

LSST-France | May 18<sup>th</sup> 2022

# Cosmic shear: from DES to Rubin/LSST

Cyrille Doux

LPSC GRENOBLE / IN2P3 / CNRS



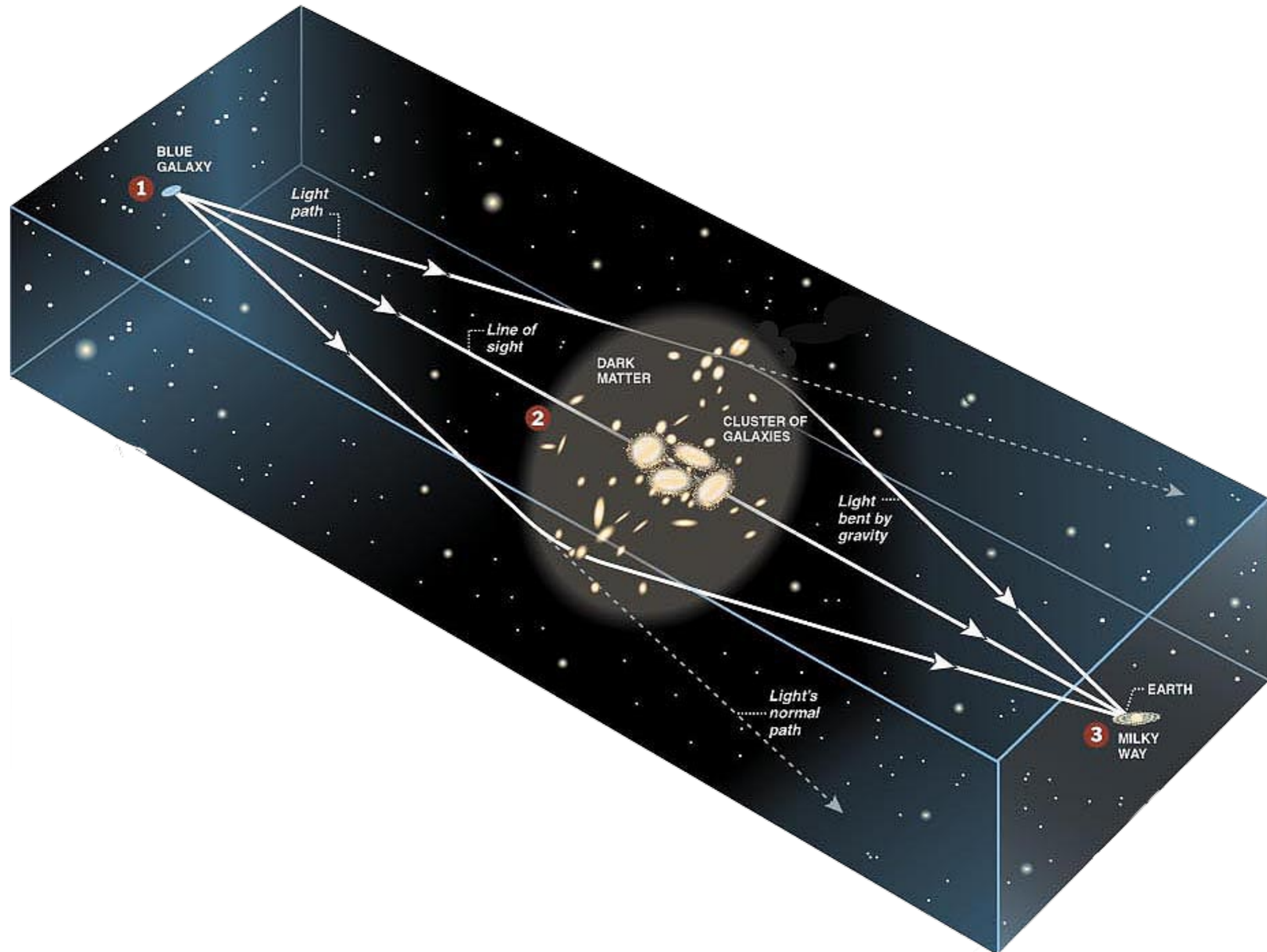
Penn  
UNIVERSITY of PENNSYLVANIA



- ▶ Cosmic shear 101
- ▶ Dark Energy Survey Year 3 analysis
  - ▶ Advances in shear/redshift calibration
  - ▶ Cosmological constraints
  - ▶ Outstanding issues
- ▶ Cosmic shear with LSST: new problems

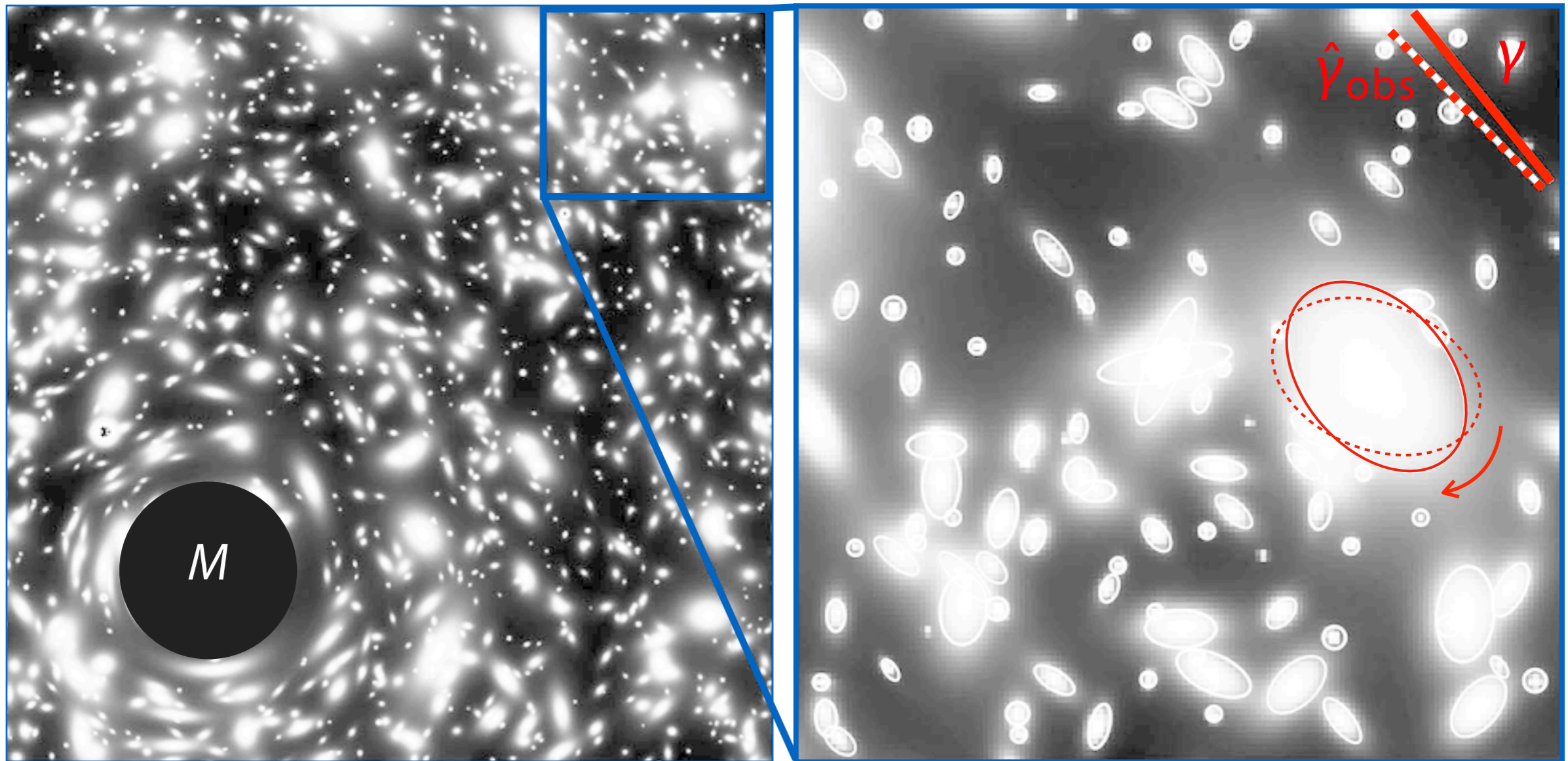
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# Weak gravitational lensing



# Weak gravitational lensing

## Cosmic shear

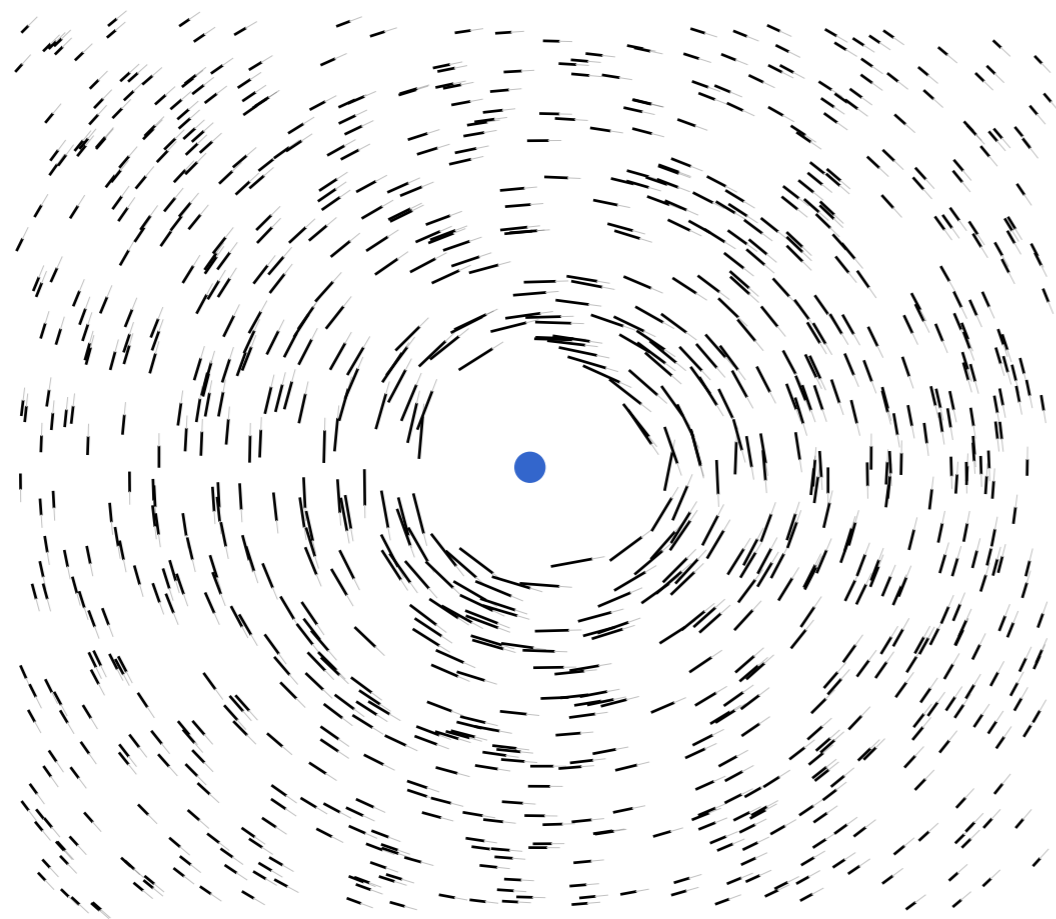


In practice,  $|\gamma| \sim 0.01$  (in the field) to  $0.1$  (in clusters)

