



Max-Planck-Institut für  
extraterrestrische Physik

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# COMPARING APPROXIMATE METHODS FOR MOCK CATALOGUES AND COVARIANCE MATRICES

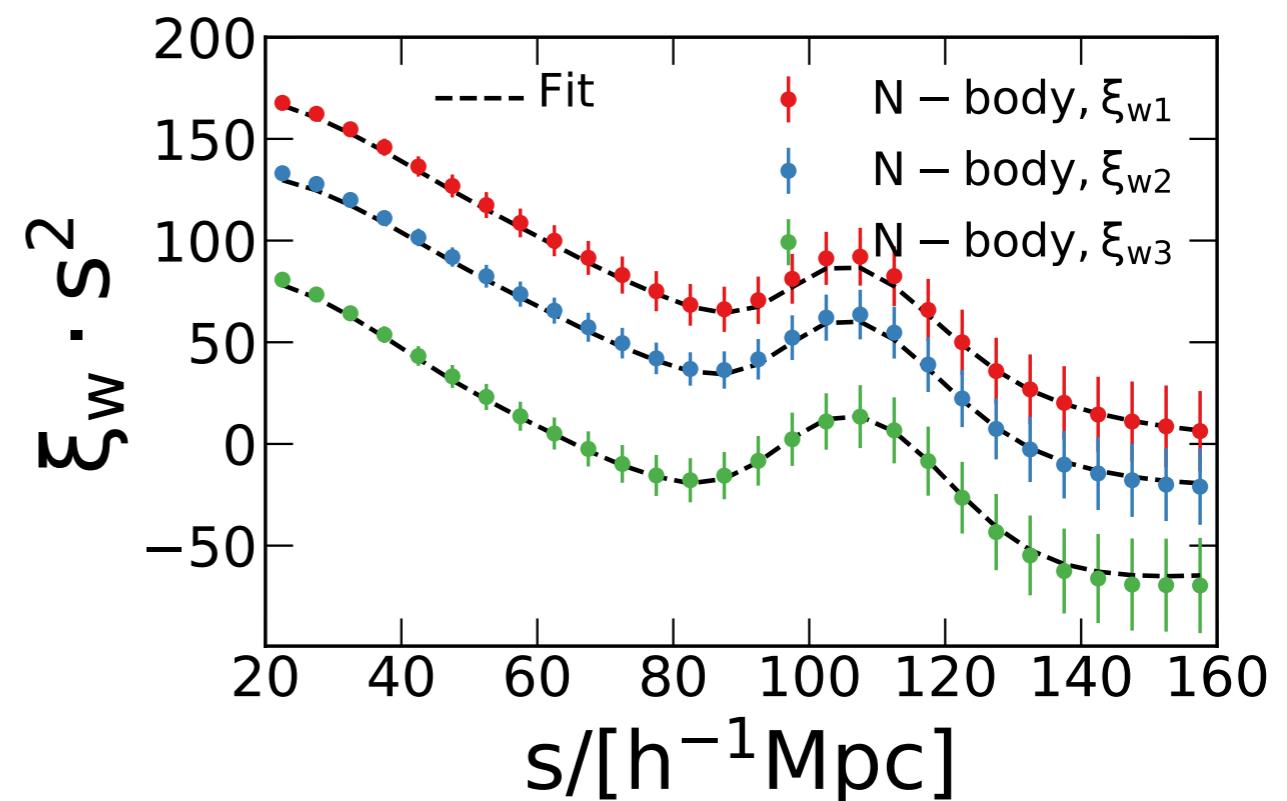
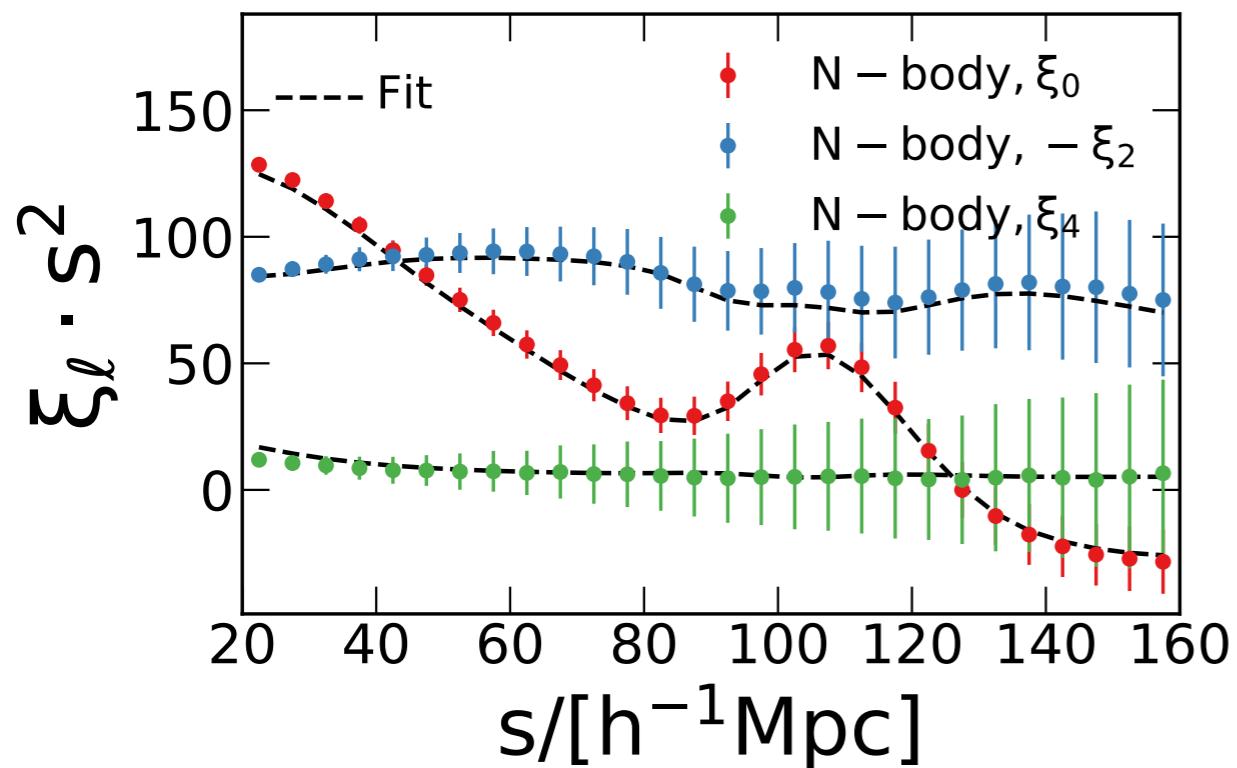
# DIFFERENT CLUSTERING MEASUREMENTS

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- ▶ 2-point correlation function (Lippich et al. 2019)
- ▶ Power spectrum (Blot et al. 2019)
- ▶ Bispectrum (Colavincenzo et al. 2019)

# CORRELATION FUNCTION MEASUREMENTS

- ▶ Anisotropic 2-point correlation function: Legendre multipoles and clustering wedges



