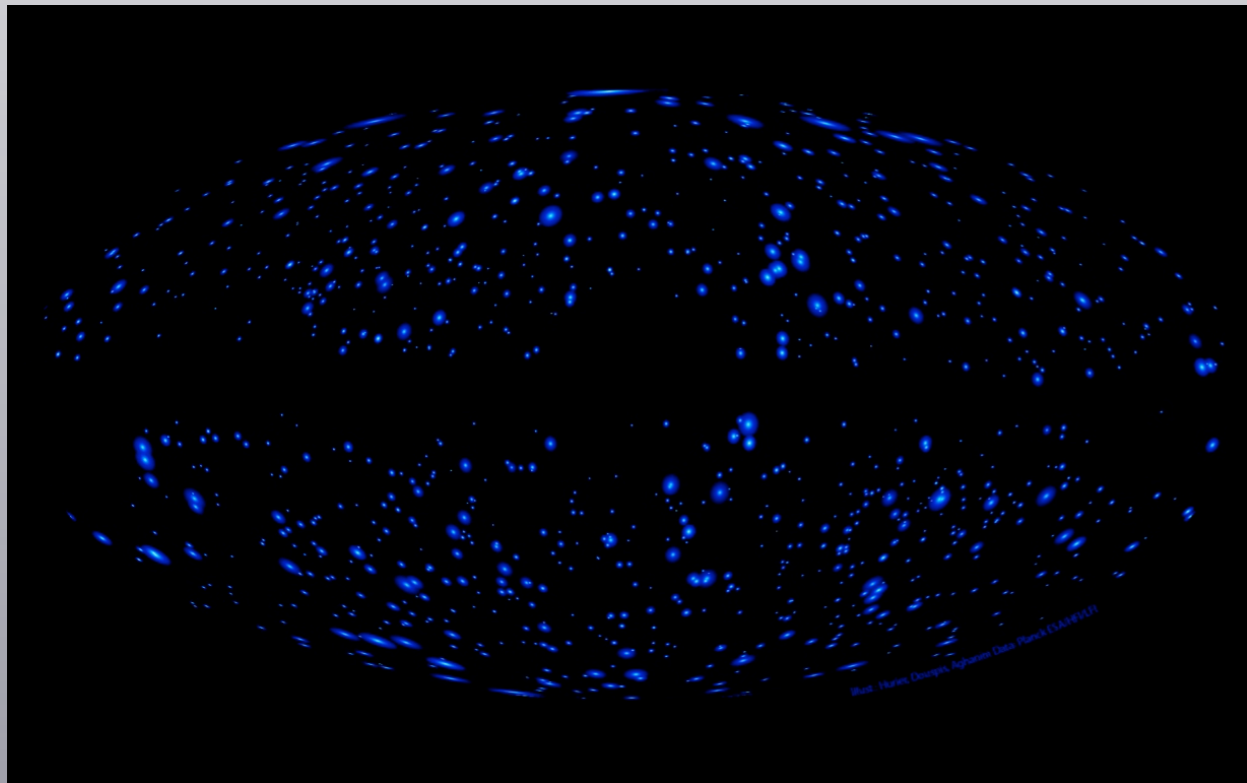


# Combining probes : cluster counts and galaxy power spectrum



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# Outline

**I. Covariance of galaxy spectrum and cluster counts**

**II. Results and Fisher analysis**

**III. Joint likelihood**

# I. Combining probes

$$\mathbf{X} = \begin{pmatrix} N_{\text{cl}} \\ C_{\ell}^{\text{gal}} \end{pmatrix}$$

$$\begin{aligned} & N_{\text{cluster}}(i_M, i_z) \\ & C_{\ell}^{\text{gal}}(i_z) \leftrightarrow 2\text{pcf} \end{aligned}$$

Motivations:

- increased constraints, can break degeneracies.
- mitigate super-sample covariance (SSC) on small scales.
- future : dark energy, modified gravity,  $f_{\text{NL}}$ .

$$\text{Cov}(\mathbf{X}, \mathbf{X}) = \begin{pmatrix} \text{Cov}(N_{\text{cl}}, N_{\text{cl}}) & \text{Cov}(N_{\text{cl}}, C_{\ell}^{\text{gal}}) \\ \text{Cov}(C_{\ell}^{\text{gal}}, N_{\text{cl}}) & \text{Cov}(C_{\ell}^{\text{gal}}, C_{\ell}^{\text{gal}}) \end{pmatrix}$$

# I. Covariance of the galaxy spectrum and cluster counts

Cluster count is the monopole of the halo density field

$$\hat{N}_{\text{cl}}(i_M, i_z) = \bar{N}_{\text{cl}}(i_M, i_z) + \frac{1}{\Omega_S} \int dM d^2\hat{n} dz r^2 \frac{dr}{dz} \frac{d^2 n_h}{dM dV} \delta_{\text{cl}}(\mathbf{x}, z | M, z)$$