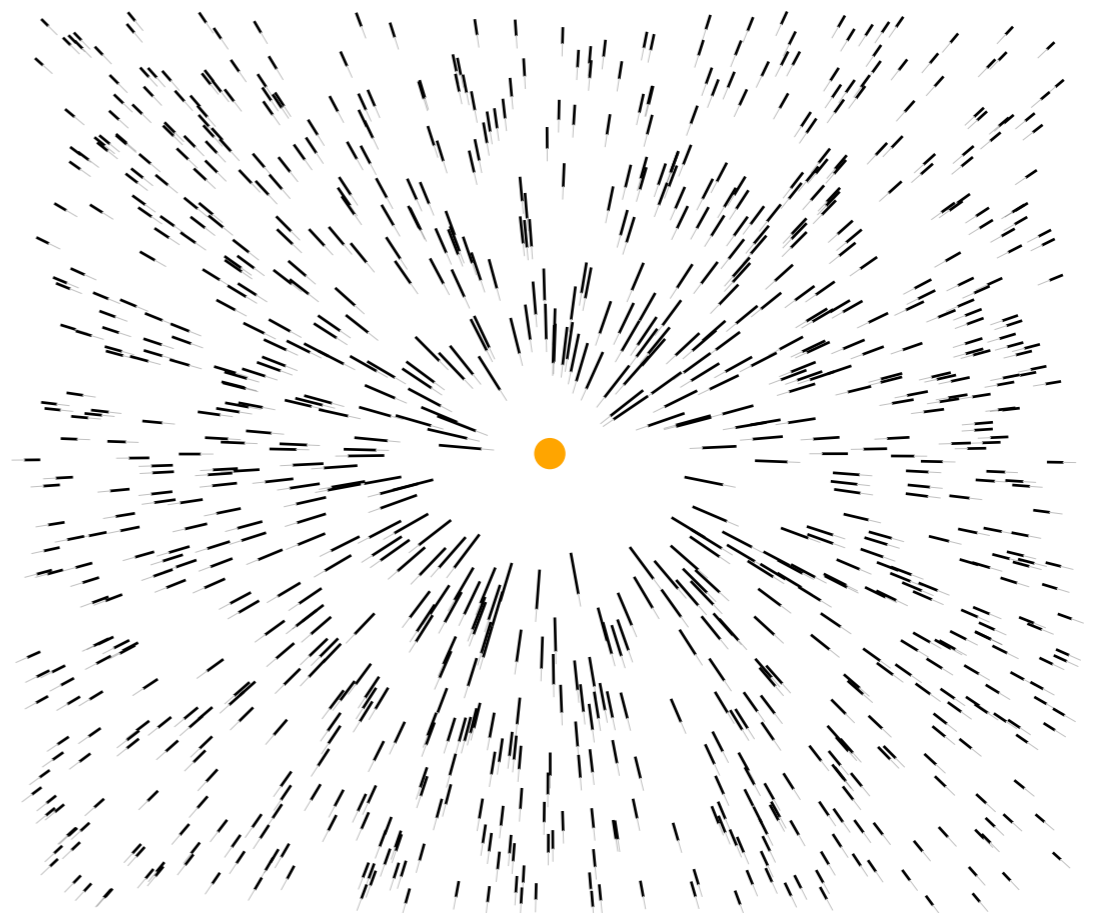
# Weak gravitational lensing

## Cosmic shear

Over-density



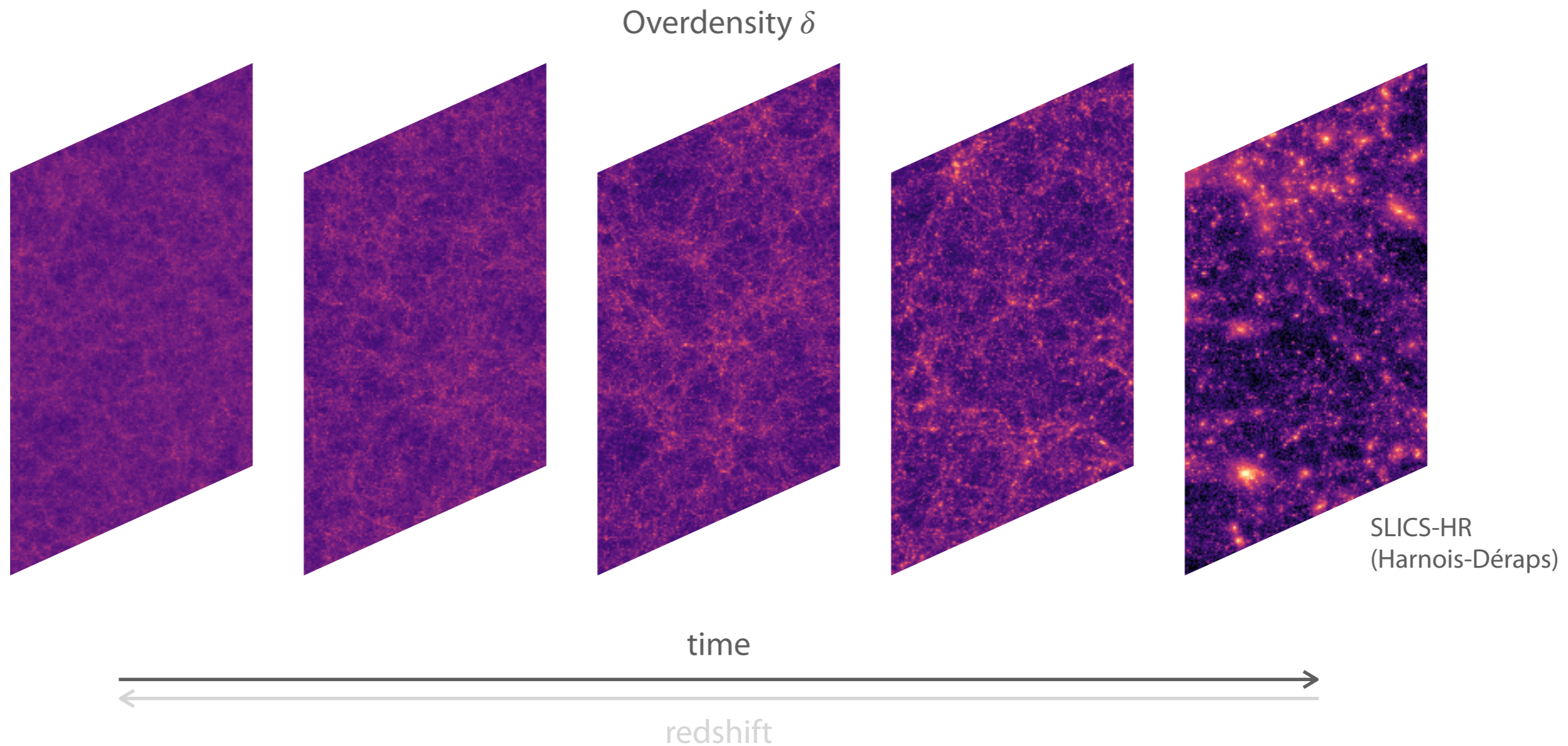
Under-density



\* Lengths do not scale

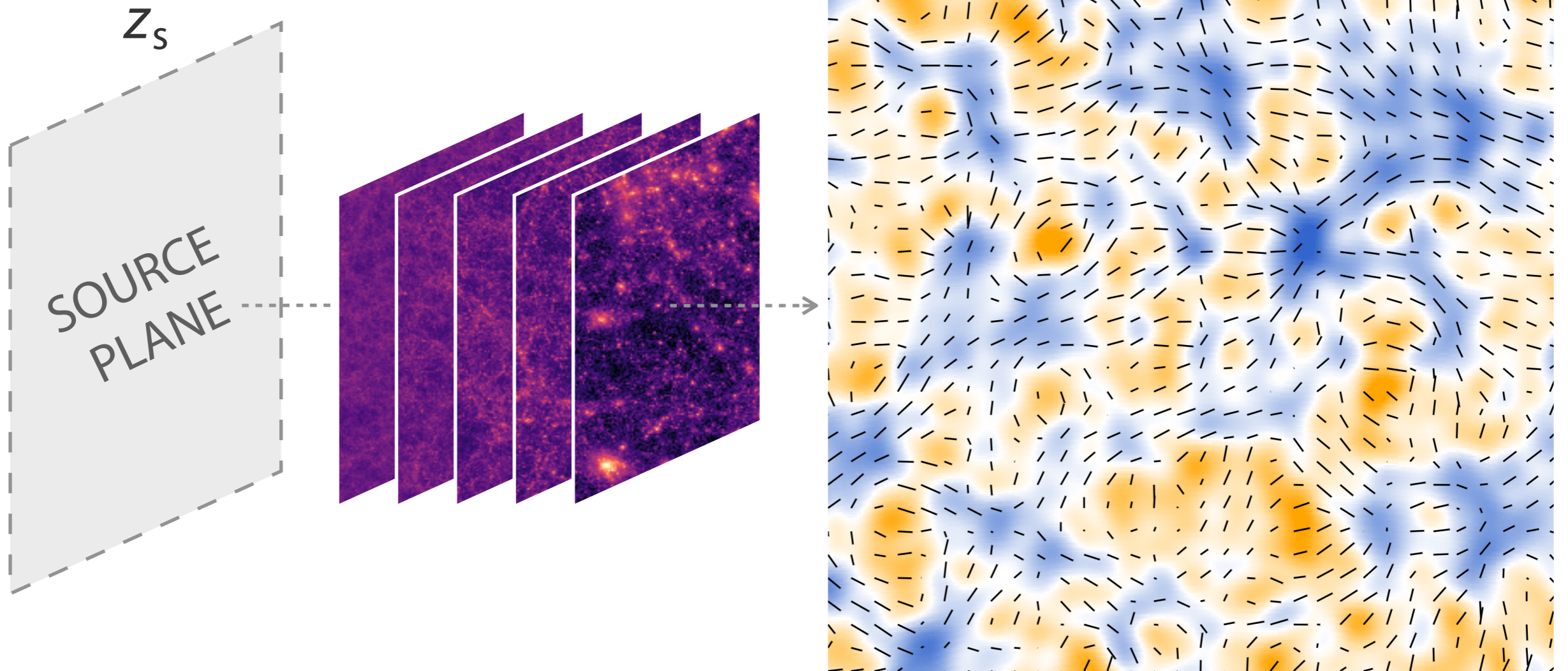
# Weak gravitational lensing

## A large-scale structure probe



# Weak gravitational lensing

## A large-scale structure probe

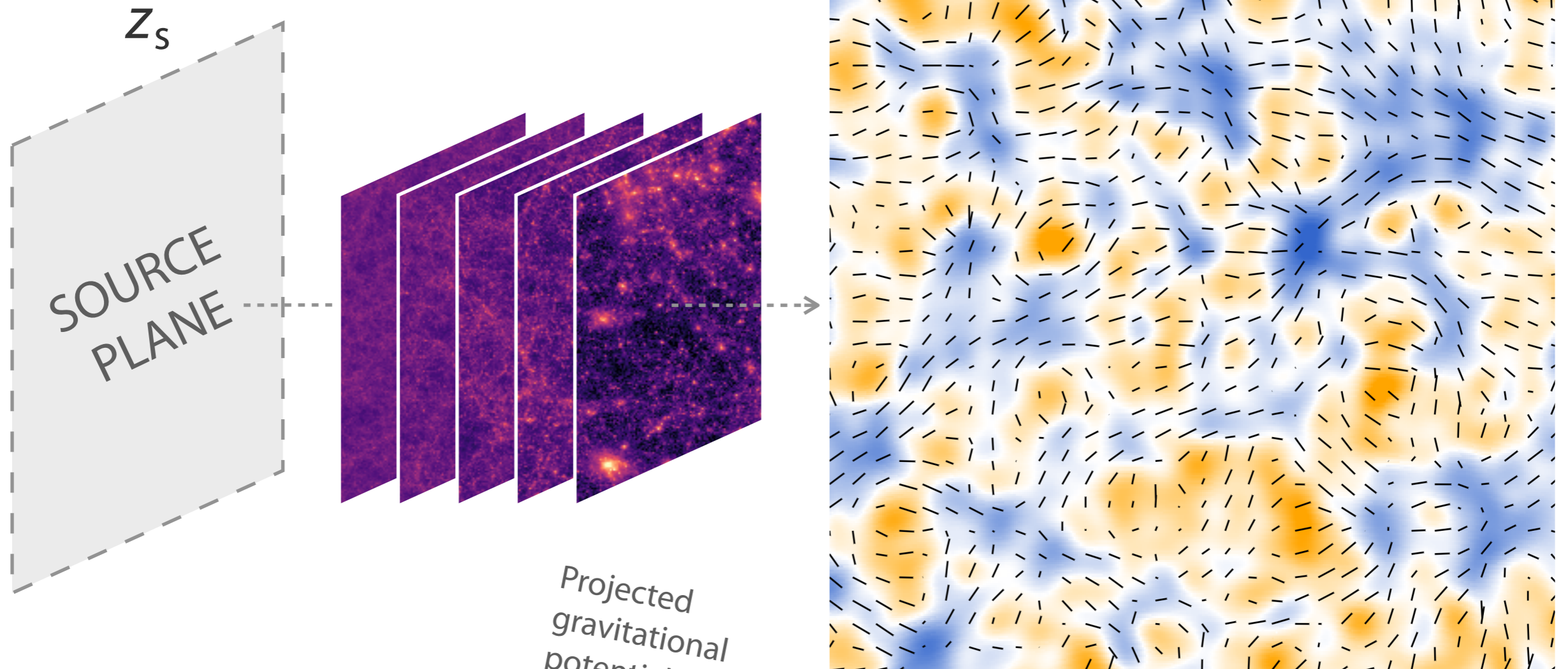


SLICS-HR  
(Harnois-Déraps)



# Weak gravitational lensing

## A large-scale structure probe



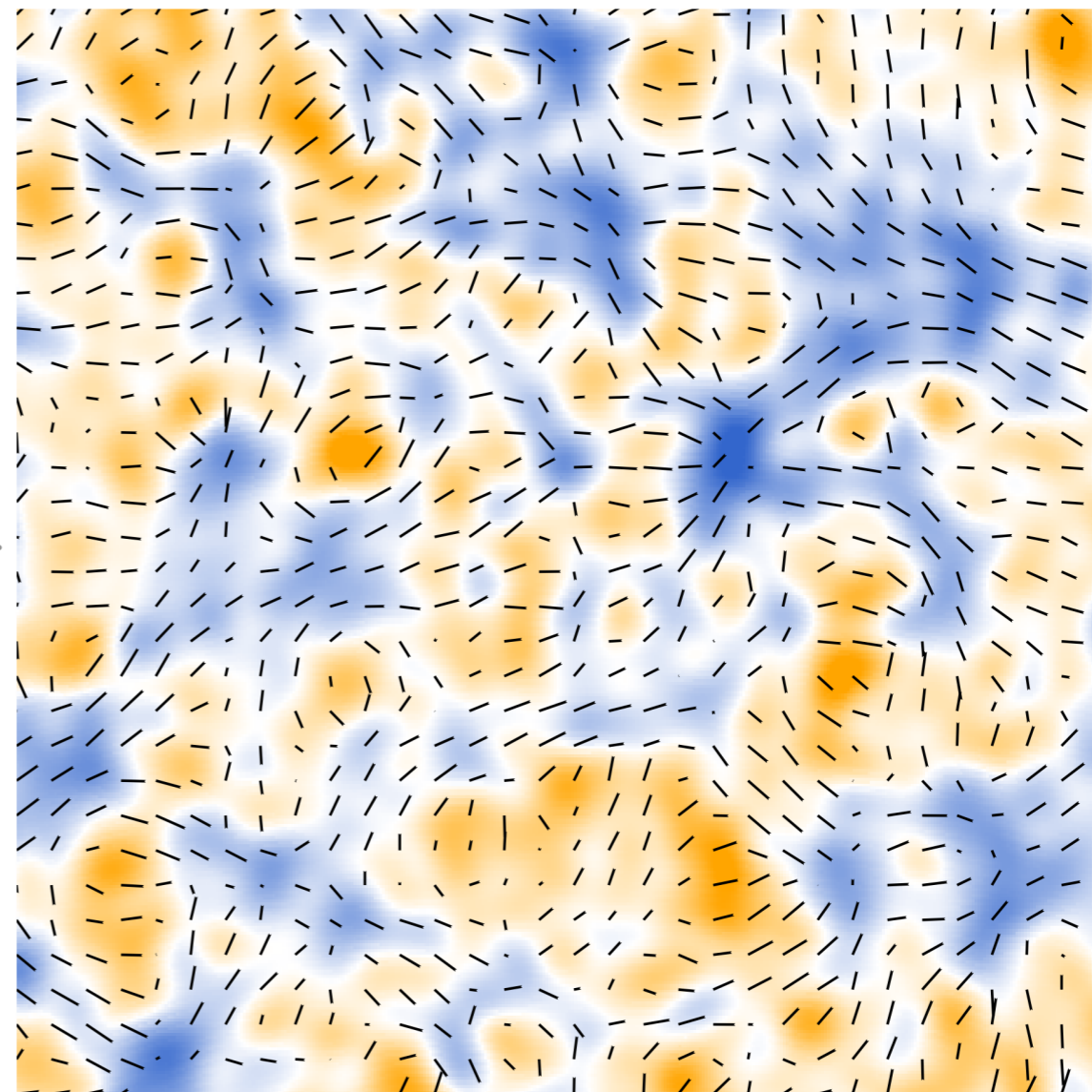
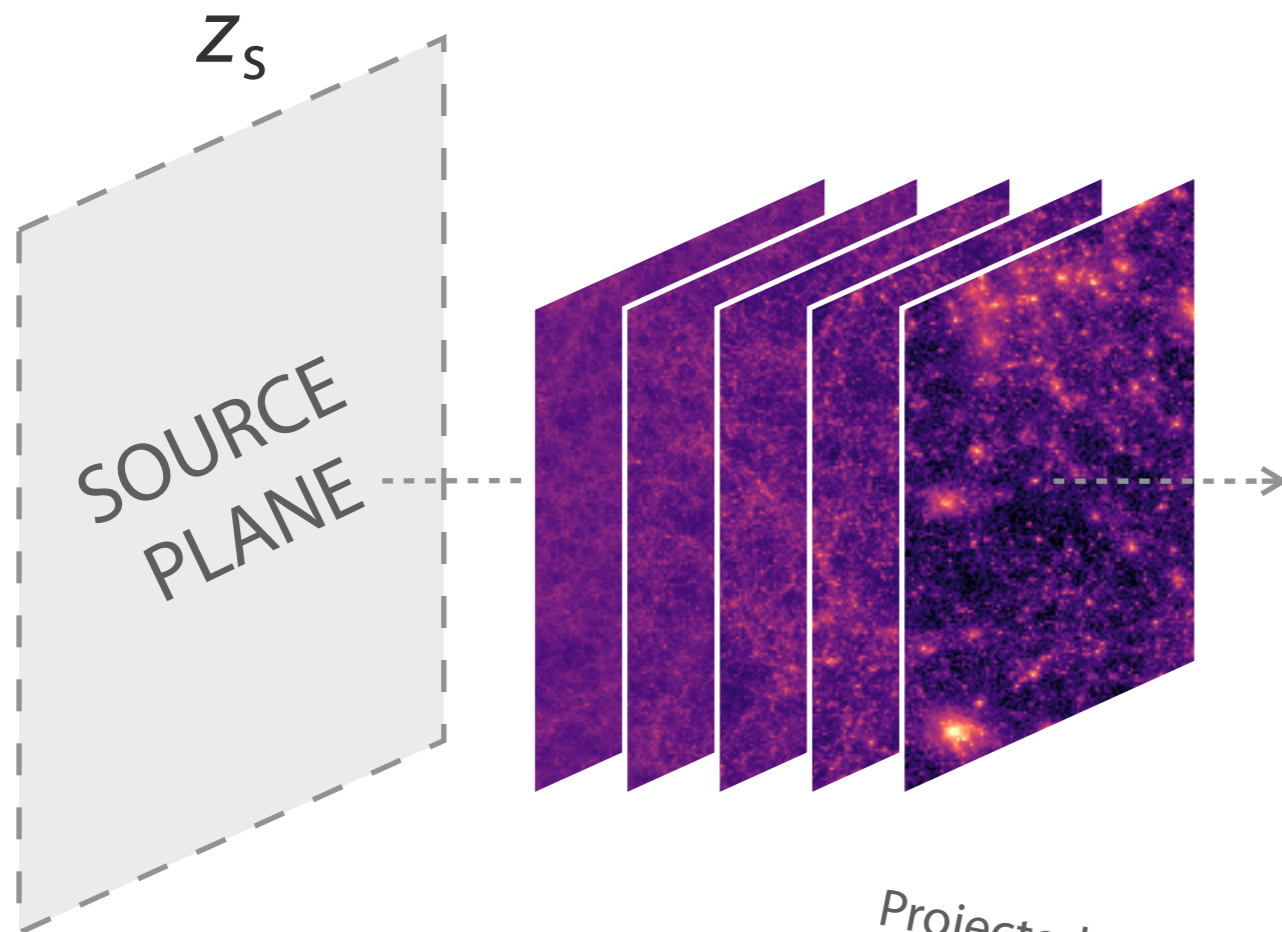
SLICS-HR  
(Harnois-Déraps)

