

# **FREMU**

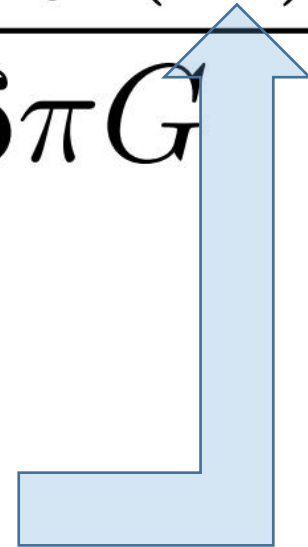
## **Power spectrum emulator for $f(R)$ gravity**

**Jiachen Bai - Department of Astronomy, Beijing Normal University**

# **F(R) gravity & Large-scale structure of the Universe**

$$S = \int d^4x \sqrt{-g} \left[ \frac{R + f(R)}{16\pi G} + \mathcal{L}_m \right]$$

An additional term as  
the deviation from GR



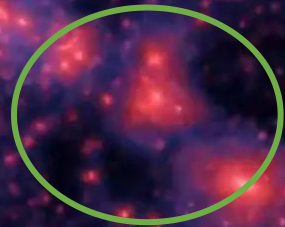
# **F(R) gravity & Large-scale structure of the Universe**

$$\text{GR:} \quad \nabla^2 \Phi = \frac{16\pi G}{3} \delta\rho$$

$$\text{F(R):} \quad \nabla^2 \Phi = \frac{16\pi G}{3} \delta\rho - \frac{1}{6} \delta R$$



ΛCDM



$f(R)$

# F(R) gravity & Large-scale structure of the Universe

$$P(\mathbf{k}) \equiv V \langle |\delta_{\mathbf{k}}|^2 \rangle = \int d^3r e^{-i\mathbf{k}\cdot\mathbf{r}} \xi(\mathbf{r})$$

We can now predict **linear**  $P(k)$  precisely,  
but **non-linear effects** cannot be ignored.

# Simulation & Emulation

N-body simulations  $\Rightarrow$  Non-linear  $P(k)$

**MONEY & TIME (Months)**

MCMC? **IMPOSSIBLE!!!**



# Simulation & Emulation



Emulator!

Directly predict  
 $P(k)$  in only  
few seconds!

