

VINCENZO F. CARDONE

# WEAK LENSING

V Euclid Italia Meeting - 24 Febbraio 2022



# Current WLSWG Activities

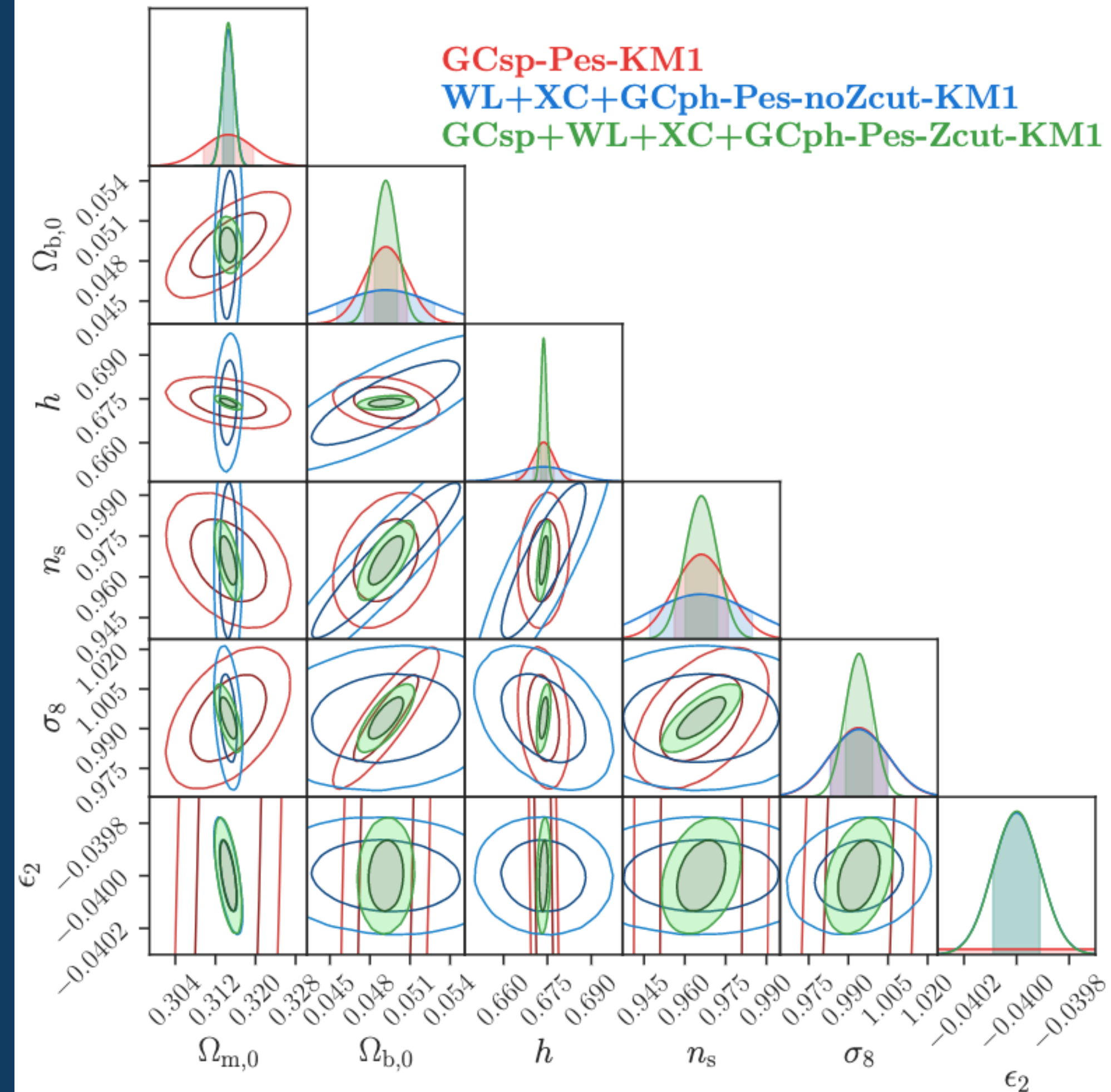
ONLY THOSE WITH ITALIAN PARTICIPATION

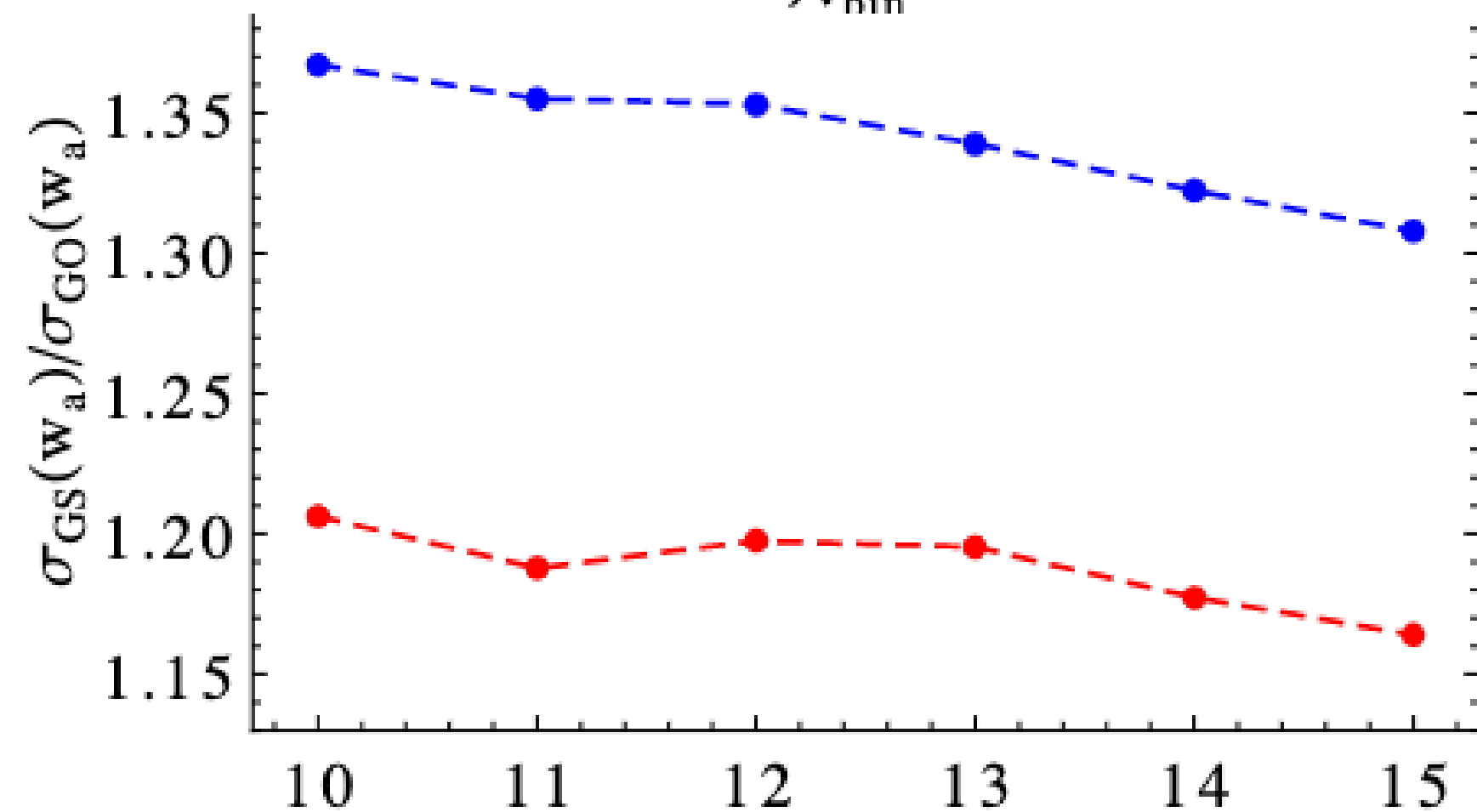
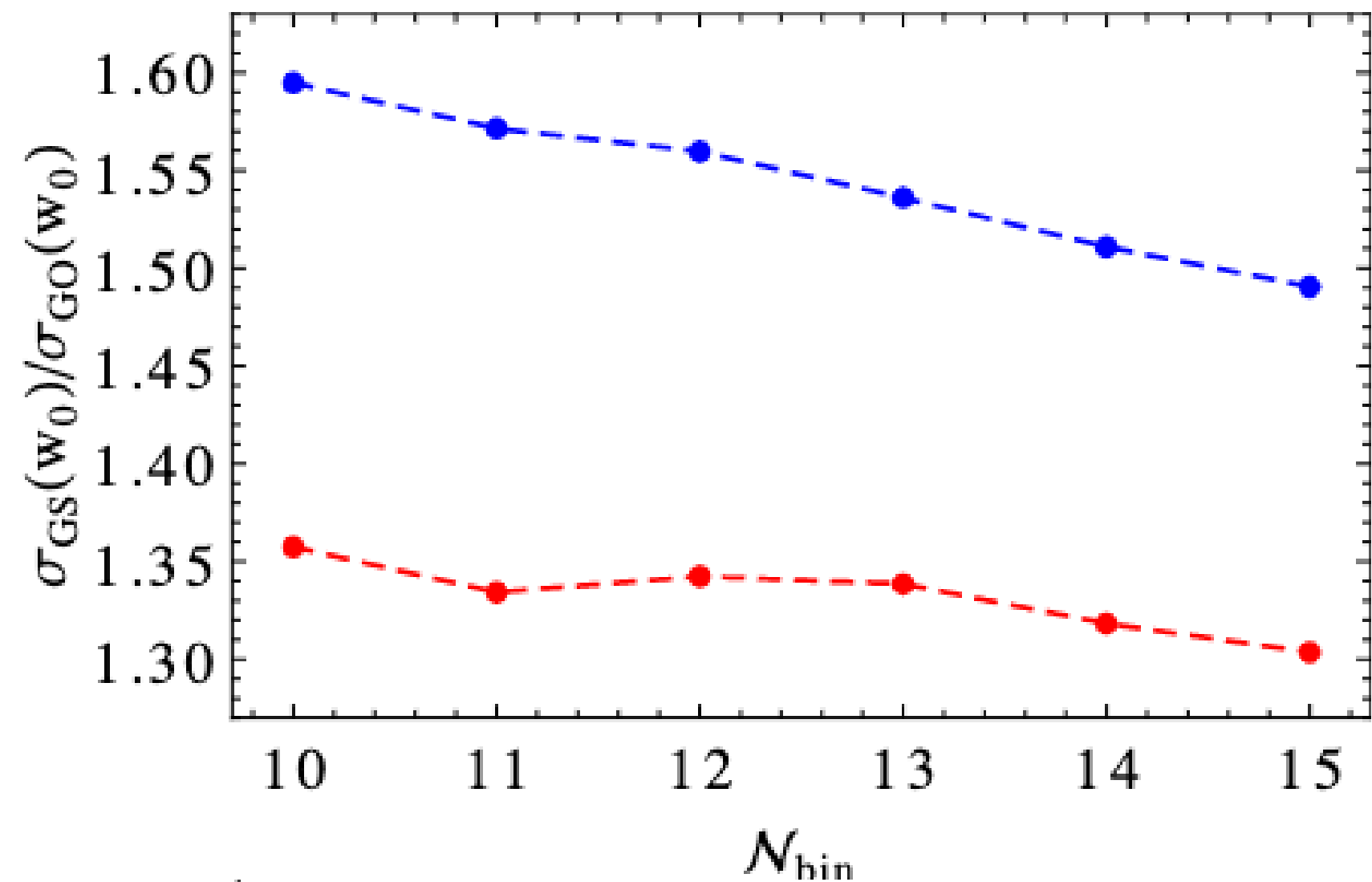
- Forecasts for extended models (jointly with TWG)
- E2E pipeline to evaluate the impact of systematics
- High Order Statistics (HOWLs Key Project)
- Weak Lensing simulations (see Carlo Giocoli talk)

# Forecasts for MG

## SCALE INDEPENDENT MODELS

- three cases: *DGP*, *JBD*, *k - mouflage*
- two different sets of fiducial parameters
  - consistent with Planck data
  - quasi LCDM
- *3x2pt + GCsp*
  - quasilinear/nonlinear
  - pessimistic/optimistic
  - single/joint