# EXTRACTING INFORMATION FROM MEASUREMENTS

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- ▶ **Model:** nonlinear gravitational evolution (gRPT, Crocce, Scoccimarro, Blas in prep.), bias and RSD
- ▶ Assume **Gaussian likelihood**

$$-2 \ln \mathcal{L}(\xi|\theta) = (\xi - \xi_{theo}(\theta))^t \Psi (\xi - \xi_{theo}(\theta))$$

$$\Psi = C^{-1}$$

↗ **Covariance matrix**

# COVARIANCE MATRIX ESTIMATION

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## Model

- + no noise
- need to know model, nonlinear

## Data

- biases

## Simulations

- noise

# COVARIANCE MATRIX ESTIMATION FROM SIMULATIONS

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- ▶ Covariance matrix  $\mathbf{C}$  estimated from  $N_s$  mock measurements

$$C_{ij} = \frac{1}{N_s - 1} \sum_{k=1}^{N_s} (\xi_{i,k} - \langle \xi_i \rangle)(\xi_{j,k} - \langle \xi_j \rangle)$$

- ▶ Depending on  $N_s$ ,  $\mathbf{C}$  has associated error (noise), which propagates into final constraints on cosmological parameters

$$\rightarrow N_S \gg N_D$$

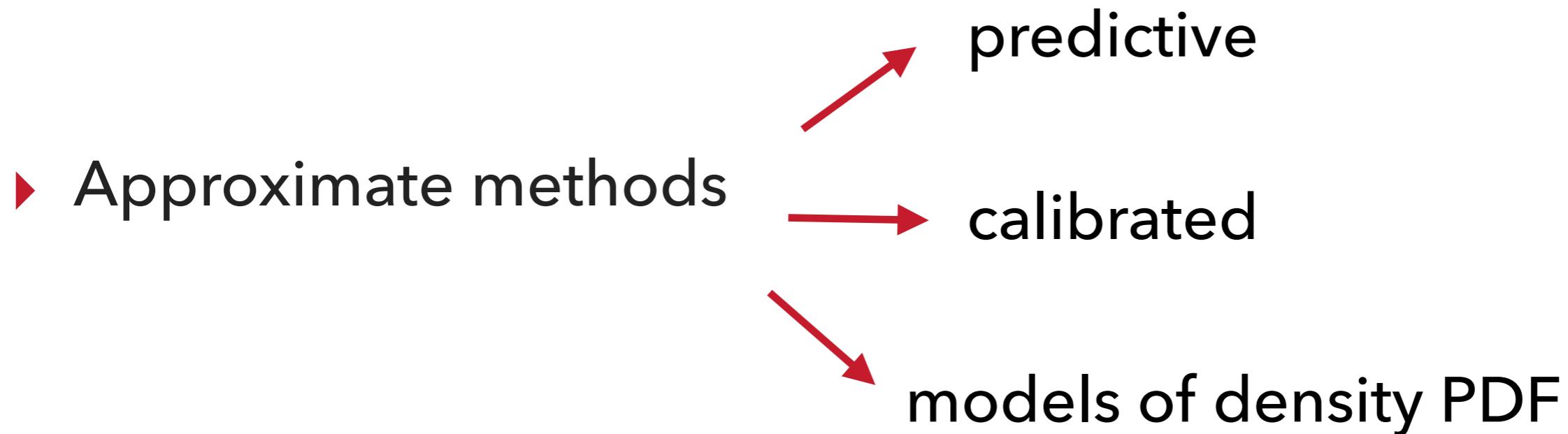
- ▶ For analysis of Euclid  $\sim 2000 - 10\,000$  independent realizations required!

WE NEED FAST APPROXIMATE METHODS

# COMPARED METHODS

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- ▶ **Reference N-body catalogues** from ***Minerva*** simulations  
300 boxes,  $L=1500 h^{-1}\text{Mpc}$ ,  $z=1.0$ ,  $\Lambda\text{CDM}$  (Grieb et al. '16)



# PREDICTIVE METHODS

- ▶ **ICE-COLA** (Izard et al. '16)
- ▶ **PINOCCHIO** (Monaco et al. '13)
- ▶ **PEAKPATCH** (Bond & Myers '96)

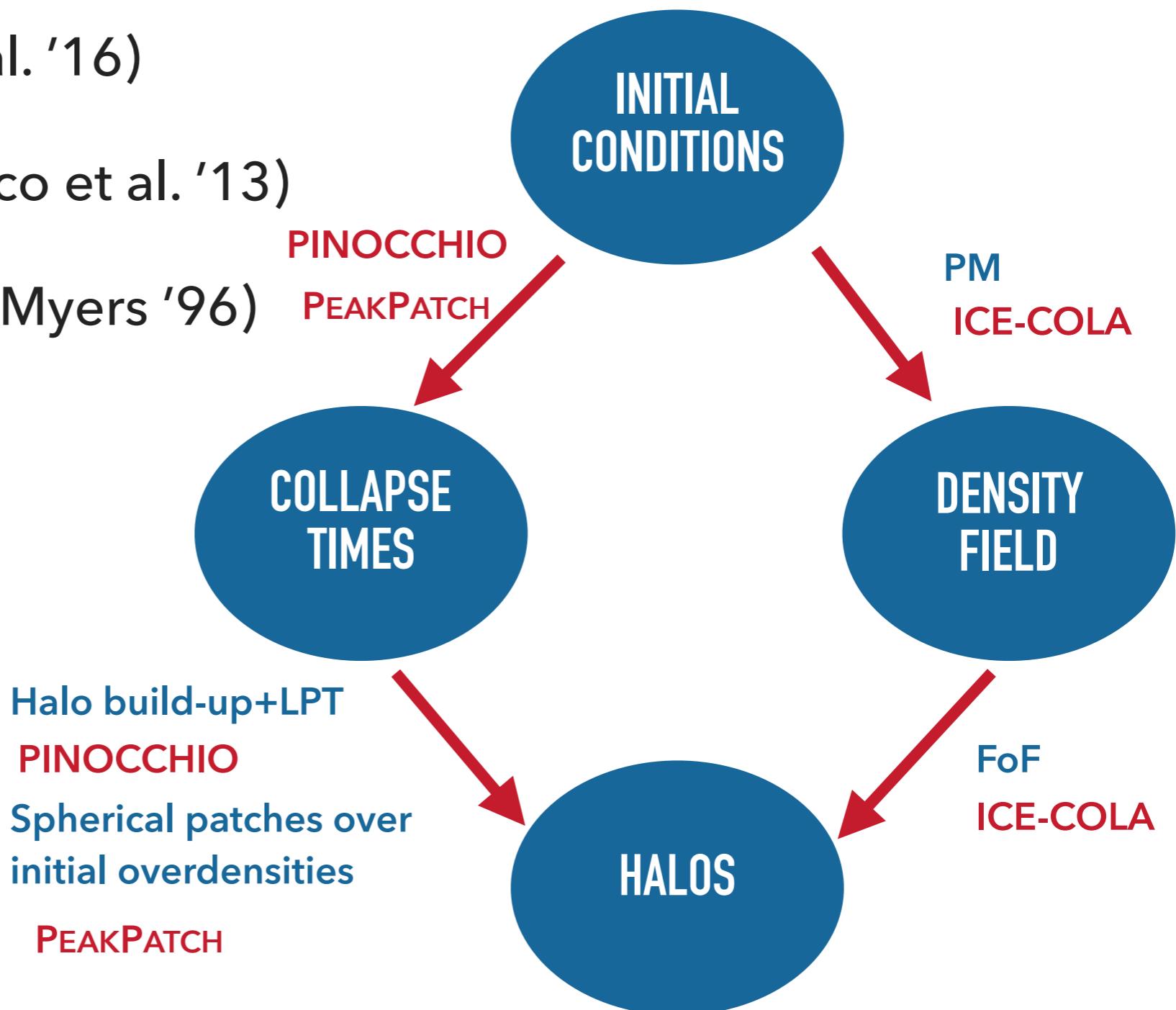


figure inspired by Chuang et al. '15

# CALIBRATED METHODS

- ▶ **HALOGEN** (Avila et al. '14)
- ▶ **PATCHY** (Kitaura et al. '14a)