# Build an emulator - Data

Quijote simulations



Quijote-MG

2048 sets

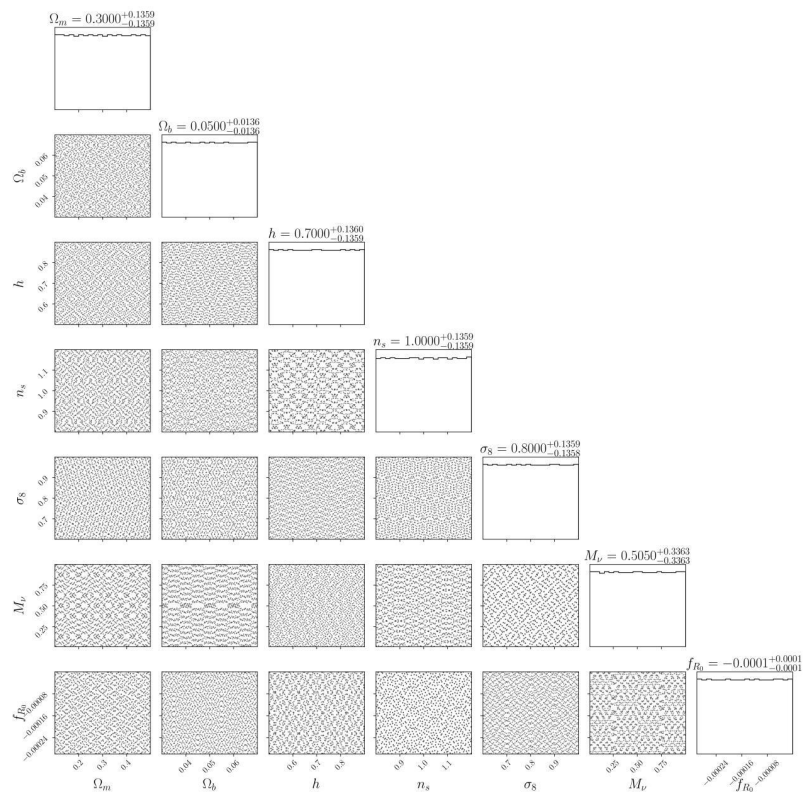
SB7



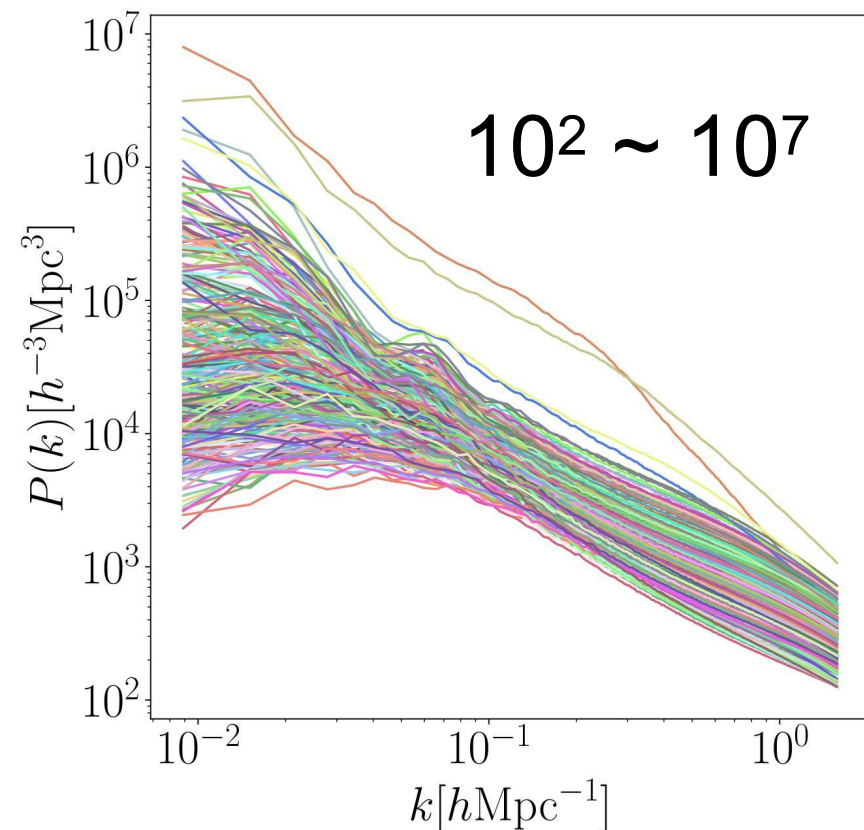
# Build an emulator - Targets

Parameters

Power spectrum



Map



# Build an emulator - Boosts

$$B(k) = P_{f(R)}^{\text{nonlin}}(k) / P_{\Lambda\text{CDM}}^{\text{halofit}}(k)$$