$$\kappa = \frac{1}{4}(\partial\bar{\partial} + \bar{\partial}\partial)\psi$$
$$\gamma = \gamma_1 + i\gamma_2 = \frac{1}{2}\partial\bar{\partial}\psi$$

Projected gravitational potential

# Weak gravitational lensing

## A large-scale structure probe



SLICS-HR  
(Harnois-Déraps)

$$\kappa = \frac{1}{4}(\partial\bar{\partial} + \bar{\partial}\partial)\psi$$

$$\gamma = \gamma_1 + i\gamma_2 = \frac{1}{2}\partial\bar{\partial}\psi$$

Projected  
gravitational  
potential

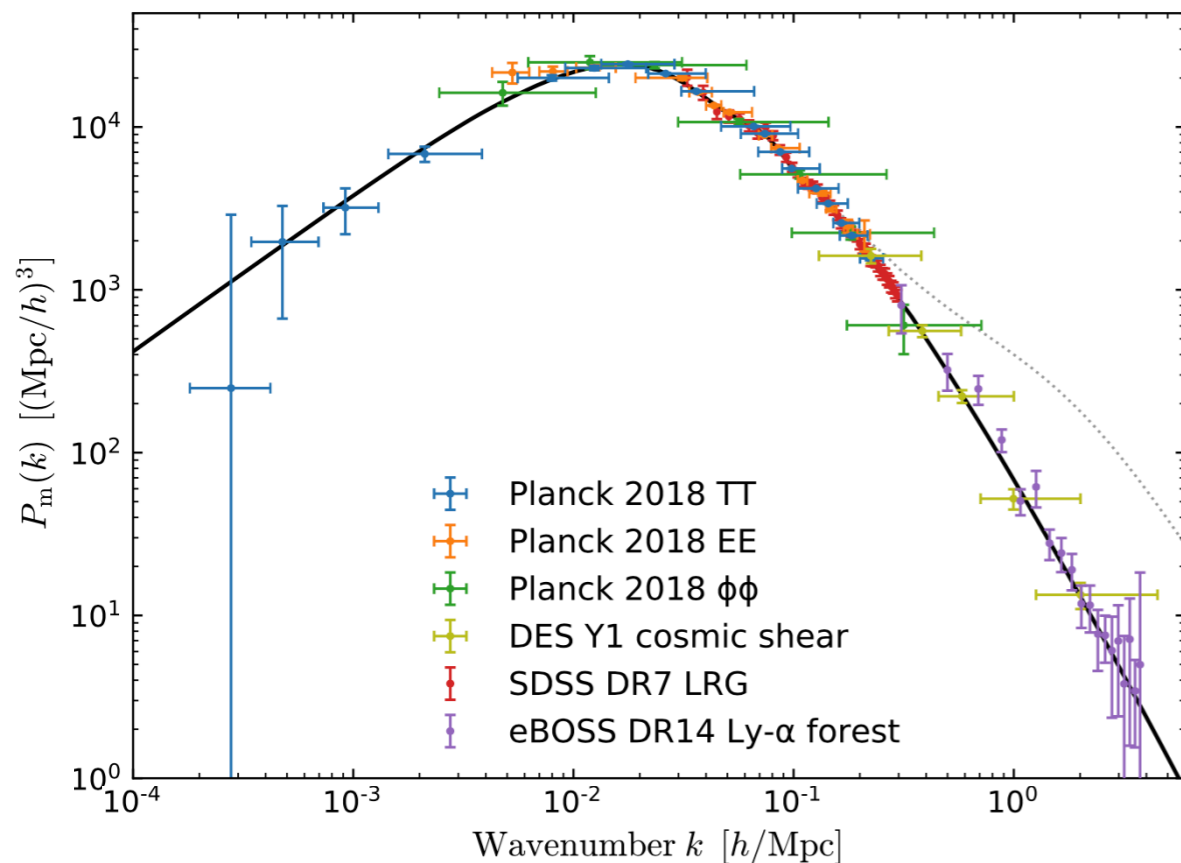
$$\kappa(\theta) = \int dz W^{\kappa}(z, z_s)\delta(\theta, z)$$

# Cosmic shear power spectrum

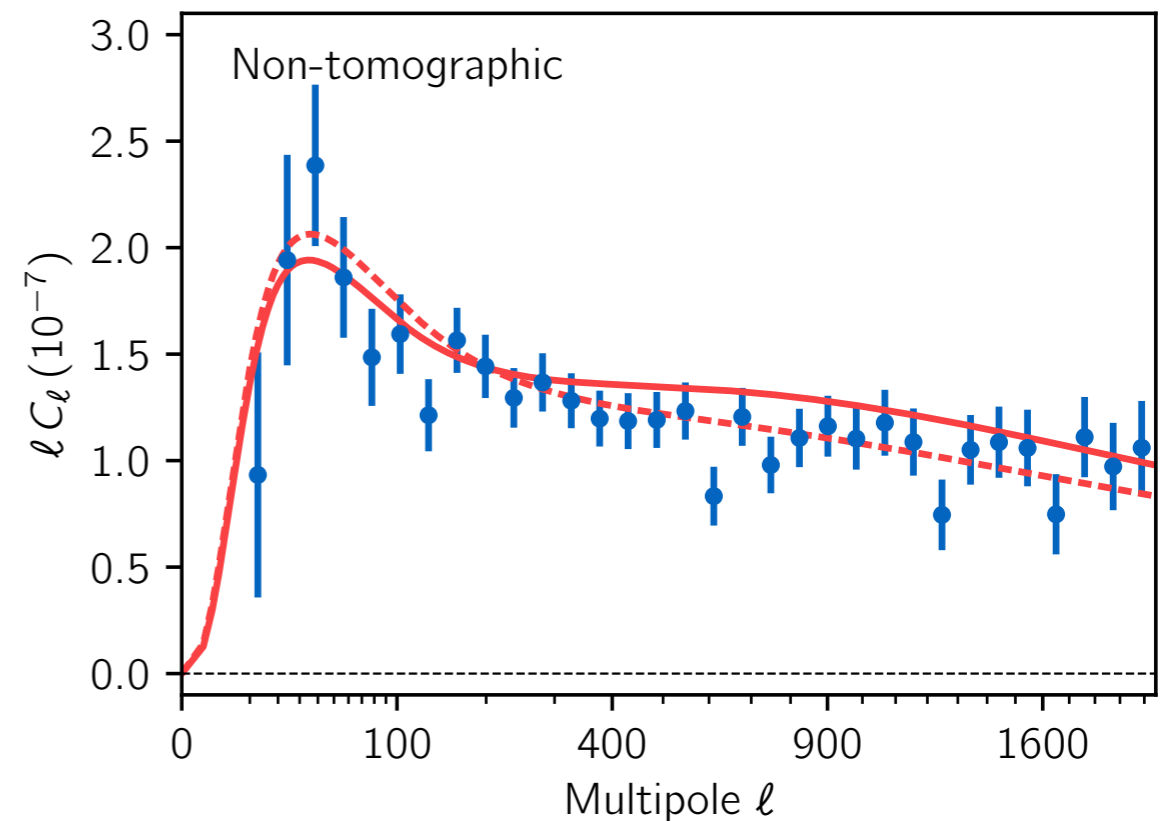
$$C_{\ell}^{\gamma_a \gamma_b} = \int_0^{z_{\star}} dz \frac{H(z)}{c \chi(z)} W^a(z) W^b(z) P_m \left( k = \frac{\ell + 1/2}{\chi(z)}, z \right)$$

GEOMETRY
GROWTH

Matter power spectrum



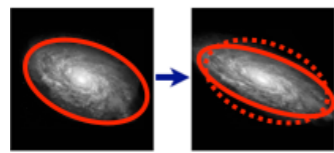
Cosmic shear power spectrum



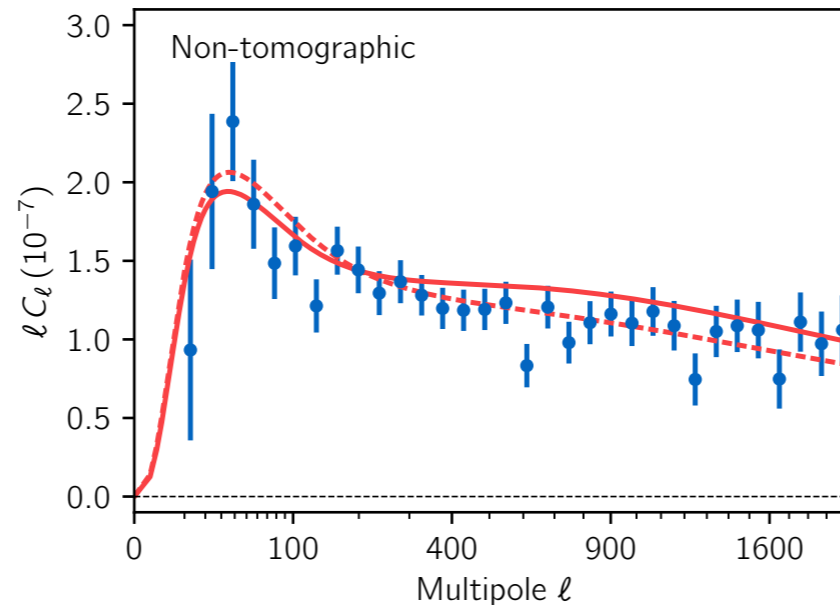
The cosmic shear power spectrum is a *projection* of the matter power spectrum !

# Cosmic shear pipeline

## STATISTICS



ELLIPTICITIES  
 $e_1/e_2$



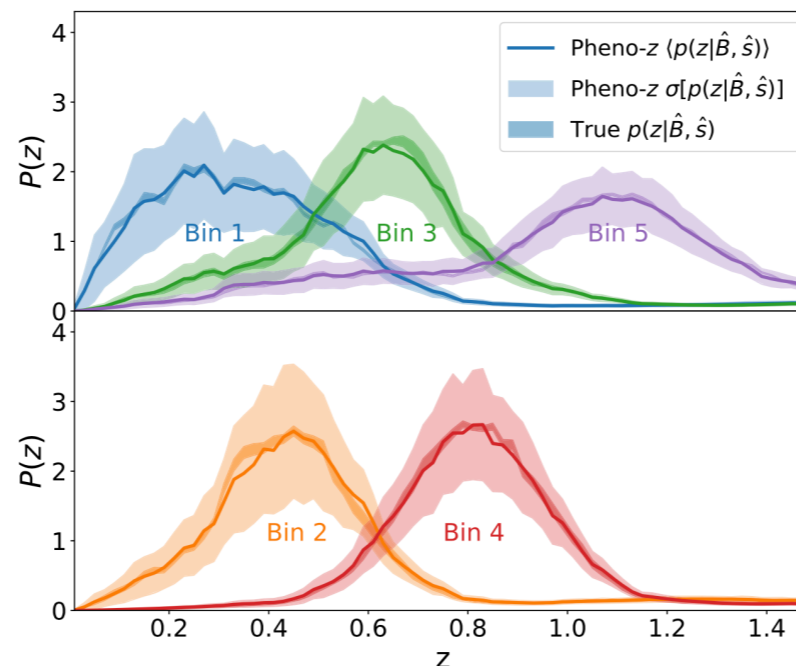
## COSMOLOGICAL SIGNAL

- Matter power spectrum  $P_{\text{NL}}$
- Lensing window functions  $q^i$

$$C_\ell^{ij} = \int_0^{X_H} dX \frac{q^i(X)q^j(X)}{X^2} P_{\text{NL}}\left(k = \frac{\ell + 1/2}{X}, X\right)$$