## FORECASTS FOR DARK MATTER

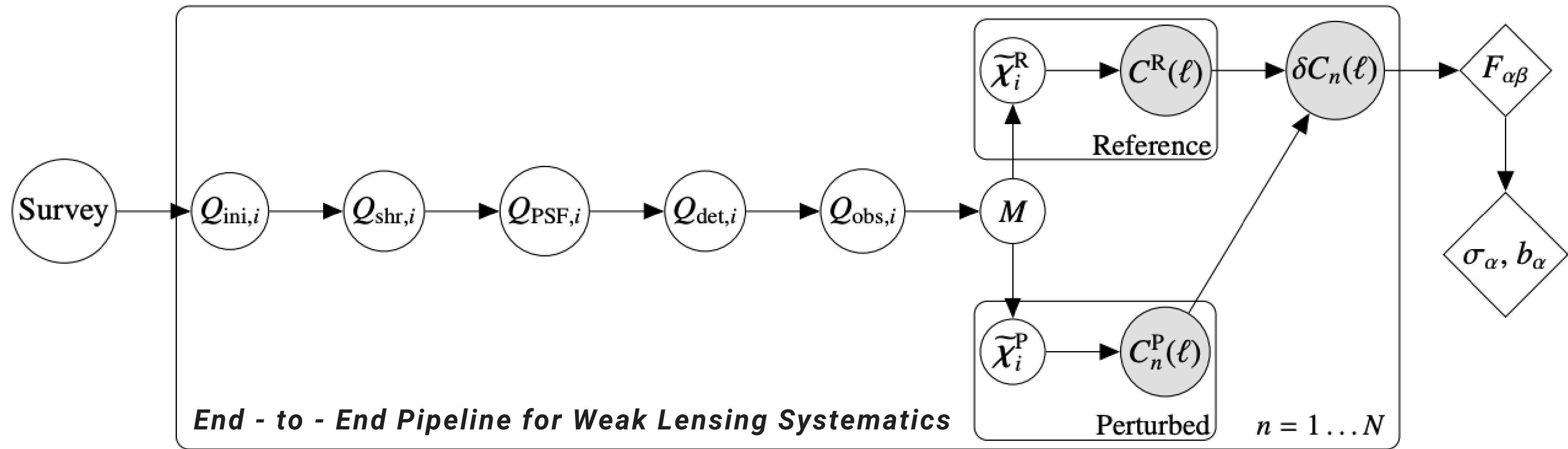
- massive neutrinos (both in GR and MG)
- particle dark matter
- generalised dark matter models
- primordial black holes

## SUPER SAMPLE COVARIANCE

- impact of SSC on 3x2pt forecasts
- included in 6x2pt forecasts (see M. Carbone talk)
- Gaussian + SSC covariance (see C. Giocoli talk)

## ITALIAN PARTICIPATION

- WP leads: Maria Archidiacono, Stefano Camera
- Key Project Paper leads: M. Bonici, D. Sciotti
- Participating: M. Bonici, C. Carbone, V.F. Cardone, C. Giocoli, M. Martinelli, F. Pace, G. Parimbelli, D. Sciotti



### AIM

evaluate the impact of residual systematics

### METHOD

emulate moments  
estimate adding systematics

### REMOVE

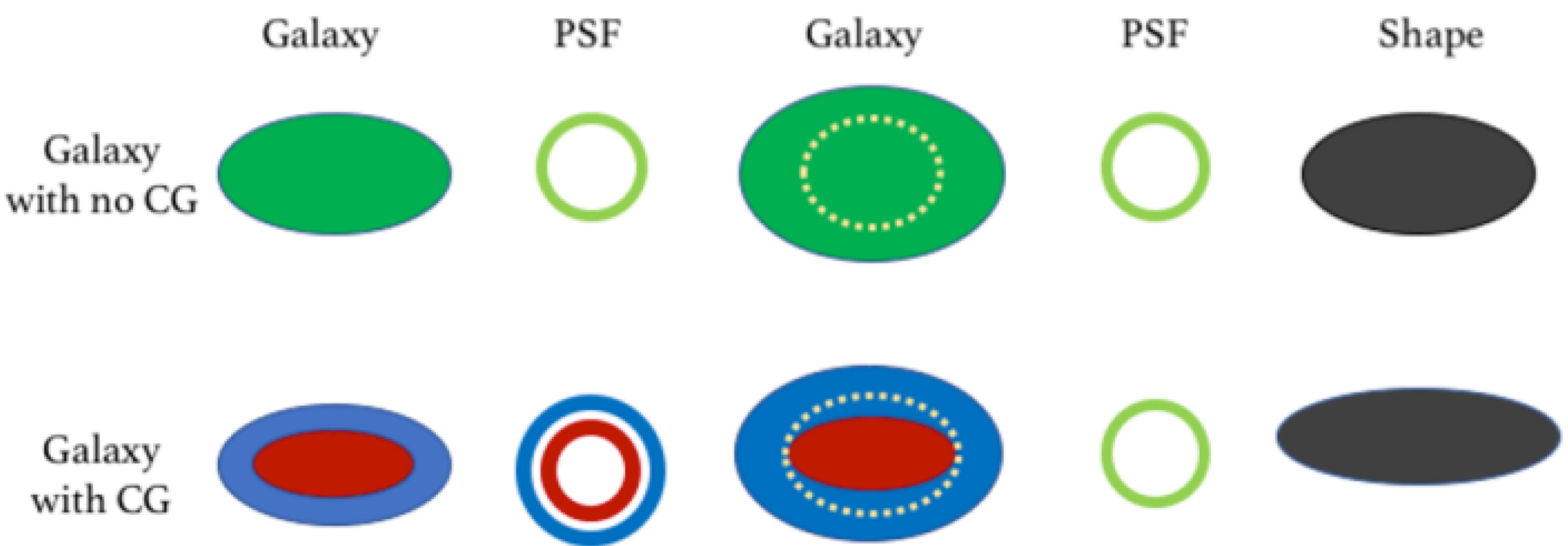
use a fiducial model to remove systematics

