Modeling and Measuring Redshift Space Distortions and the Alcock-Paczynski Effect in the Baryon Oscillation Spectroscopic Survey

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Image Courtesy Chris Blake and Sam Moorfield

### Outline

- Motivation
- Basic redshift space distortions (RSD) in configuration space
- Reid and White 2011 configuration space RSD model (+ connections to other recent RSD work)
- From halos to galaxies...
- BOSS DR9 first results: BAO, RSD and AP constraints
- Future prospects

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### RSD motivation: Testing General Relativity

- Once we know the expansion history H(a), we know how perturbations grow in GR:  $\delta(\mathbf{k}, a) = aG(H(a))\delta_i(\mathbf{k})$
- We want to test both scale (k) and time (a) dependence

#### RSD in 3d Galaxy Maps

 $\theta, \phi, redshift$ 

depends on the geometry of the universe

 $\chi(z) = \chi_{true} + v_p/aH(a)$ 

 $\chi(z) =_0 \int^z c dz' / H(z')$ 

comoving coordinates: x, y, z

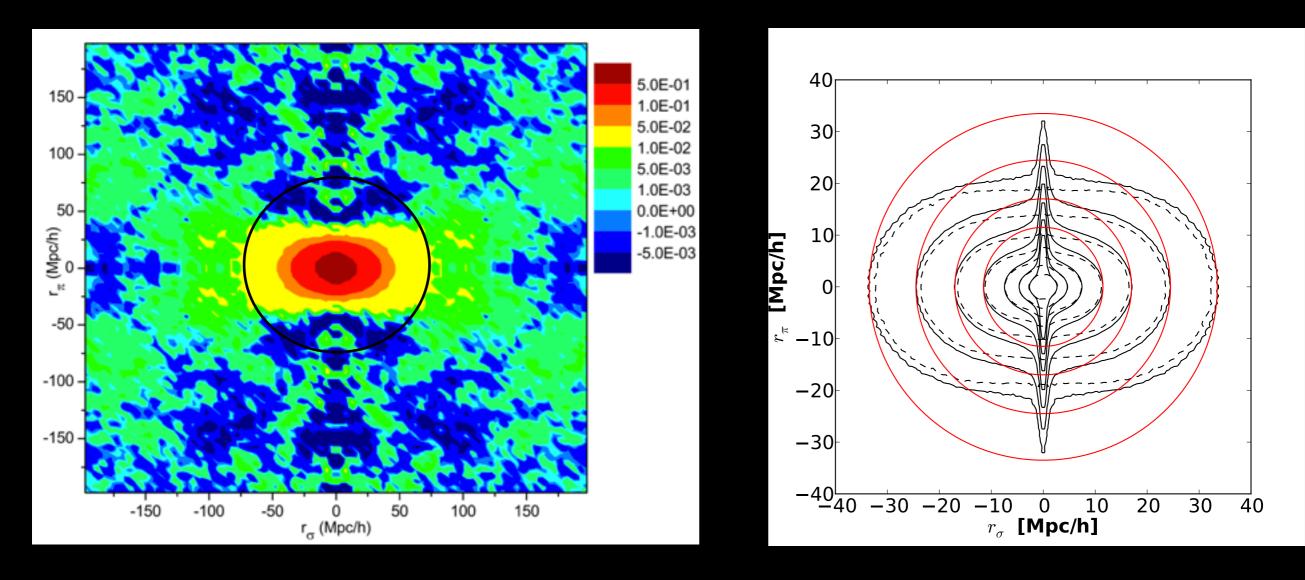


#### RSD in configuration space

real to redshift space separations  $\nabla \cdot \mathbf{v_p} = -aHf \, \delta_m$   $(\mathbf{v_p}) = -aHf \, \delta_m$ 

 $f = d \ln \sigma_8 / d \ln a$ 

### RSD: Anisotropy in $\xi(r_{\sigma}, r_{\pi})$



BOSS DR9: Reid et al., Samushia et al. (in prep)

White et al. 2011 mock catalogs

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#### Linear RSD (Kaiser 1987)

 $\delta_g^s(k) = (b + f\mu_k^2)\delta_m^r(k)$ 

$$\mu_k^2 = k_z^2/k^2$$





#### Linear RSD: Legendre Polynomial moments

General Expansion

$$P(k,\mu_k) = \sum_{\ell} P_{\ell}(k) L_{\ell}(\mu_k)$$

#### Linear theory prediction

$$\begin{pmatrix} P_0(k) \\ P_2(k) \\ P_4(k) \end{pmatrix} = P_m^r(k) \begin{pmatrix} b^2 + \frac{2}{3}bf + \frac{1}{5}f^2 \\ \frac{4}{3}bf + \frac{4}{7}f^2 \\ \frac{8}{35}f^2 \end{pmatrix}$$

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#### Legendre Polynomial moments

General Expansion

$$\xi(s,\mu_s) = \sum_{\ell} \xi_{\ell}(s) L_{\ell}(\mu_s)$$

Relation to  $P_{\ell}(k)$ 

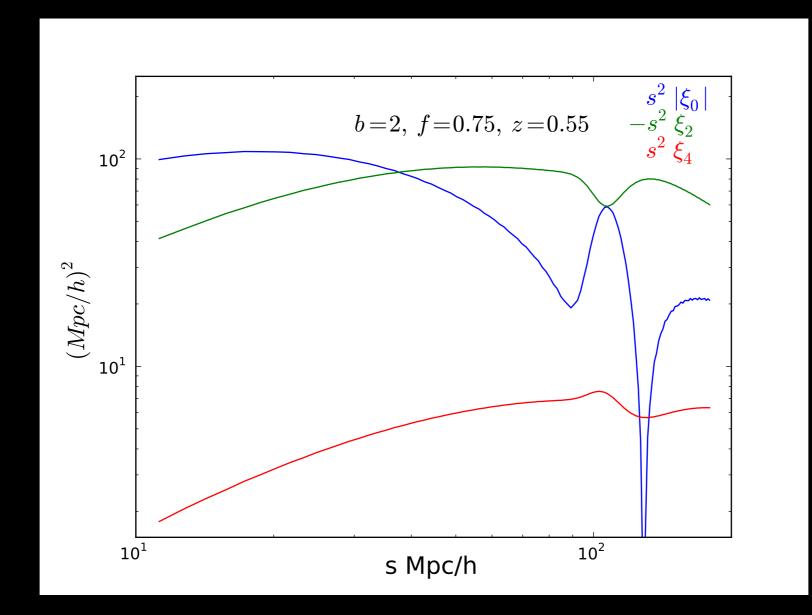
$$\xi_{\ell}(s) = i^{\ell} \int \frac{k^2 dk}{2\pi^2} P_{\ell}(k) j_{\ell}(ks)$$

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## Linear theory Legendre polynomial moments: scale dependence



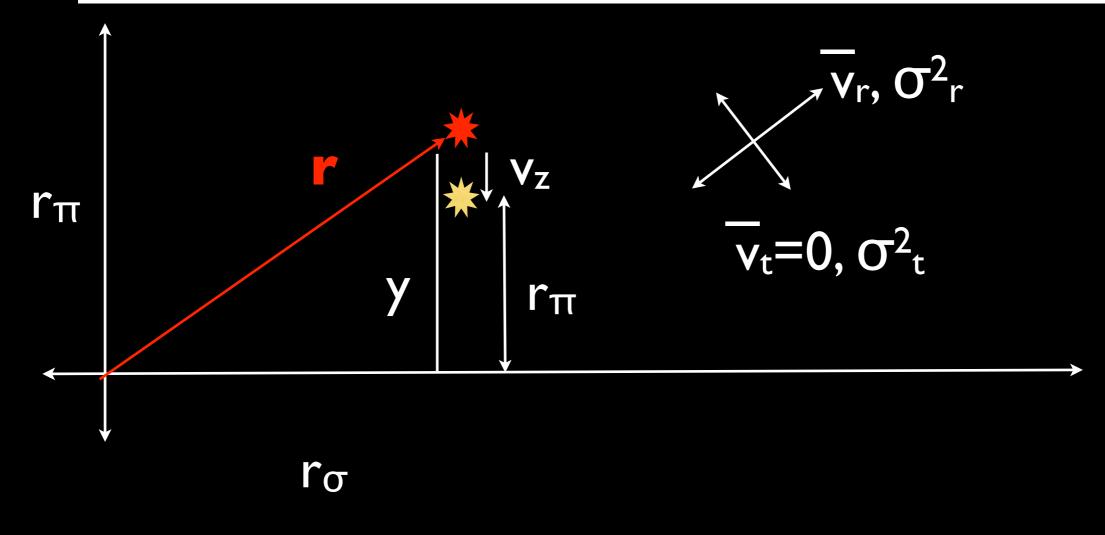
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## RSD in configuration space: new quantities of interest

$$1 + \xi_s(r_\sigma, r_\pi) = \int_{-\infty}^{\infty} dy \left[1 + \xi(r)\right] \mathcal{P}(v_z \equiv r_\pi - y, \mathbf{r})$$







#### Linear theory pairwise velocities ( $\delta_g = b\delta_m$ )

$$\mathbf{v}_{12}(r) = v_{12}(r)\hat{r} = -\hat{r}\frac{fb}{\pi^2}\int dk \ k \ P_m^r(k) j_1(kr)$$

$$\left\langle \mathbf{v}_i(\mathbf{r}' + \mathbf{r})\mathbf{v}_j(\mathbf{r}') \right\rangle = \Psi_{\perp}(\mathbf{r})\delta_{ij}^K + [\Psi_{\parallel}(r) - \Psi_{\perp}(r)]\hat{r}_i\hat{r}_j$$

$$\underbrace{\Psi_{\perp}(r)}_{=} = \frac{f^2}{2\pi^2}\int dk \ P_m^r(k) \frac{j_1(kr)}{kr}$$

$$\underbrace{\Psi_{\parallel}(r)}_{=} = \frac{f^2}{2\pi^2}\int dk \ P_m^r(k) \left[ j_0(kr) - \frac{2j_1(kr)}{kr} \right]$$

$$\sigma_{12}^2(r,\mu^2) = 2 \left[ \sigma_v^2 - \mu^2 \Psi_{\parallel}(r) - (1-\mu^2)\Psi_{\perp}(r) \right]$$