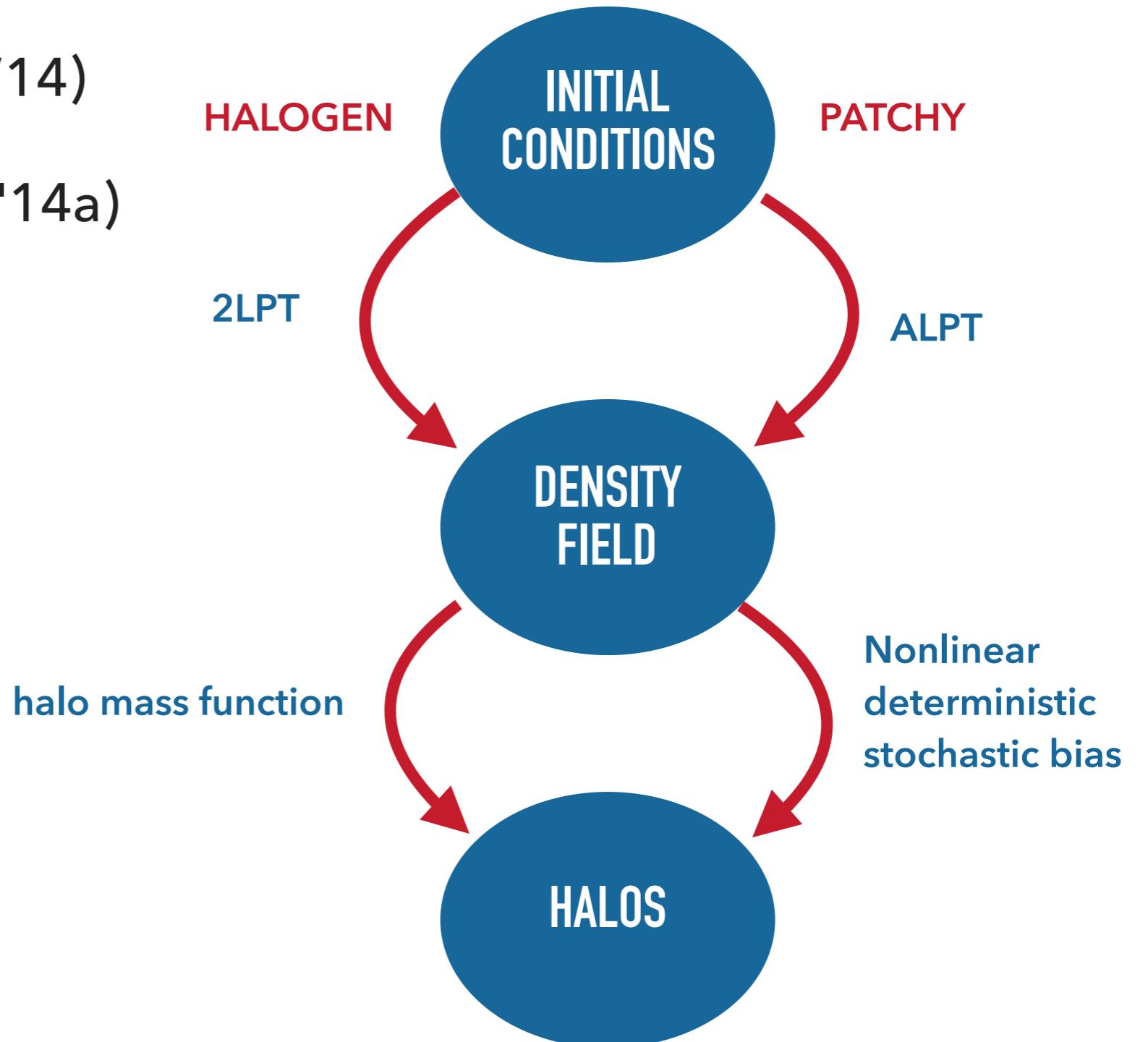


figure inspired by Chuang et al. '15

# MODELS OF THE DENSITY PDF

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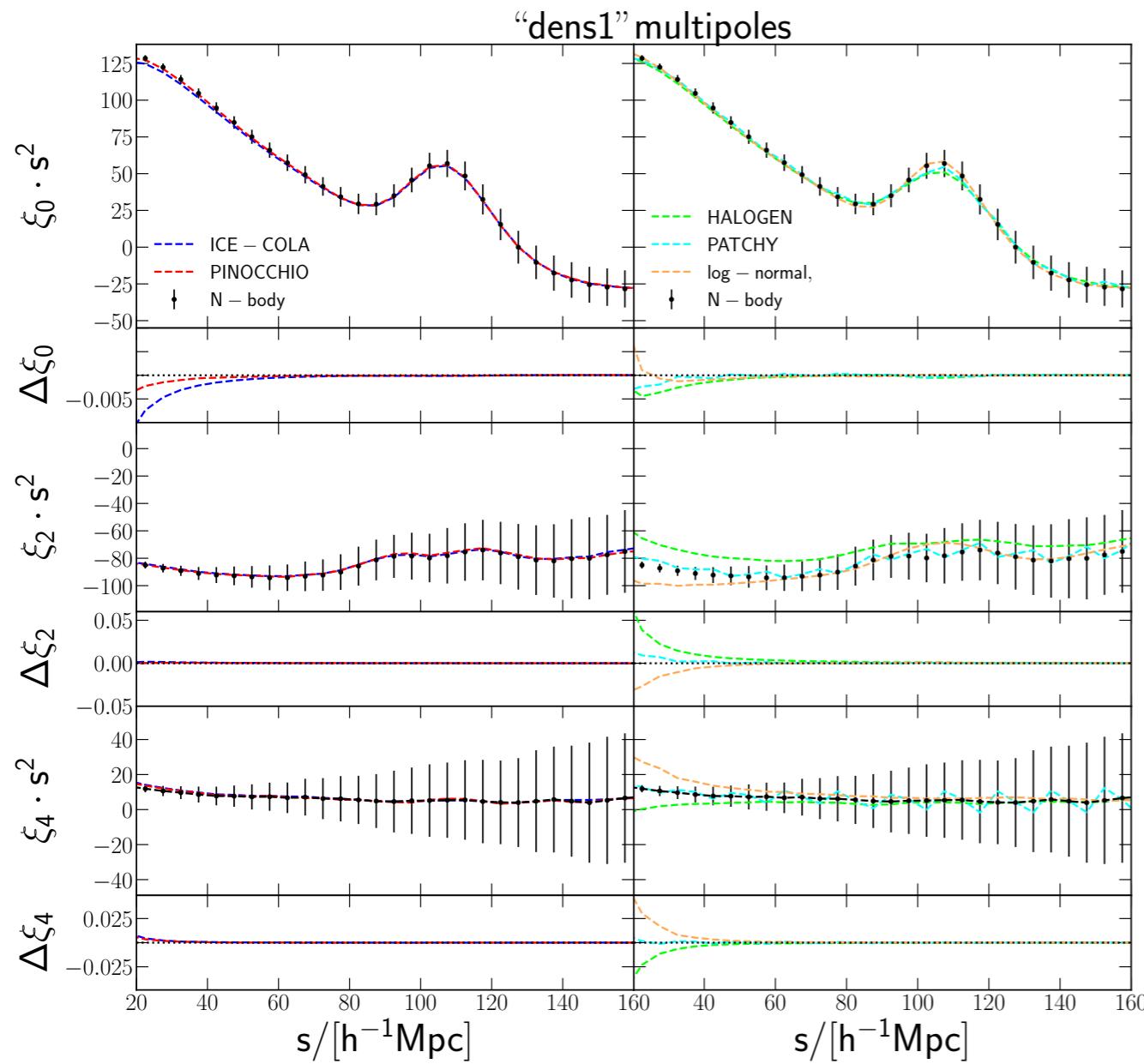
- ▶ **Gaussian covariance model:** (Grieb et al. '16),  
interpolated non-linear power spectrum as input
- ▶ **Log-normal:** assumes lognormal PDF of halo and matter  
density field (Agrawal et al. '17)