### PERTURB

remove systematics with a perturbed model

### BIAS

compare with the correct model and find bias



### ITALY AND E2E

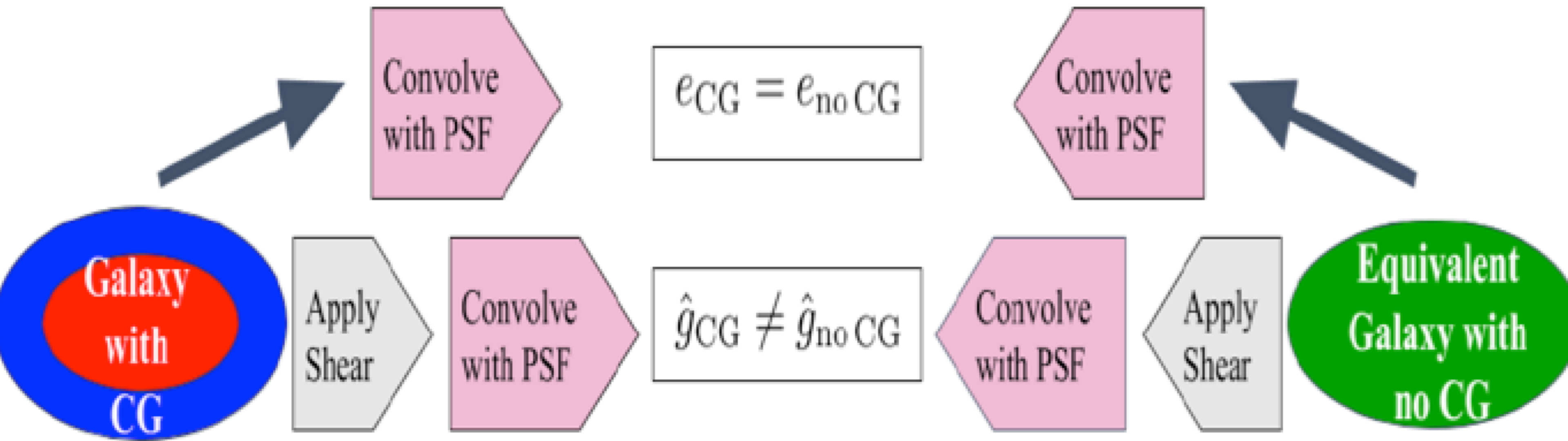
fiducial and perturbed  
model for color gradient  
bias correction

### CG BIAS

wavelength dependent  
PSF and spatially varying  
galaxy SED

### CALIBRATION

method tested on  
simulated galaxies and  
validated on HST images



### CG GALAXY

emulate analytic galaxy according to a B+D model

### EUCLIDIZE

simulate galaxy as would be detected by Euclid VIS

### NO CG GAL

same shape but without spatially varying SED

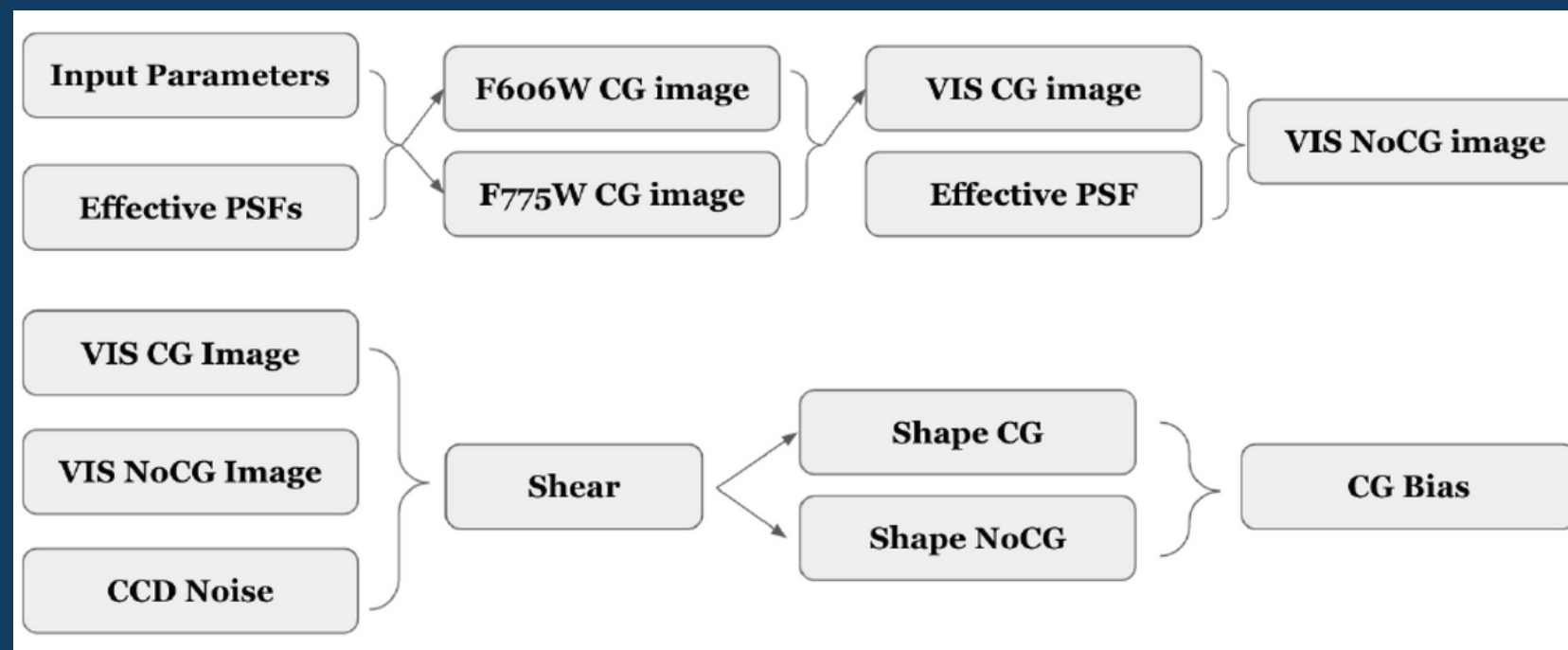
### SHEAR

apply shear to both galaxies and measure shape

### BIAS

compare the shape to measure CG bias

# Color Gradient Bias Calibration



## CG BIAS PIPELINE

- input galaxy model from RAGE catalog
- PSF and noise as for Euclid VIS
- simulate galaxies with GalSim
- different shape measurement methods

## CG BIAS CORRECTION

- CG bias as function of (S/N, z, log L)
- radial basis function interpolation
- fulfilling Euclid requirements
- validation in course with HST galaxies

