



# A large number of fast cosmological simulations for the revised WiggleZ BAO measurement

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### Outline

I. Revised Wiggle ZBAO measurement

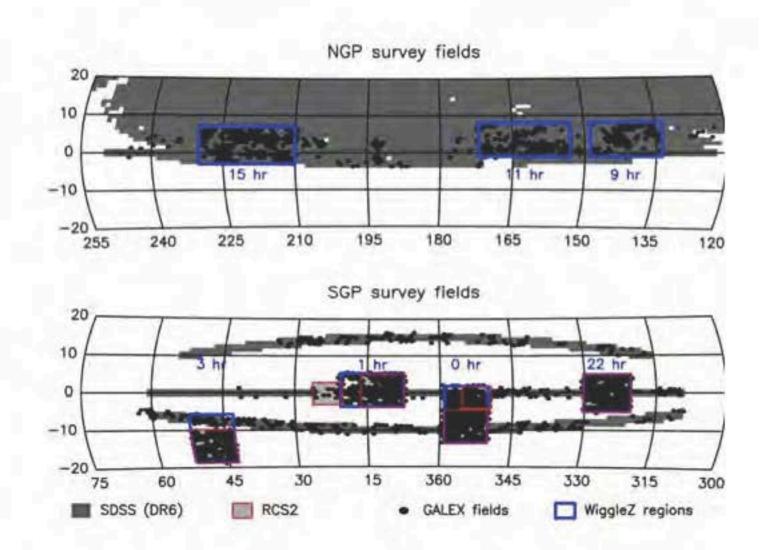
Kazin, JK, Blake & Padnabhan 2014 (arXiv:1401.0358)

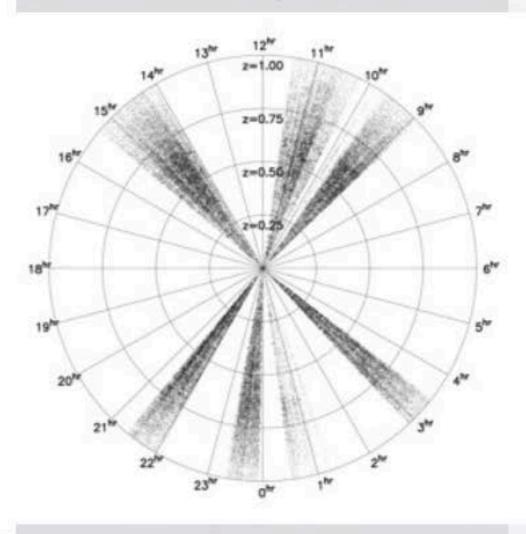
- motivation for my simulations
- WiggleZ survey
- Baryon Acoustic Oscillations (BAO) in galaxy clustering
- "Reconstruction" technique
- 2. 3600 realizations of simulations
  - Fast large-scale structure simulation methods
  - 600 mocks for the WiggleZ survey (paper in prep)

# The WiggleZ Dark Energy Survey

Drinkwater et al 2010, MNRAS 401 1429

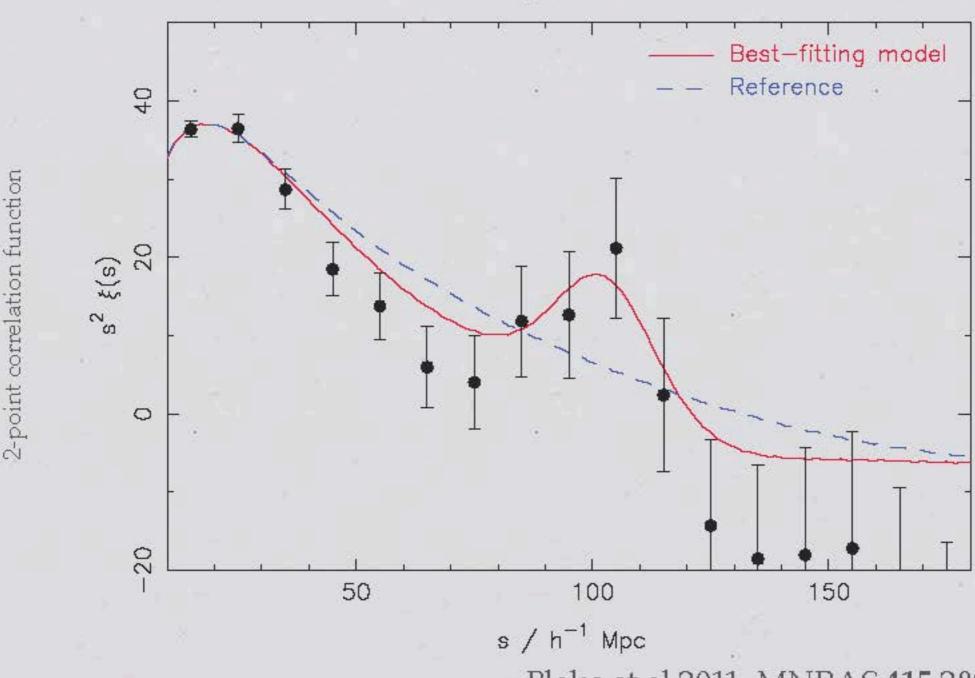
- •Redshift range: 0.2 < z < 1.0
- 1000 deg2 in 6 regions, total volume 1 Gpc3
- emission-line galaxies





# Baryon Acoustic Oscillations (BAO)

A robust cosmological "standard ruler"

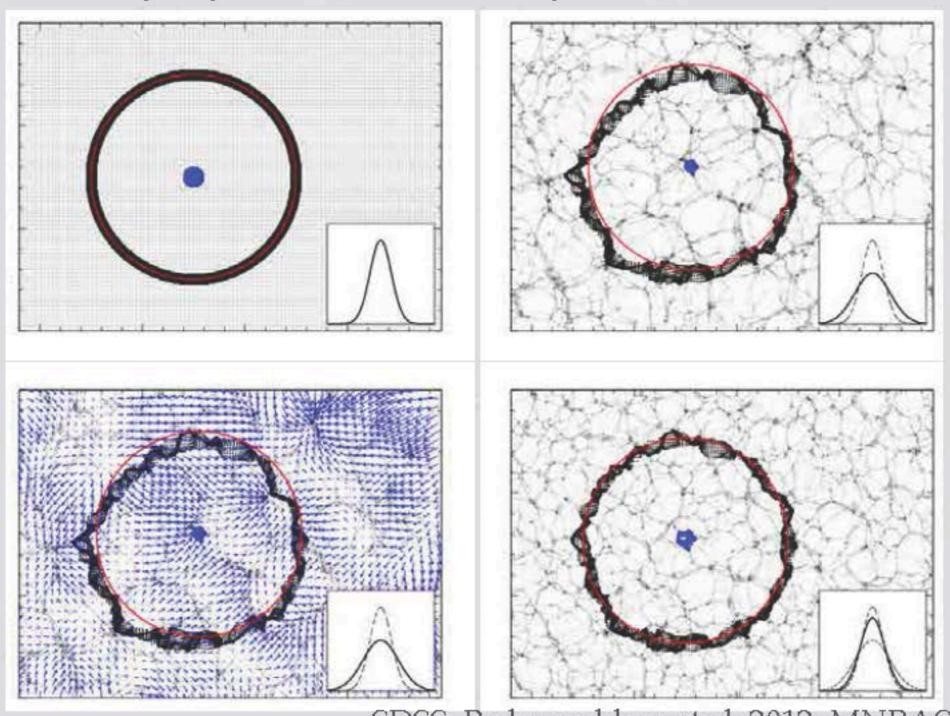


Blake et al 2011, MNRAS 415 2892 (WiggleZ)

