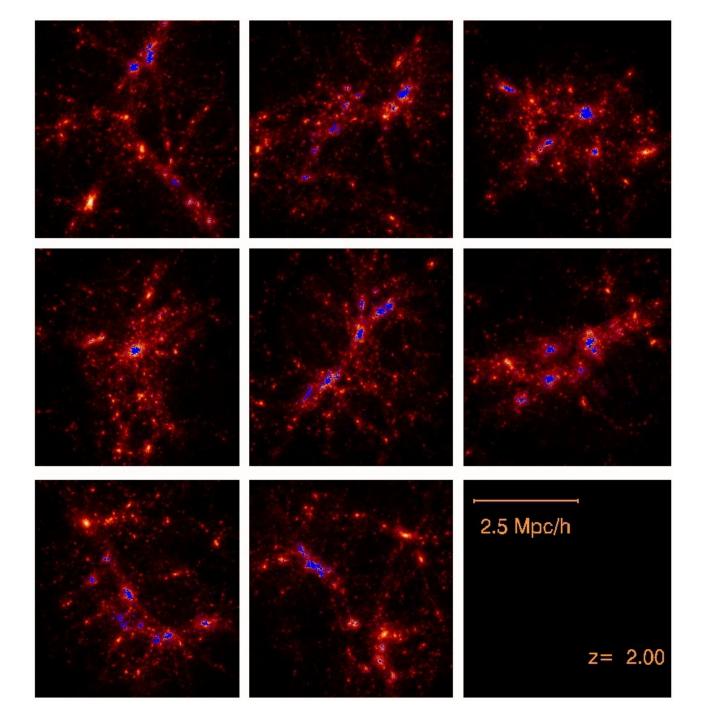
Only dark matter particles within R<sub>200</sub> shown



#### Same objects at z=1

Blue shows dark matter within 20kpc at z=0

(Springel et al.)



Same objects at z=2

Blue shows dark matter within 20kpc at z=0

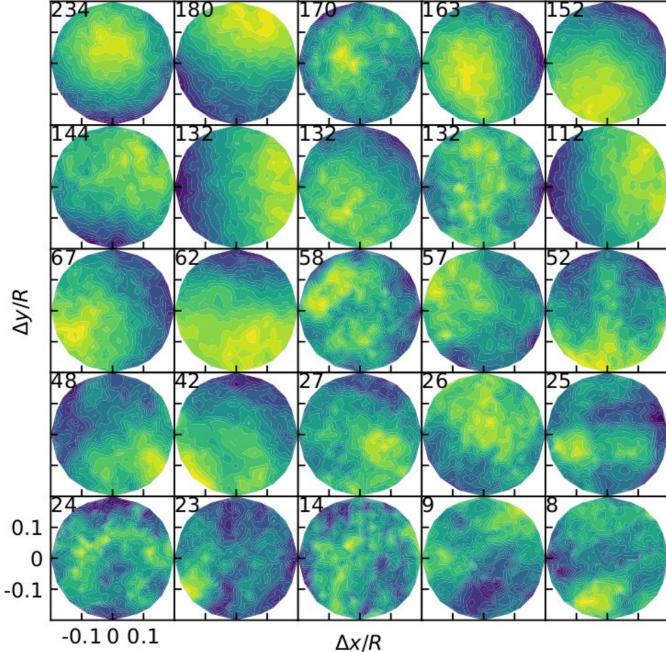
(Springel et al.)

# Why does this work at all?

- Collapse is lumpy, not smooth
  - Centers of virialized subclumps at early time end up in center of virialized halo at later time
  - Spherical collapse has rank ordering in binding energy 'built-in'
- Collapse is anisotropic, not spherical
  - Monopole of full anisotropic solution is given by SC at <u>all</u> orders

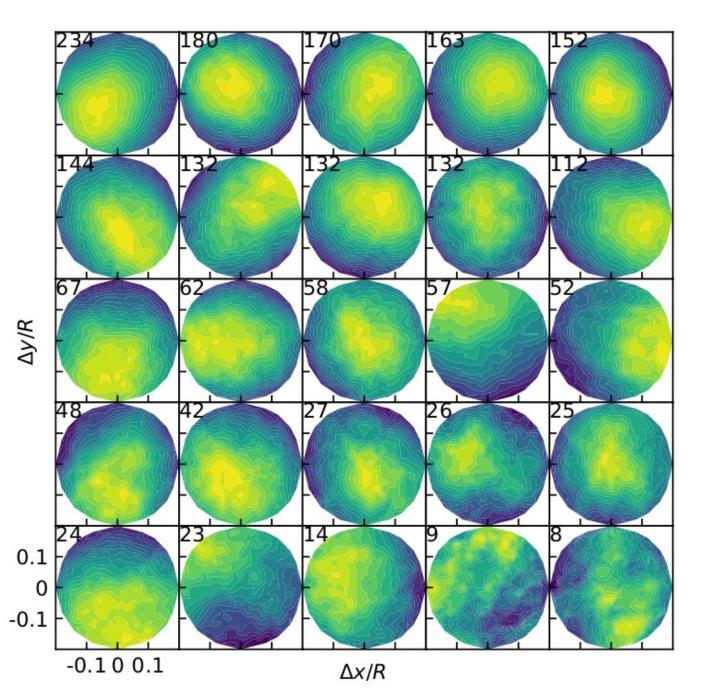
## A solution?