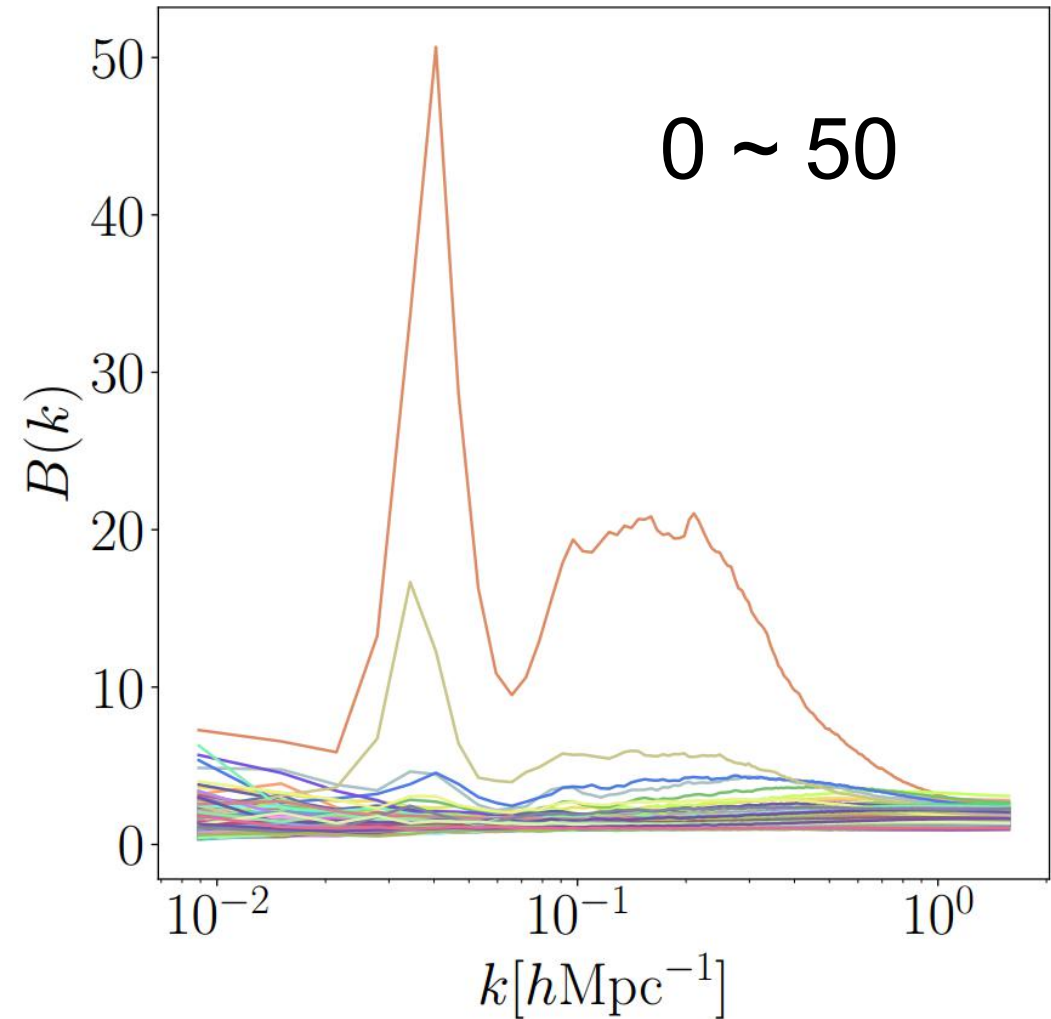
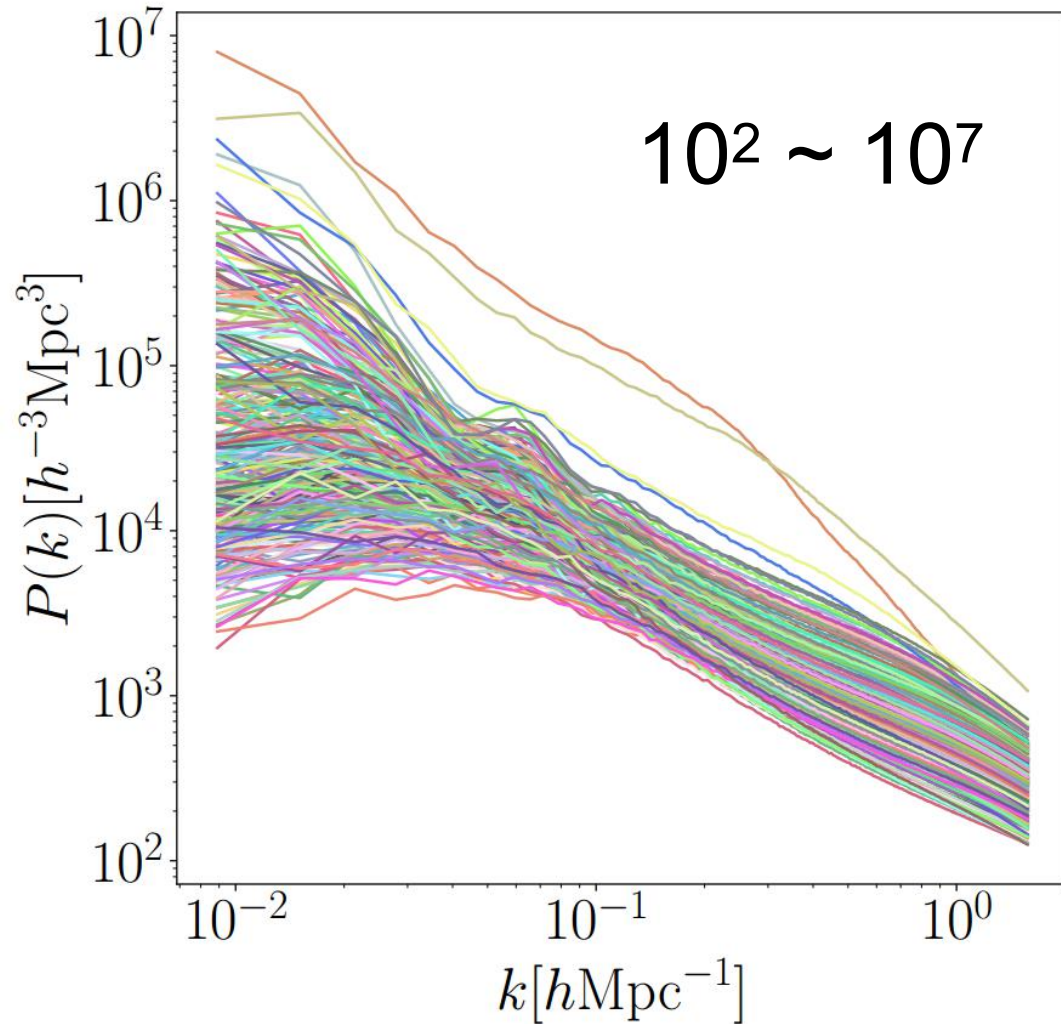
Halofit: Mead2020\_feedback  
computed with CAMB