# Fisher 1995: the Kaiser formula in configuration space

### • $\delta(\mathbf{x}), \mathbf{v}(\mathbf{x}')$ correlated Gaussian fields

$$1 + \xi_g^s(r_\sigma, r_\pi) = \int \frac{dy}{\sqrt{2\pi\sigma_{12}^2(y)}} \exp\left[-\frac{(r_\pi - y)^2}{2\sigma_{12}^2(y)}\right] \left[1 + \xi_g^r(r) + \frac{y}{r} \frac{(r_\pi - y)v_{12}(r)}{\sigma_{12}^2(y)} - \frac{1}{4} \frac{y^2}{r^2} \frac{v_{12}^2(r)}{\sigma_{12}^2(y)} \left(1 - \frac{(r_\pi - y)^2}{\sigma_{12}^2(y)}\right)\right]$$

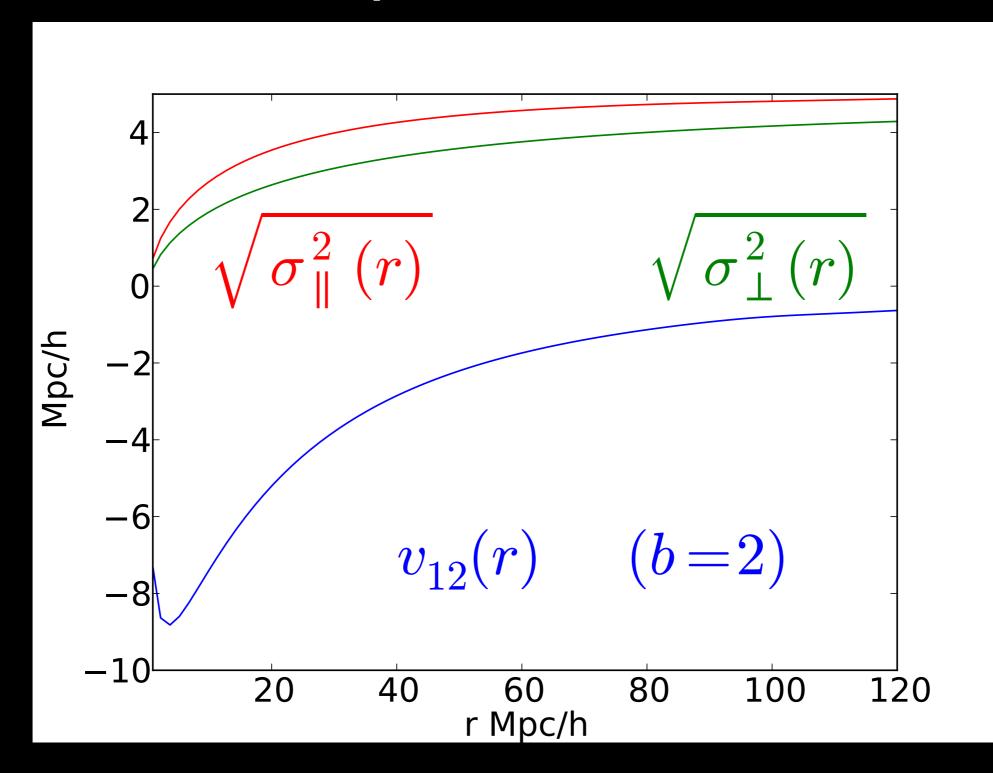
### • Expand around $y = r_{\pi}$

$$\xi_g^s(r_\sigma, r_\pi) = \xi_g^r(s) - \left. \frac{d}{dy} \left[ v_{12}(r) \frac{y}{r} \right] \right|_{y=r_\pi} + \frac{1}{2} \left. \frac{d^2}{dy^2} \left[ \sigma_{12}^2(y) \right] \right|_{y=r_\pi}$$

#### Equivalent to Kaiser formula



#### Pairwise velocity statistics in linear theory

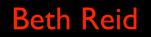




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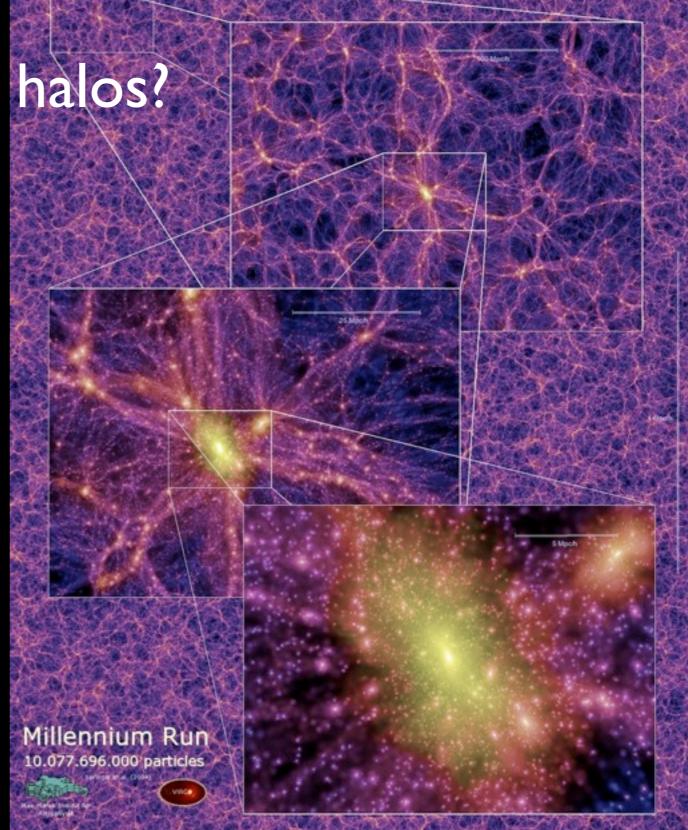
#### Recent work: Matter Density Field

	Model	Damping	Fitted parameters	Reference
1.	Empirical Lorentzian with linear $P_{\delta\delta}(k)$	Variable	$f, b, \sigma_v$	e.g. Hatton & Cole (1998)
2.	Empirical Lorentzian with non-linear $P_{\delta\delta}(k)$	Variable	$f, b, \sigma_v$	
3.	$P_{\delta\delta}, P_{\delta\theta}, P_{\theta\theta}$ from 1-loop SPT	None	f, b	e.g. Vishniac (1983), Juszkiewicz et al. (1984)
4.	$P_{\delta\delta}, P_{\delta\theta}, P_{\theta\theta}$ from 1-loop SPT	Variable	$f, b, \sigma_v$	
5.	$P_{\delta\delta}, P_{\delta\theta}, P_{\theta\theta}$ from 1-loop SPT	Linear	f, b	
6.	$P_{\delta\delta}, P_{\delta\theta}, P_{\theta\theta}$ from 1-loop RPT	None	f, b	Crocce & Scoccimarro (2006)
7.	$P_{\delta\delta}, P_{\delta\theta}, P_{\theta\theta}$ from 1-loop RPT	Linear	f, b	
8.	$P_{\delta\delta}, P_{\delta\theta}, P_{\theta\theta}$ from 2-loop RPT	None	f, b	
9.	$P_{\delta\delta}, P_{\delta\theta}, P_{\theta\theta}$ from 2-loop RPT	Variable	f, b	
10.	$P_{\delta\delta}, P_{\delta\theta}, P_{\theta\theta}$ from 2-loop RPT	Linear	f, b	
11.	$P(k,\mu)$ from 1-loop SPT	None	f, b	Matsubara (2008)
12.	$P(k,\mu)$ from 1-loop SPT	Linear	f, b	
13.	$P(k,\mu)$ with additional corrections	None	f, b	Taruya et al. (2010)
14.	$P(k,\mu)$ with additional corrections	Variable	$f, b, \sigma_v$	
15.	$P(k,\mu)$ with additional corrections	Linear	f, b	
16.	Fitting formulae from N-body simulations	None	f, b	Smith et al. (2003), Jennings et al. (2010)
17.	Fitting formulae from N-body simulations	Variable	$f, b, \sigma_v$	
18.	Fitting formulae from N-body simulations	Linear	f, b	

#### Blake et al., arXiv:1105.2862; see also Scoccimarro 2004

### Why halos?

- Galaxies live there!
- Halos occupy "special" places in the density field;  $\theta$  is a volumeaveraged statistic
- Dependence on halo bias is complex; studies of matter correlations not easily generalized



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#### Recent Work: Halos

- Tinker, Weinberg, Zheng 2006; Tinker
   2007 (+ galaxies in halo model)
- Matsubara 2008ab [LPT with biasing]
- Tang, Kayo, Takada arXiv:1103.3614
- Nishimichi, Taruya arXiv:1106.4562