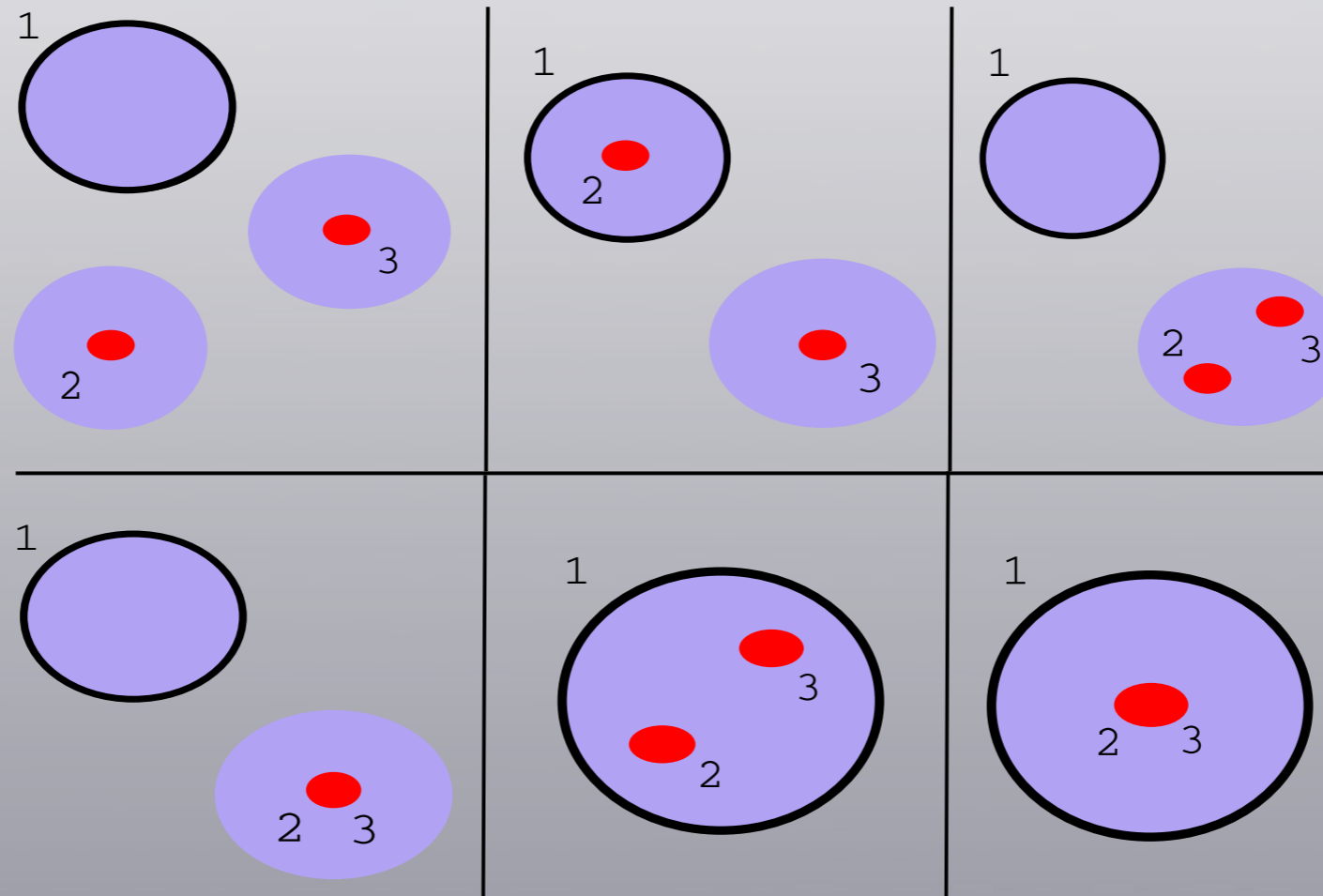
$$\text{Cov} \left( \hat{N}_{\text{cl}}(i_M, i_z), \hat{C}_\ell^{\text{gal}}(j_z, k_z) \right) = \int \frac{dM_1 dz_{123}}{4\pi} \frac{dV}{dz_1} \frac{d^2 n_h}{dM dV} \Big|_{M_1, z_1} b_{0\ell\ell}^{\text{hgg}}(M_1, z_{123})$$

Galaxy angular power spectrum between two redshift bins  
(in the following  $j_z = k_z$ )

Cluster count in a bin of mass ( $i_M$ ) and redshift ( $i_z$ )

Halo-galaxy-galaxy angular bispectrum

# I. Diagrammatic method for the hgg bispectrum

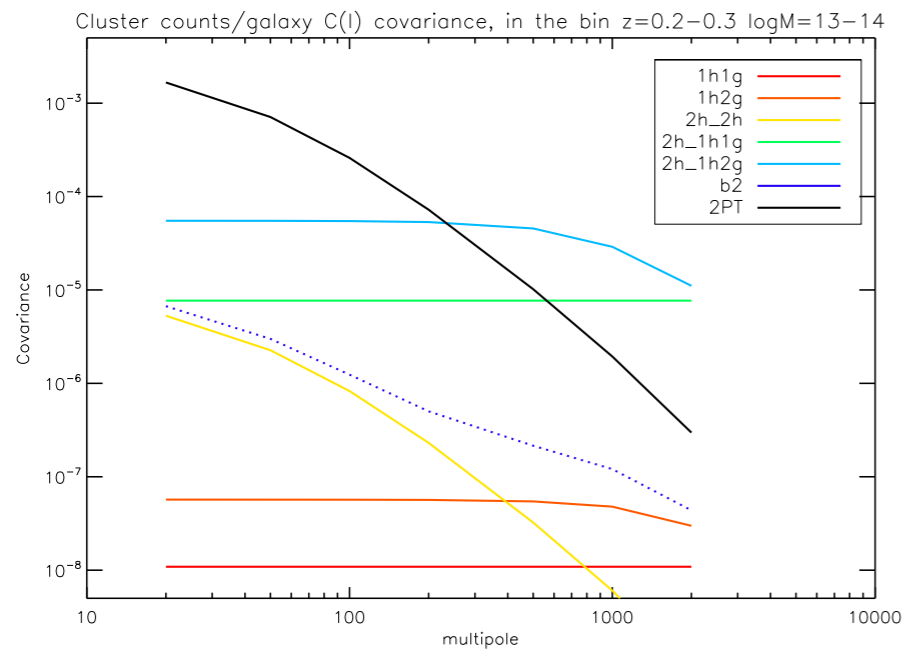


**Ex:** 
$$B_{\text{hgg}}^{2h-1h2g}(k_{123}|M_1, z_{123}) = \frac{\delta_{z_2, z_3}}{\bar{n}_{\text{gal}}^2(z_2)} \int dM \frac{d^2 n_h}{dM dV} \langle N_{\text{gal}}(N_{\text{gal}} - 1)(M) \rangle u(k_2|M) u(k_3|M) P_{\text{halo}}(k_1|M_1, M, z_1, z_2)$$