# ROADMAP

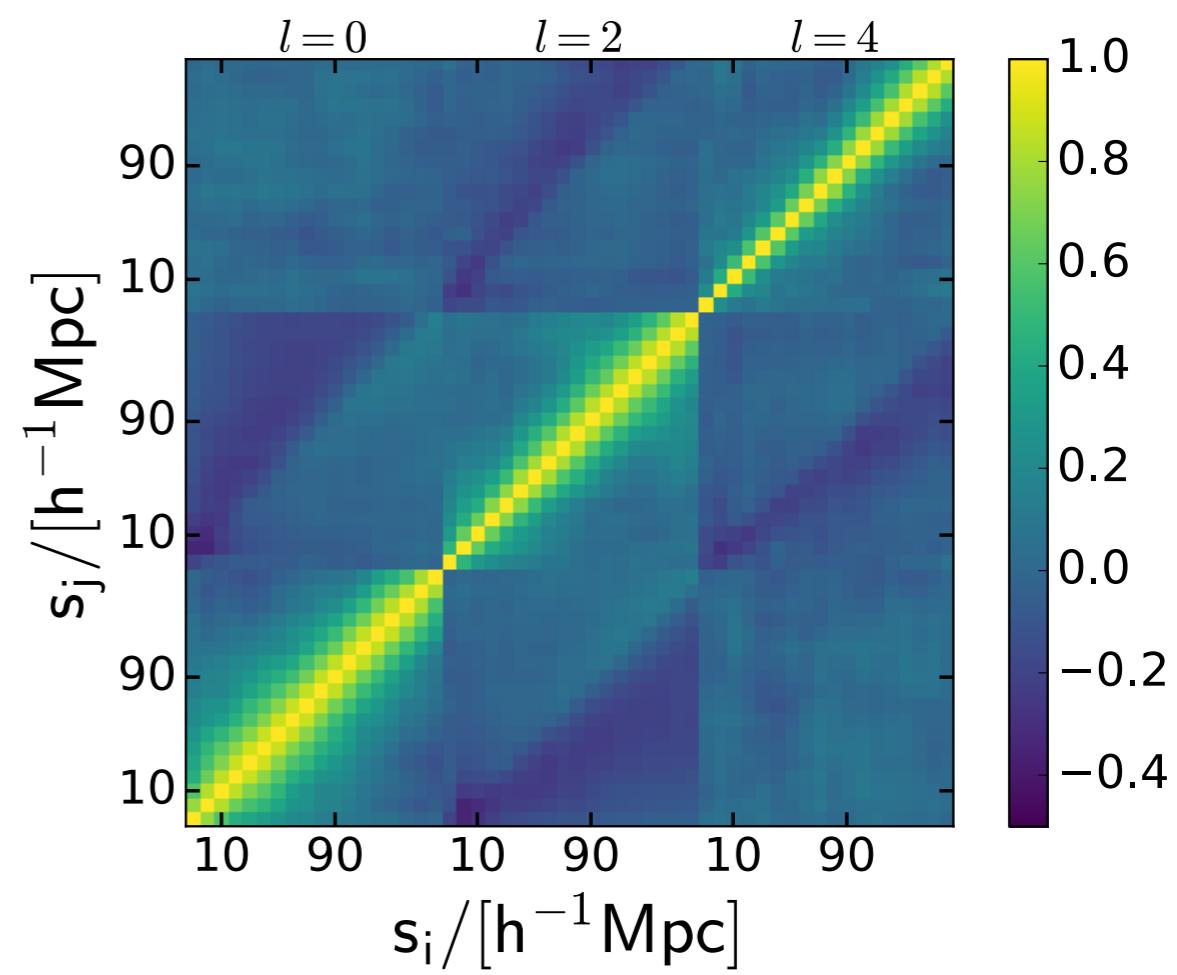
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1. Measure covariance matrix obtained from all methods
  - ▶ same ICs, two different mass thresholds ( $1.1 \times 10^{13}$ ,  $2.7 \times 10^{13} M_{\text{sun}}/h$ ) with different ways of matching to N-body catalogues (mass, abundance, bias)
2. Create synthetic data using our baseline model
3. Compare performance on fits
  - ▶ Fix cosmology to that of N-body simulations
  - ▶ Constraints on Alcock-Paczynski parameters  $\alpha_{\parallel}$ ,  $\alpha_{\perp}$  and growth rate  $f\sigma_8$