BAO measurement in galaxy clustering: Cole et al. 2005 (2dF), Eisenstein et al. 2005 (SDSS)

### "Reconstruction"

sharper peak → better BAO peak determination

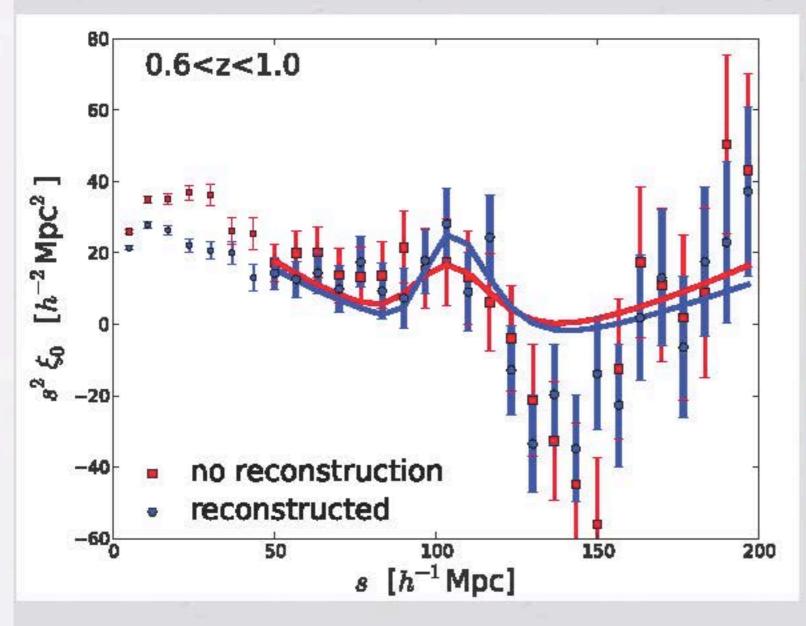


SDSS: Padmanabhan et al, 2012, MNRAS 427 2132

Theoretical idea: Eisenstein et al, 2007, ApJ 664 679

# WiggleZ BAO with reconstruction

Kazin, JK, Blake & Padnabhan 2014 (arXiv:1401.0358)

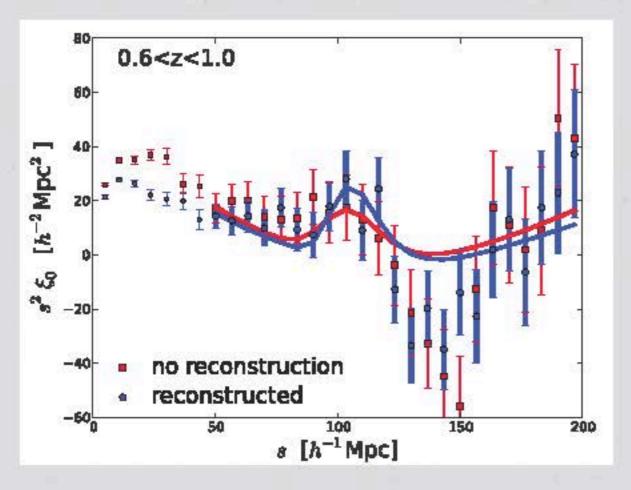


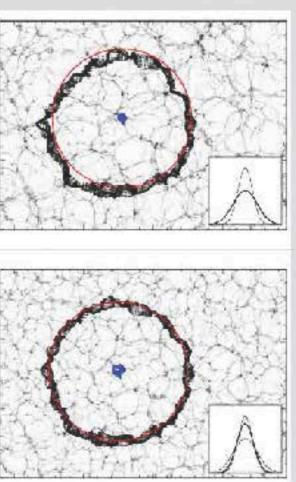


### Motivation for my many simulations

#### Question:

How do we know the uncertainties (covariance matrix) of the 2-point correlation function, especially after reconstruction?





### Motivation for my many simulations

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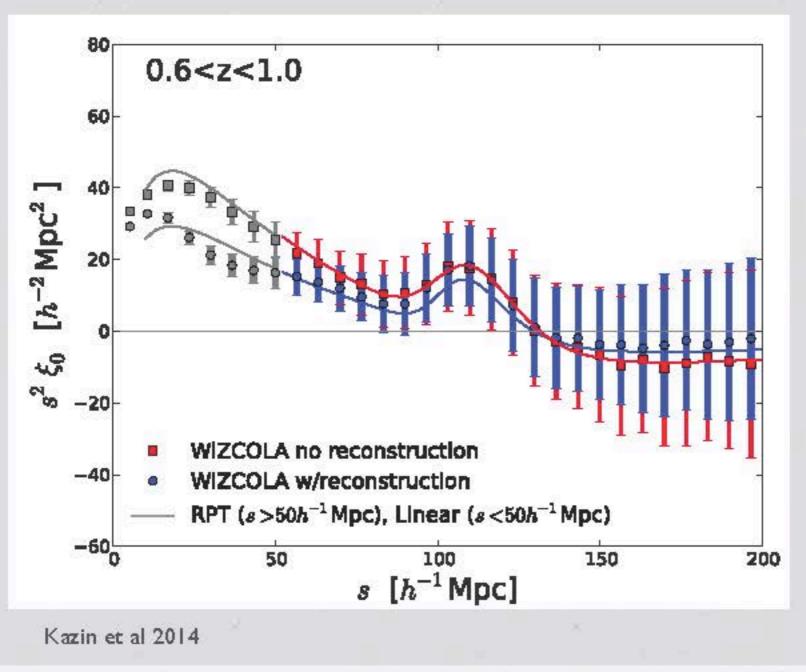
How do we know the uncertainties (covariance matrix) of the 2-point correlation function, especially after reconstruction data process?