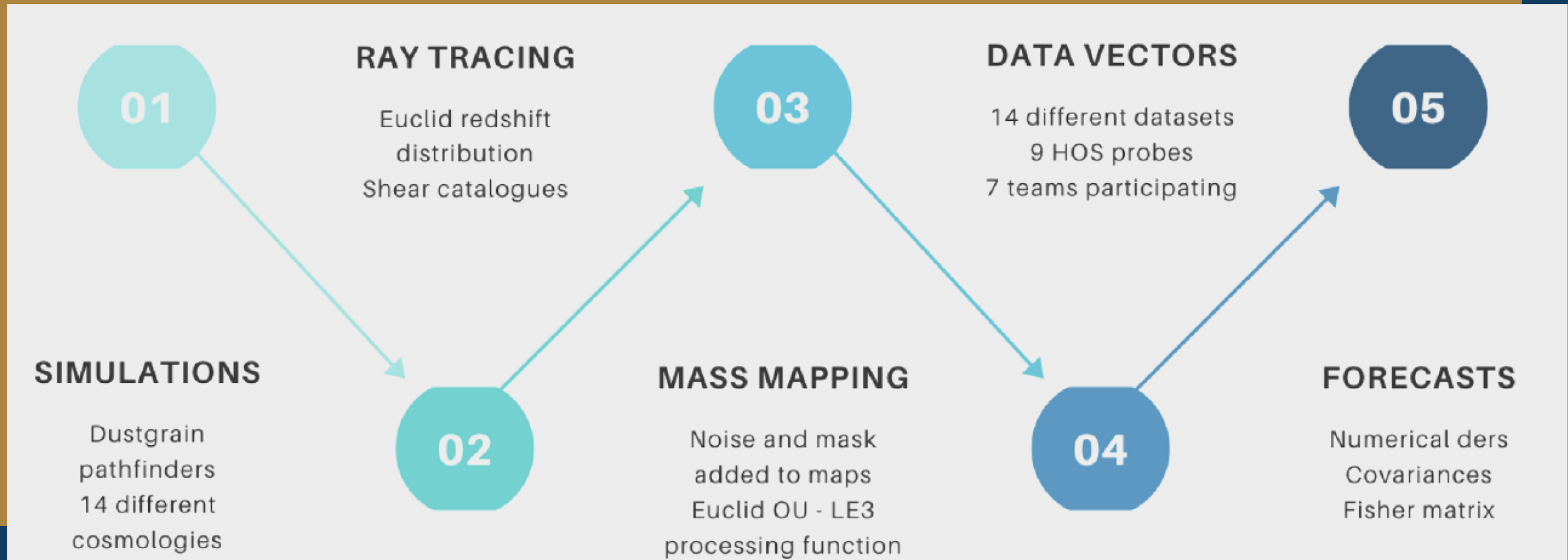
$$m(\mathbf{x}_1, \mathbf{x}_2) = \sum_{i=1}^{N_{\text{RBF}}} \omega_i \phi(\epsilon, \mathbf{r}_i)$$

$$\mathbf{r}_i = \left[ (\mathbf{x}_1 - \mathbf{x}_1^i)^2 + (\mathbf{x}_2 - \mathbf{x}_2^i)^2 \right]^{1/2}$$

$$\phi(\epsilon, \mathbf{r}) = e^{-\epsilon^2 \mathbf{r}^2}; \quad \phi(\epsilon, \mathbf{r}) = (1 + \epsilon^2 \mathbf{r}^2)^{-1}; \quad \phi(\epsilon, \mathbf{r}) = (1 + \epsilon^2 \mathbf{r}^2)^{-1/2}; \quad \phi(\epsilon, \mathbf{r}) = (1 + \epsilon^2 \mathbf{r}^2)^{1/2}$$



# HOWLS - Higher Order Statistics in Weak Lensing



- Key Project of the WLSWG
- Joint project of the Mass Mapping and High Order Statistics WP
- Also involves WL Simulations WP (see C. Giocoli talk)

# HOWLS in four steps

## SIMULATIONS

- 14 different cosmologies with DUSTGRAIN
- 928 LCDM maps from SLICS
- shear catalogues
- convergence maps with Euclid KS code

## MEASUREMENT

- Betti numbers
- Convergence PDF
- Homology heatmaps
- Mass aperture 3pCF
- Minkowski functionals
- Scattering transform

## DERIVATIVES

- 3 points stencil with 4% step
- 3 points stencil with 16% step
- linear unweighted fit
- linear weighted fit

## FORECASTS

- three parameters varied ( $\Omega_m$ ,  $w_0$ ,  $\sigma_8$ )
- Fisher matrix method
- covariance matrix from SLICS sims
- checking whether the likelihood is Gaussian
- impact of sampling and specifics cut
- estimate of errors on errors

*Italian members: M. Baldi, M. Carbone, V.F. Cardone, C. Giocoli, M. Vicinanza, S. Vinciguerra*

# HOWLS - Fisher Matrix Forecasts

Table 1: HOWLS step 3 forecasts for *Euclid* mocks rescaled to a 15000 deg<sup>2</sup> area. Covariance computed from 924 SLICS realizations, model from 128 × 6 DUSTGRAIN realizations. Only bins with skewness and kurtosis lower than 0.25 across the SLICS are retained.

cosmo	configuration	scale	probes	$\delta w_0$	$\delta \sigma_8$	$\delta \Omega_m$
16 %	ks_nomask_shear	2.34	Minkowski_Simone	1.93 %	0.63 %	1.34 %
-	-	-	-	-	0.55 %	1.12 %
16 %	ks_nomask_shear	2.34	Betti_Simone	2.64 %	1.15 %	2.30 %
-	-	-	-	-	0.79 %	1.50 %
16 %	ks_nomask_shear	2.34	Peaks_Sandrine	17.99 %	3.88 %	7.93 %
-	-	-	-	-	2.32 %	4.34 %
16 %	ks_nomask_shear	4.69	PDF_Cora	-	-	-
-	-	-	-	-	-	-
16 %	ks_nomask_shear	-	kappa2PCF_Simone	93.47 %	22.51 %	26.09 %
-	-	-	-	-	1.81 %	3.11 %
16 %	ks_nomask_shear	2.34	Moments_Simone	-	-	-
-	-	-	-	-	-	-
16 %	ks_nomask_shear	4.69	Moments_Cora	-	-	-
-	-	-	-	-	-	-
16 %	ks_nomask_shear	2.34	ST_Sihao	7.18 %	2.02 %	4.26 %
-	-	-	-	-	1.72 %	3.64 %
16 %	ks_nomask_shear	-	shear2PCF_Nicolas	-	-	-
-	-	-	-	-	-	-
16 %	ks_nomask_shear	-	Map3_LailaSven	-	-	-
-	-	-	-	-	-	-
16 %	ks_nomask_shear	2.34	Betti_Sven	2.52 %	0.77 %	1.49 %
-	-	-	-	-	0.67 %	1.37 %
16 %	ks_nomask_shear	2.34	Heatmap_Sven	10.67 %	5.84 %	6.94 %
-	-	-	-	-	5.65 %	6.92 %
16 %	ks_nomask_shear	-	Map_Lucas	8.40 %	4.00 %	7.68 %
-	-	-	-	-	2.80 %	5.65 %

Table 2: Same as Table 1 without the skewness/kurtosis cut.