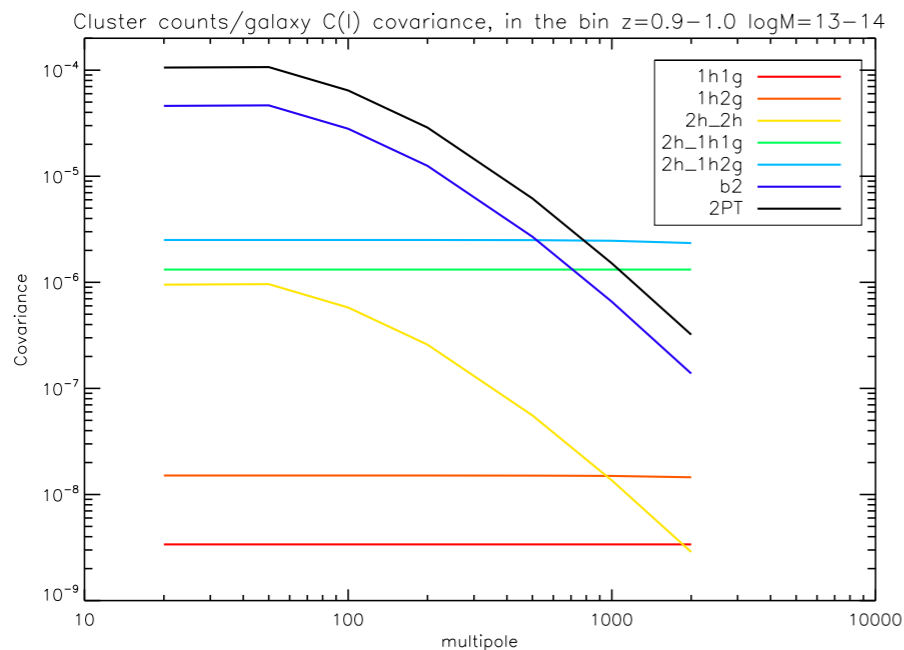
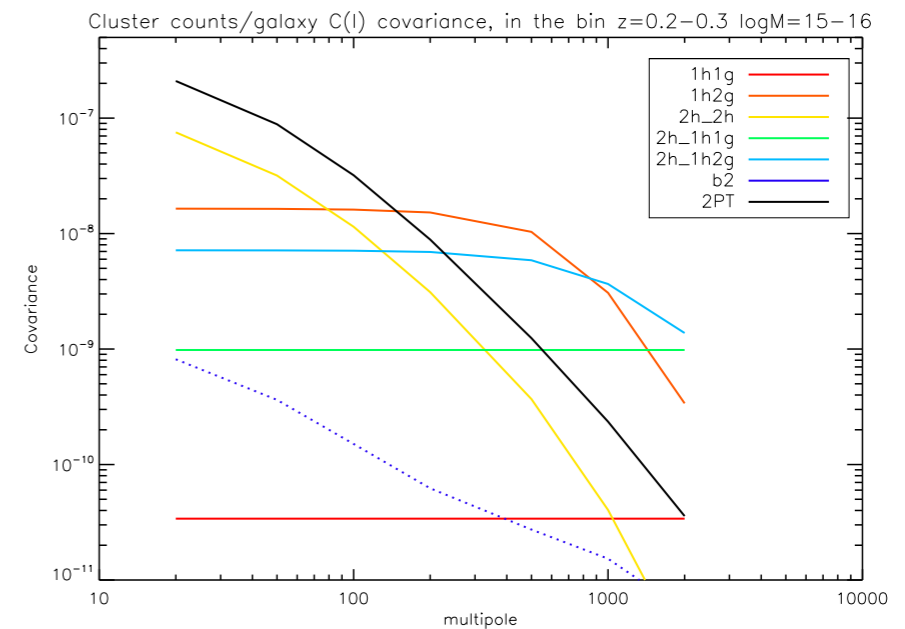
Ingredients : cosmology, halo model, Halo Occupation Distribution (HOD)