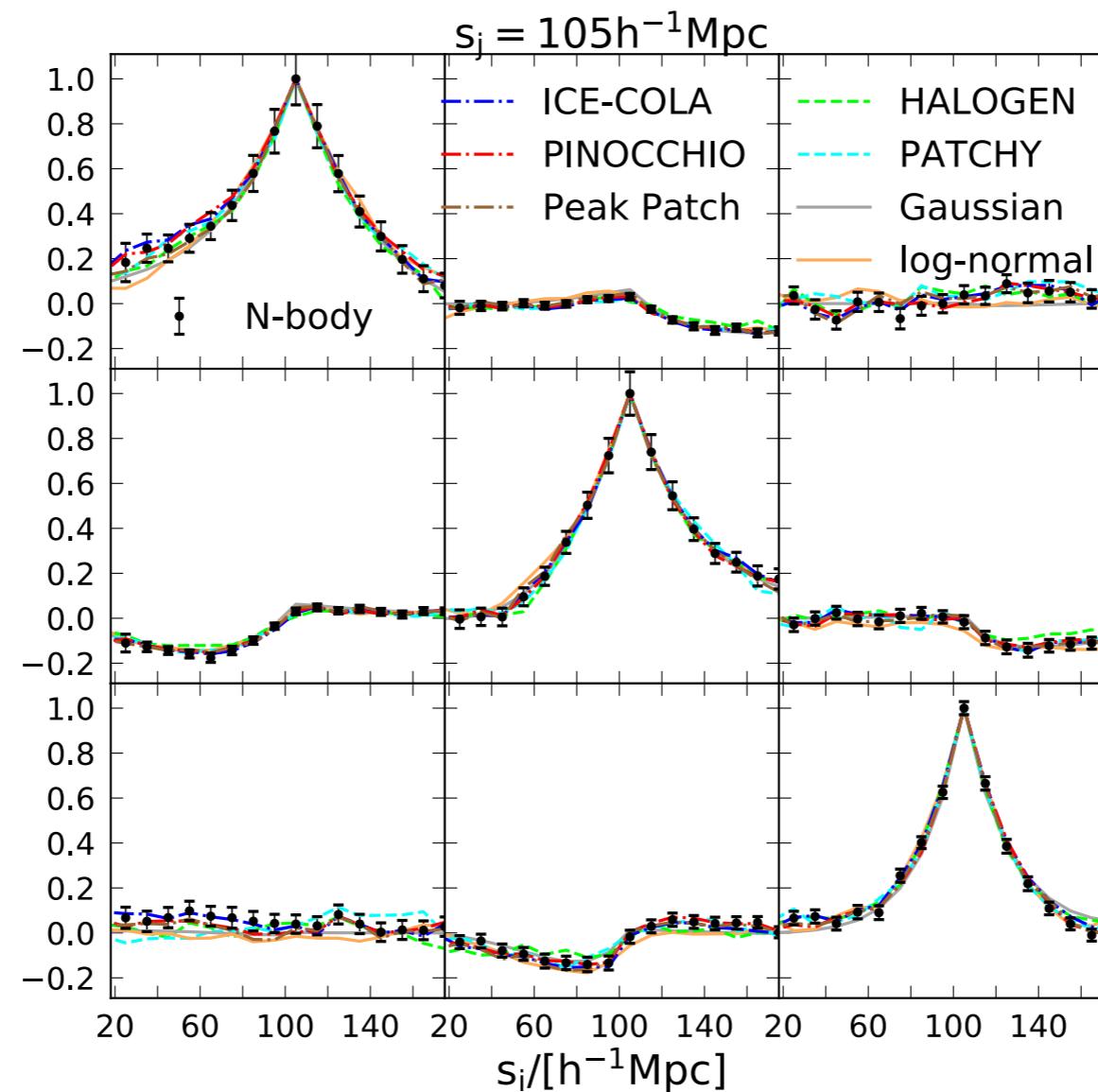
# EXAMPLE:



## MULTIPOLE ANALYSIS “DENSITY 1” SAMPLE



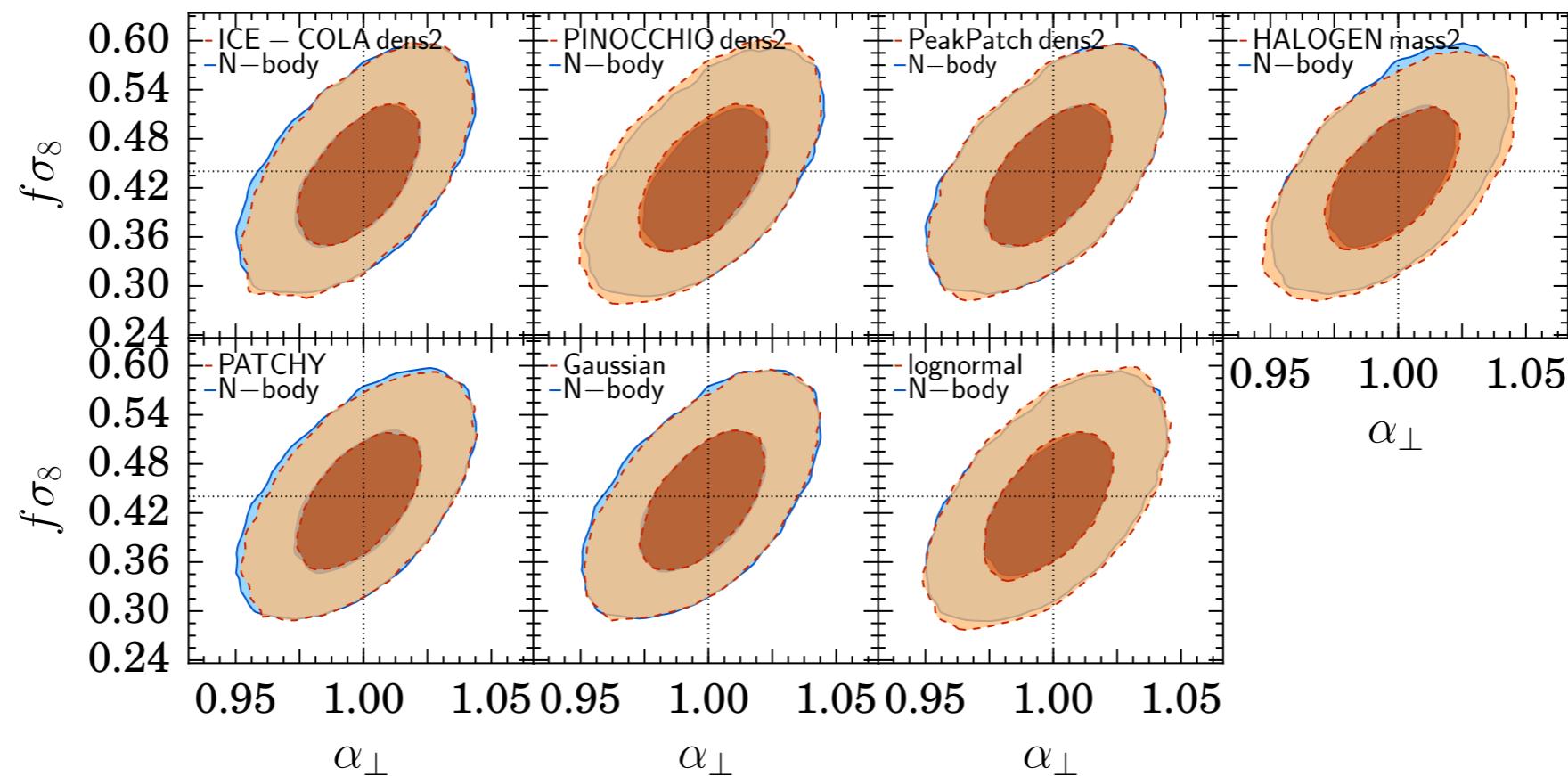
# CUT THROUGH CORRELATION MATRIX



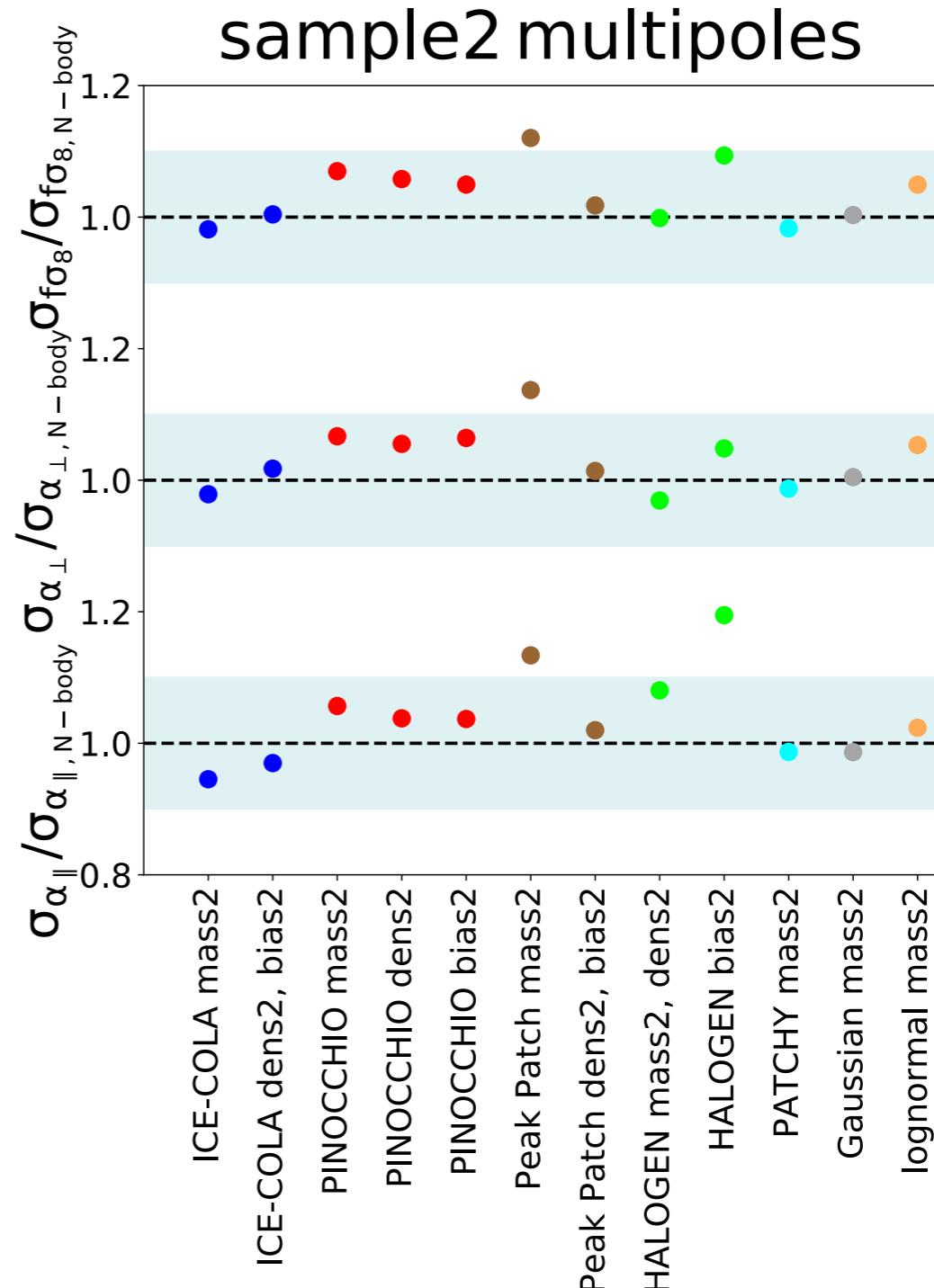
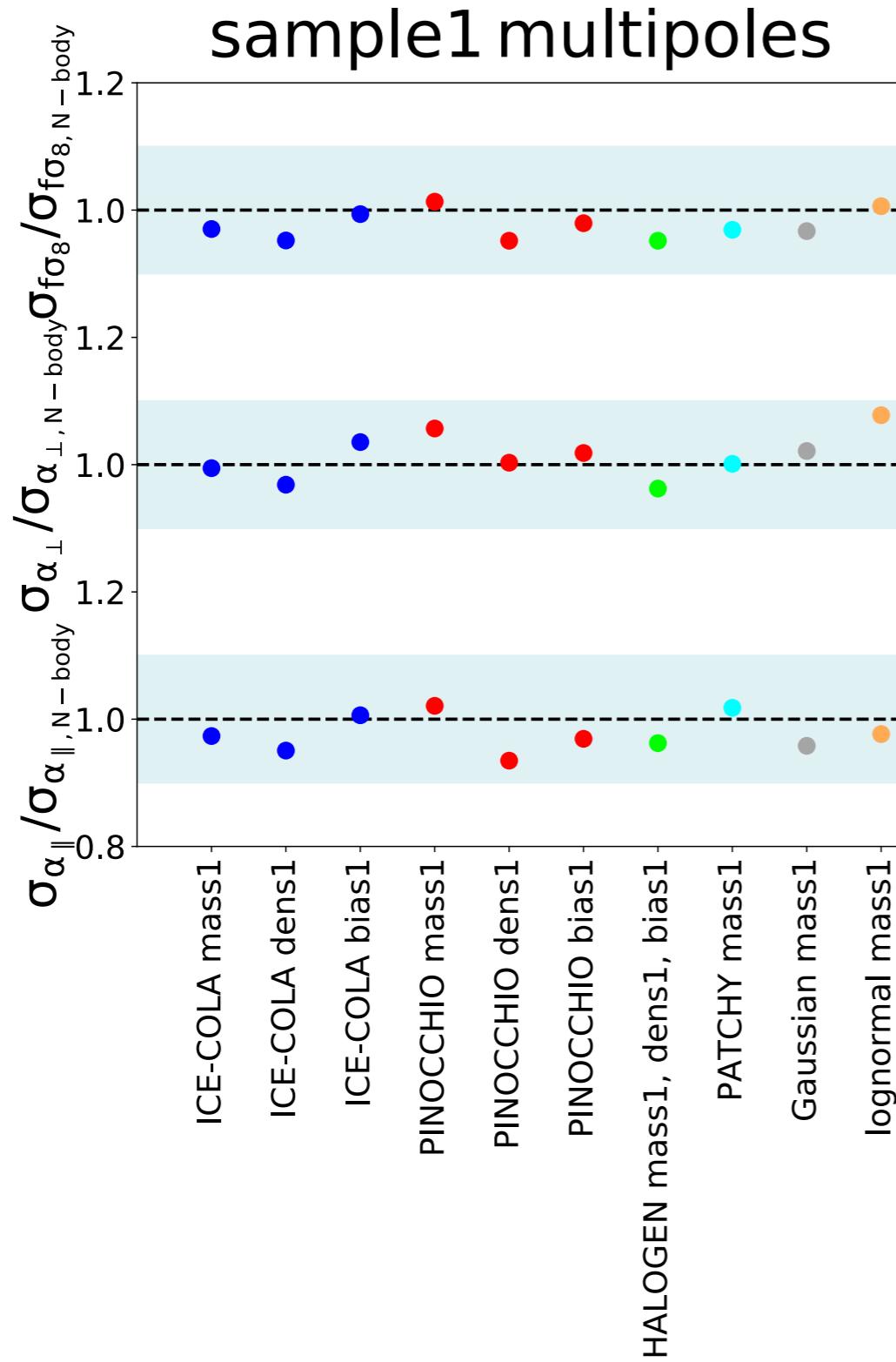
$$R_{nm} = C_{nm} [\sigma_n(s_i) \sigma_m(s_j)]^{-1}$$