OBSERVATIONS

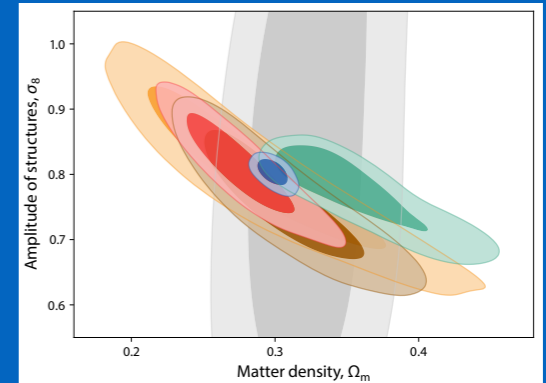
## REDSHIFT DISTRIBUTIONS



FLUXES

*griz*

COSMOLOGICAL  
PARAMETERS



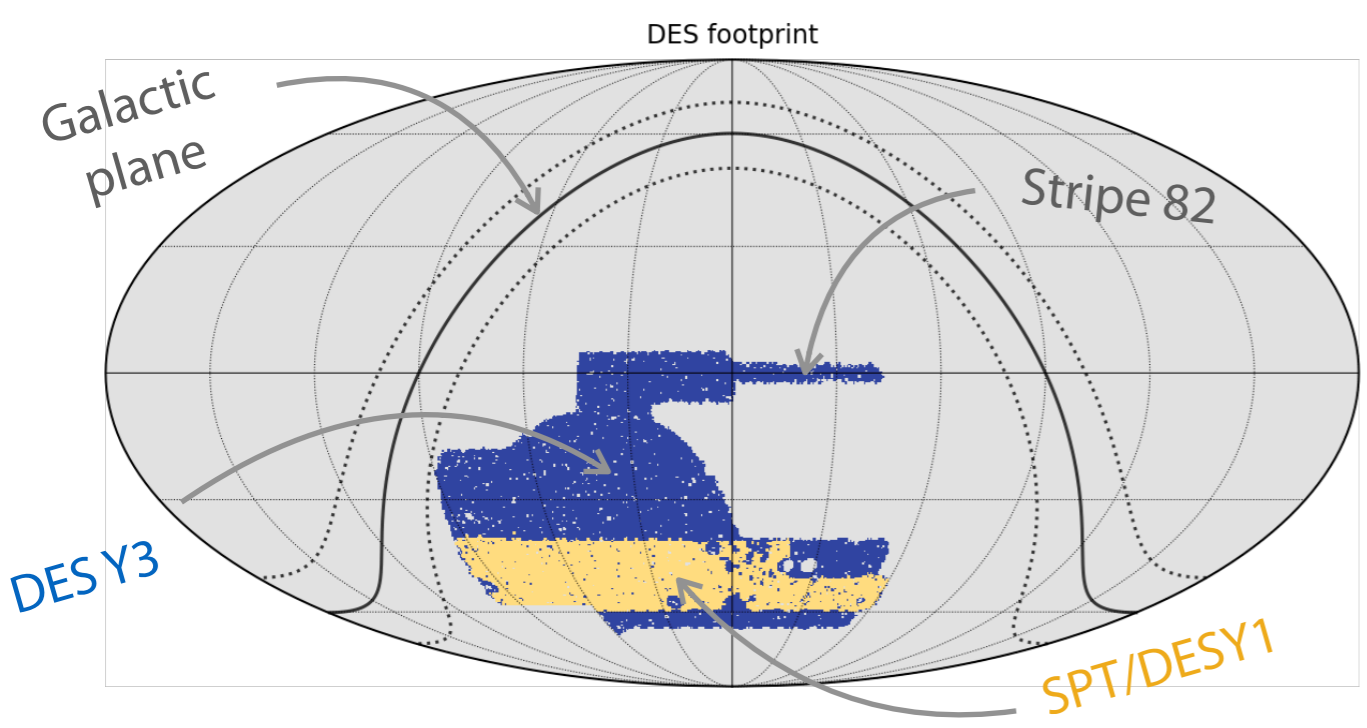
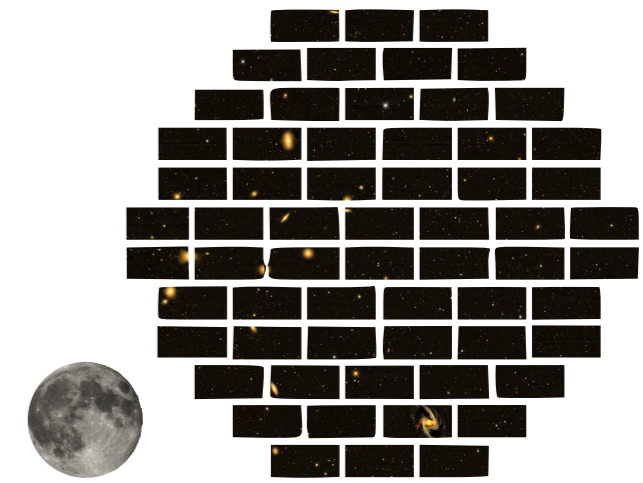
## SYSTEMATIC UNCERTAINTIES

- Shear calibration  $m_i$
- Redshift uncertainties  $\Delta z_i$
- Intrinsic alignments model

- ▶ Cosmic shear 101
- ▶ Dark Energy Survey Year 3 analysis
  - ▶ Advances in shear/redshift calibration
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# The Dark Energy Survey

- ▶ Blanco 4-meter telescope at Cerro Tololo (CTIO) in Chile
- ▶ Dark Energy Camera (DECam)
  - ▶ 3.0 deg<sup>2</sup> field-of-view, 70 CCD chips, 570 Mpix, *griz(Y)* filters
  - ▶ Seeing ~0.9' in *r*-band, magnitude  $i_{AB} < 23.0$ ,  $r < 23.5$
- ▶ Survey(s)
  - ▶ 5000 deg<sup>2</sup> footprint + **deep fields**, observed 2013-2019
- ▶ DES Year 3 in numbers
  - ▶ ~100 people, ~100M galaxies, ~30 papers



# DES Y3 METACALIBRATION shape catalogue

## ▶ METACALIBRATION in a nutshell

- ▶ For any *biased* shear estimator  $\mathbf{e}$ ,

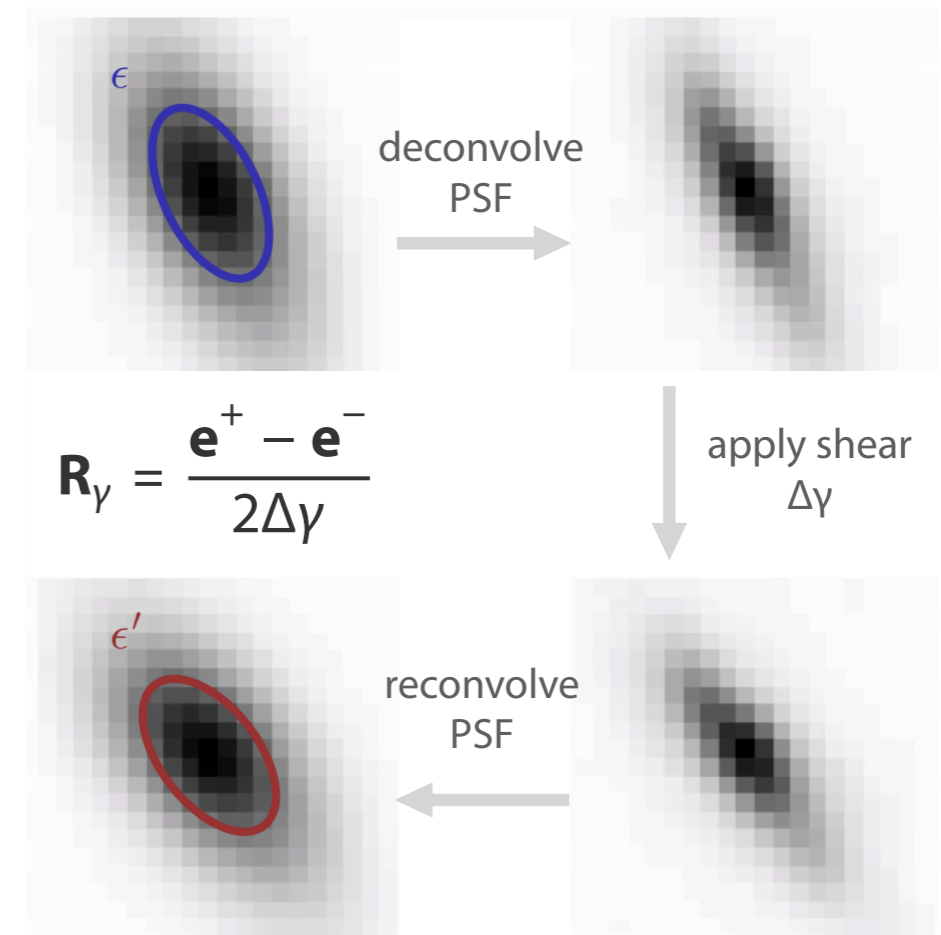
$$\mathbf{e} = \mathbf{e}|_{\gamma=0} + \underbrace{\gamma \cdot \frac{\partial \mathbf{e}}{\partial \gamma}}_{\mathbf{R}_\gamma} \Big|_{\gamma=0} + \mathcal{O}(\gamma^3)$$

such that  $\langle \hat{\gamma} \rangle \approx \langle \mathbf{R}_\gamma \rangle^{-1} \langle \mathbf{e} \rangle$  is *unbiased* 🍷

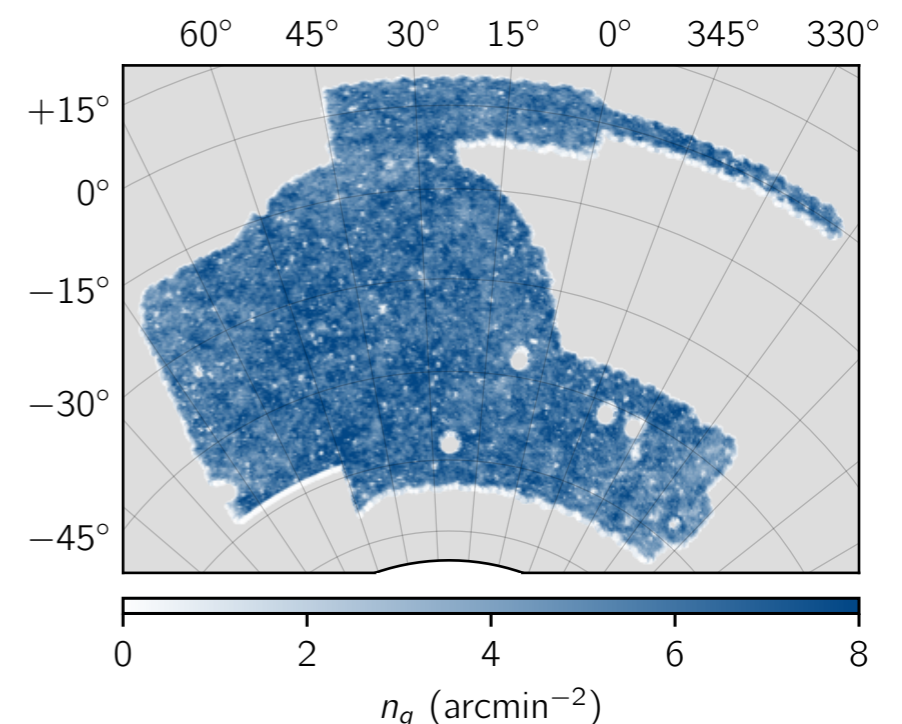
- ▶ Mitigates model+noise biases and *shear-dependent* selection

## ▶ DES Y3 METACALIBRATION catalogue

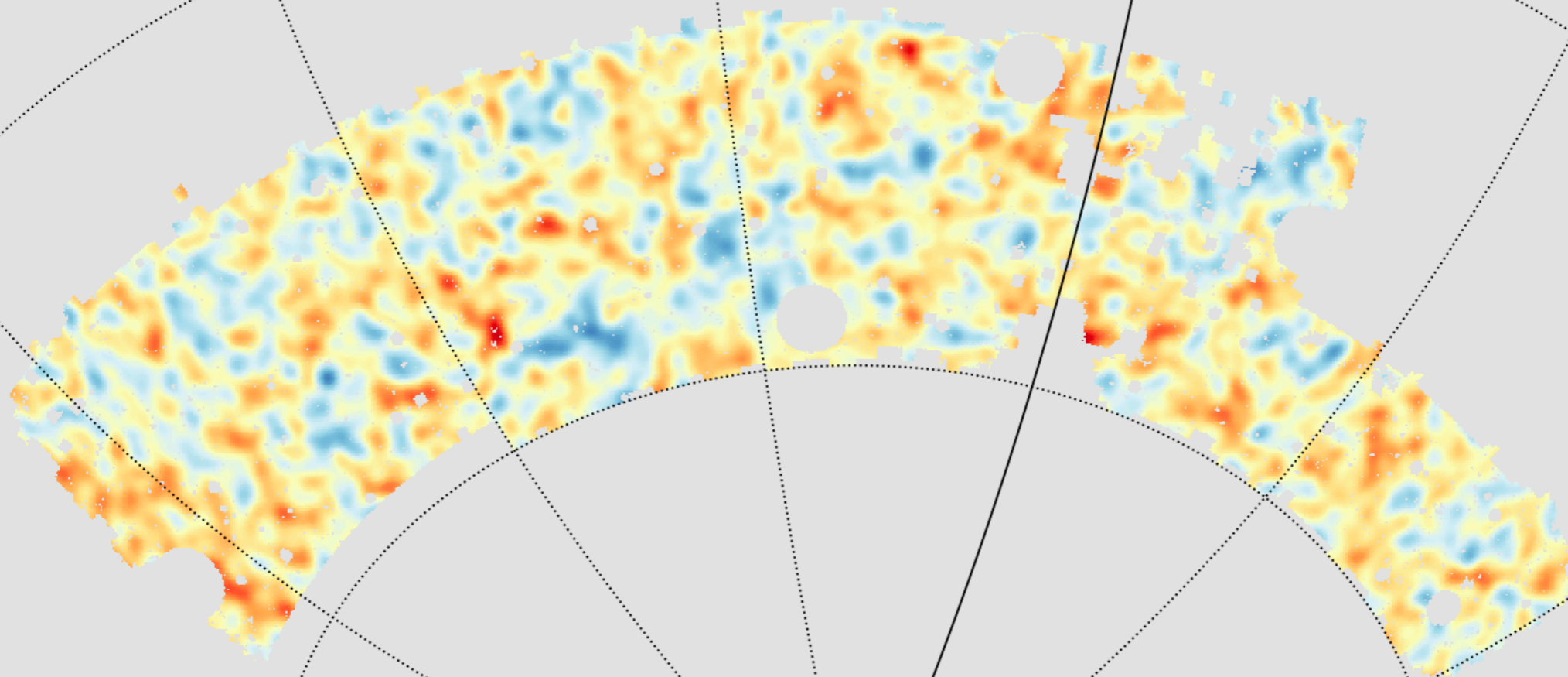
- ▶ Cuts:  $10 < S/N < 1000$ ,  $T/T_{\text{PSF}} > 0.5$  + color cuts
  - ▶ 100,204,026 galaxies from Y3 GOLD in *riz*
  - ▶  $\sigma_e = 0.261$  with inverse-variance weights ( $S/N, T/T_{\text{PSF}}$ )
  - ▶  $n_{\text{eff}} = 5.59$  gal/arcmin<sup>2</sup>
- ▶ Catalogue found to be very robust Gatti...CD+20 [DES Y3]