# II. Ideal results I : scale dependence of the covariance

1



2



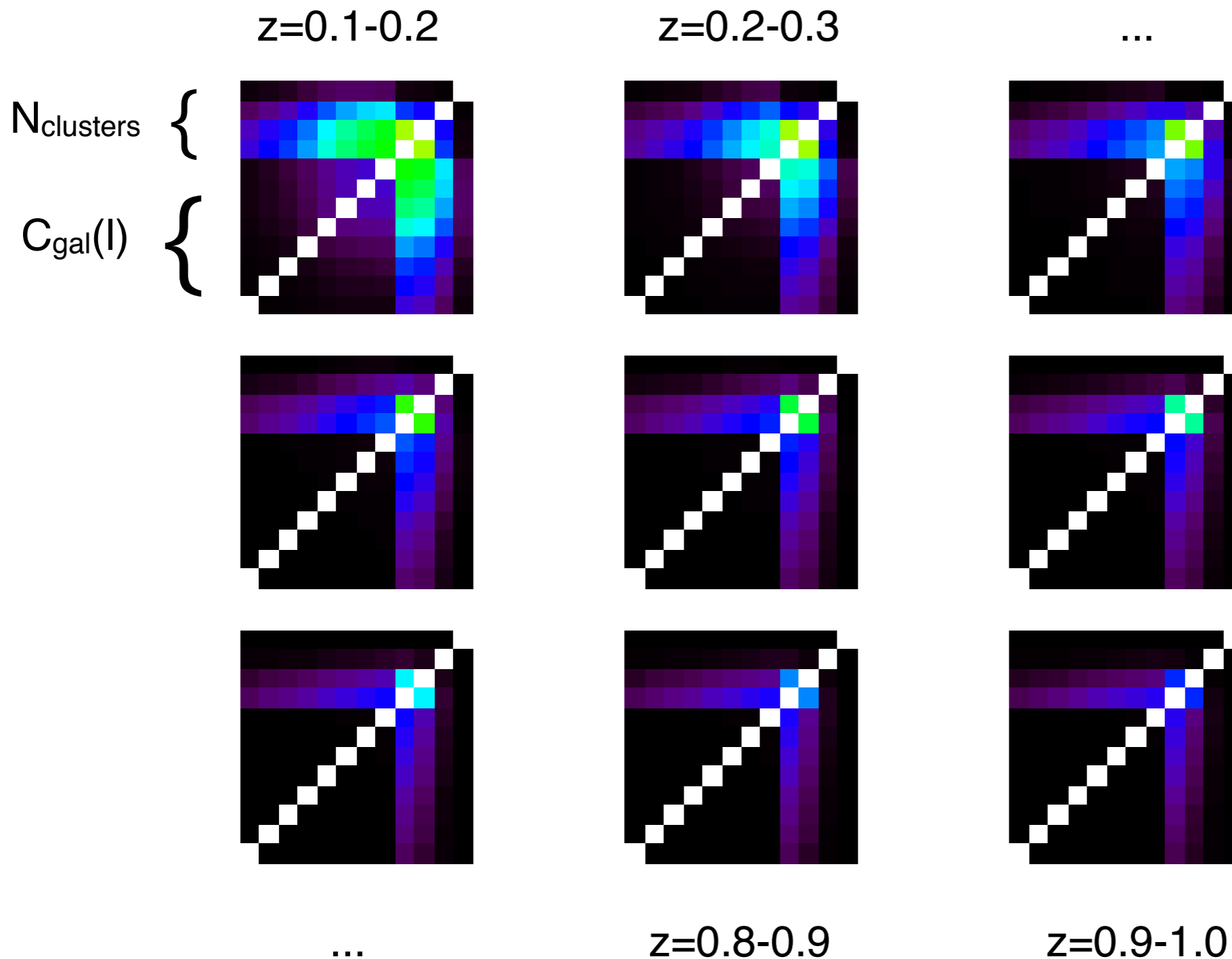
3

1 :  $z=0.2-0.3$  and  $\log(M/M_{\text{sun}}) = 13-14$

2 :  $z=0.2-0.3$  and  $\log(M/M_{\text{sun}}) = 15-16$

3 :  $z=0.9-1.0$  and  $\log(M/M_{\text{sun}}) = 13-14$

# II. Ideal results II : joint covariance matrix



9 z-bins  $z=0.1-1.0$

4 logM bins  
 $\log M = 14-16$

8 multipoles  
 $l=30-300$

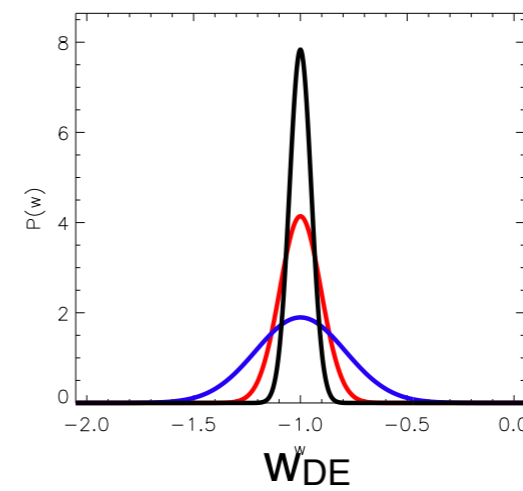
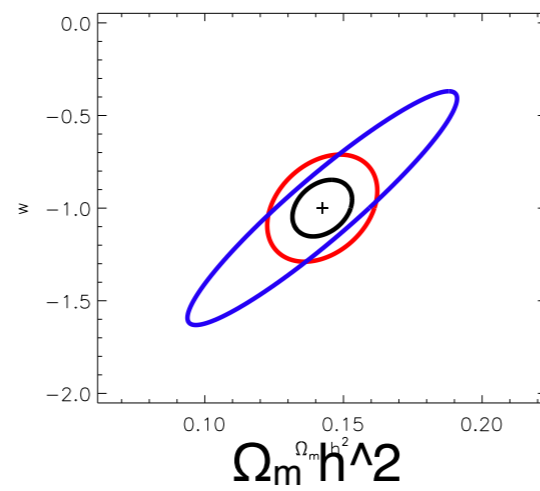
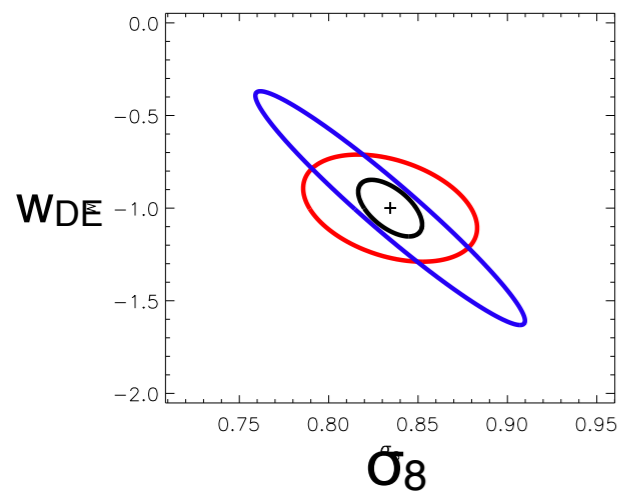
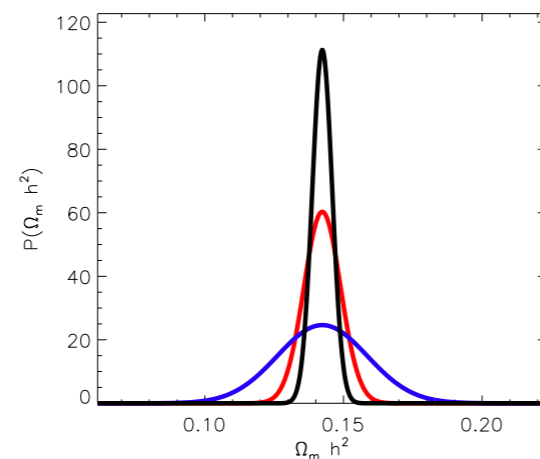
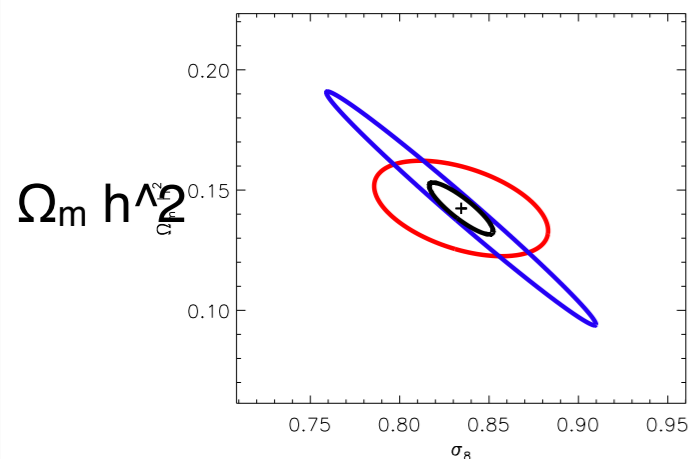
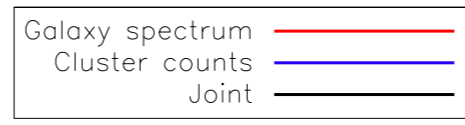
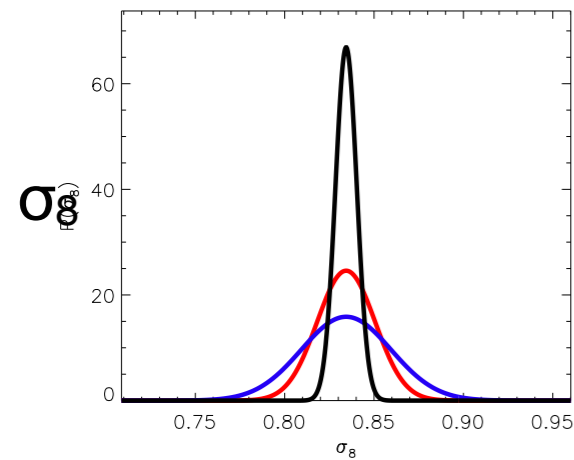
no photo-z errors,  
 purity nor  
 completeness