Consider energy conservation instead:  $dn/dlnR \sim p(\delta_R = \delta_c, \partial_i \delta_R = 0, \partial_{ii} \delta_R < 0, d\delta_R/dlnR < 0)$  $\rightarrow$  p( $\varepsilon_{R} = \varepsilon_{c}, \partial_{i}\varepsilon_{R} = 0, \partial_{ii}\varepsilon_{R} < 0, d\varepsilon_{R}/d\ln R < 0$ ) <u>No</u> extra complication. Moreover,  $3j_1(x)/x \rightarrow 15j_2(x)/x^2$  (like 'damped tophat') And  $\partial_i \varepsilon_R = 0$  means dipole=0;  $\partial_{ii} \epsilon_{R} < 0$  means  $d\delta_{R}/dR < 0$ ;  $d\epsilon_{\rm R}/d\ln R$  at fixed  $\partial_{\rm ii}\epsilon_{\rm R}$  is just  $\delta_{\rm R}$ .



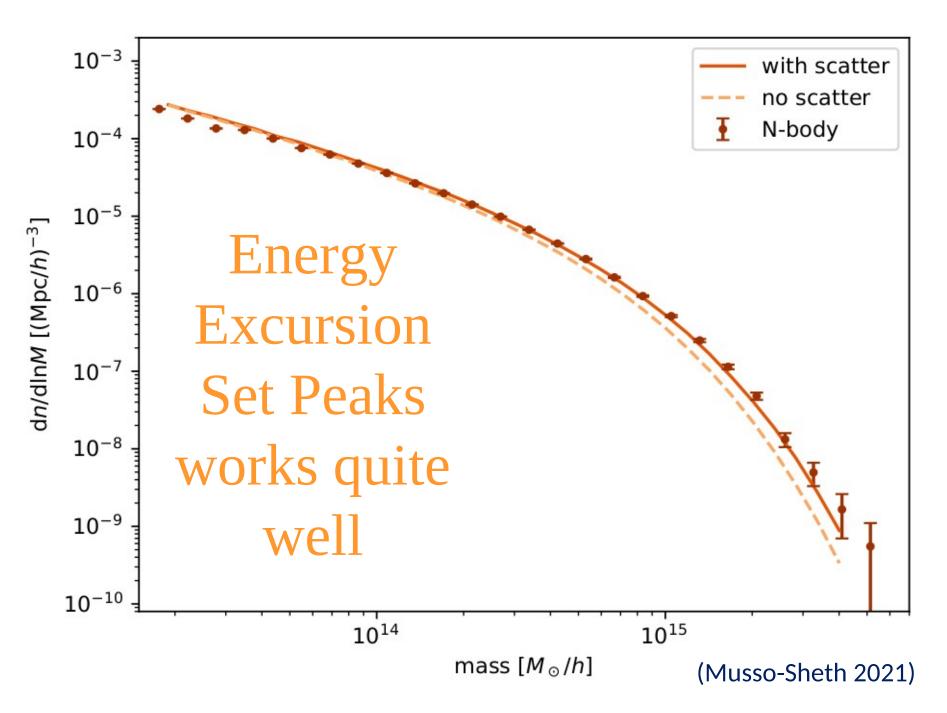
Density smoothed within patch centered on protohalo is noisy, miscentered, especially at lower mass

(Musso-Sheth 2021)



Energy smoothed within patch centered on protohalo is less noisy, ~centered, also at lower mass