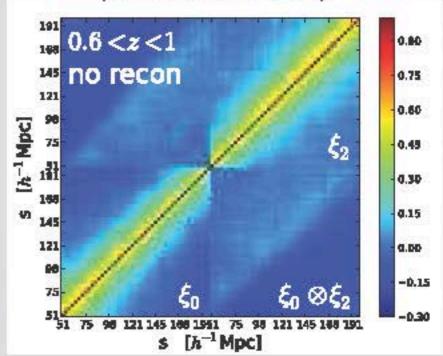
#### Answer:

Do all the data analysis procedure for many many mock galaxy catalogues, and compute the covariance matrix with mocks

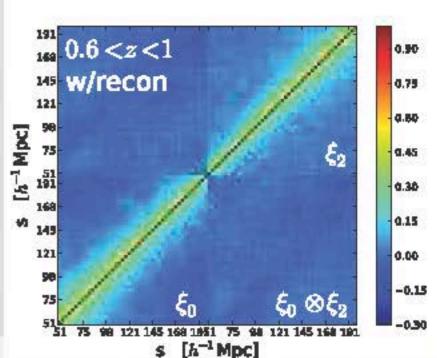
### Covariance matrix

Error bars and covariance matrix from 600 mock galaxy catalogue

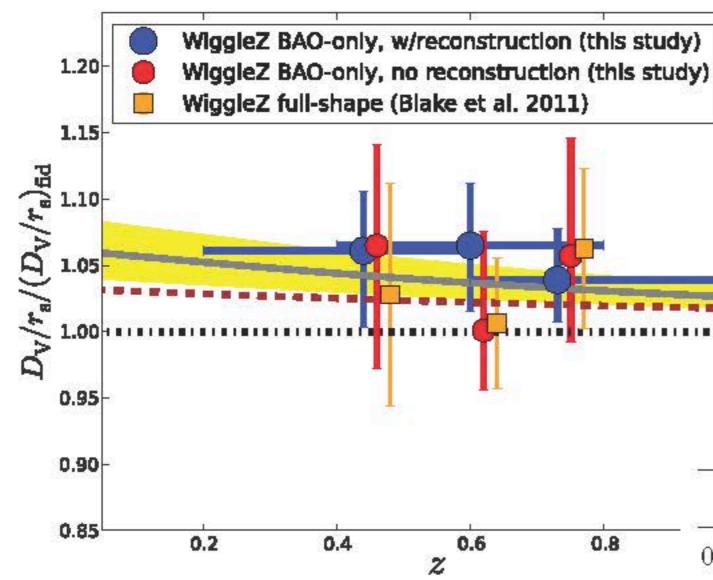




(correlation coefficient)



# Cosmology result



$$D_{\rm V}(z) = \left(\frac{cz(1+z)^2 D_{\rm A}^2}{H}\right)^{1/3},$$

#### 1/2 error bar for 0.6 < z < 1.0 bin

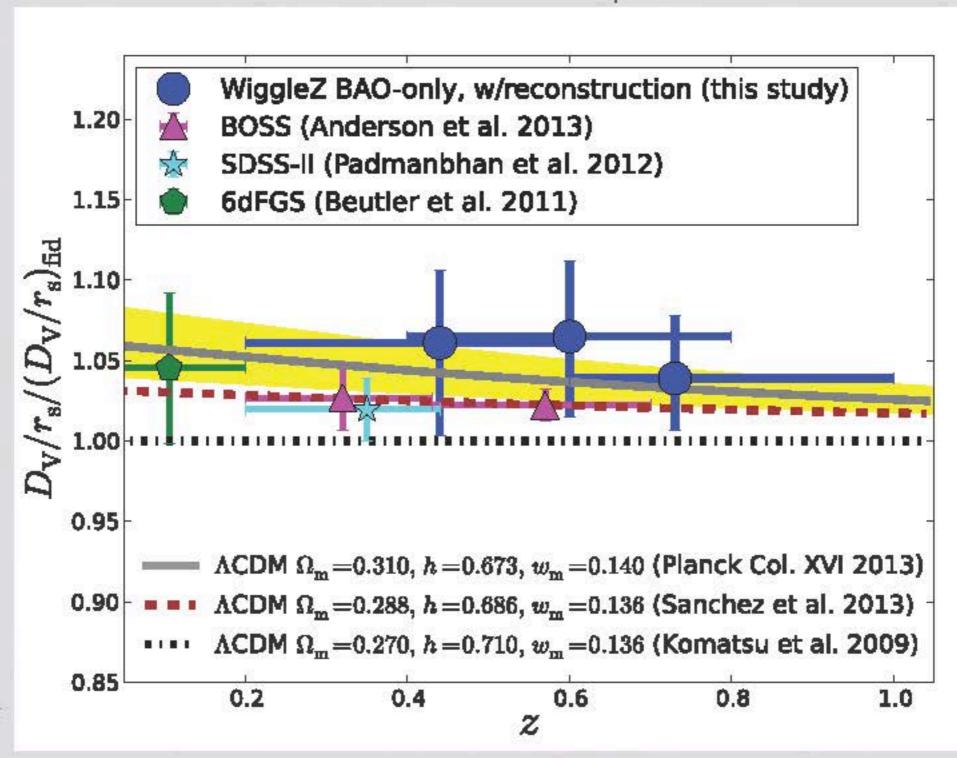
— still consistent with standard ΛCDM (Planck)

Kazin et al 2014

effective $z$	data $D_{\rm V}\left(r_{\rm s}^{\rm fid}/r_{\rm s}\right)~[{ m Mpc}]$
0.44 no recon	$1723_{-151}^{+122}$
0.44 w/ recon	$1716_{-93}^{+73}$
0.60 no recon	$2087^{+156}_{-95}$
0.60 w/ recon	$2221_{-104}^{+97}$
0.73 no recon	$2560^{+218}_{-157}$
0.73 w/ recon	$2516_{-78}^{+94}$

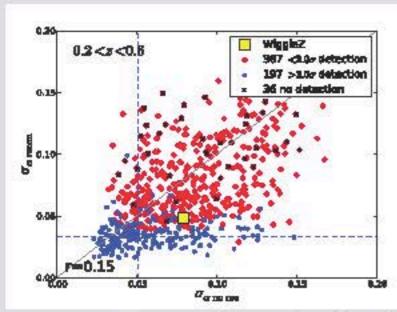
### Cosmology result

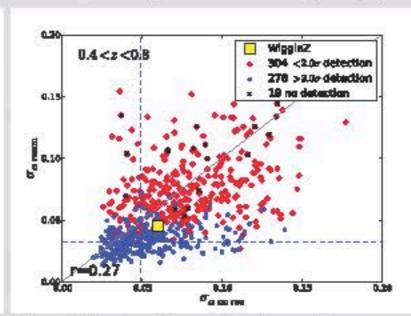
comparison with other BAO measurements

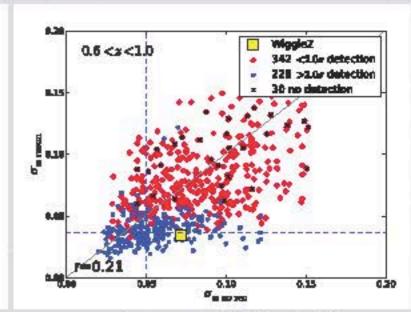


### Precision before and after reconstruction

Uncertainty in  $~\alpha \equiv (D_{\rm V}/r_{\rm s})/(D_{\rm V}/r_{\rm s})_{\rm fid}$ 