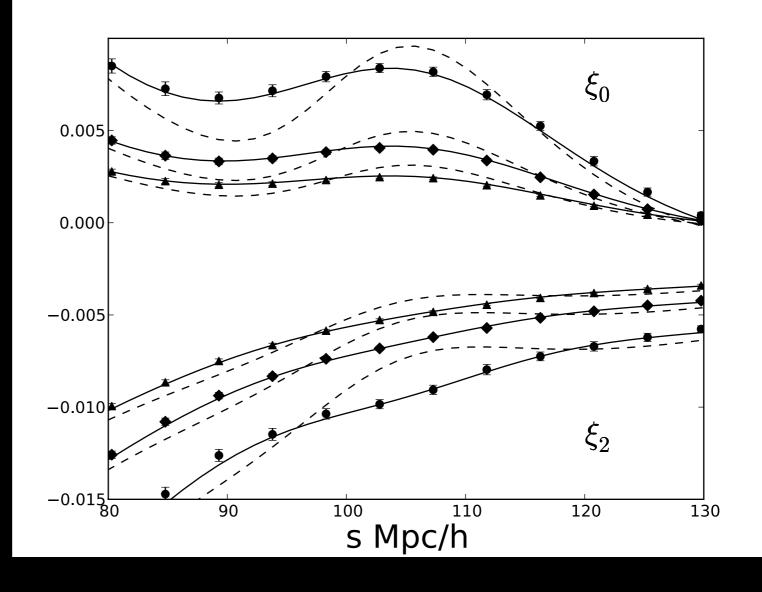
#### N-body Simulations

- White et al. 2011; arXiv:1010.4915
- 67.5 (Gpc/h)<sup>3</sup> total volume (for BOSS galaxies V ~ 5 (Gpc/h)<sup>3</sup>)

sample	log(M) range	$ar{b}_{lin}$	$ar{b}_{LPT}$	$\bar{n} (h^{-1} Mpc)^{-3}$
high	>13.387	2.67	2.79	$7.55 \times 10^{-5}$
low	12.484 - 12.784	1.41	1.43	$4.04 \times 10^{-4}$
HOD	-	1.84	1.90	$3.25 \times 10^{-4}$

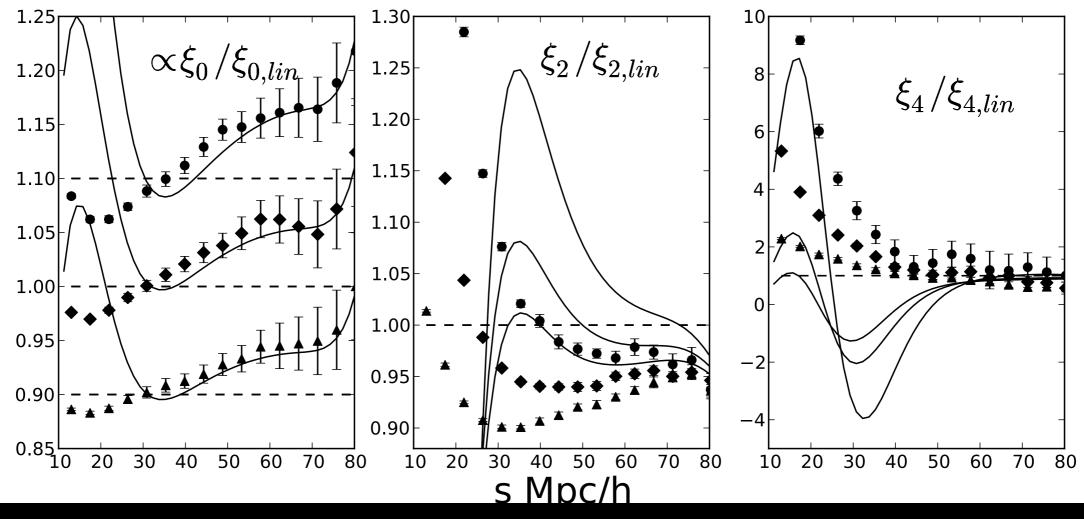
### N-body simulations vs Linear and Lagrangian Perturbation Theories

- LPT works on BAO scales
- See Matsubara
   PRD 78, 083519; arXiv:1105.5007





### N-body simulations vs Linear and Lagrangian Perturbation Theories



 ξ<sub>2</sub> suppressed by 2.5-7.5% at 50 h<sup>-1</sup> Mpc, depends strongly on bias

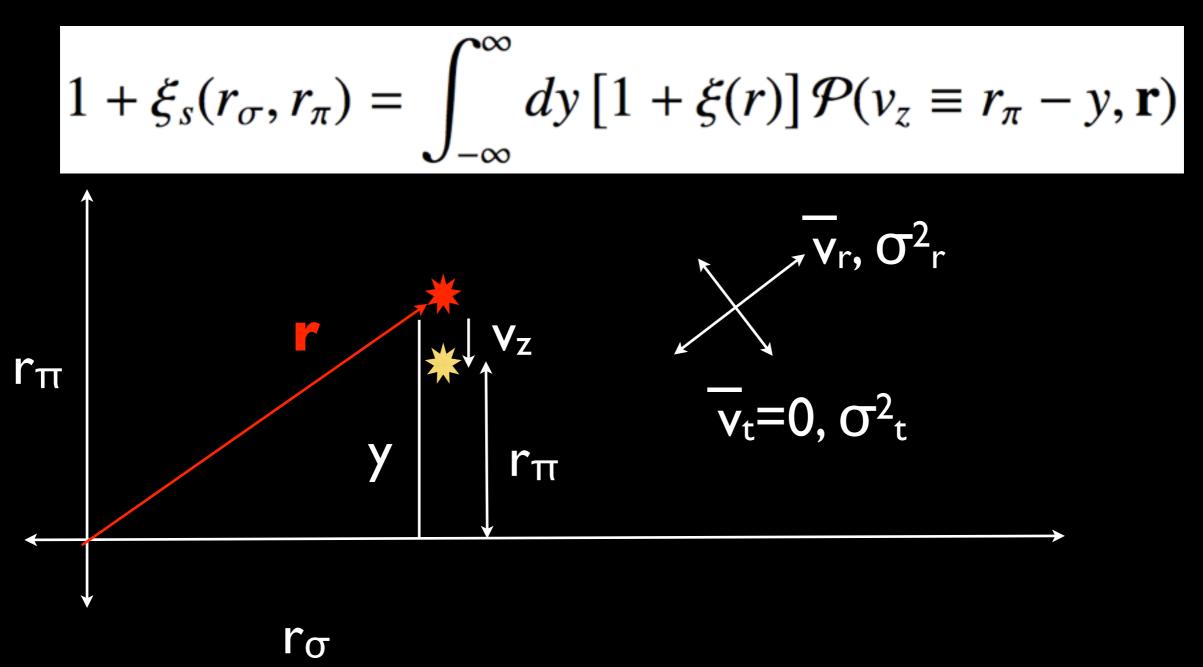
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### Our approach

- Two distinct sources of nonlinearity:
  - Nonlinear growth of structure/biasing -affects both halo clustering and velocities (study in N-body sims/perturbation theory)
  - Nonlinear mapping from real to redshift space coordinates (non-perturbative)
  - Recall: to get Kaiser:  $dv_z/dz$  small (P) or expand around  $y = r_{\pi}(\xi)$

## The scale-dependent Gaussian streaming model ansatz



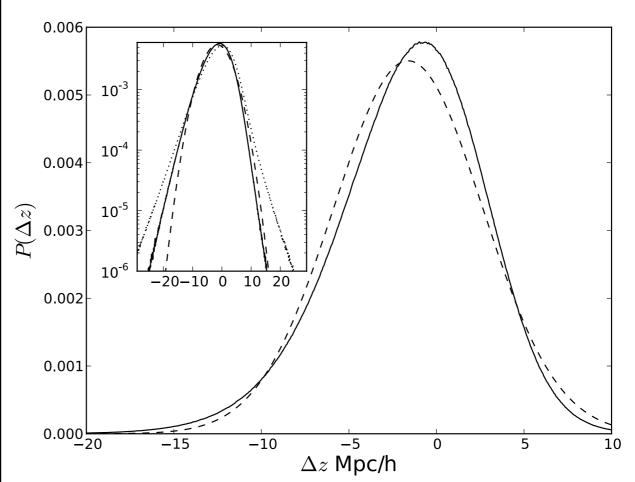
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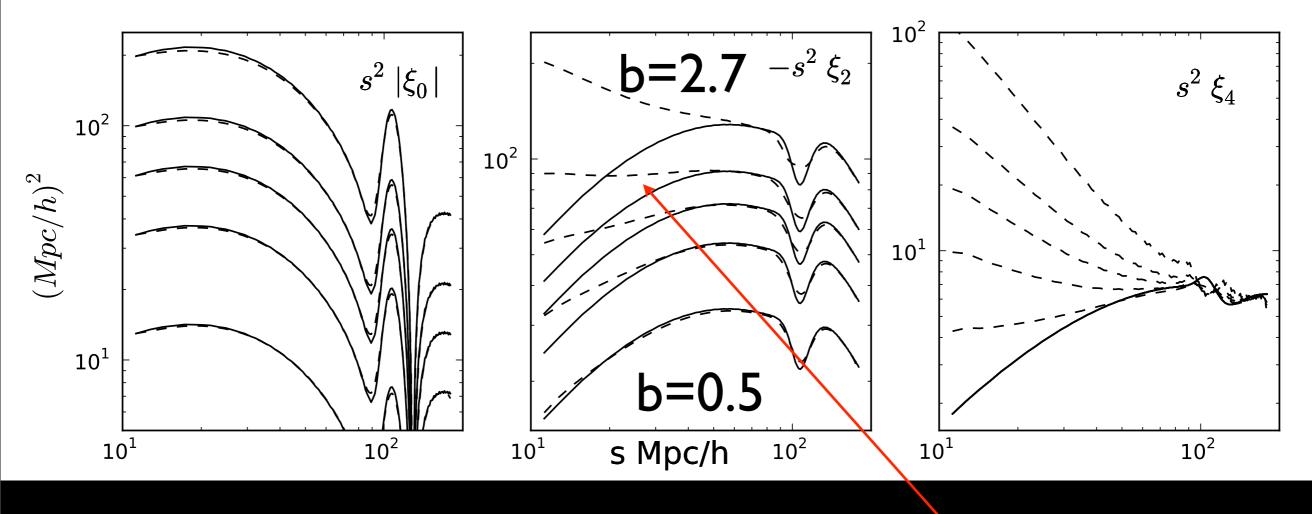
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# The scale-dependent Gaussian streaming model ansatz

- Non-perturbative!
- Approximate pairwise velocity PDF P(vz, r) with a Gaussian; match I<sup>st</sup> and 2<sup>nd</sup> moments
- Agrees at linear order with Kaiser/exact



# The scale-dependent Gaussian streaming model ansatz: "linear" theory predictions



Kaiser limit Gaussian streaming model

b<sup>3</sup> correction !!