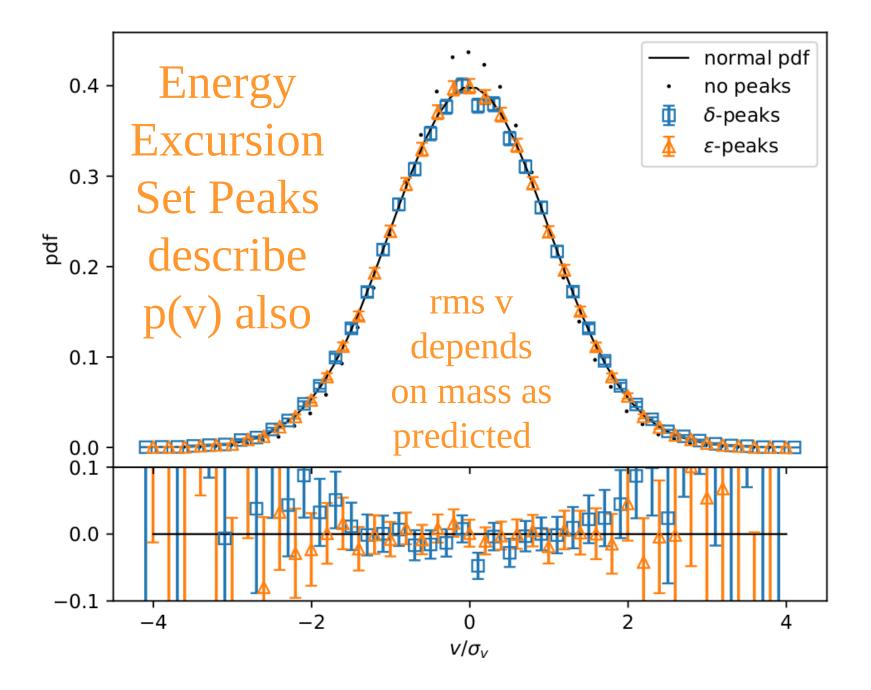
(Musso-Sheth 2021)



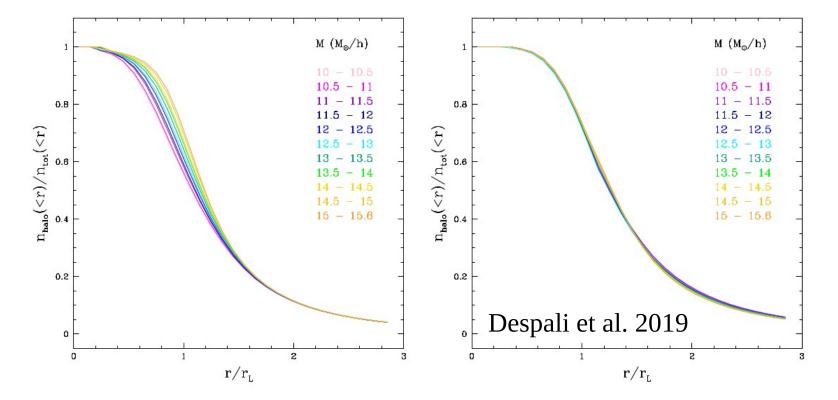
Energy Excursion Set Peaks works quite well

Each constraint modifies (biases) mean and shifts variance

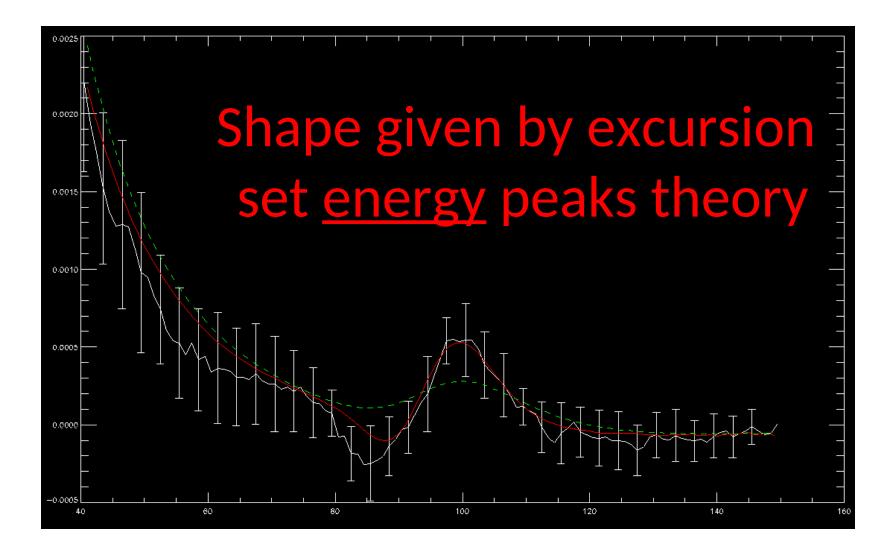
Results in both spatial bias and velocity bias



# Why displacements better (see Marcello Musso)



Anisotropic (Lagrangian) smoothing is better (more painful!)



#### Summary

# Nice convergence of BAO reconstruction efforts and understanding of cosmic web