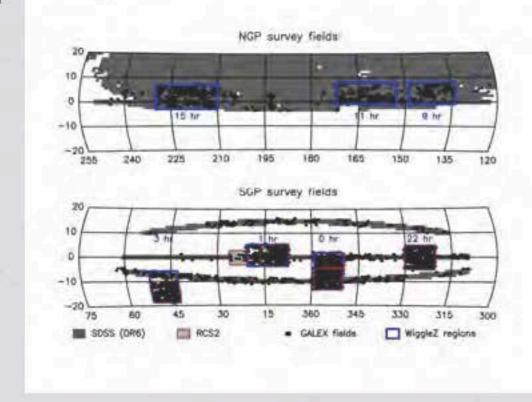


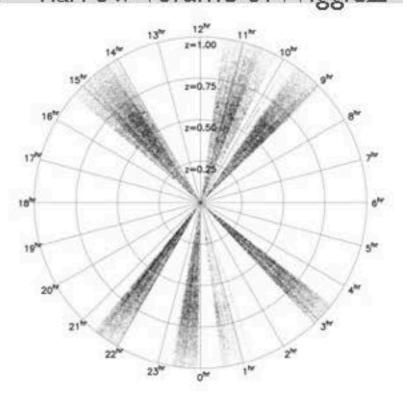




Kazin et al 2014

Large scatter in the effect of reconstruction -- narrow volume of WiggleZ





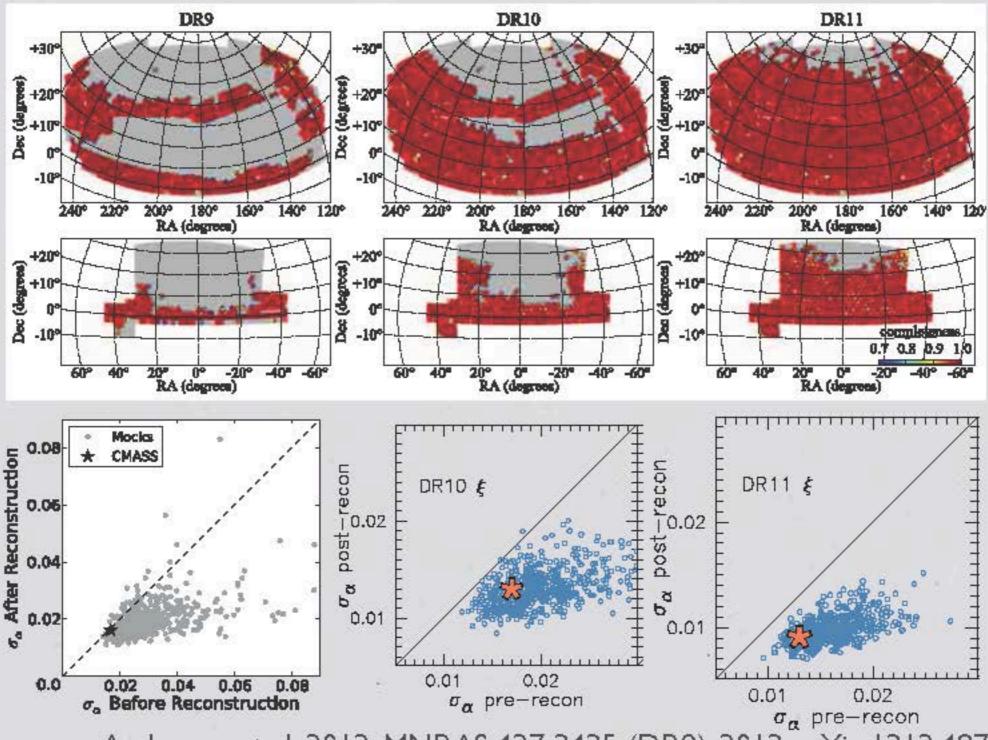
### Precision before and after reconstruction

Table 2. Significance of detection of the baryonic acoustic feature

$\sqrt{\Delta \chi^2}$	$\chi^2_{\rm phys},\chi^2_{\rm nw}$	Expected (All mocks)	Expected (> $2\sigma$ subsample)
0.5	18.0, 18.3	1.4±0.8 (600)	2.0±0.8 (197)
1.3	24.3, 26.0	1.6±0.9 (600)	2.4±0.5 (197)
2.1	20.5, 25.1	1.7±0.9 (600)	2.1±0.8 (278)
2.1	9.1, 13.5	1.9±0.9 (600)	2.6±0.6 (278)
2.0	24.3, 28.5	1.5±0.8 (600)	2.0±0.7 (228)
2.9	24.0, 32.4	1.7±0.8 (600)	2.5±0.5 (228)
	0.5 1.3 2.1 2.1 2.0	0.5 18.0, 18.3 1.3 24.3, 26.0 2.1 20.5, 25.1 2.1 9.1, 13.5 2.0 24.3, 28.5	0.5 18.0, 18.3 1.4±0.8 (600) 1.3 24.3, 26.0 1.6±0.9 (600) 2.1 20.5, 25.1 1.7±0.9 (600) 2.1 9.1, 13.5 1.9±0.9 (600) 2.0 24.3, 28.5 1.5±0.8 (600)

### Precision before and after reconstruction

in BOSS



Anderson et al. 2012, MNRAS 427 3435 (DR9), 2013 arXiv:1312.4877 (DR11)

### Outline

#### 1. Revised Wiggle ZBAO measurement

Kazin, JK, Blake & Padnabhan 2014 (arXiv:1401.0358)

- motivation for my simulations
- WiggleZ survey
- Baryon Acoustic Oscillations (BAO) in galaxy clustering
- "Reconstruction" technique

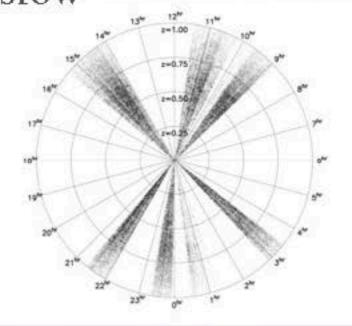
#### 2. 3600 realizations of simulations

- Fast large-scale structure simulation methods
- 600 mocks for the WiggleZ survey (paper in prep)

# Simulation requirements

- 600 mock catalogues for each of 6 WiggleZ regions
  - → 3600 independent simulations
- at least 600<sup>3</sup> (h<sup>-1</sup> Mpc)<sup>3</sup> simulation volume
- needs to resolve  $10^{12} M_{\odot}$  haloes  $\rightarrow 1296^3$  particles