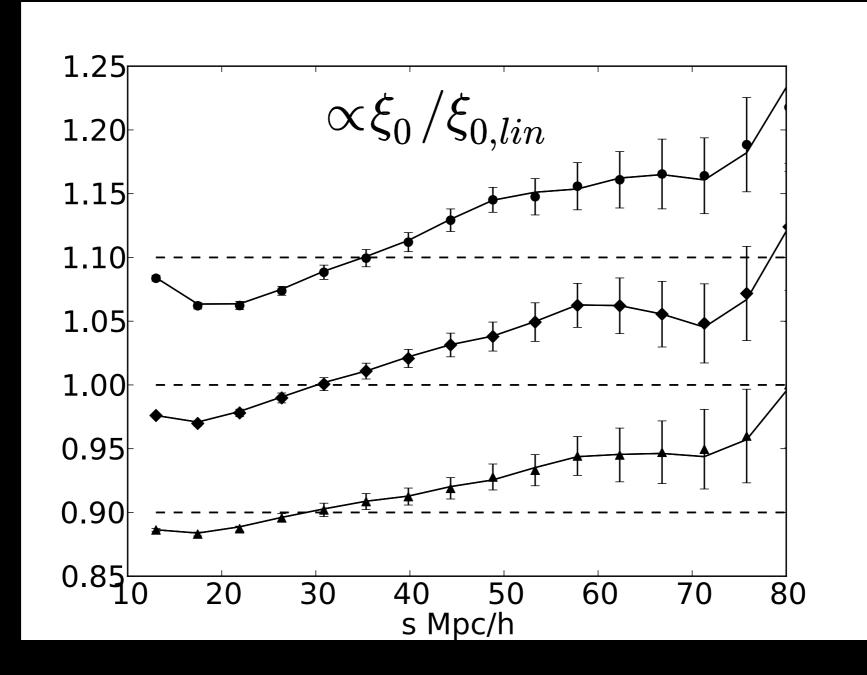
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The scale-dependent Gaussian streaming model ansatz vs N-body simulations

- Start with  $\xi(r)$ , v(r),  $\sigma^2_{\perp, I}(r)$  measured from N-body halos in real space
- Compare with N-body halo clustering in redshift space

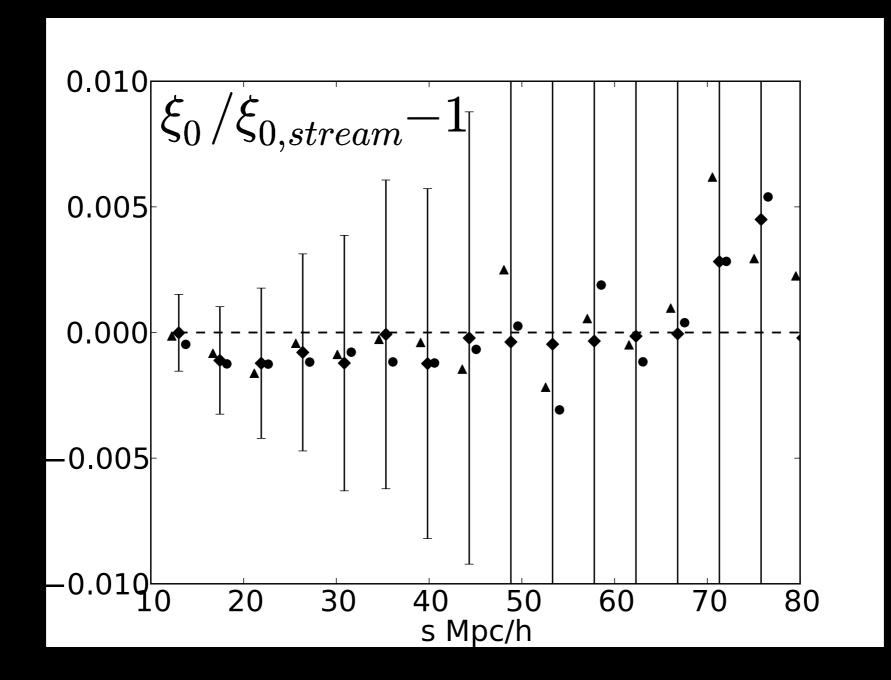
# The scale-dependent Gaussian streaming model ansatz vs N-body simulations: ξ<sub>0</sub>



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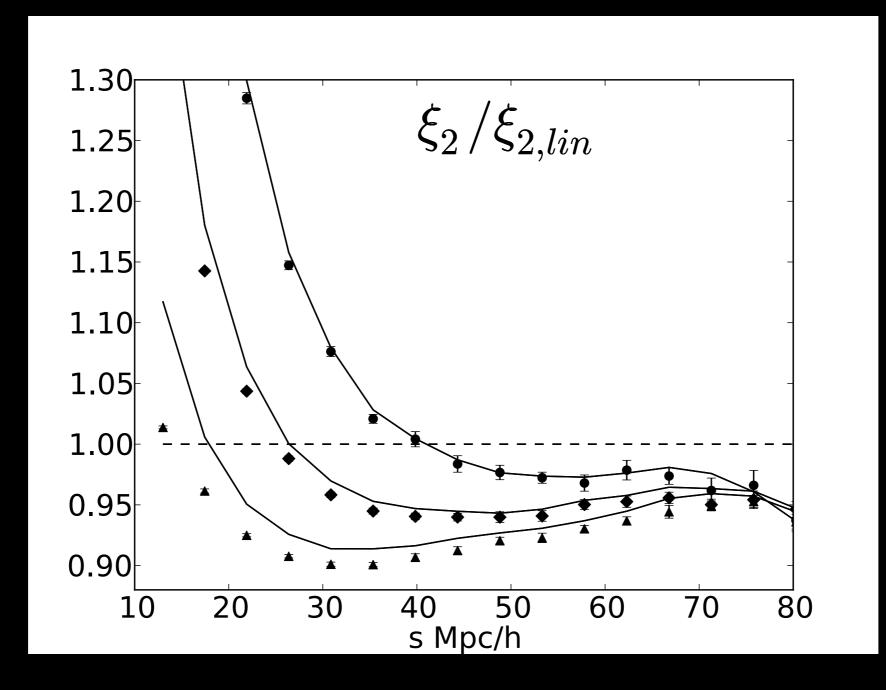
# The scale-dependent Gaussian streaming model ansatz vs N-body simulations: $\xi_0$



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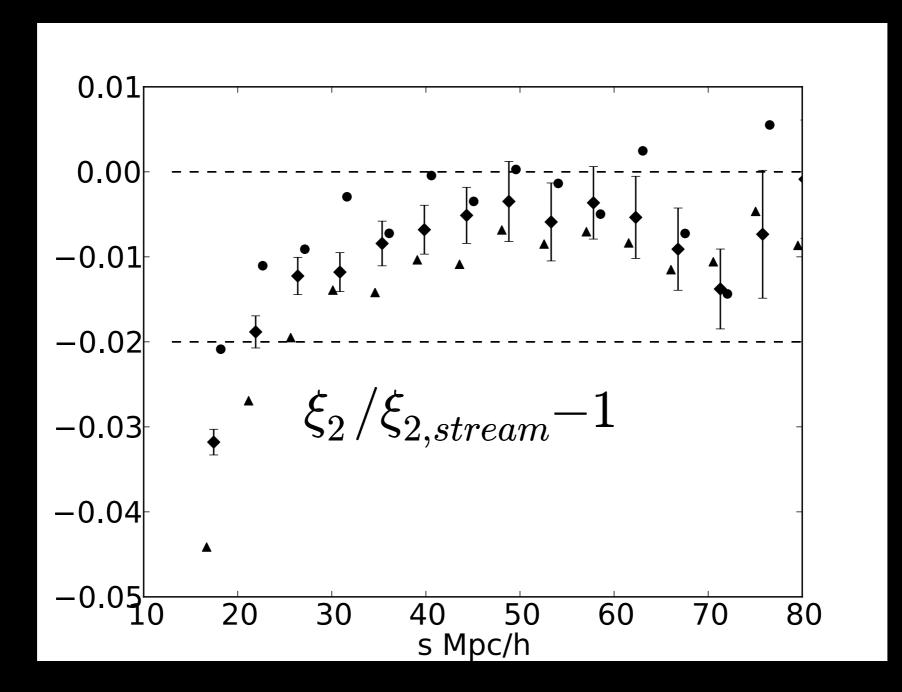
# The scale-dependent Gaussian streaming model ansatz vs N-body simulations: $\xi_2$



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# The scale-dependent Gaussian streaming model ansatz vs N-body simulations: $\xi_2$

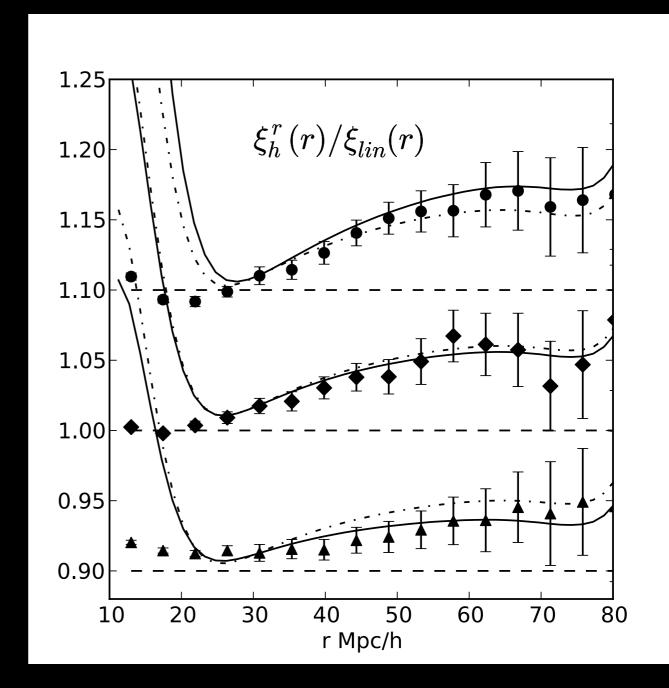






### Can we predict real space halo clustering/ velocity PDFs using perturbation theory?

 LPT (including nonlinear bias) predicts halo ξ(r) down to 25 Mpc/h







• Pair-weighted, not volume weighted!