# PERFROMANCE COMPARISON

## ▶ Comparison of 2D constraints



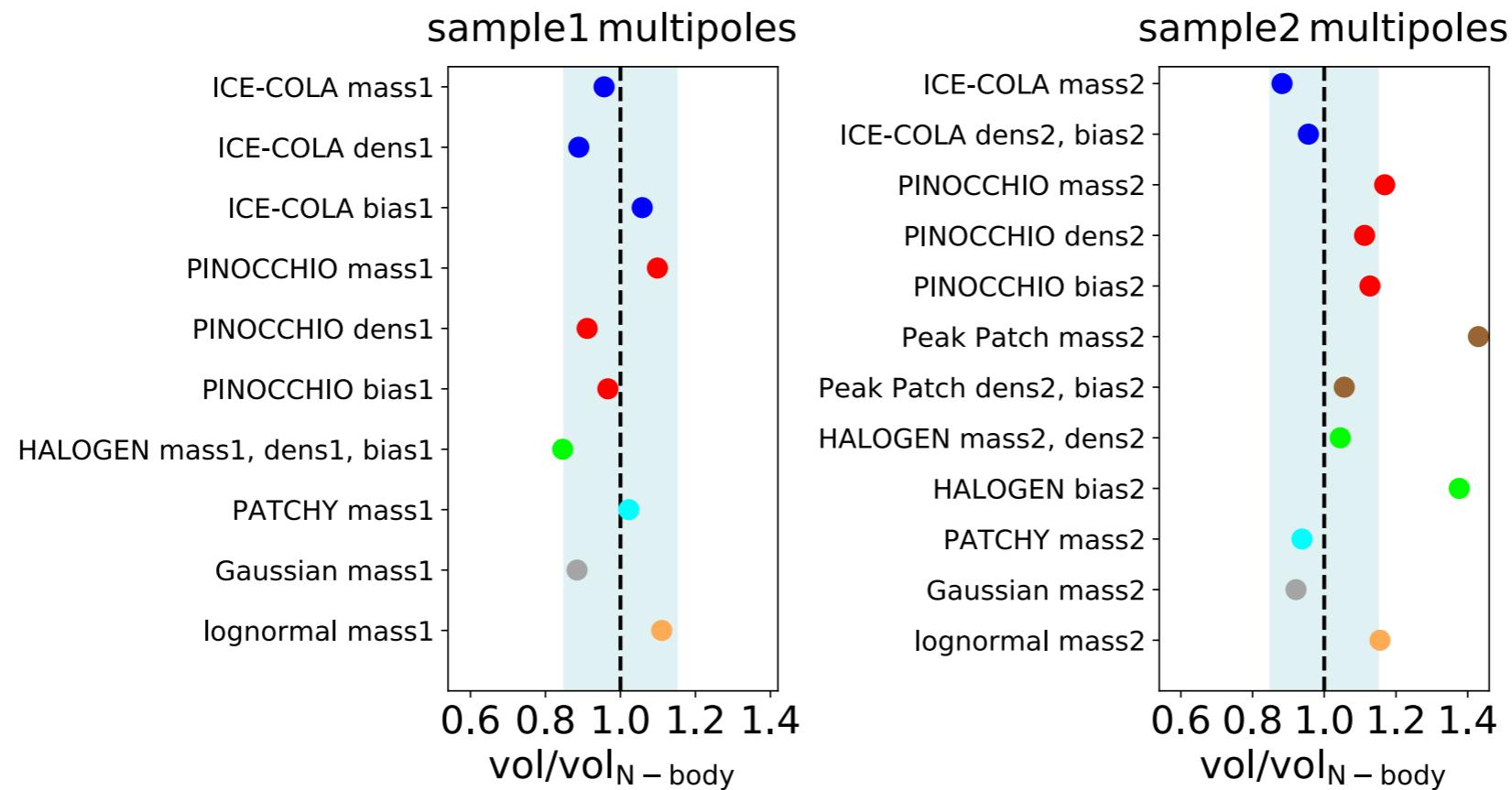
# PARAMETER ERRORS CORRELATION FUNCTION



# STATISTICAL PARAMETER VOLUMES

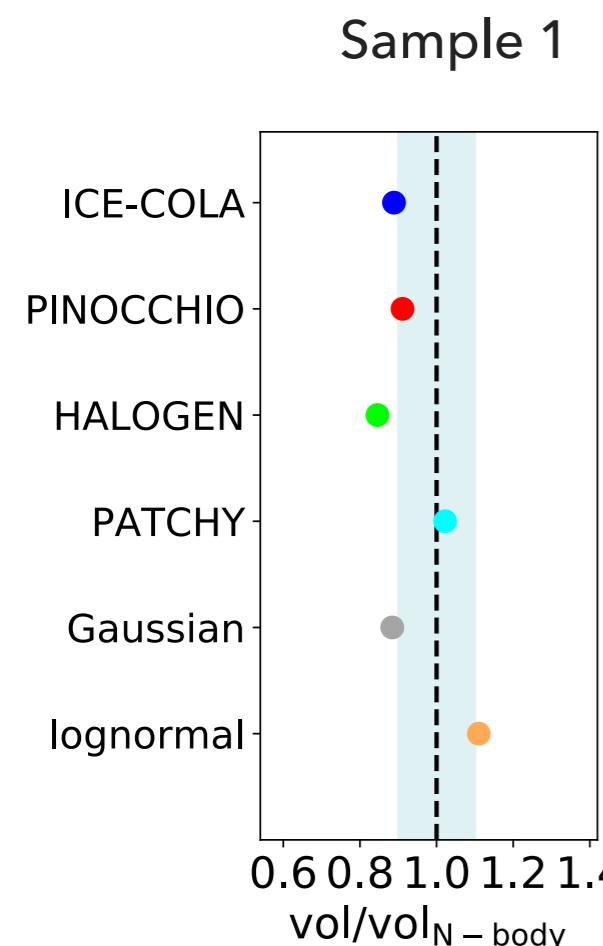
- ▶ Volume of allowed region in 3D parameter space

$$V = \sqrt{\det \text{Cov}(\alpha_{||}, \alpha_{\perp}, f\sigma_8)}$$



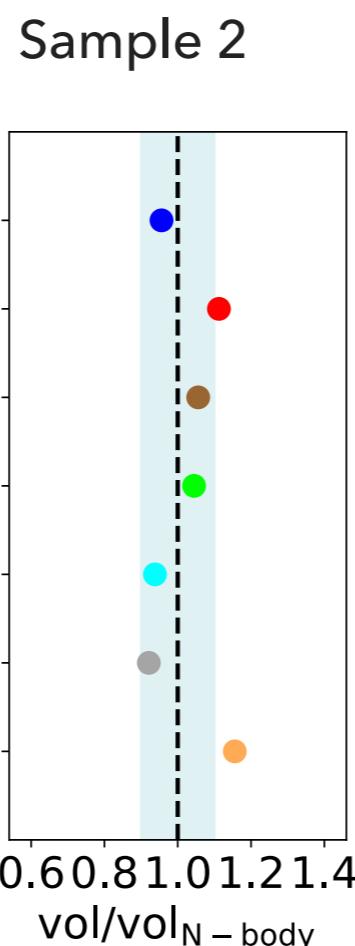
# COMPARISON CONFIGURATION AND FOURIER SPACE