N. MacCrann

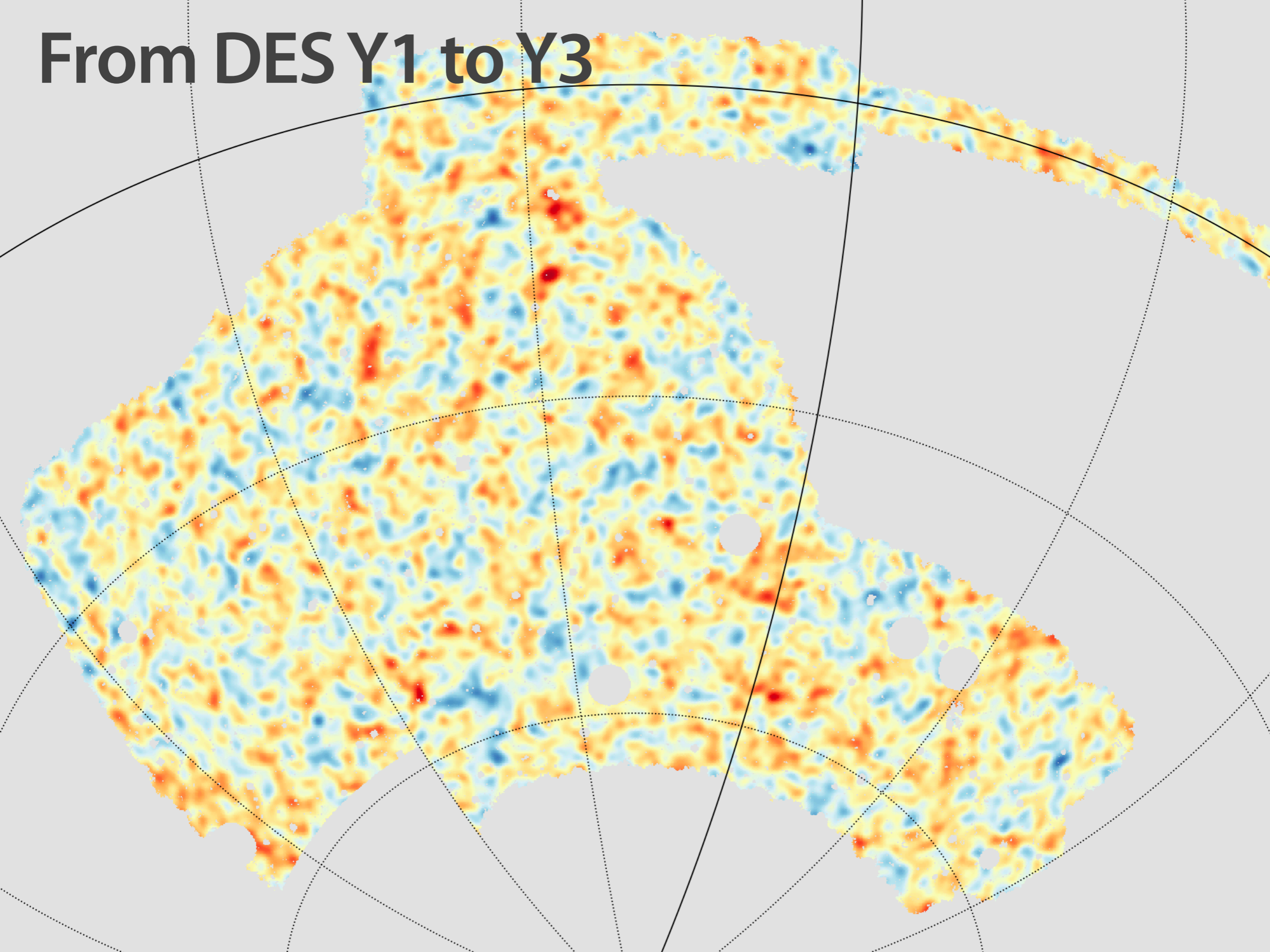


# From DES Y1 to Y3

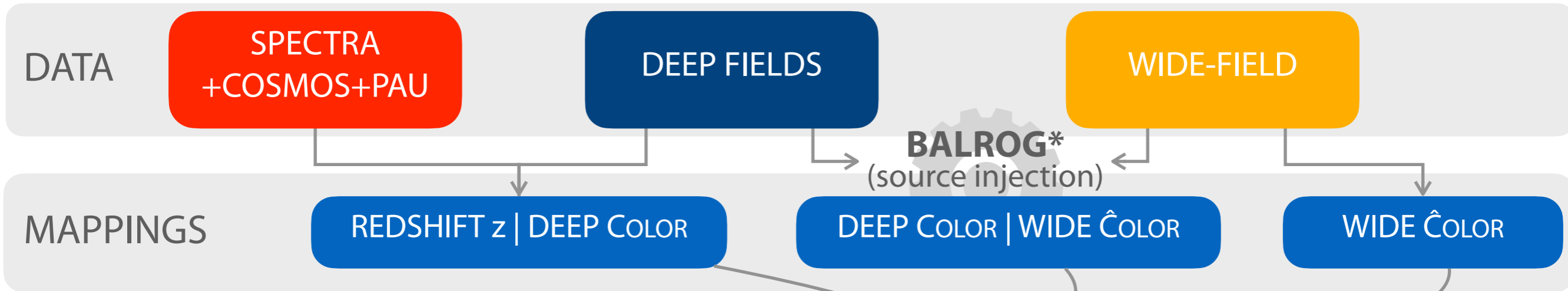




# From DES Y1 to Y3



# DES Y3 redshift distributions with SOMPZ

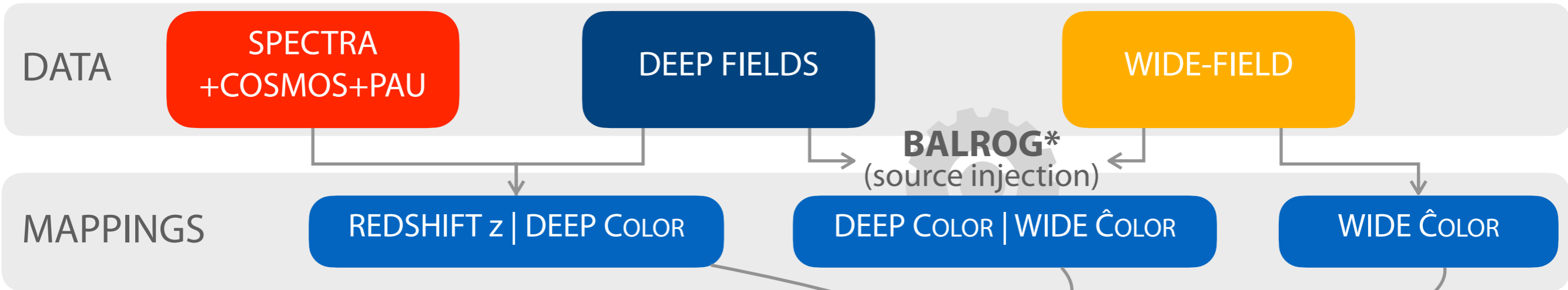


► Marginal photo- $z$  for bin  $\hat{b}$  is

$$p(z|b) = \sum_{\hat{c} \in b} \sum_c p(z|c) p(c|\hat{c}) p(\hat{c})$$

\*Everett+20 [DES Y3]

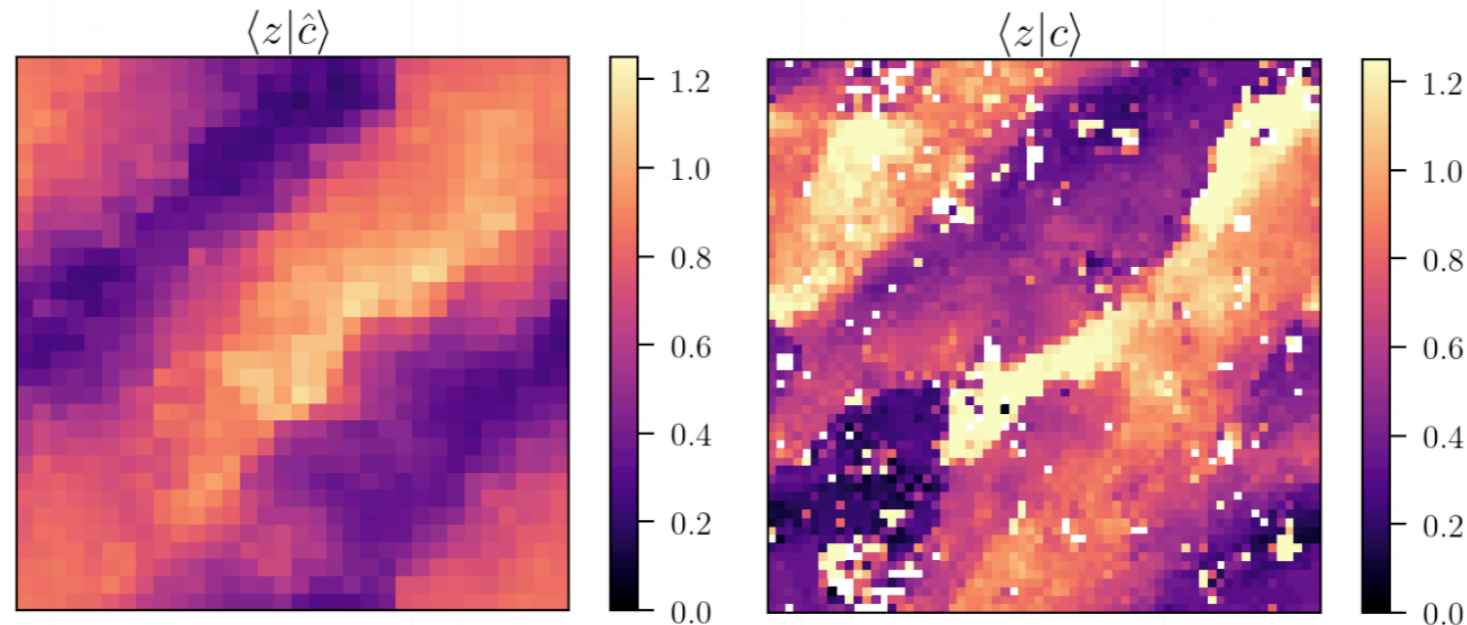
# DES Y3 redshift distributions with SOMPZ



- ▶ Marginal photo-z for bin  $\hat{b}$  is

$$p(z|b) = \sum_{\hat{c} \in b} \sum_c p(z|c) p(c|\hat{c}) p(\hat{c})$$

- ▶ Bayesian mapping with self-organizing maps method (no template, no ML) from Buchs+19



Myles+20 [DES Y3]

- ▶ **RESULT:** produces *posterior samples* of  $n(z)$  for each redshift bin

\*Everett+20 [DES Y3]

# DES Y3 redshift distributions with SOMPZ

## ▶ 3 sources of information

1. SOMPZ method calibrated with Balrog
2. Constraints from clustering
3. Shear-ratio

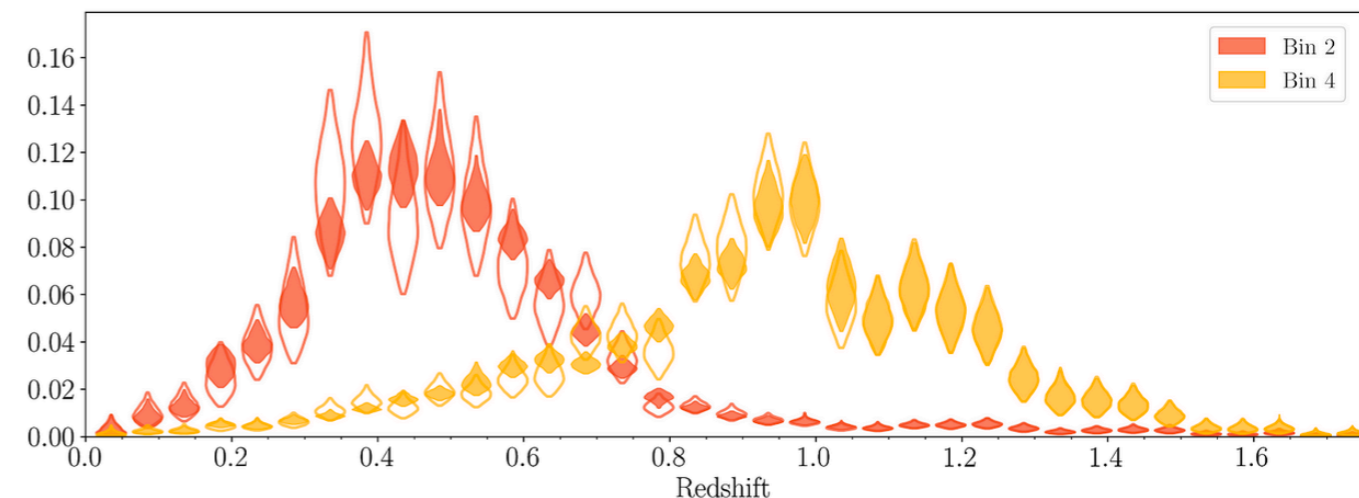
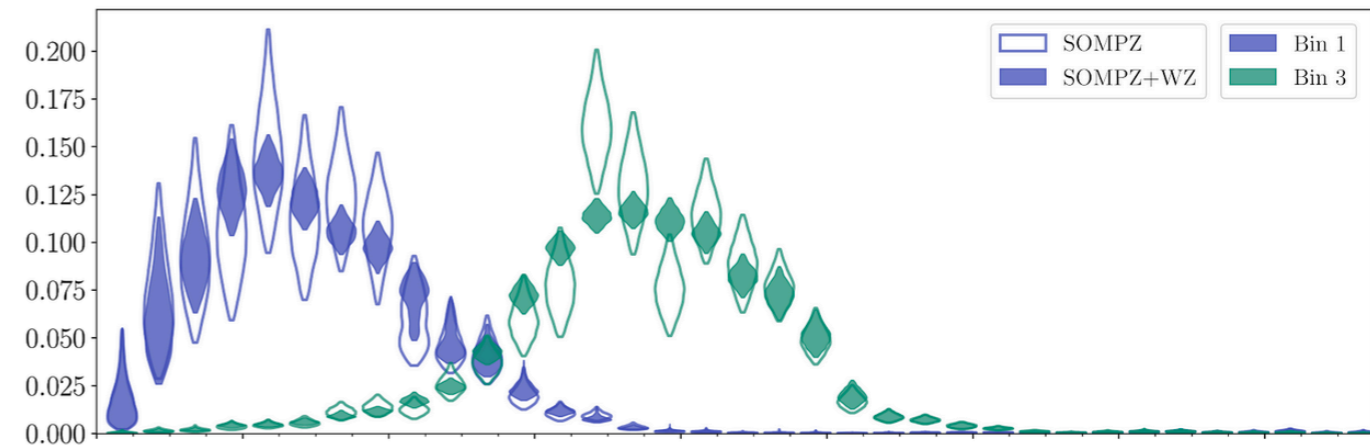
## ▶ DES Y3 $n(z)$ 's

- ▶ Effective combined  $\langle z \rangle$  uncertainties between 0.008 and 0.015
- ▶ Error dominated by
  - ▶ photo-calibration at low  $z$
  - ▶ sample variance at higher  $z$

## ▶ Marginalisation over $n(z)$ 's with HYPERRANK Cordero+ 21 [DES Y3]

- ▶ *Posterior samples* of  $n(z)$ 's instead of usual shift  $n'(z) = n(z+\Delta z)$
- ▶ HYPERRANK ranks  $n(z)$ 's to allow marginalisation over both  $\langle z \rangle$  and  $n(z)$  shape