full cluster autocov  
 (shot-noise,  
 sample variance)

full crosscov

galaxy autocov :  
 Gaussian, SSC,  
 1h trispectrum

# II. Fisher analysis



after marginalisation  
over HOD parameters

$$S/N(C_{l}^{gal}) = S/N(N_{cl})$$

Joint constraints better  
than if probes were  
independent



# III. Joint likelihood

Cluster counts follow a Poisson distribution  
Galaxy correlation is more Gaussian

→ How to mix their likelihood ?  
(cannot assume that the joint likelihood is Gaussian)

Edgeworth / Gram-Charlier expansion

$$P(x) = \exp \left[ \sum_{n=1}^{+\infty} (\kappa_n(P) - \kappa_n(P_{\text{fidu}})) \frac{(-1)^n}{n!} \frac{d^n}{dx^n} \right] P_{\text{fidu}}(x)$$

Expand around independent case. Result :

$$\mathcal{L}(\text{counts}, C_\ell) = \exp \left[ - \sum_{ij} \langle c_i C_{\ell_j} \rangle_c (\log \bar{c}_i - \Psi(c_i + 1)) ({}^T C_\ell C^{-1} e_j) \right] \mathcal{L}(\text{counts}) \mathcal{L}(C_\ell)$$

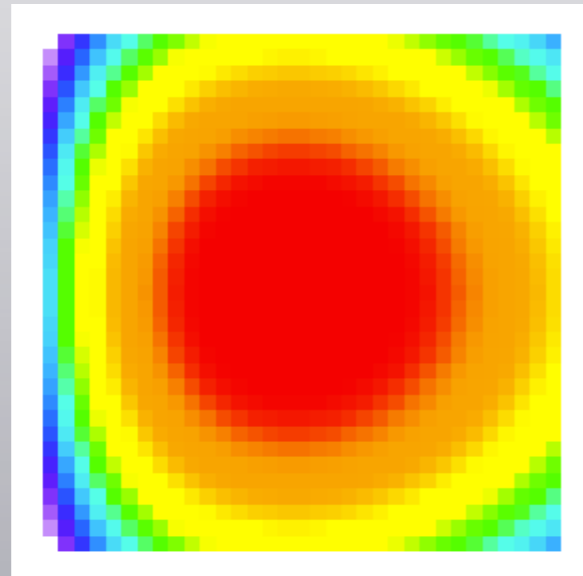
# III. Joint likelihood : functional form

without correlation

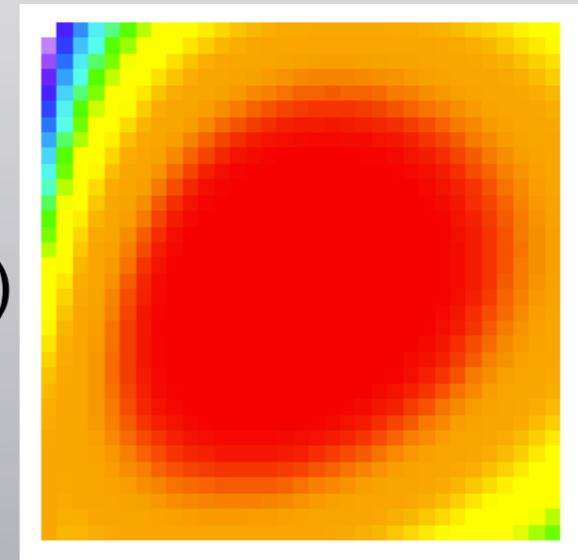
with correlation

$\langle N_{\text{clust}} \rangle = 16$

C(I)



C(I)

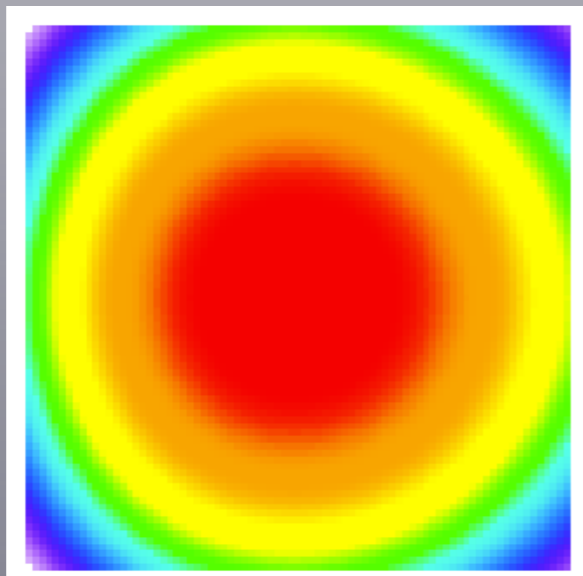


0 counts 20

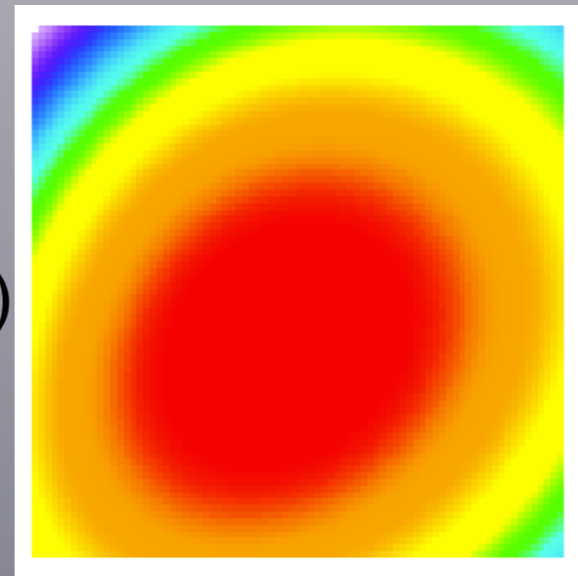
0 counts 20

$\langle N_{\text{clust}} \rangle = 100$

C(I)