$$P_{f(R)}(\mathbf{k}) = P_{\text{halofit}}(\mathbf{k}) \times B(\mathbf{k})$$

Fast Fast

Focus on  $f(R)$  &  $M_v$  features

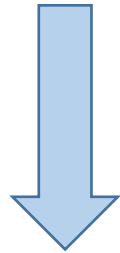
# Build an emulator - Boosts



# Build an emulator - PCA

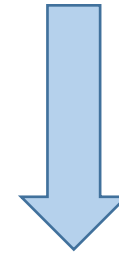
7 parameters

7 parameters



Map

PCA



Map

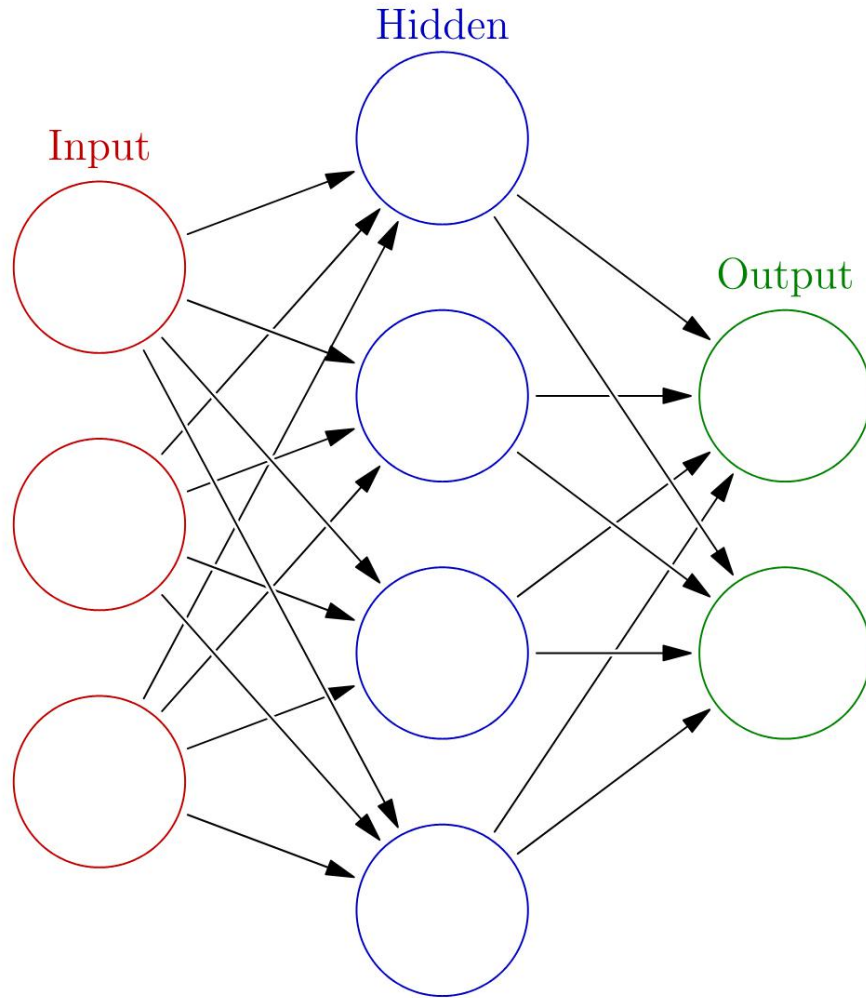
Hundreds of points

30 PCA coefficients

$$B(k, z; \theta) = \mu_B(k, z) + \sum_{i=1}^{N_{pc}} \phi_i(k, z) w_i(\theta) + \epsilon$$