Myles+20 [DES Y3]



# Joint calibration of shears and redshifts

## Redshift distributions as *shear response*

- Consider  $n(z)$  as *response of data ensemble to shear* at redshift  $z$

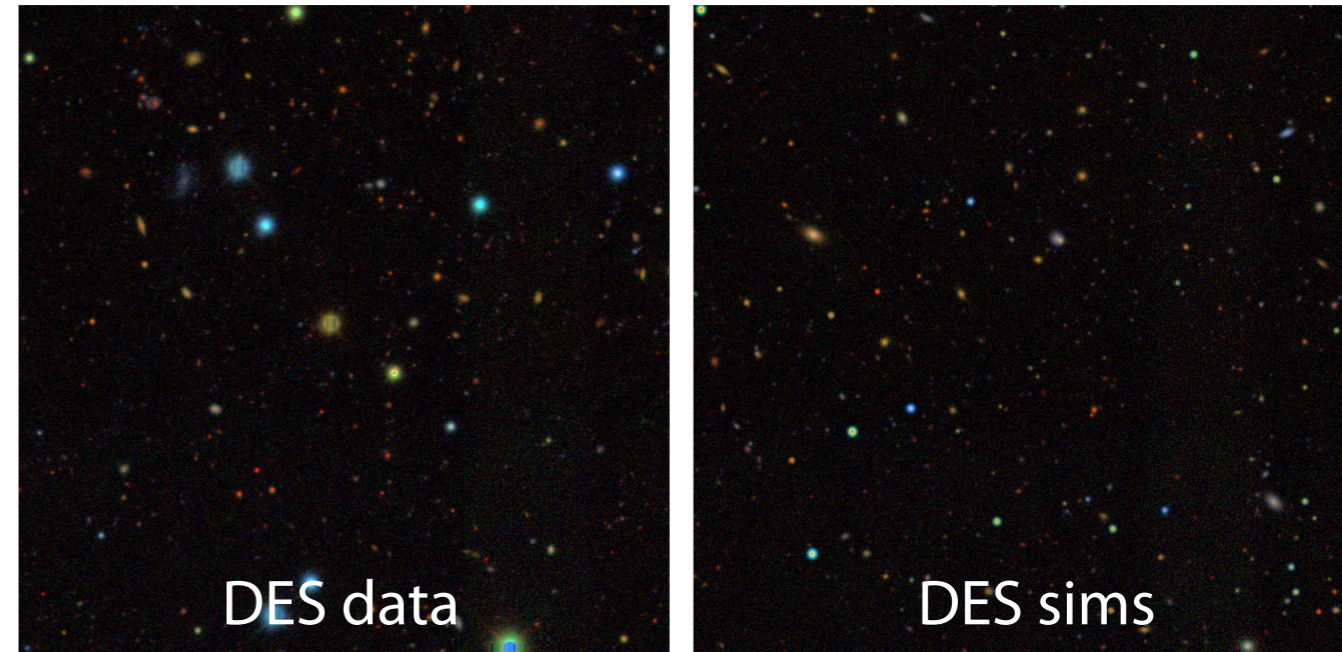
$$\langle \mathbf{e}_{\text{obs}} \rangle = \int n_{\gamma}(z) \gamma_{\text{true}}(z) dz + \mathbf{c} + \text{noise}$$

- Distorsion  $n(z) \rightarrow n_{\gamma}(z)$  measured by sims

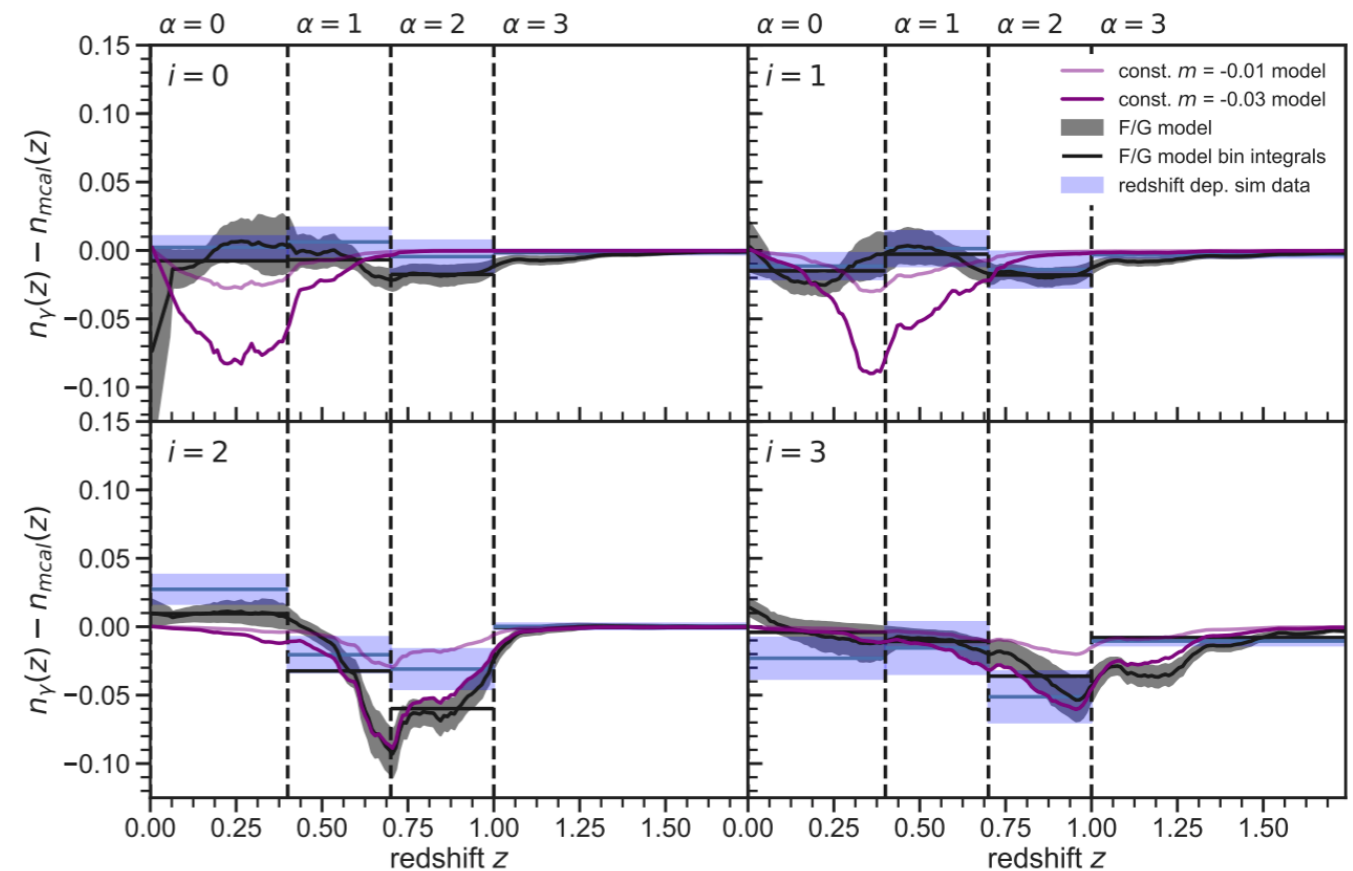
- $n_{\gamma}(z)$  has norm  $1+m$
- Very realistic simulations matching deep field colors and blending

## DES Y3 results

- $m \sim -2\%$  dominated by blending
- Distorted/calibrated SOMPPZ
- $n_{\gamma}(z)$  samples to be used for cosmology



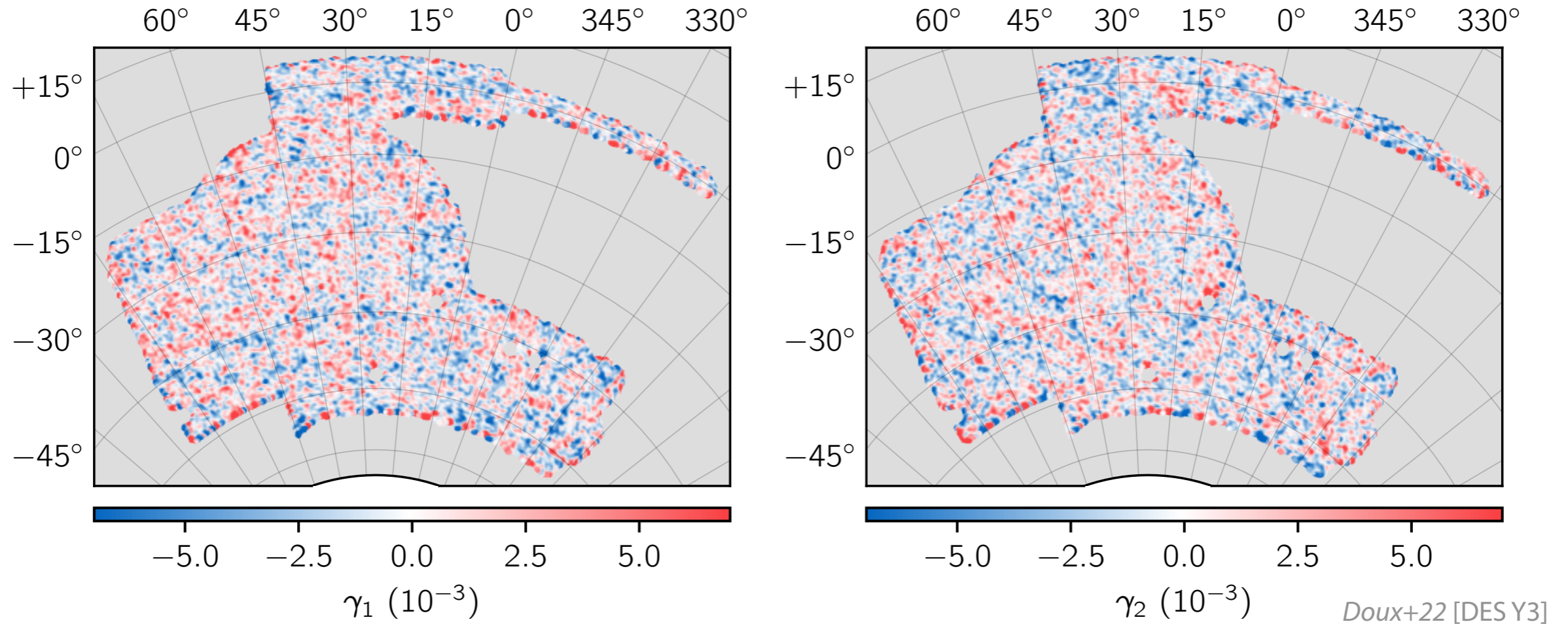
MacCrann+20 [DES Y3]



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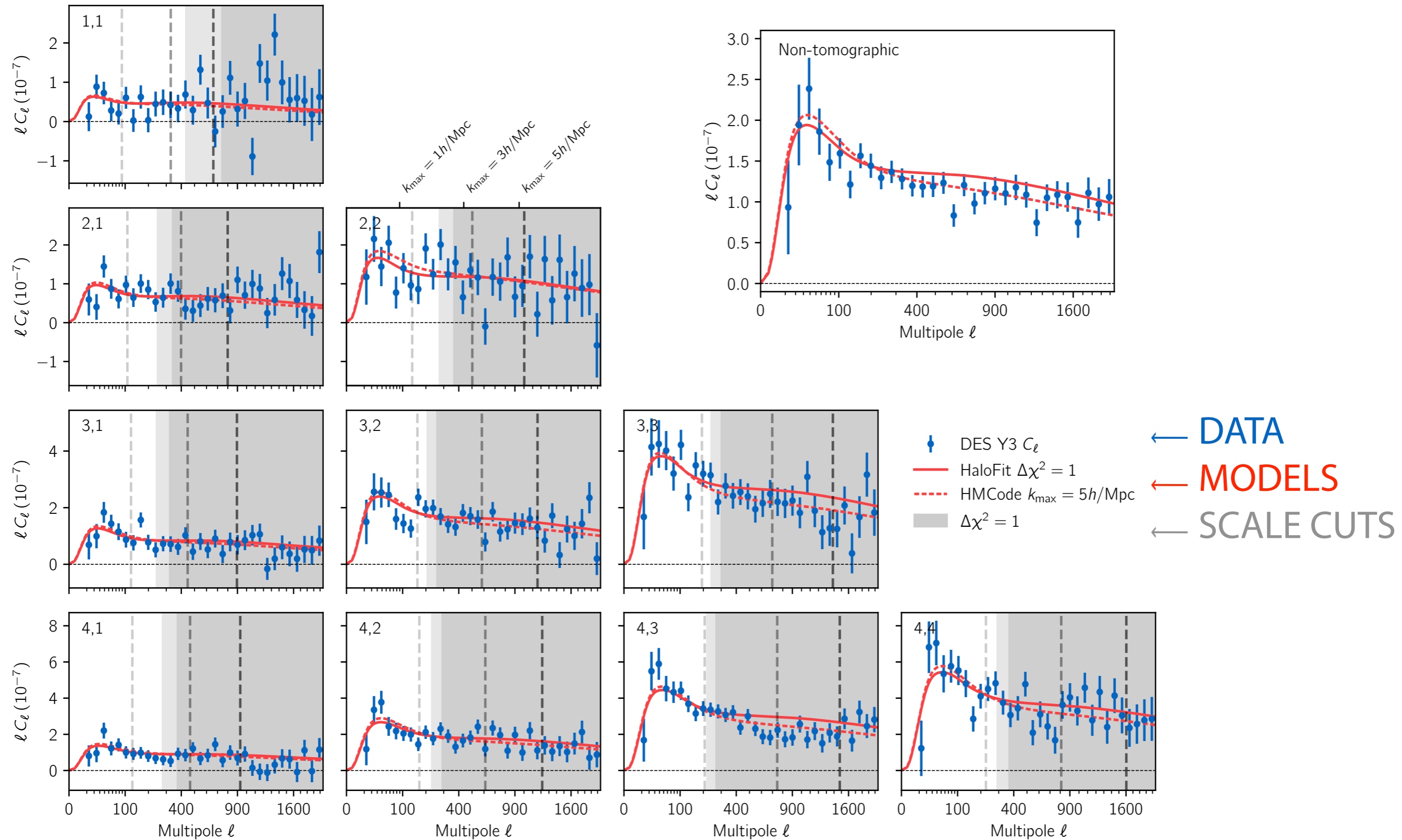
# DES Y3 cosmic shear maps

## NON-TOMOGRAPHIC MAPS



- ▶  $\gamma_1/\gamma_2$  shear maps per redshift bin
- ▶ Auto- and cross two-point functions
  - ▶ Correlations functions  $\xi_{\pm}(\theta)$ : Amon+21 and Secco+21 [DES Y3]
  - ▶ Angular power spectra  $C_{\ell}$ : Doux+22 [DES Y3]