- ▶ Comparison of volume ratios of density matched samples



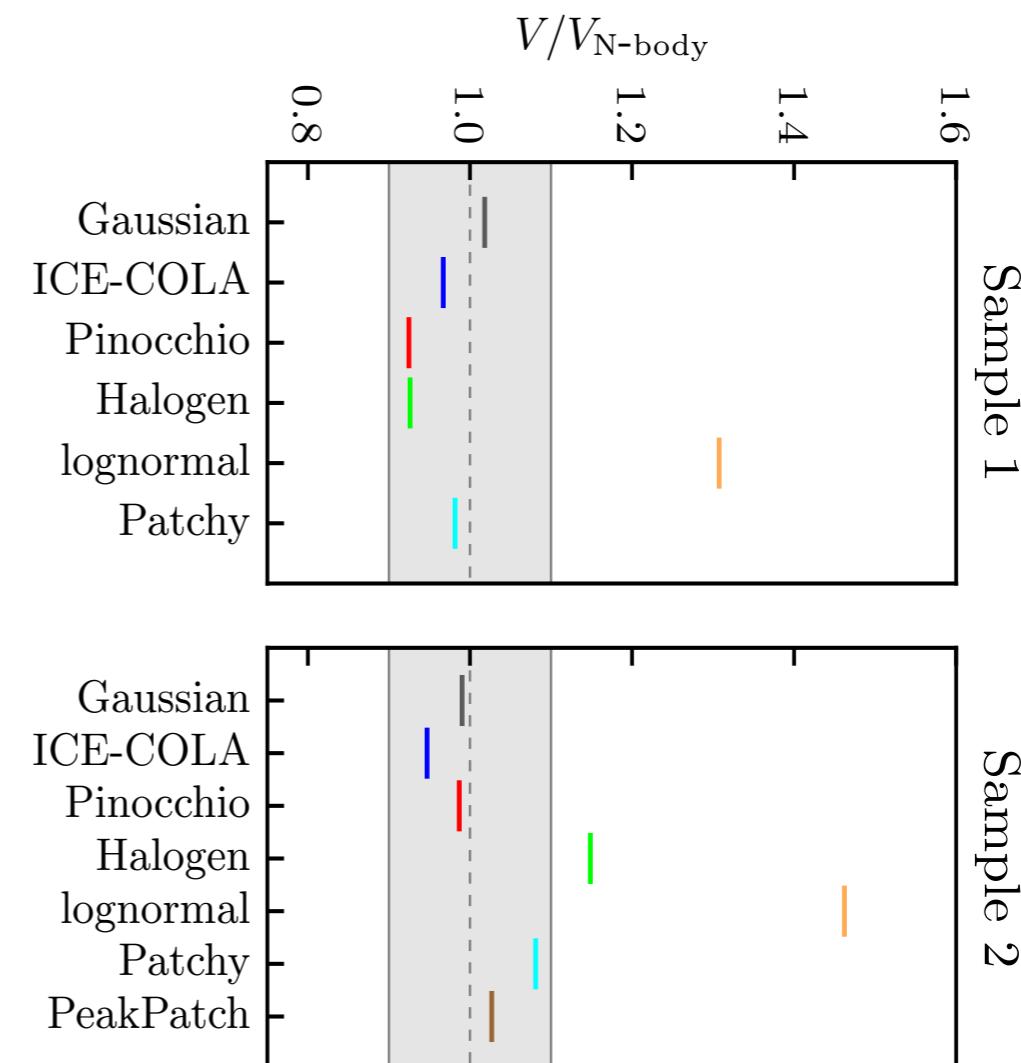
correlation function

(Lippich et al. 2019)

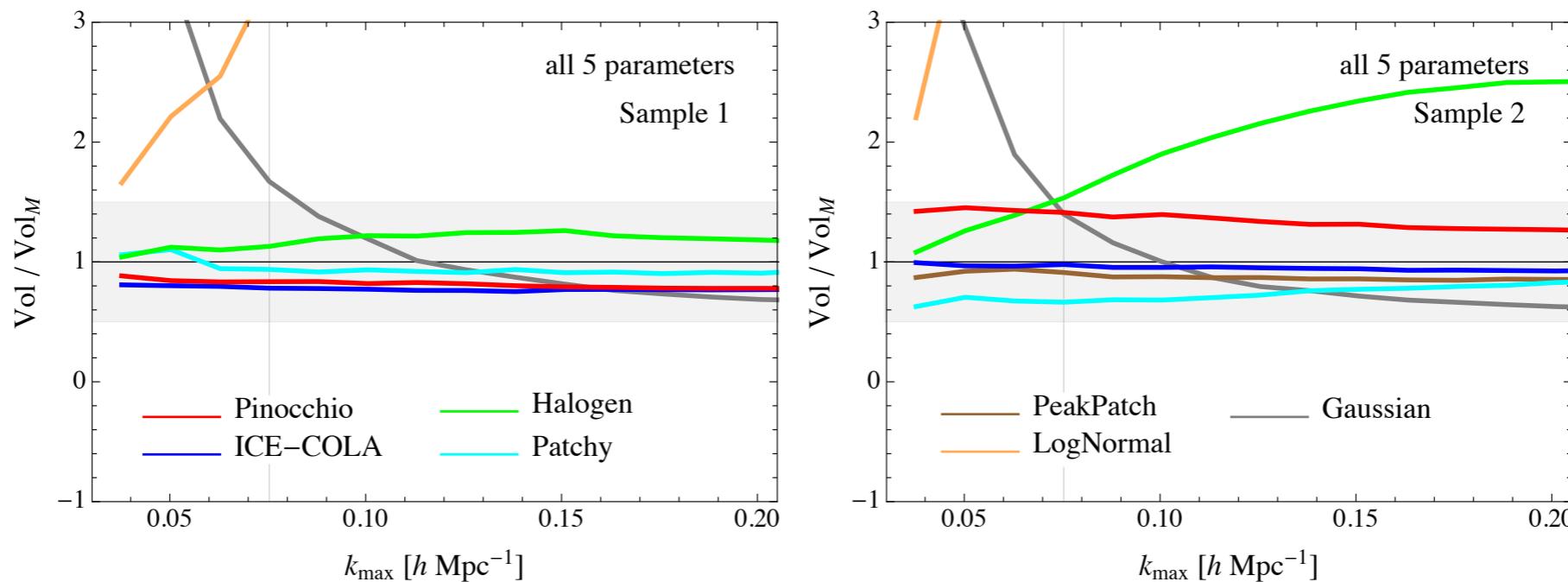


power spectrum

(Blot et al. 2019)



# BISPECTRUM: PARAMETER VOLUMES



- ▶ Likelihood analysis with bispectrum variance
- ▶ Model of halo bispectrum = tree-level approximation in PT
- ▶ Model parameters:  $\{b_1, b_2, \gamma_2, B_{SN}^{(1)}, B_{SN}^{(2)}\}$

(Colavincenzo et al. 2019)

# CONCLUSIONS

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- ▶ Noise from covariance matrices propagates into cosmological constraints
- ▶ Mean values of parameter constraints from approximate methods agree perfectly with N-body results
- ▶ Configuration space: no clear preference for any of the approximate methods, Gaussian works well!
- ▶ Differences between methods become more evident for power spectrum and are strongest for bispectrum