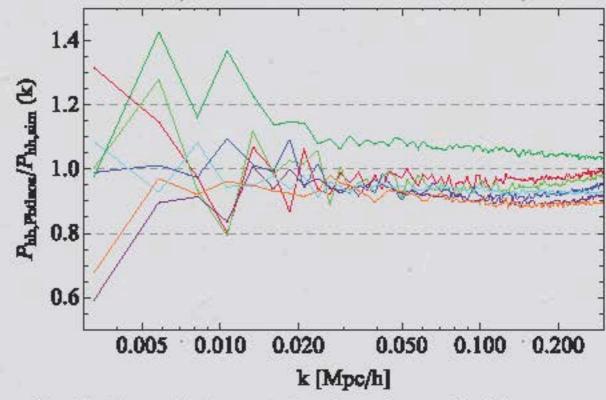
\* But conventional N-body simulations are too slow



# 2LPT (PTHalos for BOSS)

Manera et al. 2013 MNRAS 428 1036 (BOSS)

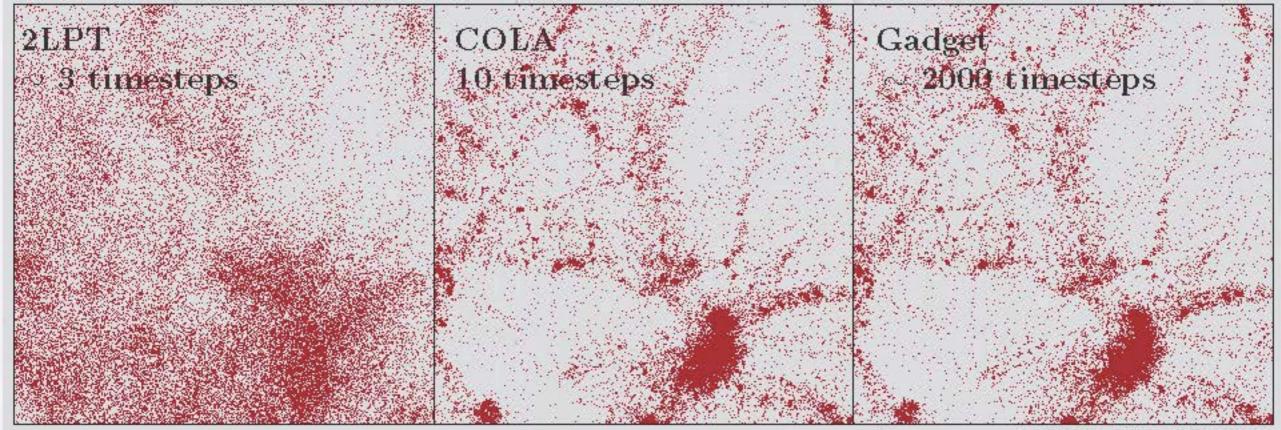
- 2nd order Lagrangian perturbation theory
- Usually for simulation initial conditions (e.g.  $z \sim 50$ )
- BOSS uses 2LPT instead of N-body for mocks (PTHalos)
  - ☑ Works for CMASS sample (~10¹³ solar mass, bias ~2)



\* But I couldn't find PTHaloes for WiggleZ (low bias galaxies b ~ 1.1)

# COLA 10-timestep simulation

2LPT + Particle Mesh (PM) force correction



Tassev et al. 2013 JCAP 06 36

2LPT (left): very fast but resolves high-mass haloes only ~1013 M o

COLA (middle): acceleration: acola = apm - a2LPT

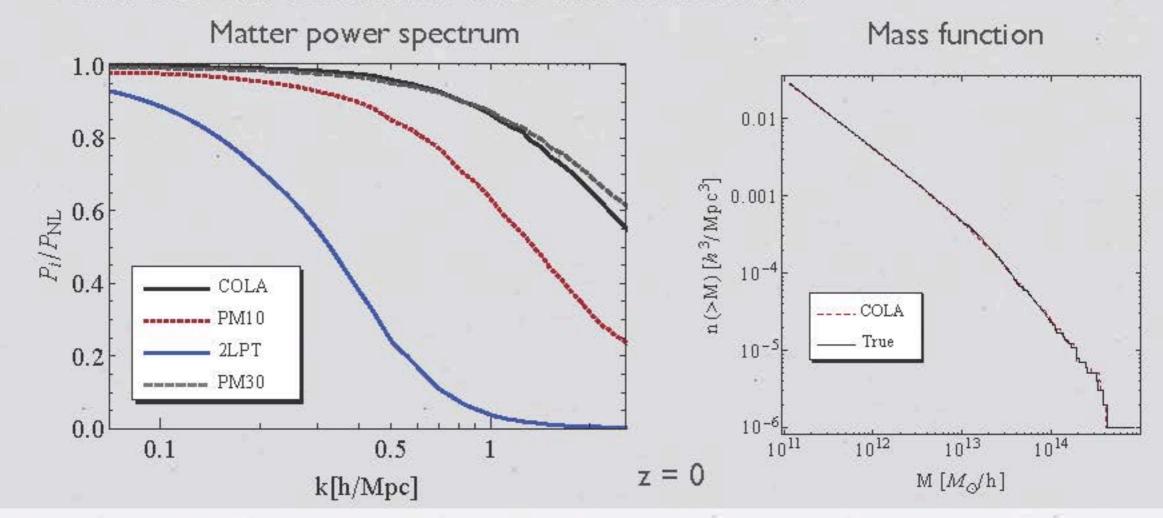
Leap-frog "kick":  $v_{COLA} += a_{COLA} \Delta t$ 

Leap-frog "drift":  $\times += \Delta \psi_{2LPT} + v_{COLA} \Delta t$ 

### COLA 10-timestep simulation

Tassev et al. 2013 JCAP 06 36

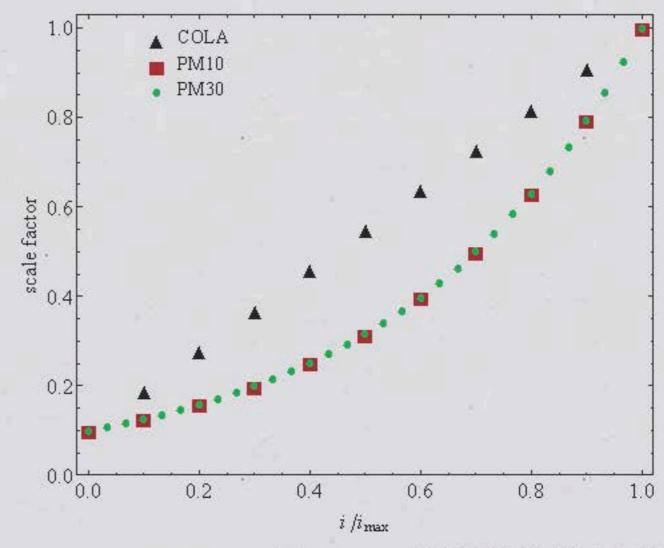
- Accurate matter power spectrum
- Good halo mass ~ 5% accuracy for COLA
   30 % error for conventional 10-timestep Particle Mesh (PM)
- 10 COLA timesteps ~ 30 PM timesteps
- More than 100 times faster than usual simulations