probes	$\delta w_0$	$\delta \sigma_8$	$\delta \Omega_m$
Minkowski_Simone	1.51 %	0.54 %	1.17 %
-	-	0.49 %	1.04 %
Betti_Simone	2.15 %	0.86 %	1.68 %
-	-	0.67 %	1.26 %
Peaks_Sandrine	1.30 %	0.40 %	0.73 %
-	-	0.33 %	0.65 %
PDF_Cora	1.17 %	0.46 %	0.77 %
-	-	0.45 %	0.70 %
kappa2PCF_Simone	3.68 %	0.78 %	1.07 %
-	-	0.56 %	0.92 %
Moments_Simone	2.79 %	0.33 %	1.19 %
-	-	0.30 %	0.70 %
Moments_Cora	2.68 %	0.27 %	1.09 %
-	-	0.25 %	0.65 %
ST_Sihao	2.51 %	0.63 %	1.23 %
-	-	0.44 %	0.74 %
shear2PCF_Nicolas	3.11 %	0.39 %	0.52 %
-	-	0.37 %	0.50 %
Map3_LailaSven	3.77 %	1.15 %	2.65 %
-	-	0.73 %	1.56 %
Betti_Sven	1.32 %	0.39 %	0.73 %
-	-	0.34 %	0.64 %
Heatmap_Sven	1.50 %	0.72 %	1.14 %
-	-	0.57 %	0.89 %
Map_Lucas	1.24 %	0.24 %	0.41 %
-	-	0.15 %	0.33 %

Table 3: Same as Table 2 for probed combined with shear2PCF\_Nicolas.

cosmo	configuration	scale	probes	$\delta w_0$	$\delta \sigma_8$	$\delta \Omega_m$
16 %	ks_nomask_shear	-	shear2PCF_Nicolas	3.11 %	0.39 %	0.52 %
-	-	-	-	-	0.37 %	0.50 %
16 %	ks_nomask_shear	2.34	Minkowski_Simone	1.05 %	0.29 %	0.42 %
-	-	-	-	-	0.29 %	0.40 %
16 %	ks_nomask_shear	2.34	Betti_Simone	1.30 %	0.30 %	0.44 %
-	-	-	-	-	0.30 %	0.43 %
16 %	ks_nomask_shear	2.34	Peaks_Sandrine	1.05 %	0.25 %	0.42 %
-	-	-	-	-	0.22 %	0.36 %
16 %	ks_nomask_shear	4.69	PDF_Cora	0.90 %	0.29 %	0.42 %
-	-	-	-	-	0.29 %	0.41 %
16 %	ks_nomask_shear	-	kappa2PCF_Simone	2.71 %	0.36 %	0.44 %
-	-	-	-	-	0.32 %	0.44 %
16 %	ks_nomask_shear	2.34	Moments_Simone	1.42 %	0.21 %	0.35 %
-	-	-	-	-	0.21 %	0.34 %
16 %	ks_nomask_shear	4.69	Moments_Cora	1.36 %	0.17 %	0.31 %
-	-	-	-	-	0.16 %	0.30 %
16 %	ks_nomask_shear	2.34	ST_Sihao	1.54 %	0.29 %	0.47 %
-	-	-	-	-	0.28 %	0.41 %
16 %	ks_nomask_shear	-	Map3_LailaSven	1.16 %	0.26 %	0.44 %
-	-	-	-	-	0.19 %	0.32 %
16 %	ks_nomask_shear	2.34	Betti_Sven	1.07 %	0.24 %	0.40 %
-	-	-	-	-	0.22 %	0.35 %
16 %	ks_nomask_shear	2.34	Heatmap_Sven	1.12 %	0.31 %	0.47 %
-	-	-	-	-	0.29 %	0.42 %
16 %	ks_nomask_shear	-	Map_Lucas	0.94 %	0.19 %	0.32 %
-	-	-	-	-	0.13 %	0.24 %

- *single probes*: no HOS tool particularly better than the others
- *HOS + shear 2PCF*: up to a factor 2 improvement of the error on  $w_0$
- some additional work needed to optimise binning and smooting

# From Noise in Derivatives to Errors on Errors

- Marginalized errors

$$\sigma^2(\Omega_M) = \frac{F_{22} F_{33} - F_{23}^2}{\det(F)} \quad \sigma^2(w_0) = \frac{F_{11} F_{33} - F_{13}^2}{\det(F)} \quad \sigma^2(\sigma_8) = \frac{F_{11} F_{22} - F_{12}^2}{\det(F)}$$

- fisher matrix elements ( $i = \{1, 2, 3\}$  for  $\{\Omega_M, w_0, \sigma_8\}$ )

$$F_{ij} = \left( \frac{\partial D_{HOS}}{\partial p_i} \right)^T \cdot \Psi \cdot \left( \frac{\partial D_{HOS}}{\partial p_j} \right)$$

- $D_{HOS}$  = HOS data vector,  $\Psi = \{\text{Cov}[D_{HOS}]\}^{-1}$  (inverse covariance)
- Derivatives from 3pt stencil method

$$\frac{\partial D_{HOS}}{\partial p_i} \simeq \frac{D_{HOS}[p_i^{fid}(1+\epsilon)] - D_{HOS}[p_i^{fid}(1-\epsilon)]}{2\epsilon p_i^{fid}}$$