C(I)



60 counts 140

60 counts 140

## B. Joint likelihood : conclusions / perspectives

- valid to combine any Gaussian and Poisson observables

(e.g. weak-lensing/counts)

- large counts and small crosscov limit :  
Gaussian with correct covariance matrix

- extended to include cluster sample covariance

- inclusion of Bayesian hyperparameters  
→ robustness to tension and error estimates  
(in progress)

# Conclusions

- Cluster counts - galaxy spectrum cross-covariance with a diagrammatic formalism
- Full non-linear model is needed : HM+HOD
- Cross-covariance is not negligible and creates a synergy between the probes
- Joint non-Gaussian likelihood
- Future : MC pipeline for realistic forecast and application to DES data

Thanks for your attention

# Super-sample covariance

Reaction of observable to long wavelength modes (=background change)

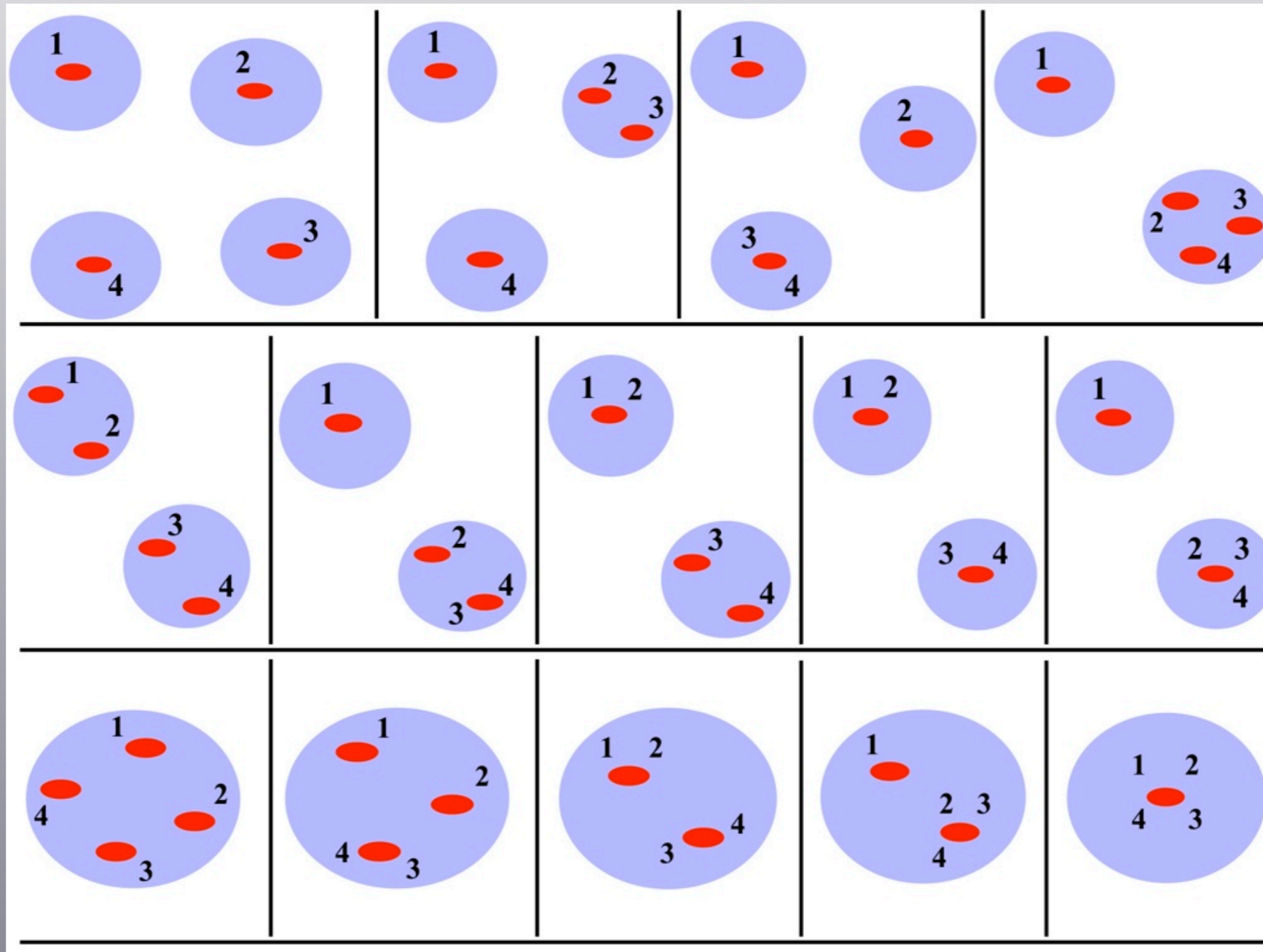
$$\text{Cov}_{\text{SSC}}(C_\ell(i_z), C_{\ell'}(j_z)) = \int dV_1 dV_2 \frac{\bar{n}_{\text{gal}}(z_1)^2 \bar{n}_{\text{gal}}(z_2)^2}{\Delta N_{\text{gal}}(i_z)^2 \Delta N_{\text{gal}}(j_z)^2} \frac{\partial P_{\text{gal}}(k_\ell)}{\partial \delta_b} \frac{\partial P_{\text{gal}}(k_{\ell'})}{\partial \delta_b} \sigma_{\text{proj}}^2(z_1, z_2)$$

$$\text{Cov}_{\text{SSC}}(\hat{N}_{\text{cl}}(i_M, i_z), \hat{C}_\ell(j_z)) = \int \frac{dV_{12} \bar{n}_{\text{gal}}(z_2)^2}{\Delta N_{\text{gal}}(j_z)^2} \frac{\partial n_h}{\partial \delta_b}(i_M, z_1) \frac{\partial P_{\text{gal}}(k_\ell | z_2)}{\partial \delta_b} \sigma_{\text{proj}}^2(z_1, z_2)$$

Covariance of the density monopole (between two redshifts)