### Timestep distribution

COLA can use large timestep in quasi-linear regime (high z)

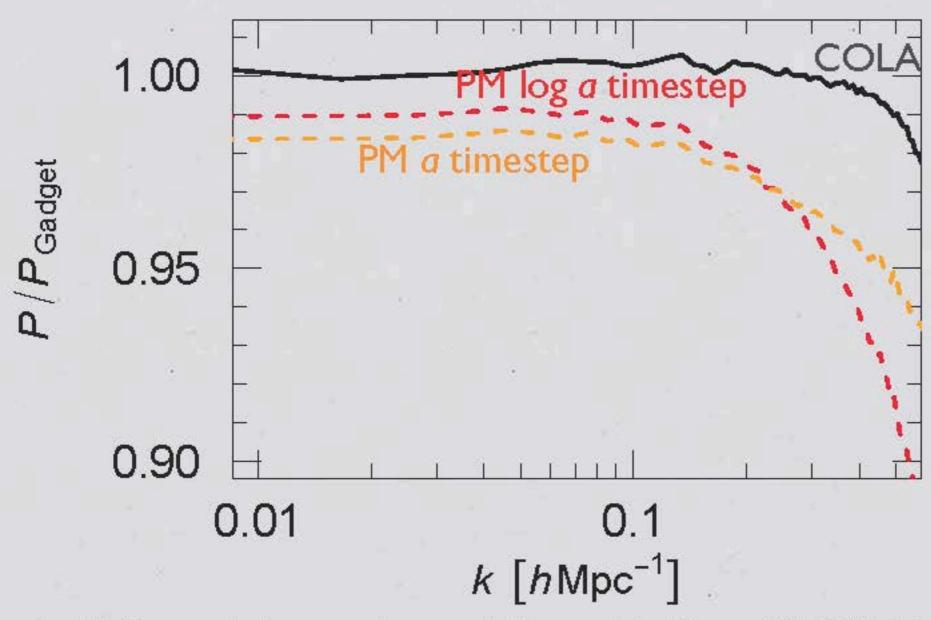
- PM equally spaced in  $\log \alpha$  [ $\Delta \alpha \propto \alpha$  or  $\Delta t \propto H(a)^{-1}$ ]
- COLA equally spaced in a



Large PM timestep at low z is causing halo mass error

Tassev et al. 2013 JCAP 06 36

### Timestep distribution



I-2 % error in large scale growth factor with IO-step PM, COLA is much better Timestep equally spaced in log  $\sigma$  gives slightly better growth factor for PM

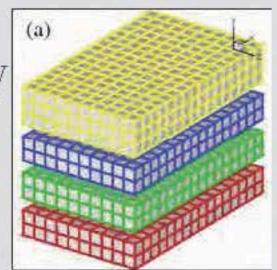
# Wiz-COLA simulation (my work)

• Parallelized the serial COLA code by Tassev et al.

Simple slab decomposition with FFTW library



(No disk space for post processing)



- Writes snapshots at given redshifts z=0.44, 0.6, and 0.73
- Used 216 cores at SwinSTAR (RAM requirement)
- 15 minutes/simulation  $\rightarrow$  200,000 core hours in total

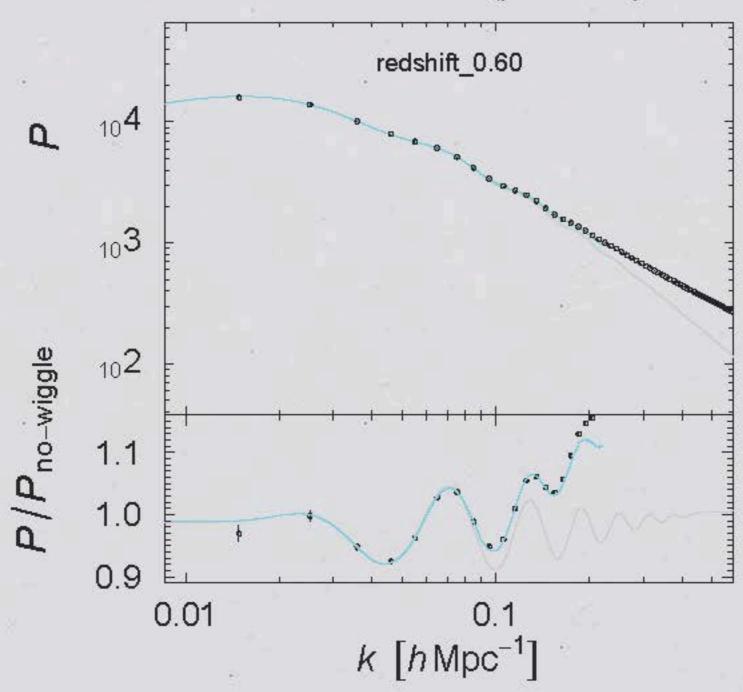
# Details of computation time

	[sec]	
Init	4.2	0.7%
2LPT	15.6	2.8%
COLA	450.3	79.3%
FFT	392.1	69.1%
assign	9.7	1.7%
force_mesh	15.5	2.7%
pforce	19.2	3,4%
check	3.3	0.6%
communication	6.7	1.2%
evolve	2.2	0.4%
Snapshot analysis	97.5	17.2%
communication	6.0	1.1%
kd_build	8.3	1.5%
kd_link	22.4	4.0%
interpolate	5.4	0.1%
serial linking	40.5	7.1%
smalldata	19.7	3.5%