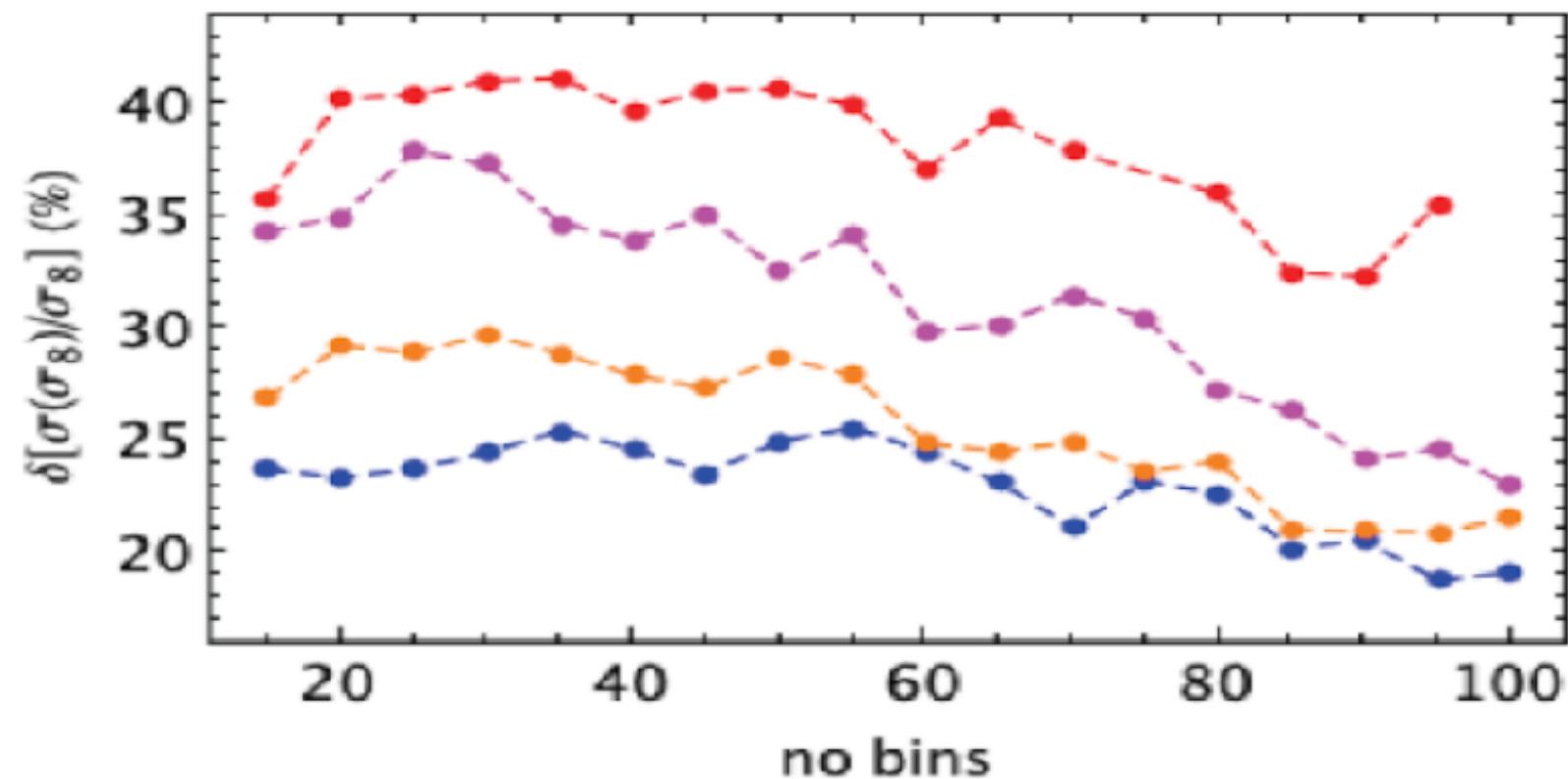
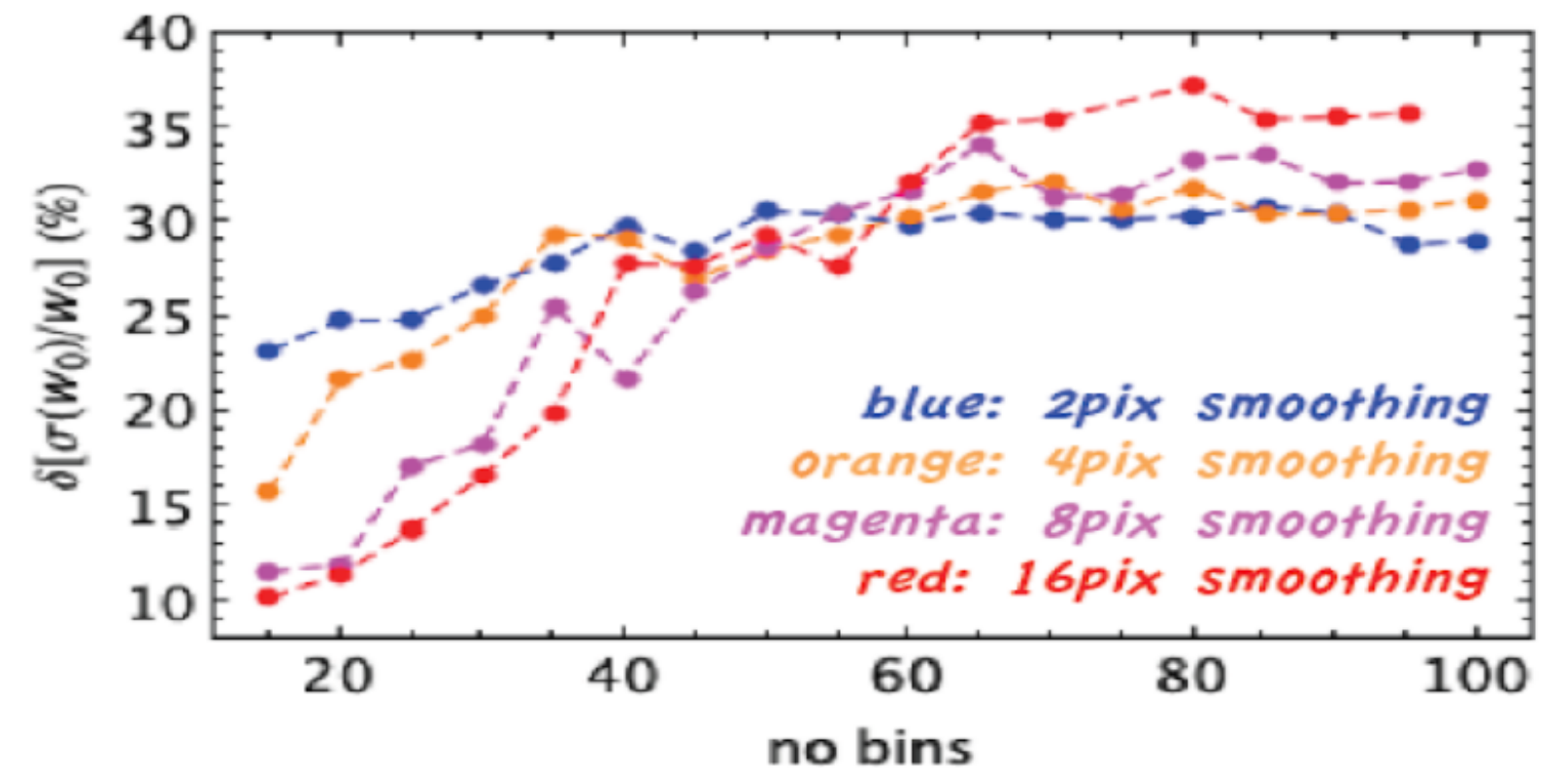
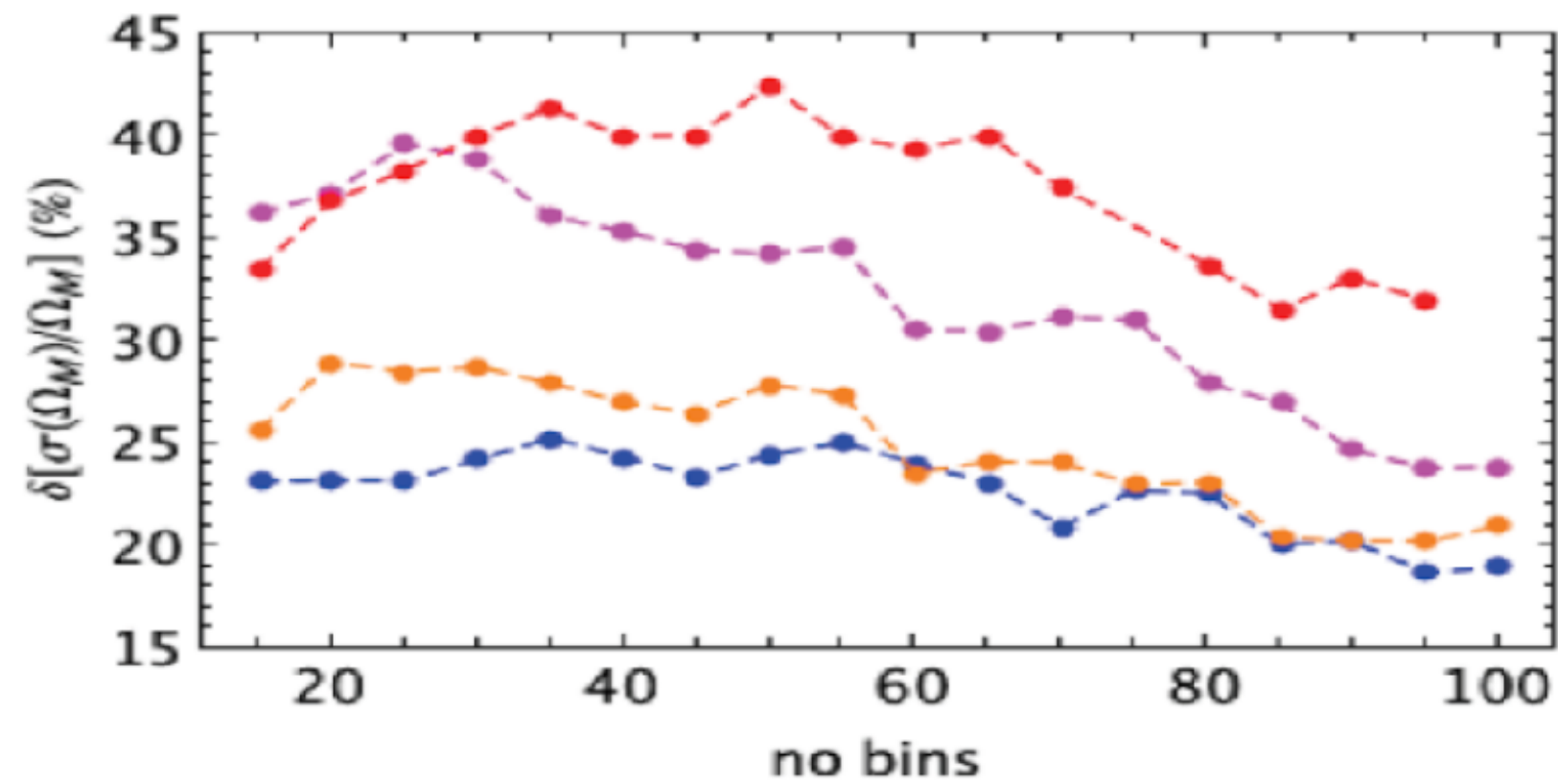
$$\text{Cov} \left( \frac{\partial D_{HOS}}{\partial p_i} \right) \simeq \frac{\text{Cov}\{D_{HOS}[p_i^{fid}(1+\epsilon)]\} + \text{Cov}\{D_{HOS}[p_i^{fid}(1-\epsilon)]\}}{2\epsilon p_i^{fid}} \simeq \frac{\text{Cov}\{D_{HOS}(p_i^{fid})\}}{\epsilon p_i^{fid}}$$