# Cosmic shear power spectra

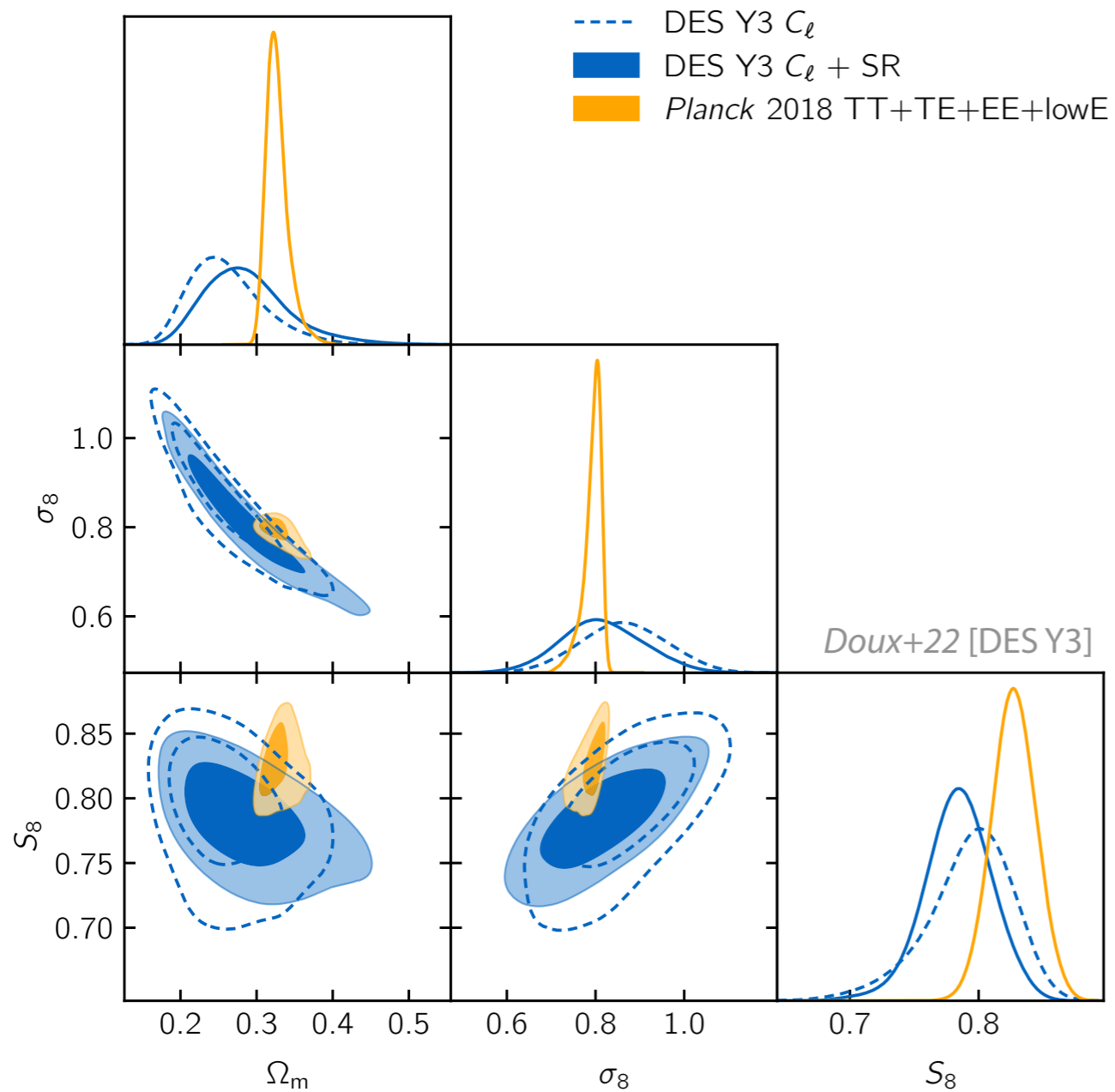


Doux+22 [DES Y3]

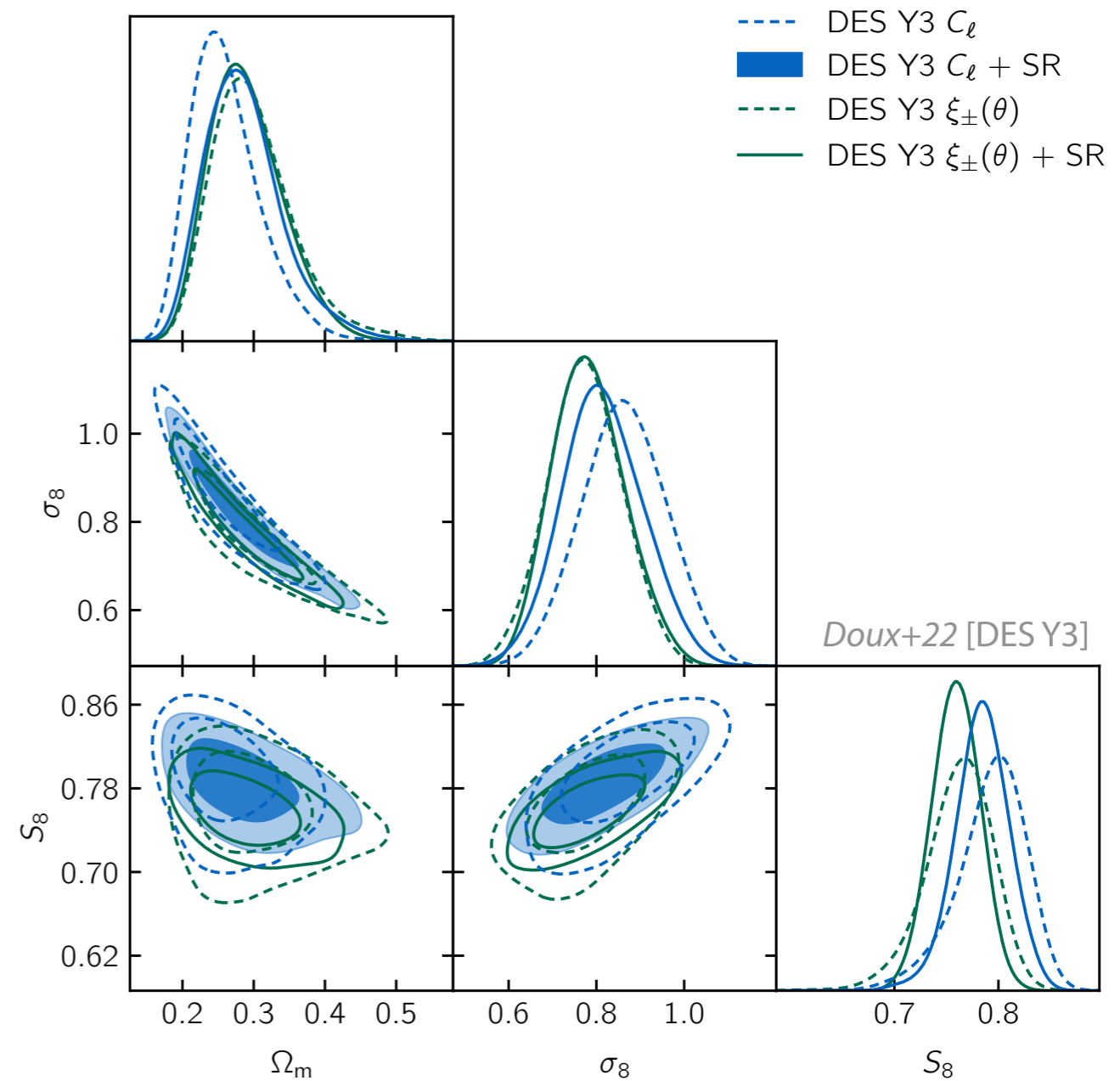


# Cosmological constraints

DES Y3 cosmic shear power spectra vs Planck



DES Y3 power spectra vs two-point functions

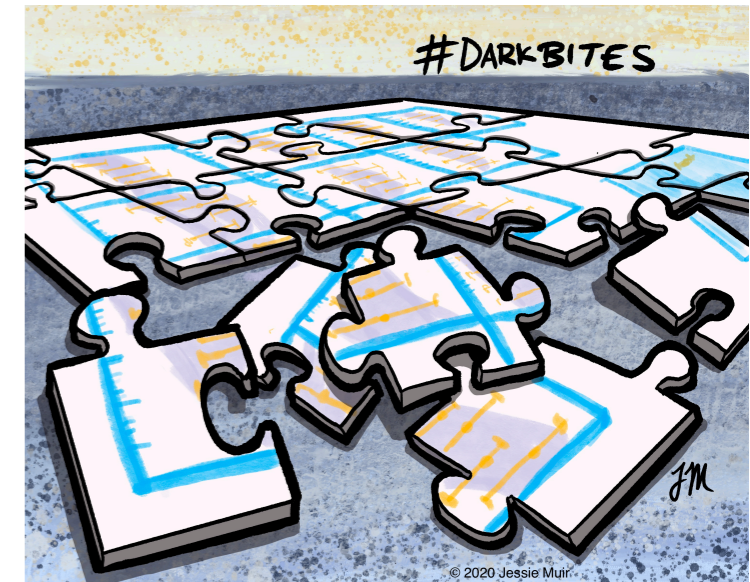
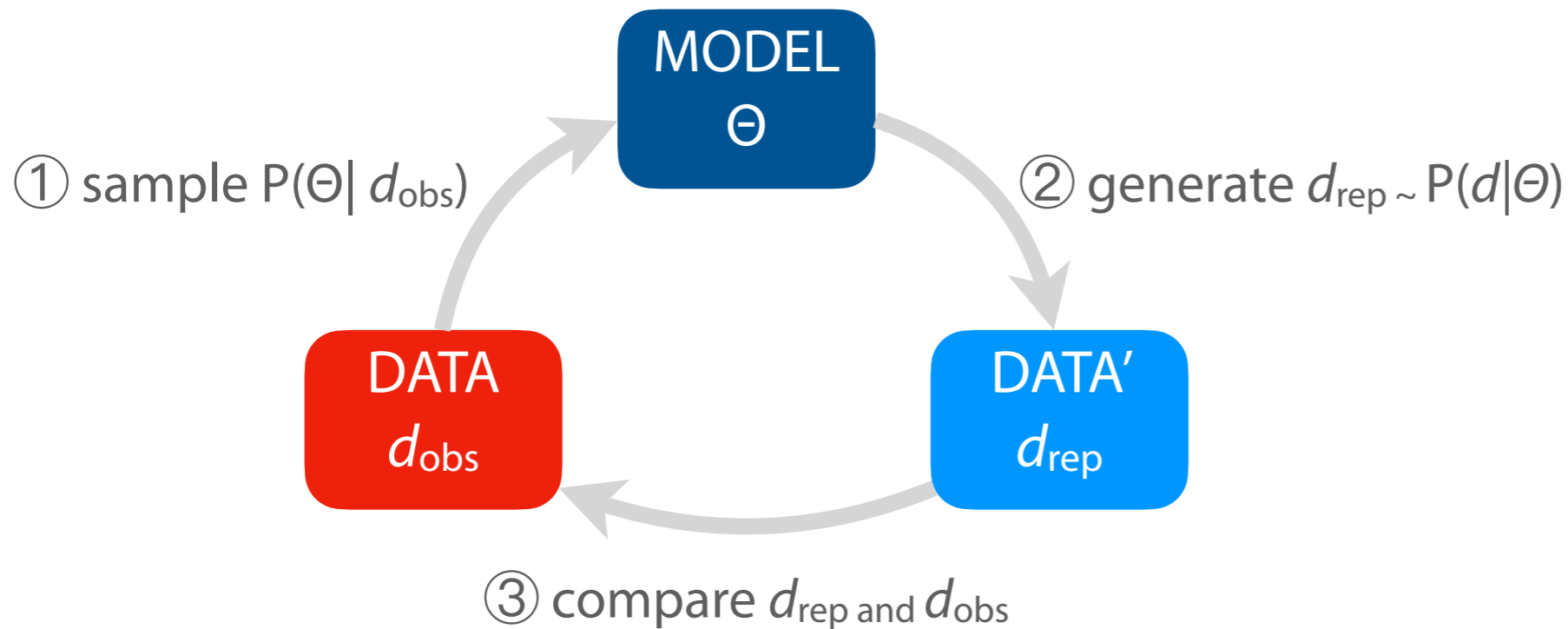


- ▶  $S_8=0.784\pm0.026$  at  $1.6\sigma$  from Planck
- ▶  $\Delta S_8=0.002$  from two-point function analysis (expected)

# Internal consistency

## ► Consistency in *data* space

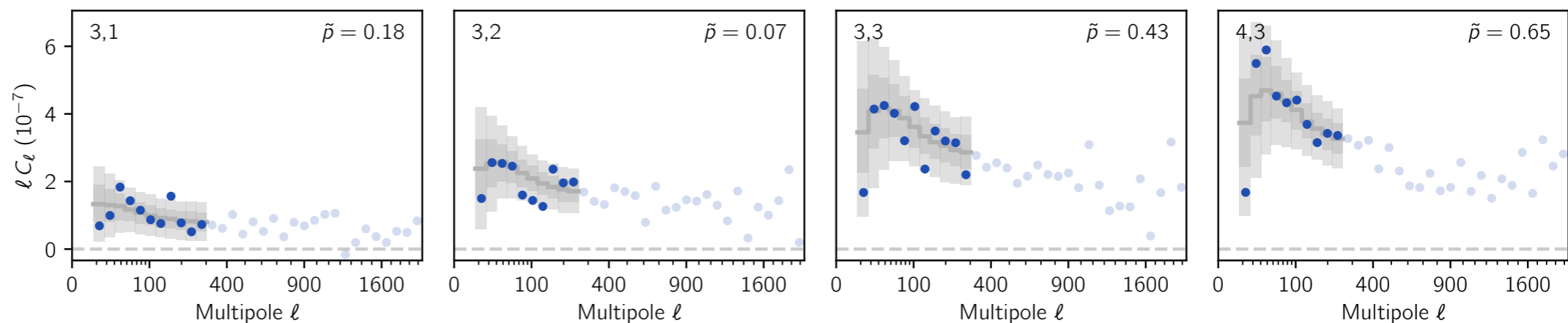
- Posterior predictive distribution (PPD) method *Doux+21* [DES Y3]



Jessie Muir | [#darkbites](#)