# Build an emulator - ANN



7 Input

650 Hidden

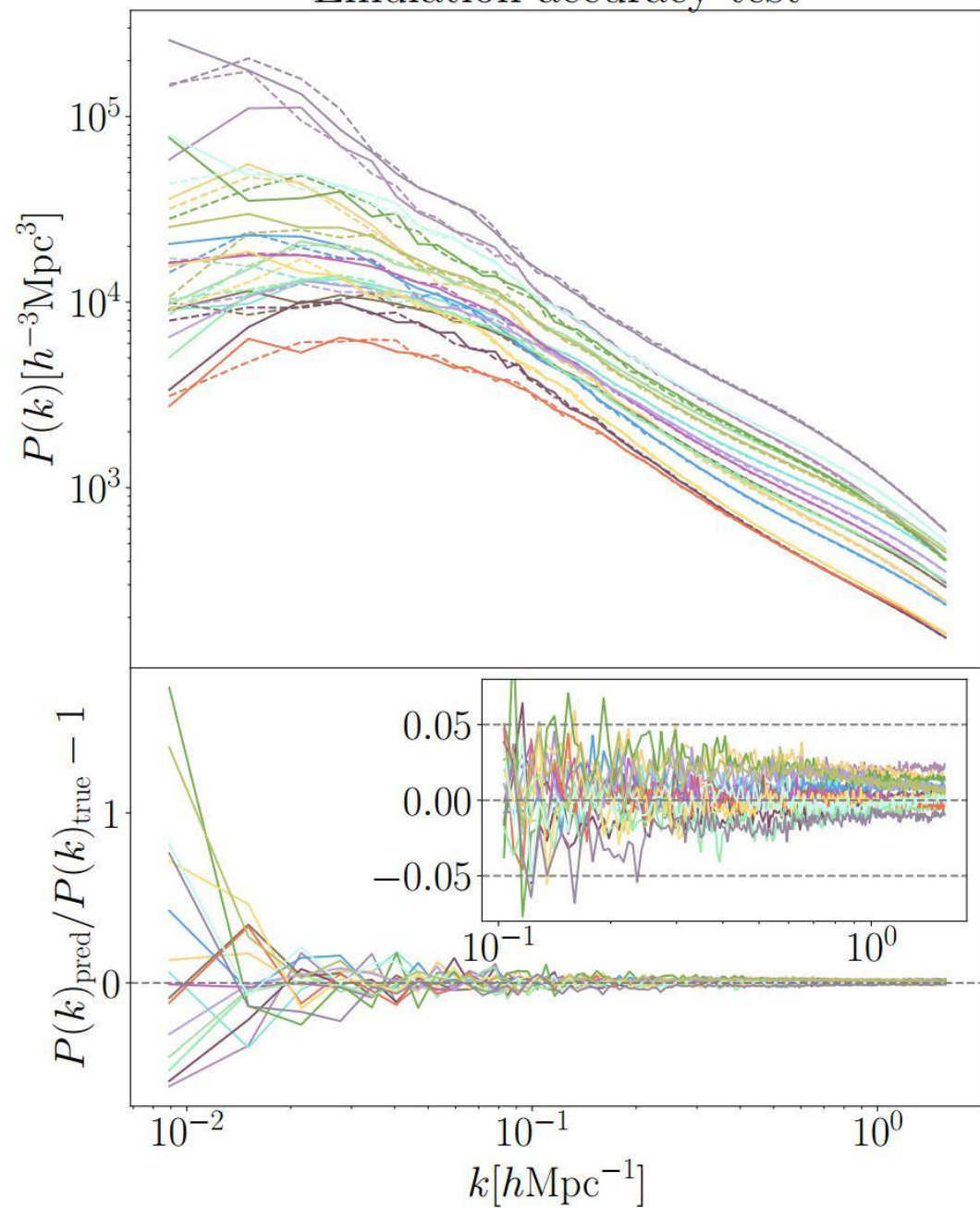
30 Output

Linear - Sigmoid - Linear

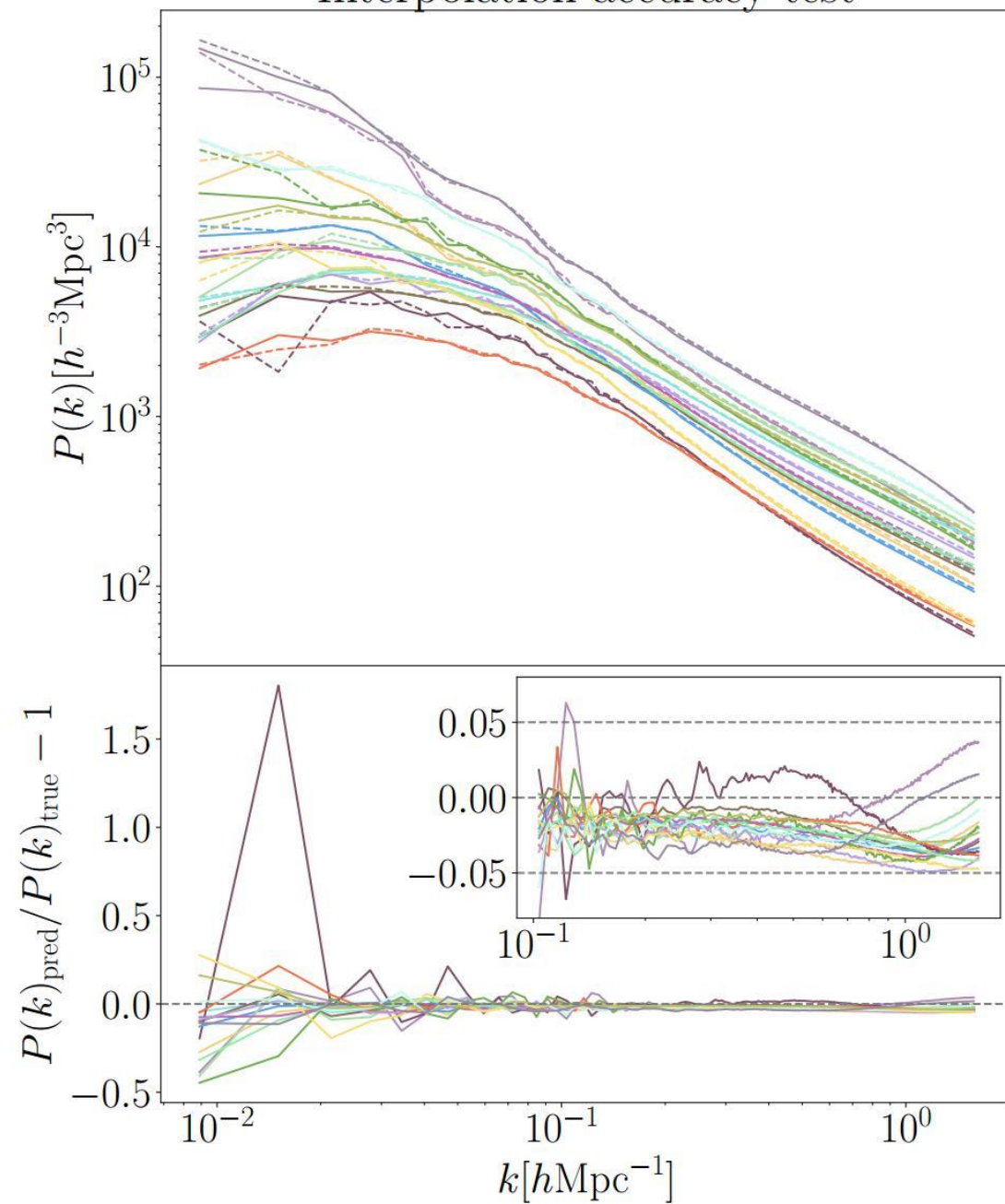
# Results

Accuracy & Application

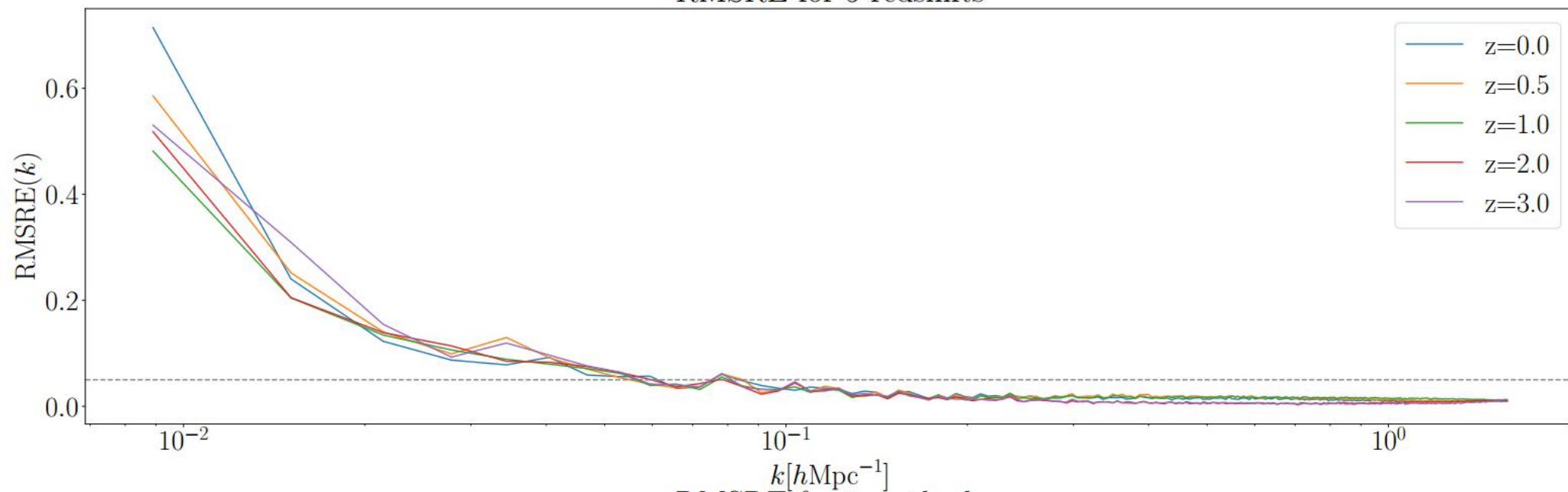
Emulation accuracy test



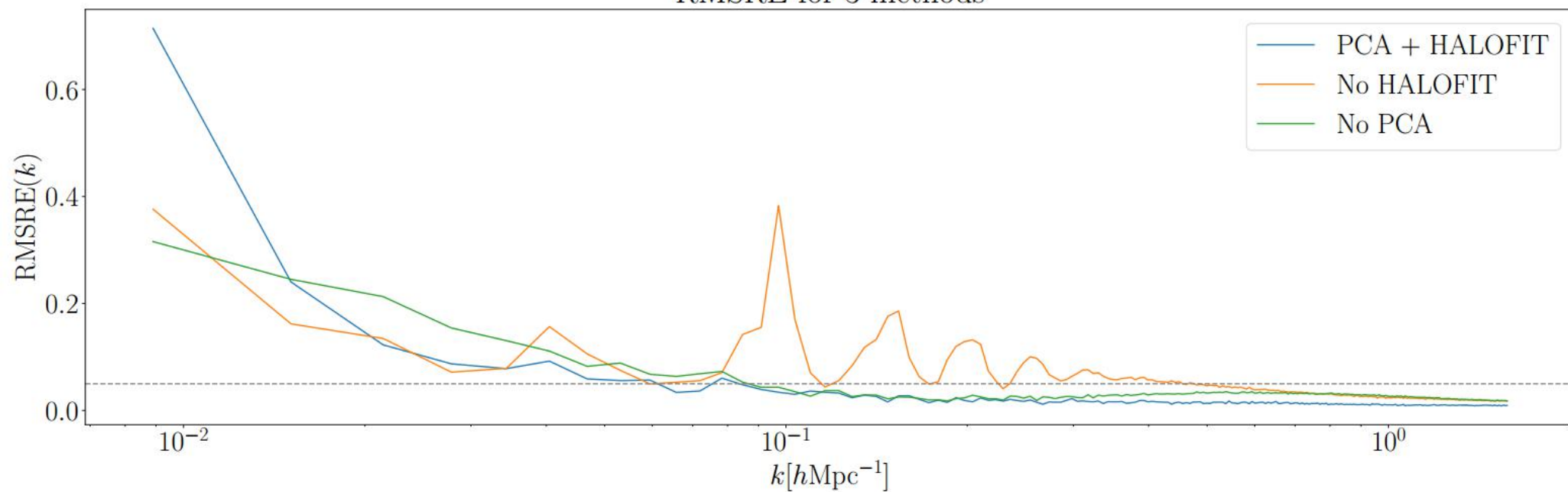
Interpolation accuracy test