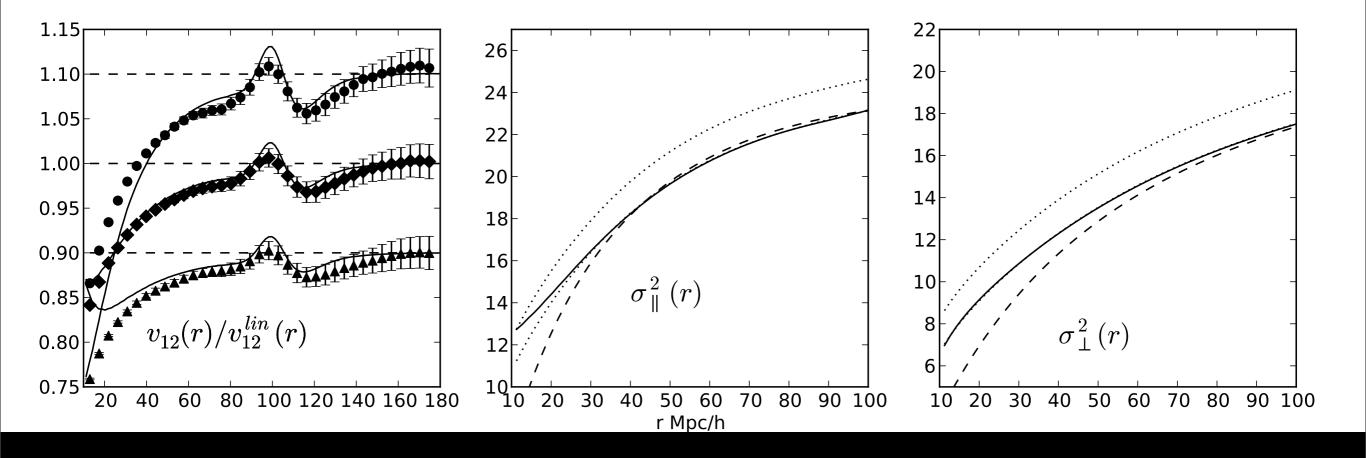
$$v_{12}(r)\hat{r} = \frac{\langle [1+b\delta(\mathbf{x})][1+b\delta(\mathbf{x}+\mathbf{r})][\mathbf{v}(\mathbf{x}+\mathbf{r})-\mathbf{v}(\mathbf{x})]\rangle}{\langle [1+b\delta(\mathbf{x})][1+b\delta(\mathbf{x}+\mathbf{r})]\rangle}$$

$$\sigma_{12}^2(r,\mu^2) = \frac{\left\langle (1+b\delta(\mathbf{x}))(1+b\delta(\mathbf{x}+\mathbf{r}))(v^\ell(\mathbf{x}+\mathbf{r})-v^\ell(\mathbf{x}))^2 \right\rangle}{\langle (1+b\delta(\mathbf{x}))(1+b\delta(\mathbf{x}+\mathbf{r})) \rangle}$$

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#### \* assumes linear bias





Pair-weighting correction

Linear theory

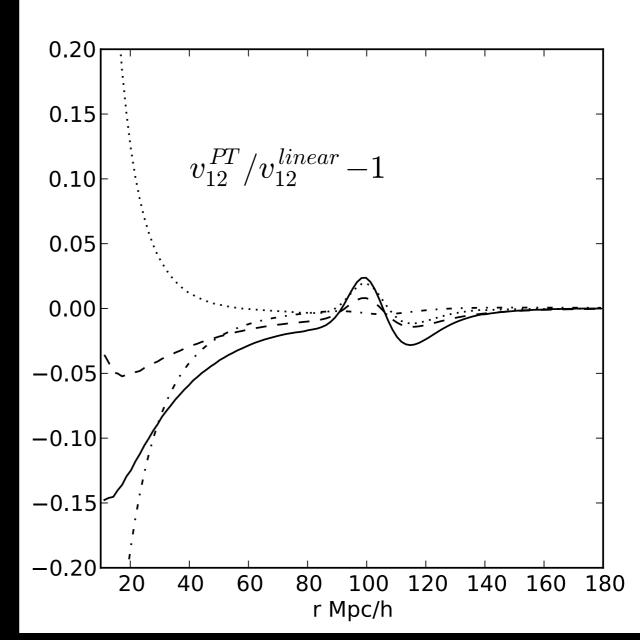
$$\left[1+b^{2}\xi_{m}^{r}(r)\right]v_{12}^{PT}(r)\hat{r} = 2b\left\langle\delta_{1}(\mathbf{x})\mathbf{v}_{1}(\mathbf{x}+\mathbf{r})\right\rangle + 2b\sum_{i>0}\left\langle\delta_{i}(\mathbf{x})\mathbf{v}_{4-i}(\mathbf{x}+\mathbf{r})\right\rangle + 2b^{2}\sum_{i,j>0}\left\langle\delta_{i}(\mathbf{x})\delta_{j}(\mathbf{x}+\mathbf{r})\mathbf{v}_{4-i-j}(\mathbf{x}+\mathbf{r})\right\rangle.$$

PT correction to  $P_{\delta\theta}$ 

**Bispectrum terms: Β**δδθ

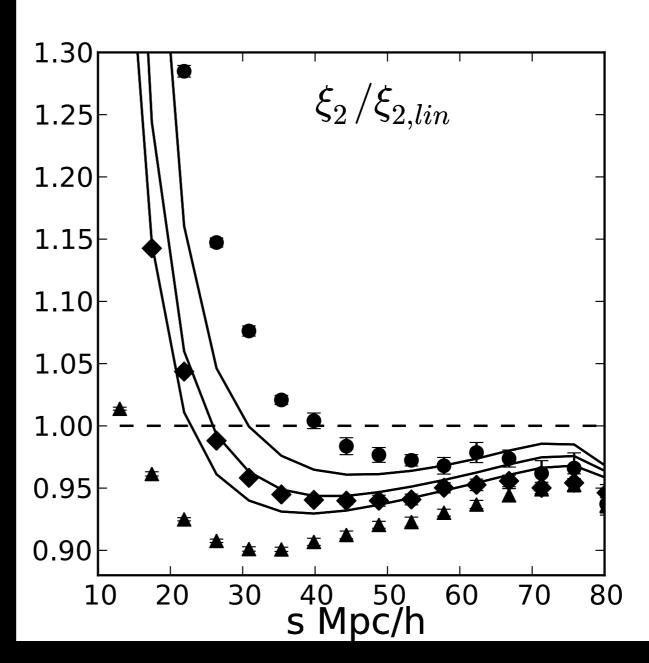


**Bispectrum terms: B**δδθ  $B_{\delta\delta\theta}$ ,  $P_{\delta\theta}$  terms appear in Tang et al., Nishimishi et al. PT correction to  $P_{\delta\theta}$ total PT correction Pair-weighting correction



### Putting it all together: fully analytic model

- Error dominated by error in v<sub>12</sub>(r) slope
- Works where b<sub>2</sub><sup>L</sup> = 0 (i.e., for BOSS galaxies)
- New LPT calculation in prep: Carlson et al., 2012

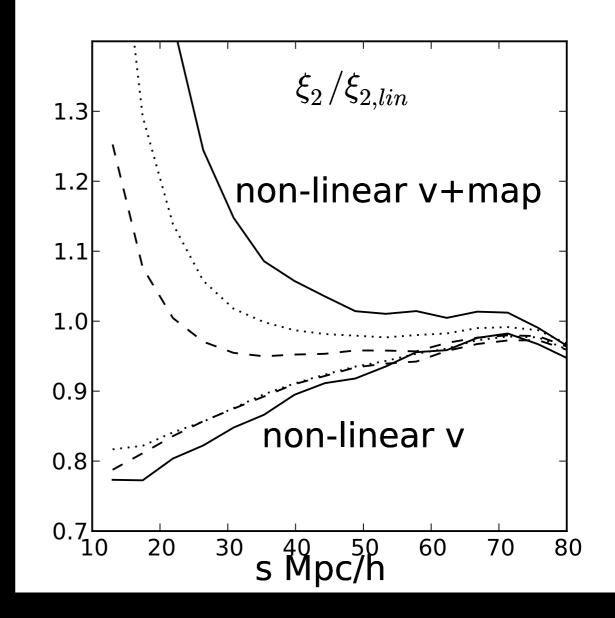


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#### Summary: Two distinct effects

- Non-linear gravitational evolution: MUST be accounted for given current statistical errors: ξ<sub>2</sub> suppressed by 2.5-7.5% at 50 h<sup>-1</sup> Mpc!
- Non-linear real-to-redshift space mapping: b<sup>3</sup> term



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- Interlude: SDSS DR9 first results
- Future prospects