*(assuming approximately model independent covariance matrix)*

# From Noise in Derivatives to Errors on Errors

- *Errors on fisher matrix elements*  $\{F_{11}, F_{12}, F_{13}, F_{22}, F_{23}, F_{33}\}$ 
  1. generate random  $dD_{HOS}/dp_i$  from multinormal distribution
  2. compute  $\{F_{11}, F_{12}, F_{13}, F_{22}, F_{23}, F_{33}\}$
  3. estimate covariance matrix of  $\{F_{11}, F_{12}, F_{13}, F_{22}, F_{23}, F_{33}\}$
- *Errors on marginalized errors*
  1. generate random  $F_{ij}$  from multinormal distribution
  2. remove unphysical samples (e.g, giving  $\det(F) < 0$ )
  3. compute  $C_{11} = \sigma^2(\Omega_M)$ ,  $C_{22} = \sigma^2(w_0)$ ,  $C_{33} = \sigma^2(\sigma_8)$
  4. estimate  $\delta[\sigma(p_i)/p_i] = (1/2) \sigma(C_{ii})/C_{ii}$  from sample NMAD
- *Underlying assumptions of the method*
  1. unbiased numerical derivatives
  2. cosmology independent covariance matrix

# From Noise in Derivatives to Errors on Errors



- *Plots for Minkowski Functionals*
- *Also available for*
  - *Betti numbers*
  - *convergence PDF*
  - *homology heat maps*
  - *peaks count*

# Italy and Euclid Weak Lensing

(AND DO NOT FORGET PHOTOMETRIC GALAXY CLUSTERING)

## THEORY

- strong involvement in forecasts
- stronger in next MCMC forecasts
- leading the work on covariance
- leading the 3x2pt modelling
- involved in many Key Projects

## SYSTEMATICS

- participation to the E2E pipeline
- impact of magnification bias
- modelling of RSD in 3x2pt
- impact of photo - z errors
- modelling of systematics

## HIGH ORDER STATS

- coordinating HOS WP
- strong involvement in HOWLS
- stronger for next steps
- semi - analytical methods
- full sky simulations