RMSRE for 5 redshifts



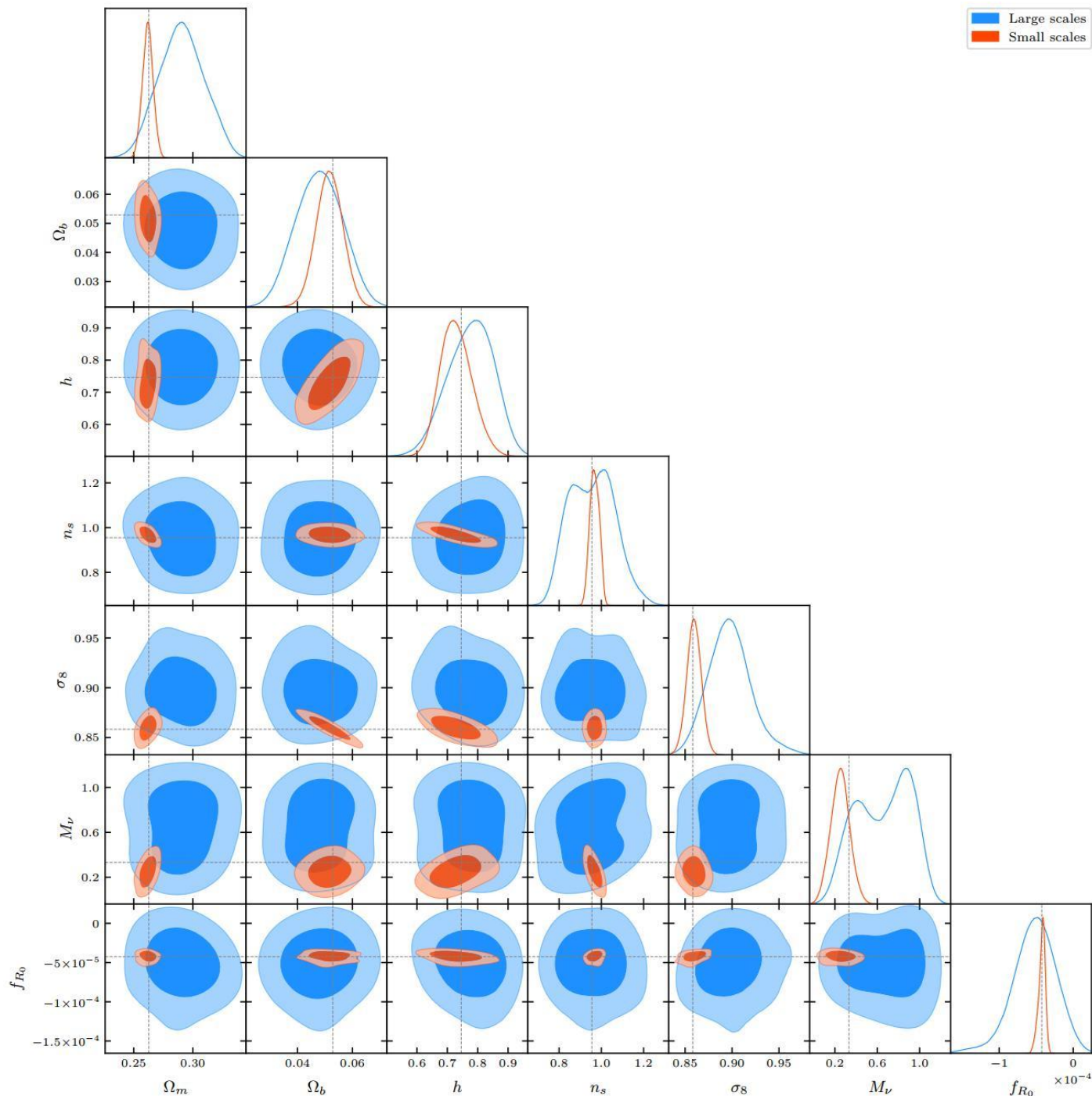
RMSRE for 3 methods





# Application

## MCMC!



$$\Sigma(k_1, k_2) = \left[ \frac{2}{N_{k_1}} + \sigma_{\text{sys}}^2 \right] P^2(k_1) \delta_{k_1 k_2}$$

$$\mathcal{L}(\theta | D) = \exp \left( -\frac{1}{2} (\mathbf{O}(D) - \mathbf{M}(\theta))^T \Sigma^{-1} (\mathbf{O}(D) - \mathbf{M}(\theta)) \right)$$

Parameter	True	Small-scale	Large-scale
$\Omega_m$	0.263	$0.2619^{+0.0091}_{-0.0093}$	$0.290^{+0.035}_{-0.035}$
$\Omega_b$	0.053	$0.0516^{+0.0095}_{-0.0088}$	$0.049^{+0.014}_{-0.015}$
$h$	0.746	$0.729^{+0.10}_{-0.097}$	$0.78^{+0.13}_{-0.14}$
$n_s$	0.955	$0.968^{+0.042}_{-0.042}$	$0.95^{+0.17}_{-0.17}$
$\sigma_8$	0.858	$0.860^{+0.016}_{-0.015}$	$0.898^{+0.042}_{-0.042}$
$m_\nu$	0.332	$0.25^{+0.17}_{-0.17}$	$0.66^{+0.36}_{-0.44}$
$f_{R_0}$	$-4.24 \cdot 10^{-5}$	$(-4.22^{+0.81}_{-0.98}) \cdot 10^{-5}$	$(-52^{+51}_{-61}) \cdot 10^{-6}$

**Thank you!**

**FREmu**

`pip install fremu`

Documentation: <https://astrobai.github.io/codes/fremu>

Source code: <https://github.com/AstroBai/FREmu>