#### Dominant impact of galaxies: Fingers-of-God

REAL SPACE: r ~ I Mpc/h

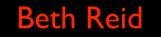


Central galaxies

Satellite galaxies

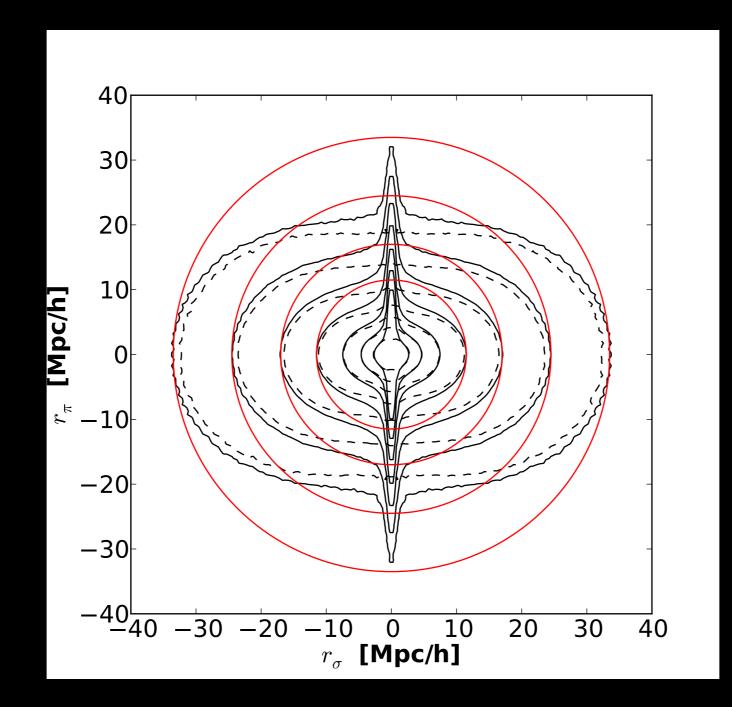
#### REDSHIFT SPACE: r ~ 15 Mpc/h Finger-of-God features mix small and large scale power

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### Fingers-of-God in $\xi(r_{\sigma}, r_{\pi})$



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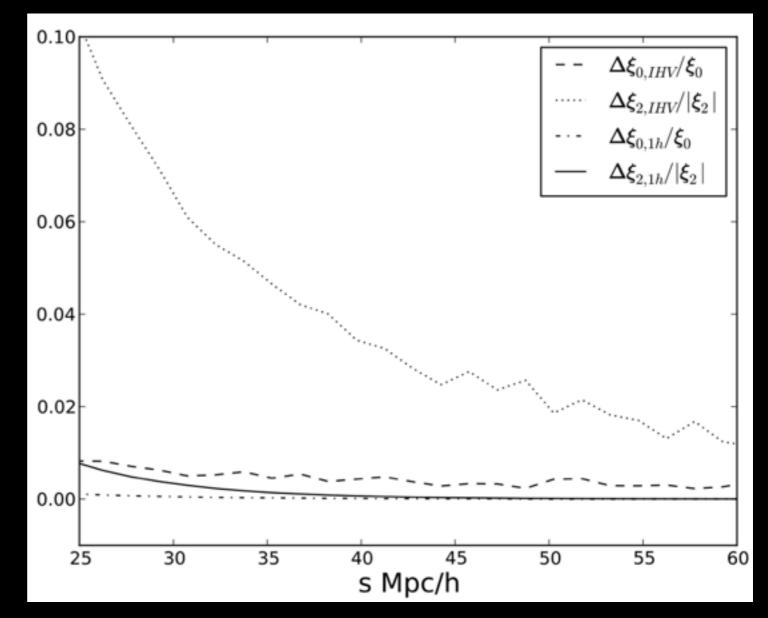
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### From halos to galaxies

- In principle, straightforward to model in  $\xi(r_{\sigma}, r_{\pi})$ -- just another convolution with intrahalo velocity PDF
- In practice 3 (broad) distinct PDFs: cs, ss (1h), ss (2h)
- Inaccarucy of halo  $\xi(r_{\sigma}, r_{\pi})$  on small scales inhibits this approach

### Safe on quasilinear scales...

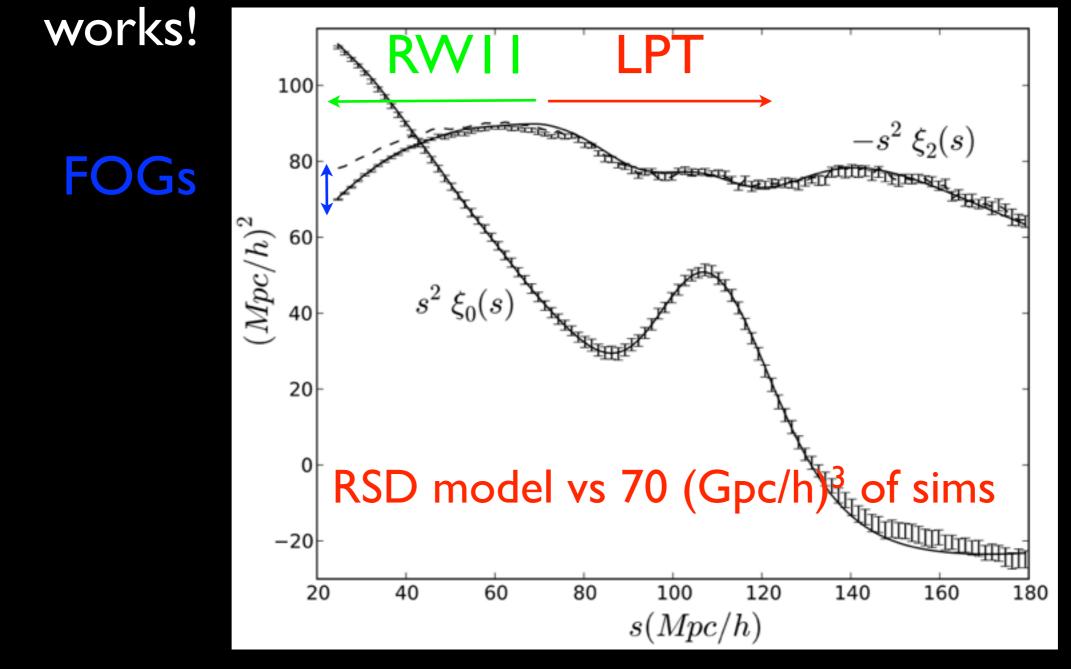
- One-halo (classical FOG) unimportant
- ~ 10% effect at 25 Mpc/h for BOSS galaxies



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### From halos to galaxies

Marginalizing over additional Gaussian dispersion



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### SDSSIII Galaxy clustering lightning theory review

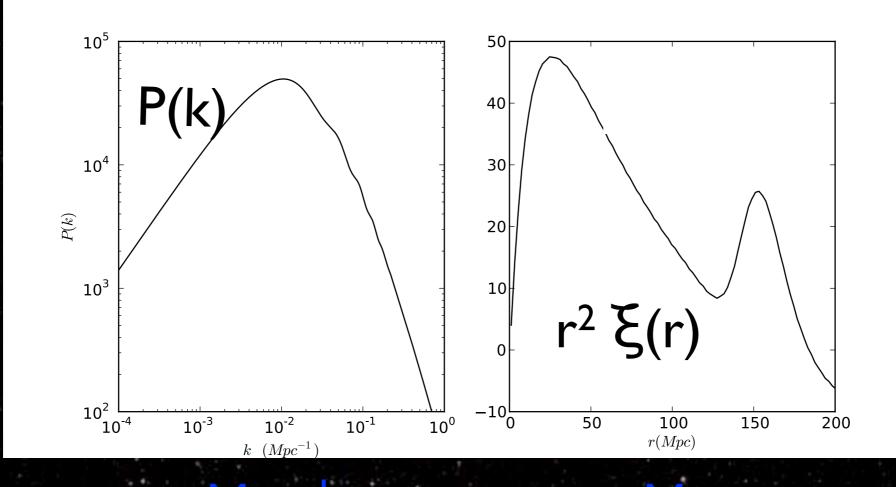
 Theory I: underlying matter power spectrum (determined at z >~ z<sub>CMB</sub>, neglecting V)

Theory II: Expansion history H(0 < z < z<sub>GAL</sub>)

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### Matter Power Spectrum

- Entire P(k) (not just BAO) acts as standard ruler determined by CMB
- We marginalize over the (negligible) uncertainty



SDSS

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**Z**2

# Theory II: geometry

We measure  $\theta$ ,  $\phi$ , and z for each galaxy, and use a cosmological model to convert to comoving coordinates  $z_1$ 

 $\Theta$ 

### $\chi(z)$ (or $D_A(z)$ )

I/H(z)

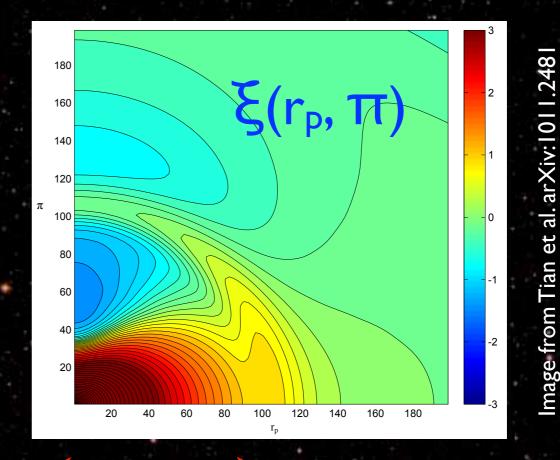
SDSS

### SDSSIII Theory II: Alcock-Paczynski

 $\xi(r_P, \pi)$  appears anisotropic if you assume the wrong cosmological model (constrain  $\eta_{AP} = D_A * H$ )

#### $\chi(z) =_0 \int^z c \, dz' / H(z')$

BAO in  $\xi_0(s)$  determines "geometric mean"  $D_V \propto (D_A^2 H^{-1})^{1/3}$ 