# Diagrams for the galaxy trispectrum



# Halo-galaxy-galaxy bispectrum : from 3D to 2D

$$b_{0\ell\ell}^{\text{hgg}}(M_1, z_{123}) = \frac{\delta(z_2 - z_3)}{r_2^2 \frac{dr}{dz_2}} \frac{2}{\pi} \int k_1^2 dk_1 B_{\text{hgg}}(k_1, k_2^*, k_2^* | M_1, z_1, z_2, z_2) j_0(k_1 r_1) j_0(k_1 r_2) \quad \text{with} \quad k_2^* = \frac{\ell + 1/2}{r(z_2)}$$

angular bispectrum

3D bispectrum

Bessel functions

Limber's approximation on  $k_2$  and  $k_3$   
(bispectrum varies slowly compared to bessel's oscillations)

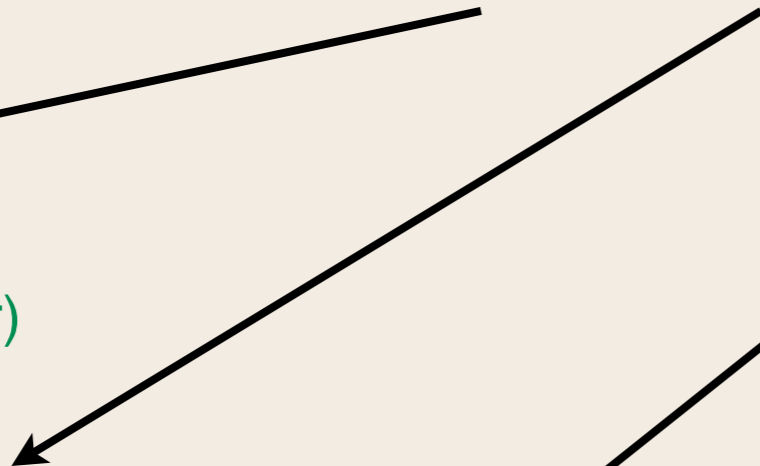


# Ingredients

$$B_{\text{hgg}}^{2h-1h2g}(k_{123}|M_1, z_{123}) = \frac{\delta_{z_2, z_3}}{\bar{n}_{\text{gal}}^2(z_2)} \int dM \frac{d^2 n_h}{dM dV} \langle N_{\text{gal}}(N_{\text{gal}} - 1)(M) \rangle u(k_2|M) u(k_3|M) P_{\text{halo}}(k_1|M_1, M, z_1, z_2)$$



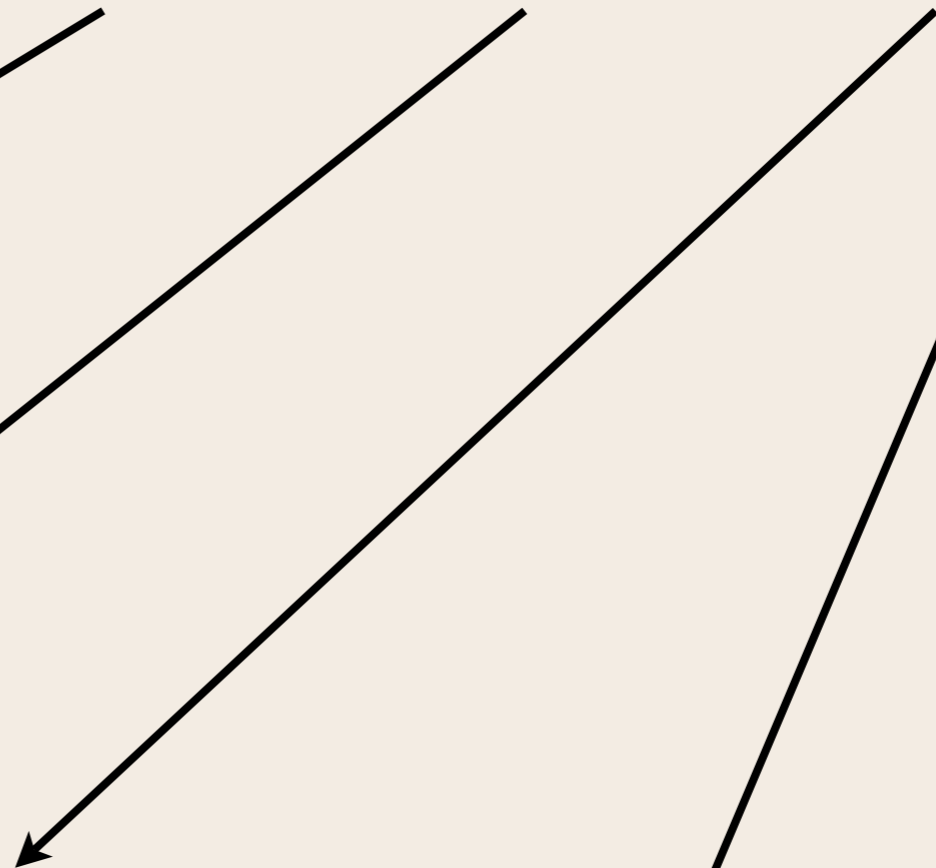
halo mass function  
(Sheth&Tormen or Tinker)



Halo Occupation Distribution  
(Tinker&Wetzel 2010)



halo profile  
(NFW)



halo bias  
(Tinker : 1, Sheth&Tormen : 1&2)