568 sec per realization with 324 cores Raijin supercomputer in NCI Australia

# Wiz-COLA matter power spectrum

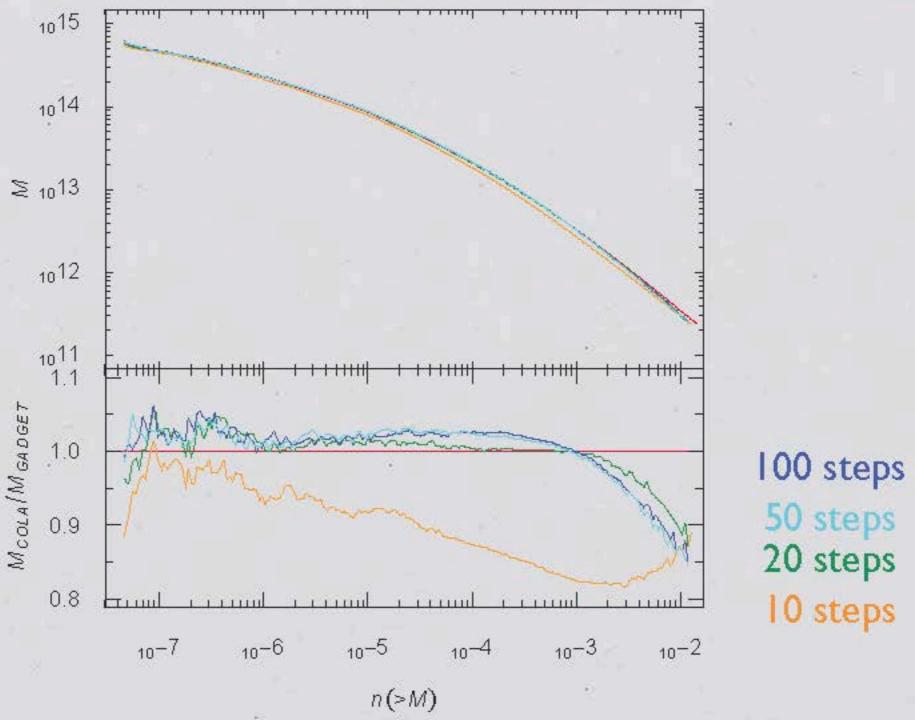
(preliminary, mean of 1800 realizations)



Blue line: MPTBREEZE Crooce et al. 2012 MNRAS 427 2537

### Mass function

(preliminary results)



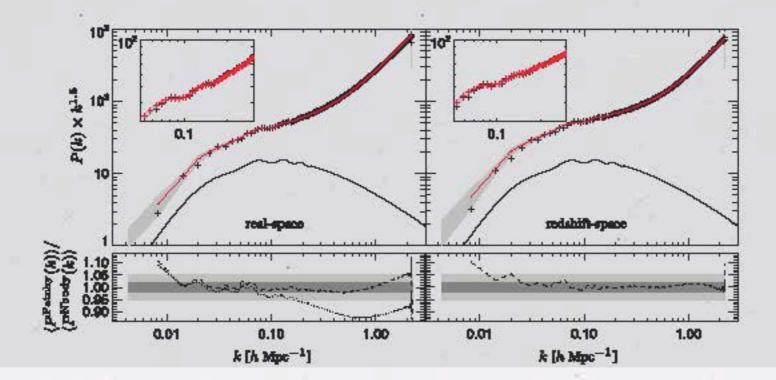


Mass resolution at low end is limited by force resolution not timestep

### Need to resolve haloes?

Price of resolving haloes is expensive -- FFT with ×3 finer grid. New ideas are coming up to create halo catalogue without resolving.

- de la Torre & Peacock 2013, MNRAS 435 743
- QPM (White et al. 2014, MNRAS 437 2594)
- PATCHY (Kitaura et al 2014, MNRAS 439 21)
- 1. Generate smooth density field using fast methods (2LPT, ALPT, PM)
- 2. Randomly "populates" haloes depending on the density field



Kitaura et al. 2014

### Populates haloes with mock galaxies

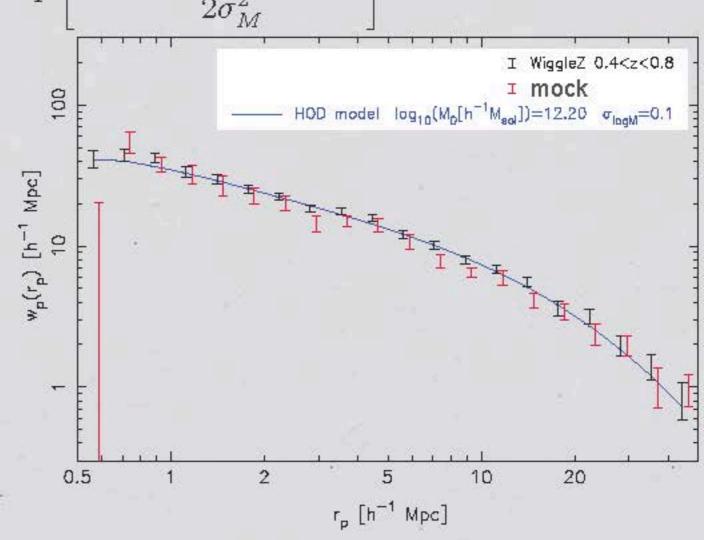
Making mock catalogue: step 1

Using a Gaussian Halo Occupation Distribution (HOD)

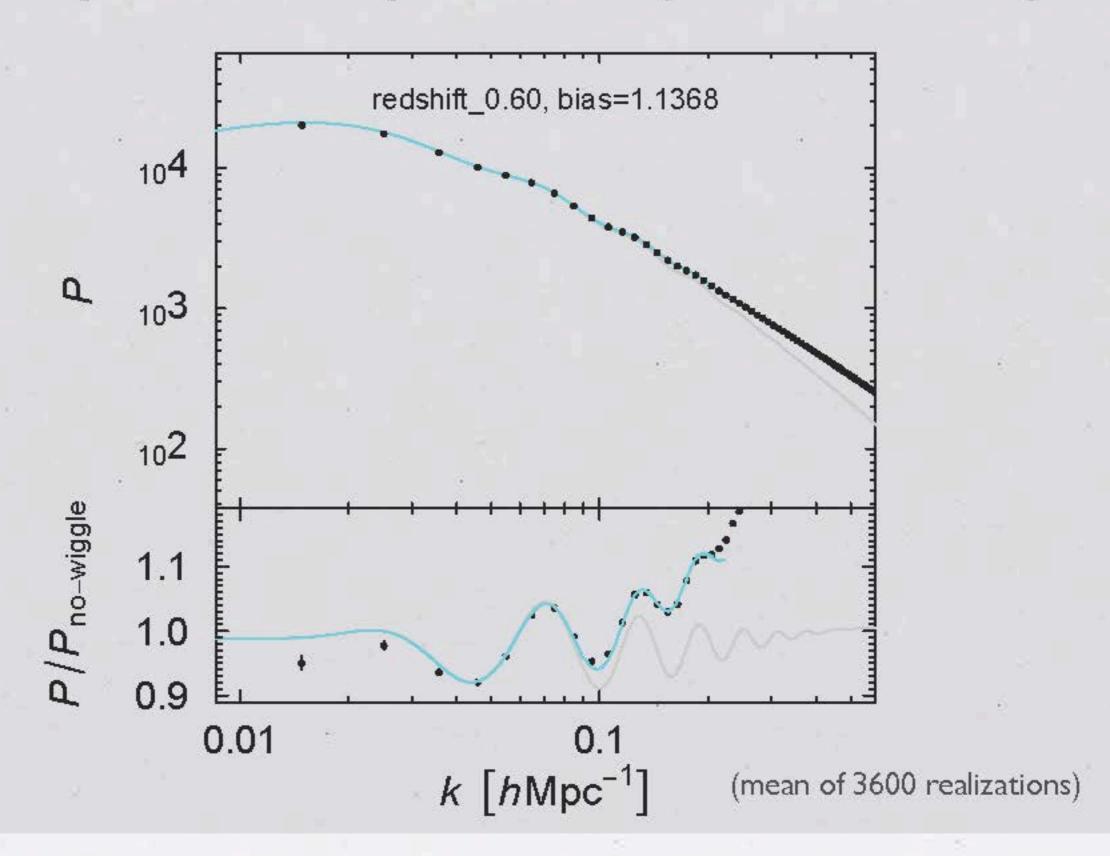
Probability that a halo of mass M hosts a WiggleZ galaxy is set to:

$$P = A \exp \left[ -\frac{(\log M - \log M_0)^2}{2\sigma_M^2} \right]$$

- Assumed  $\sigma = 0.1$
- $log_{10} M_0 = 12.3$  (COLA halo mass)
- Satellite galaxies are not important in WiggleZ



# Galaxy Power Spectrum (mock mean)



# Simulation box remapping

Carlson & White 2010 ApJS 190 311

Making mock catalogue: step 2

→ 
$$1039h^{-1}\text{Mpc} \times 490h^{-1}\text{Mpc} \times 424h^{-1}\text{Mpc}$$

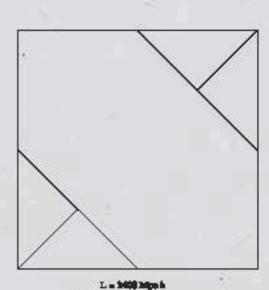
 $\sqrt{3}$ 

(for 0.2 < z < 0.6)

$$\rightarrow$$
849h<sup>-1</sup>Mpc × 735h<sup>-1</sup>Mpc × 346h<sup>-1</sup>Mpc

$$\sqrt{2}$$

(for 0.4 < z < 0.8 and 0.6 < z < 1.0)



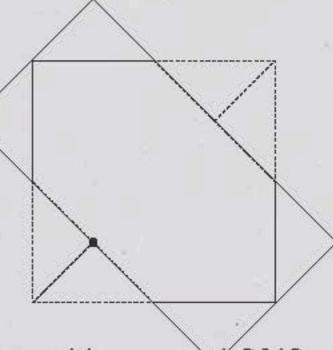
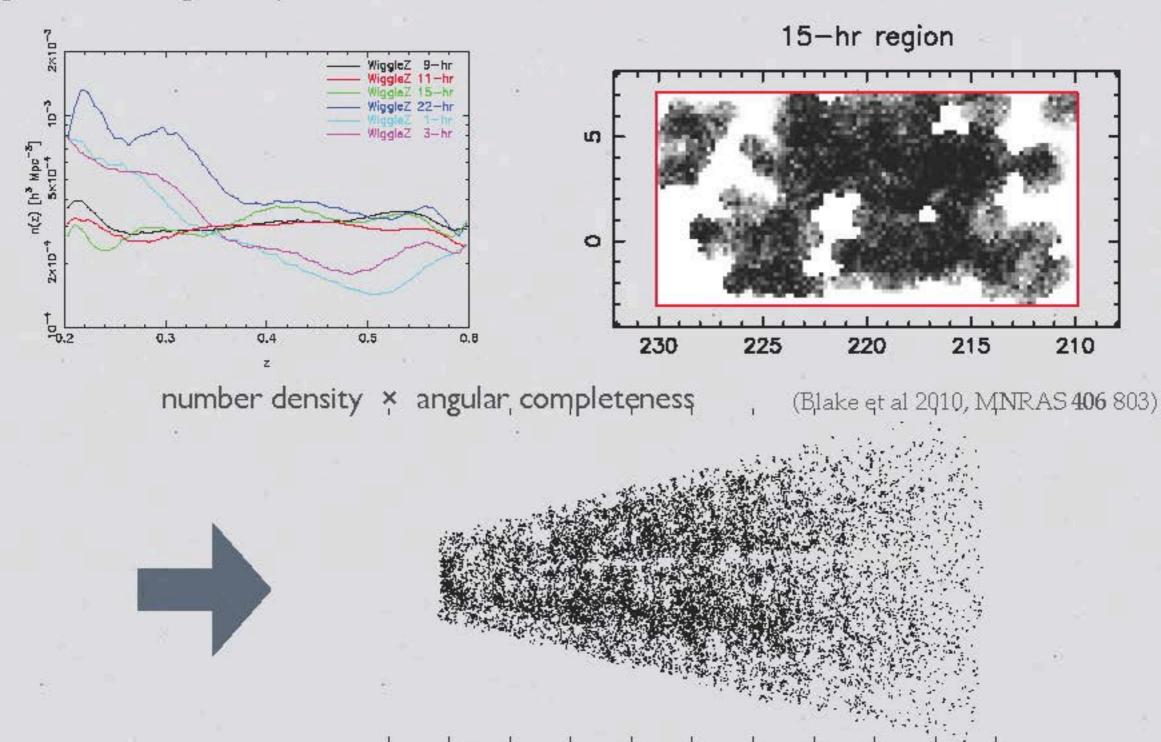


figure: Manera et al. 2013

### Apply selection function

Making mock catalogue: step 3



# Future of many mock galaxies

- Demand of many fast simulation is growing
  - TAIPAN larger volume BAO for 1% Hubble constant  $H_0$
  - ASKAP/WALLABY higher mass resolution
  - eBOSS wants mocks better than PTHalo
  - Euclid, SKA requires both resolution and volume
- Better parallelization needed for my code for larger simulation
  - slab decomposition of FFTW is not ideal
- No need to resolve haloes?
  - Comparison project in July at Madrid (Knebe et al. <a href="http://popia.ft.uam.es/nlFTyCosmology/">http://popia.ft.uam.es/nlFTyCosmology/</a>)

# Summary

- 3600 simulations for low-bias mock galaxies catalogues
  - Complicated data analysis technique (reconstruction) requires many realizations of simulations for error evaluation
  - Parallelized COLA simulation code
  - Ran with 12963 particles in a 600 h<sup>-1</sup> Mpc box
  - Resolves 10<sup>12</sup> h<sup>1</sup> solar mass halos with 10 time steps, (3×1296)<sup>3</sup> PM grids
  - With reasonable computational resource 216 cores, 200k hours for 3600 simulations
- Revised WiggleZ BAO measurement (Kazin et al. 2014)
  - improved the distance by a factor of 2 in  $0.6 \le z \le 1.0$  (luckily)
  - consistent with the standard ACDM
- Many other ideas without resolving haloes.
  - I'm interested in the requirements / requests from observers here