 $X(z)^*\Delta\theta$ 

# SDSSII

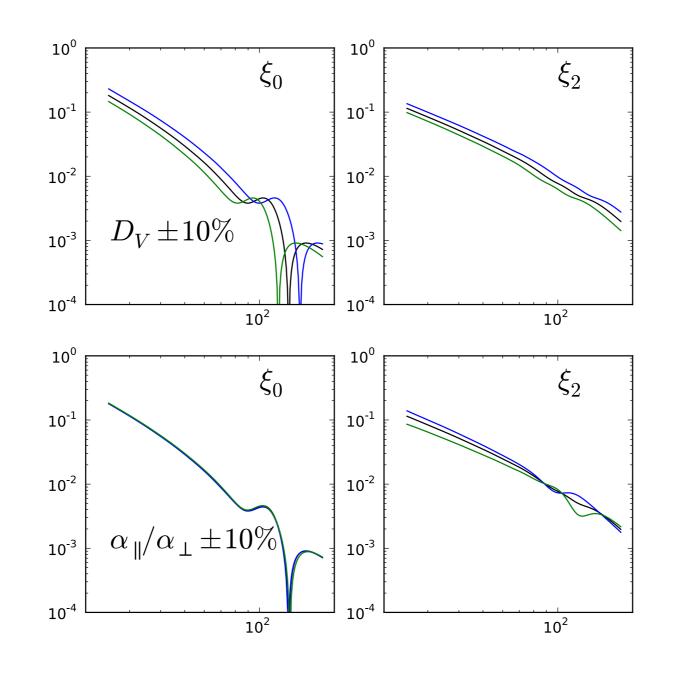
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### Fitting to 2d clustering

- Use full model of  $\xi_{0,2}$  (s  $\geq 25 \text{ h}^{-1} \text{ Mpc}$ ) to constrain:
- growth of structure (f $\sigma_8$ )
- $D_V \propto (D_A^2/H)^{1/3}$ 
  - Alcock-Paczynski ( $\eta_{AP} \propto D_A(z_{eff}) * H(z_{eff})$ )
    - marginalizing over shape of underlying linear P(k),  $b\sigma_8$ ,  $\sigma_{FOG}^2$

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### Alcock-Paczynski in multipoles



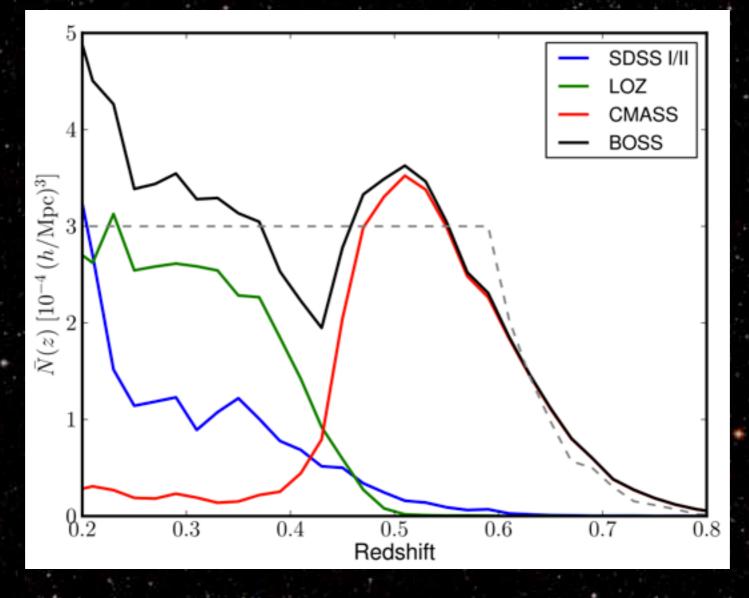
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SDSS

# DR9 spectroscopic results: preliminary!

- DR9 data final (public July 2012), clustering/ covariances ~final, cosmological constraints preliminary
  - Current uncertainties reported, not central values

# SDSSIII BOSS "CMASS" (z<sub>eff</sub> = 0.57) galaxy sample in perspective



Eisenstein et al. arXiv:1101.1529

SDSSII

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# BAO fits in $P(k)/\xi(r)$ consistent

X. Xu et al. (in prep; DR7) BOSS Galaxy Clustering (in prep.)

#### plot of BAO feature here

2-3% uncertainty on BAO position in angle-averaged  $P(k)/\xi(r)$ 

Constrains  $D_V \propto (D_A^2/H)^{1/3}$ 



### The CMASS measurements

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#### • 26 log bins in s for $\xi_0$ and $\xi_2 = 52$ DOF

plot of  $\xi_0$  and  $\xi_2$  here



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#### Model Fits

• We test the LCDM hypothesis in 4 models, always marginalizing over P(k) shape and  $\sigma^{2}_{FOG}$ :

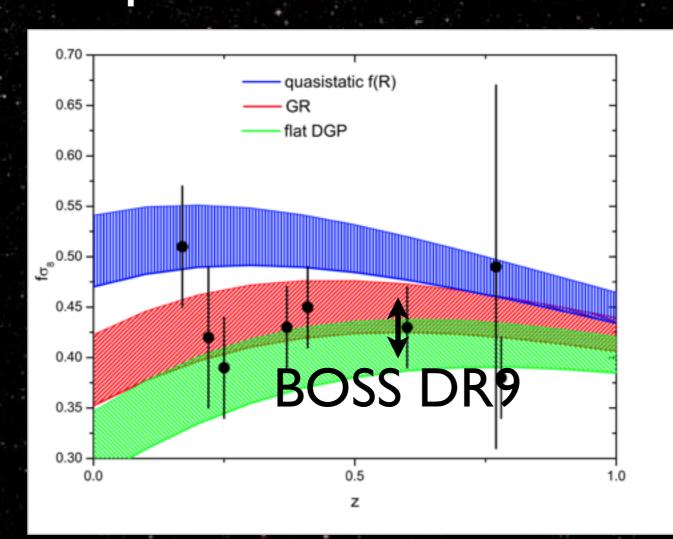
- LCDM (bσ<sub>8</sub>)
- LCDM + fσ<sub>8</sub>: (bσ<sub>8</sub>, fσ<sub>8</sub>)
  - LCDM + geometry:  $(b\sigma_8, D_V, D_A*H)$
- LCDM++:  $(b\sigma_8, f\sigma_8, D_V, D_A*H)$

### SDSS

Current status

- $D_V/D_{V,fid} = x \pm 0.019$  (i.e., minimal information gain on  $D_V$  compared to BAO only!)
- Geometry LCDM:  $f\sigma_8 = xx \pm 0.03$  (7%) [WMAP7 LCDM: 0.45 ± 0.025]
- $f\sigma_8 LCDM: \eta = xx \pm 0.04$  (4%) [WMAP7 LCDM: 1.00 ± 0.012]
  - Fit both:  $f\sigma_8 = xx \pm 0.07$ ,  $\eta = xx \pm 0.07$

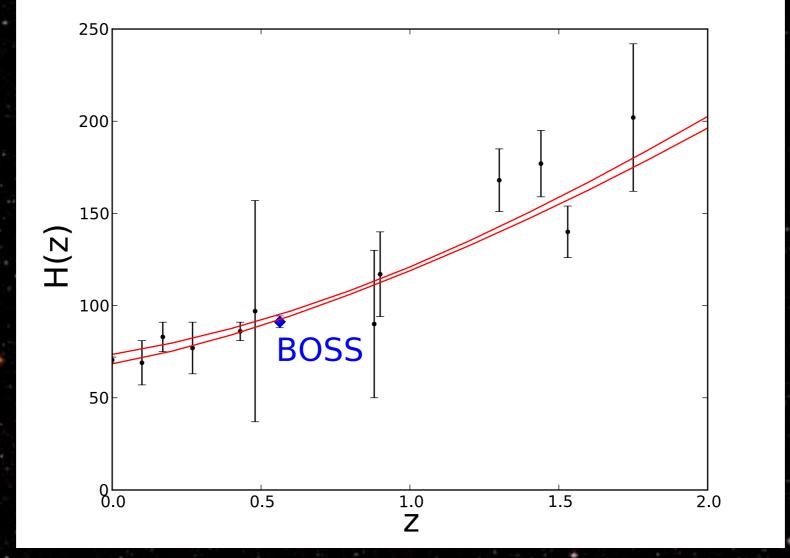
### SDSSIII Testing alternative models with amplitude of peculiar velocities



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### Expansion rate at z=0.57