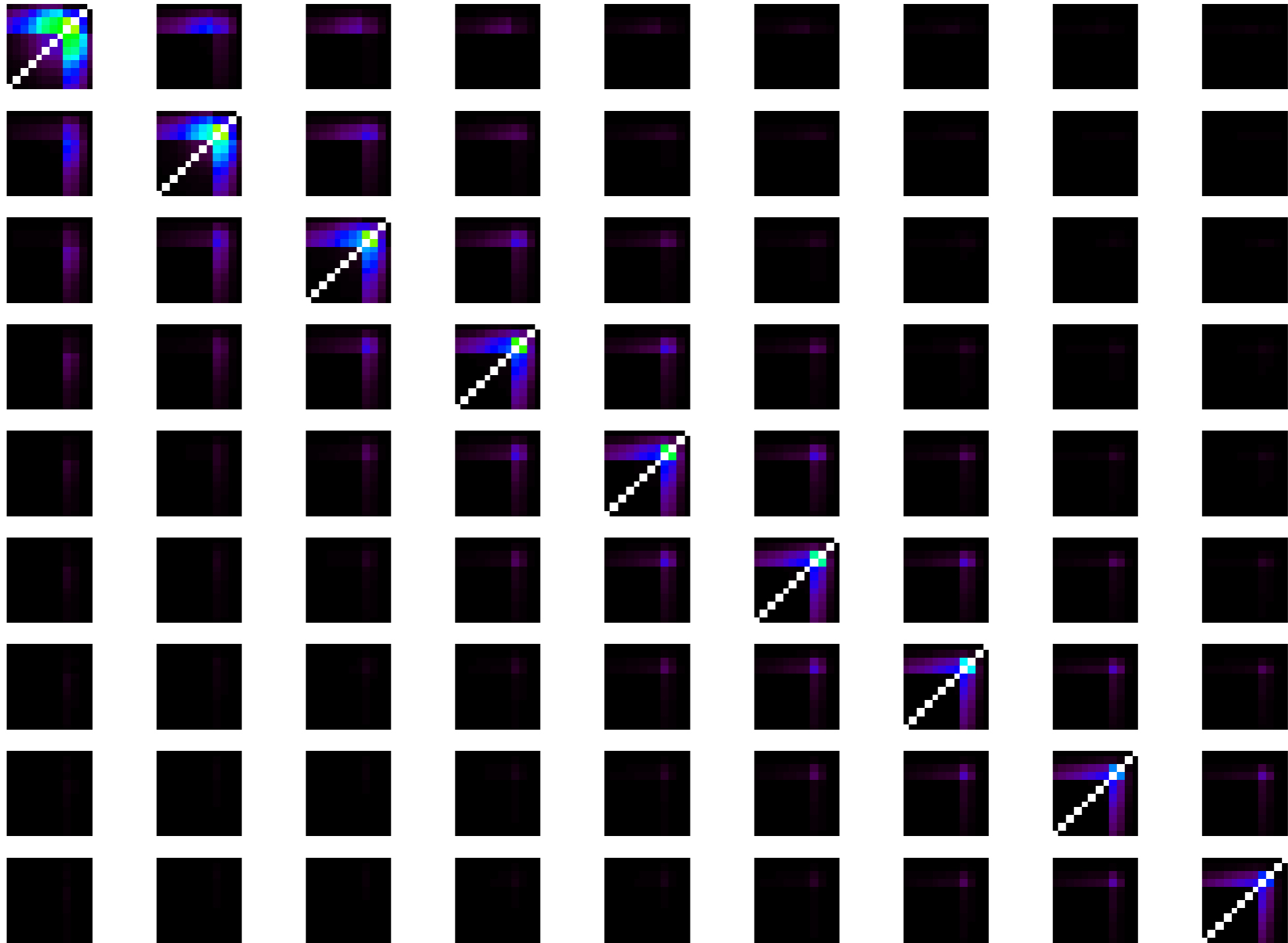


matter power spectrum  
(Eisenstein&Hu 98)

+ cosmology

(growth function, comoving volume...)

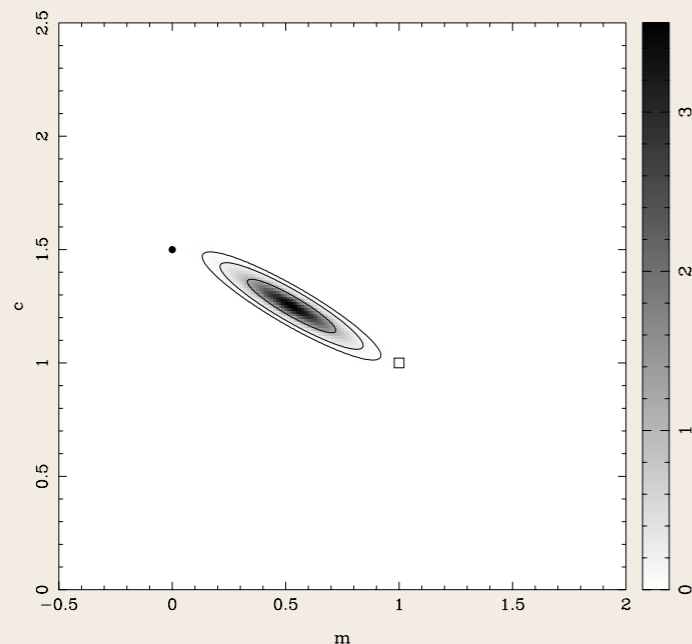
# Counts - gal spectrum covariance, with cross-redshifts



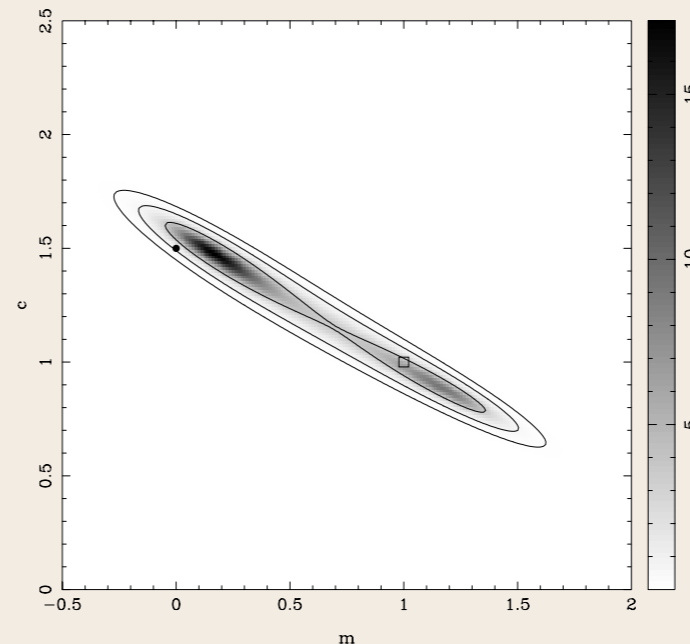
# Bayesian hyperparameters

- Statistical method allowing to detect underestimation of error bars or inconsistencies between data sets

without HP



with HP



Hobson et al. 2002

- Idea : rescale error bars  
one rescaling parameter per data set. These parameters are included in the MCMC exploration. Then marginalise over them.
- Only done for Gaussian distribution at the moment

# Hyperparameters for a Poisson distribution

- not possible to satisfy all the properties of the Gaussian case (i.e. keep the mean but rescale the variance)
- two possible approximate prescriptions with a good asymptotic behaviour