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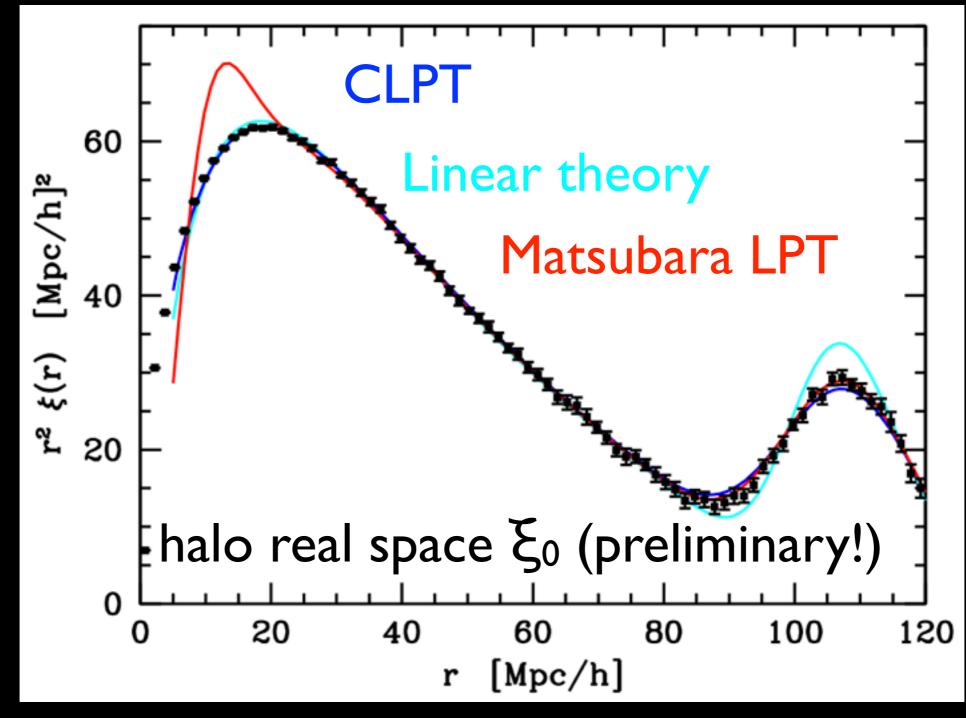
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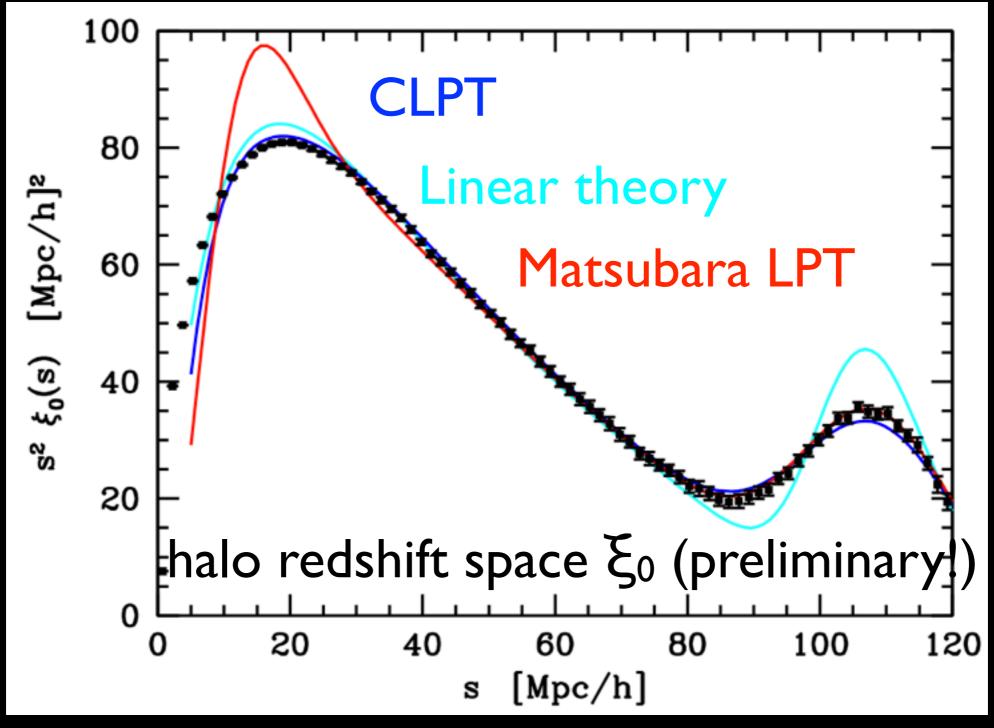
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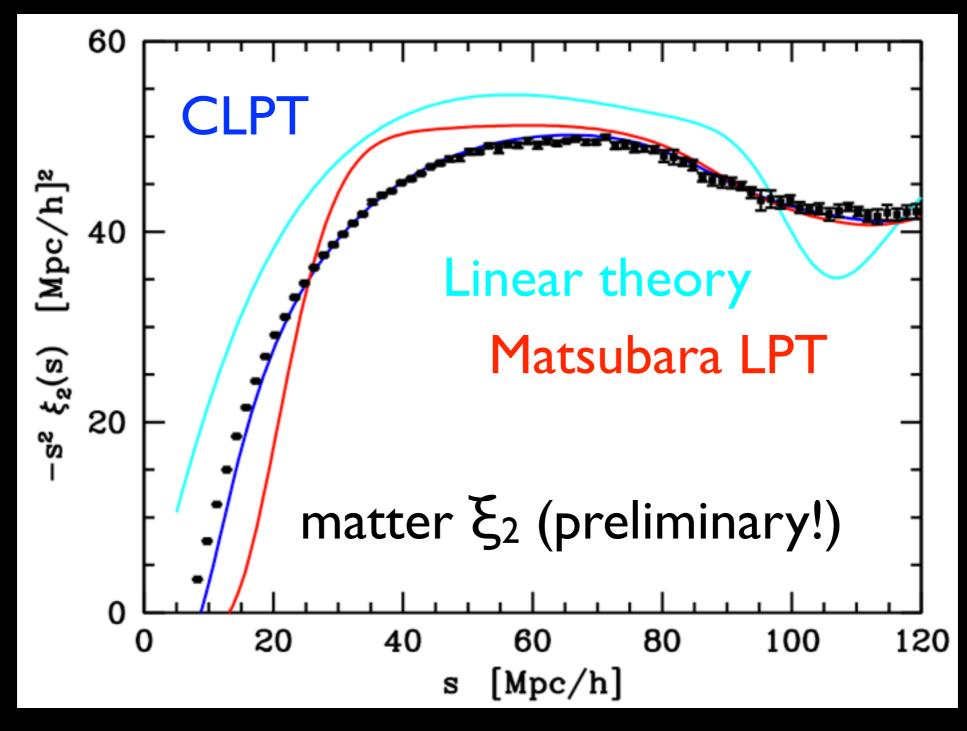
- Fourier transform formal LPT P(k, μ) expression; use cumulant expansion thm + Gaussian integrals
- Recovers Zel'dovich approximation exactly -> b<sup>3</sup> nonlinear mapping term (?)



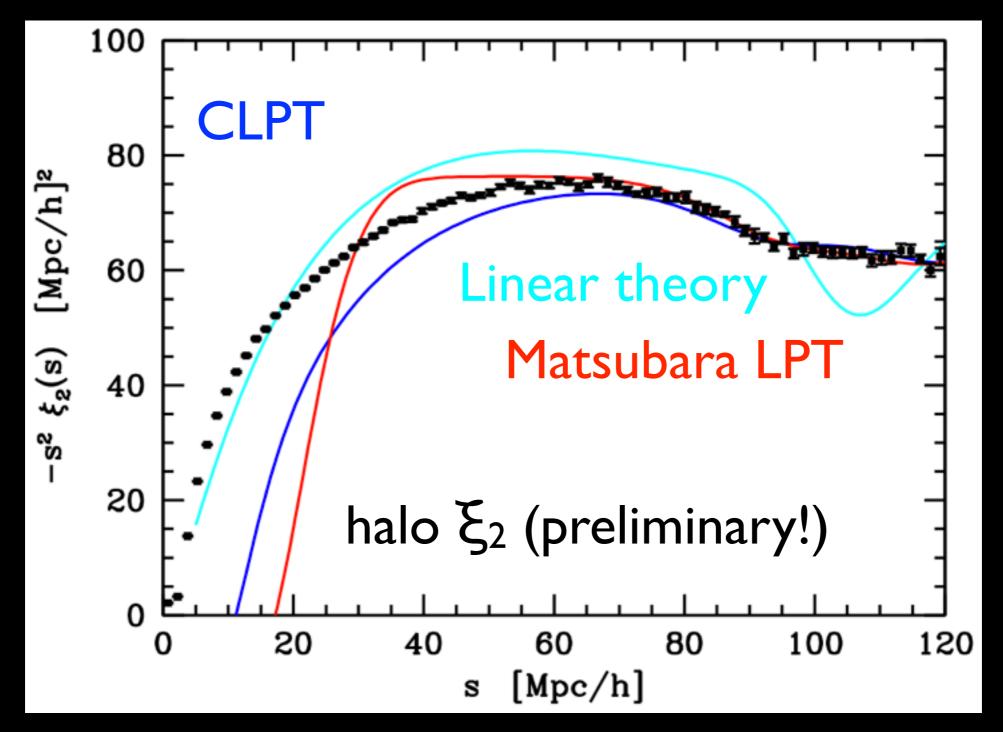




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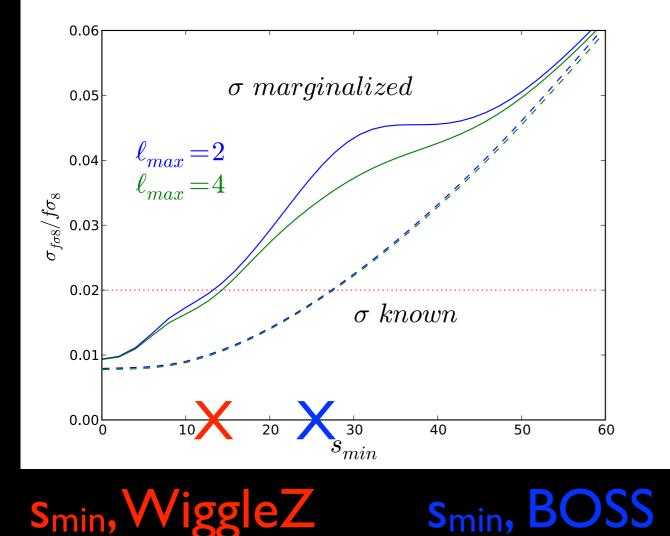


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- New real space  $\xi(r)$  fits to ~ 10 Mpc/h !!
- Repeat  $v_{12}(r)$ ,  $\sigma^2_{\perp, I}(r)$  calculations in LPT (including  $b_2^L$ ) may extend analytic Gaussian streaming model to smaller scales

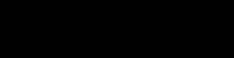
# Future Prospects: using small-scale clustering to infer $\sigma^2_{\text{FOG}}$

$$P_{g}^{s}(k,\mu) = \left(b + f\mu^{2}\right)^{2} P_{m}^{r}(k) e^{-k^{2}\sigma^{2}\mu^{2}}$$



IF we can determine σ from small-scale clustering (e.g., HOD), gain factor of 2 on RSD

Nagoya Feb I



**Beth Reid** 

### Conclusions

- Configuration space simplifies many conceptual issues in modeling RSD
- Worked example of developing/modelling target (BOSS) galaxies: 2% accurate to 25 h<sup>-1</sup> Mpc
- 7% measurement of fσ<sub>8</sub> in DR9 CMASS galaxies, ~4% final (barring further modeling improvements)
- Further development underway (CLPT, small scale/ HOD modeling, ...)