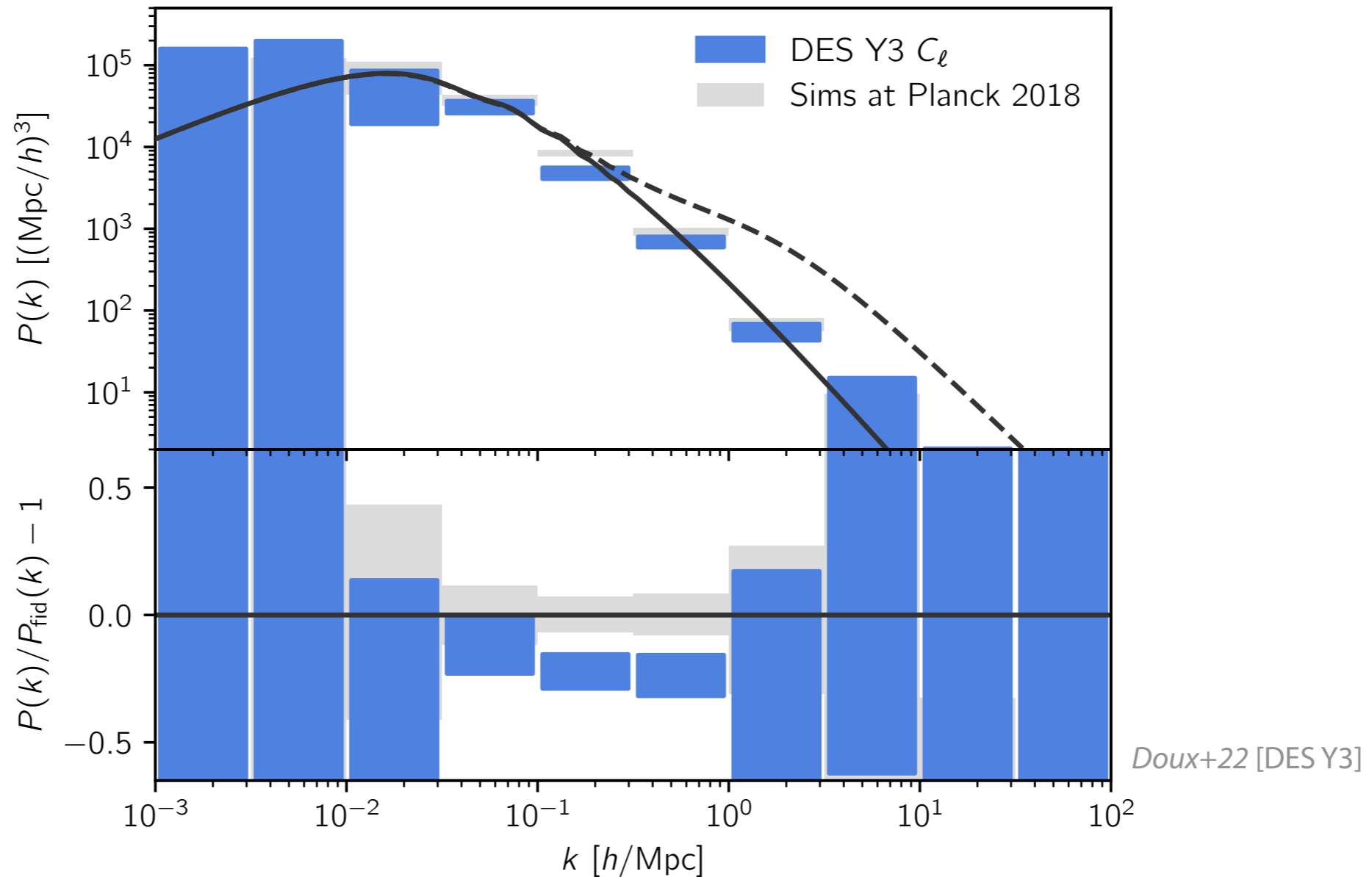
- Test *goodness-of-fit* and *internal consistency*: splitting data according to redshift, scales, etc

Example:  
redshift bin 3 vs  
bins 1,2,4



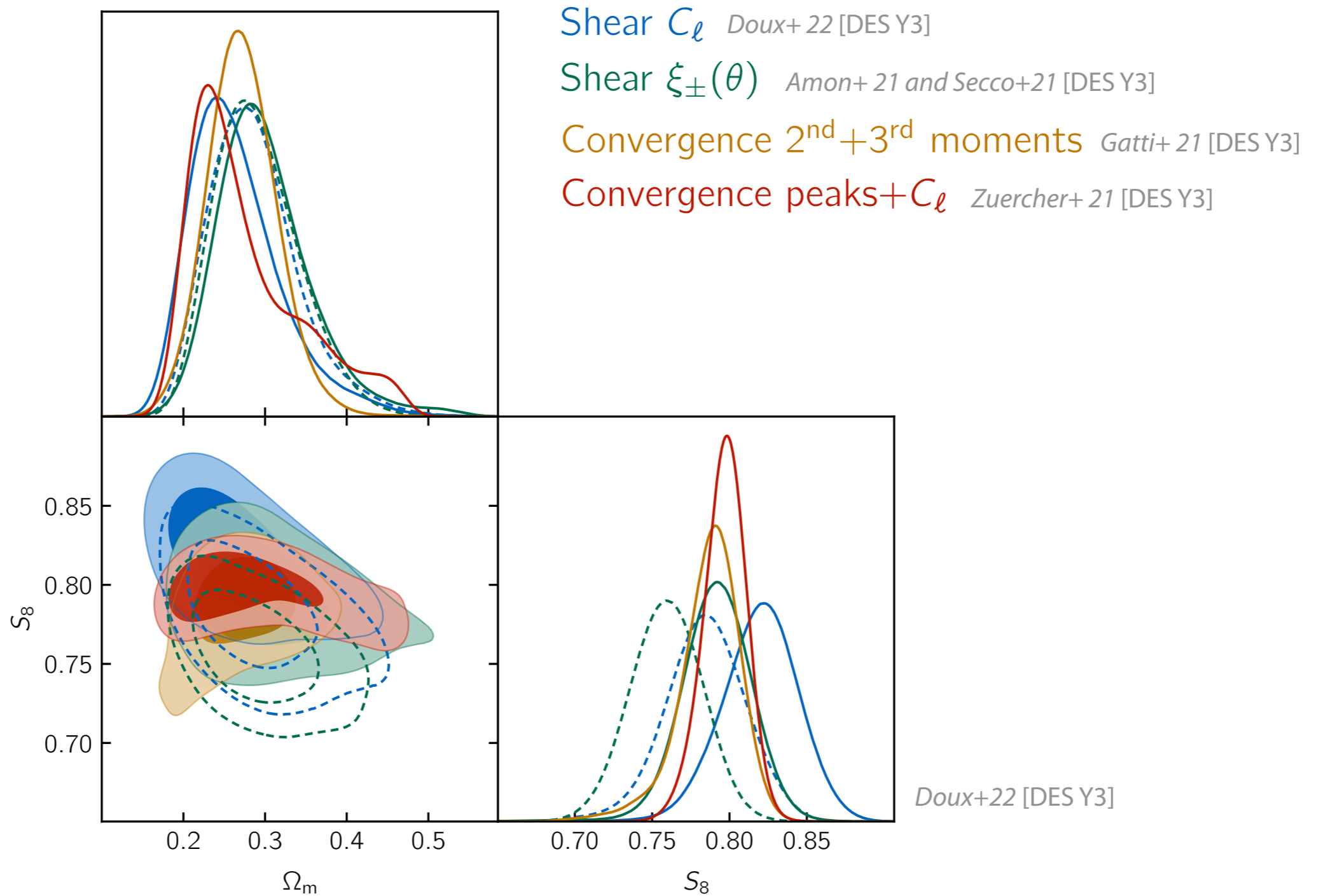
- We found strong level of consistency between *all* data and the model

# Reconstructing the power spectrum



- ▶ **IDEA** : *approximate* reconstruction by inverting  $C_\ell = F[ P(k) ]$
- ▶ **RESULT** :  $P(k)$  found  $\sim 20\%$  lower than Planck in 0.03 to 1  $h/\text{Mpc}$

# Gaussian vs non-Gaussian statistics



(CAVEAT: this comparison requires fixing the total neutrino mass and using a simpler IA model)

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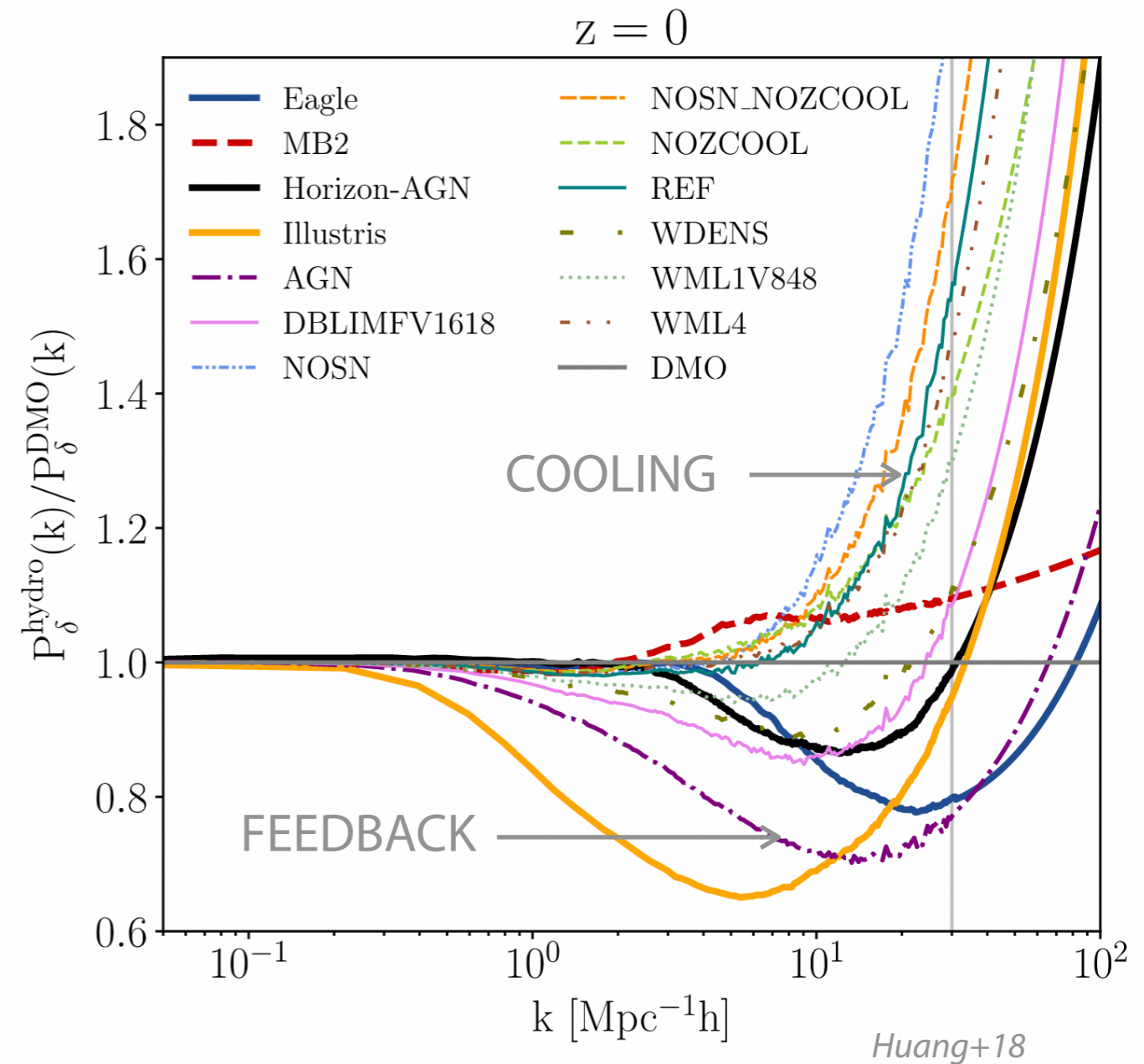
# Impact of baryons

## ► Impact of baryons

- Baryons redistribute matter
- Suppression of power up to 30% at  $k \sim 1 h/\text{Mpc}$
- Broooooaaad variations across hydrodynamical simulations...

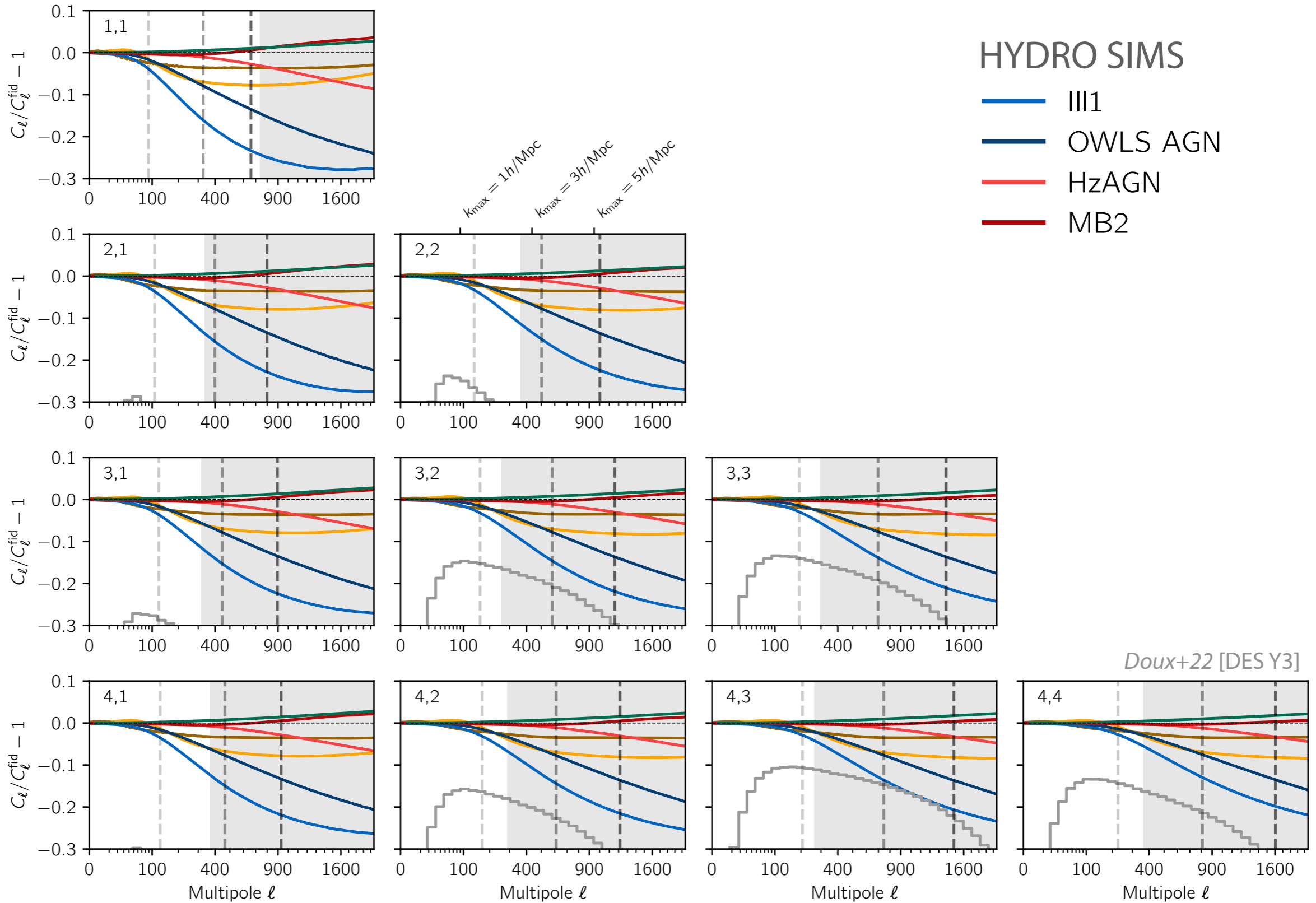
## ► DES Y3 fiducial approach

- Discards these scales !



# Baryons vs scale cuts

POWER SPECTRUM RESIDUALS



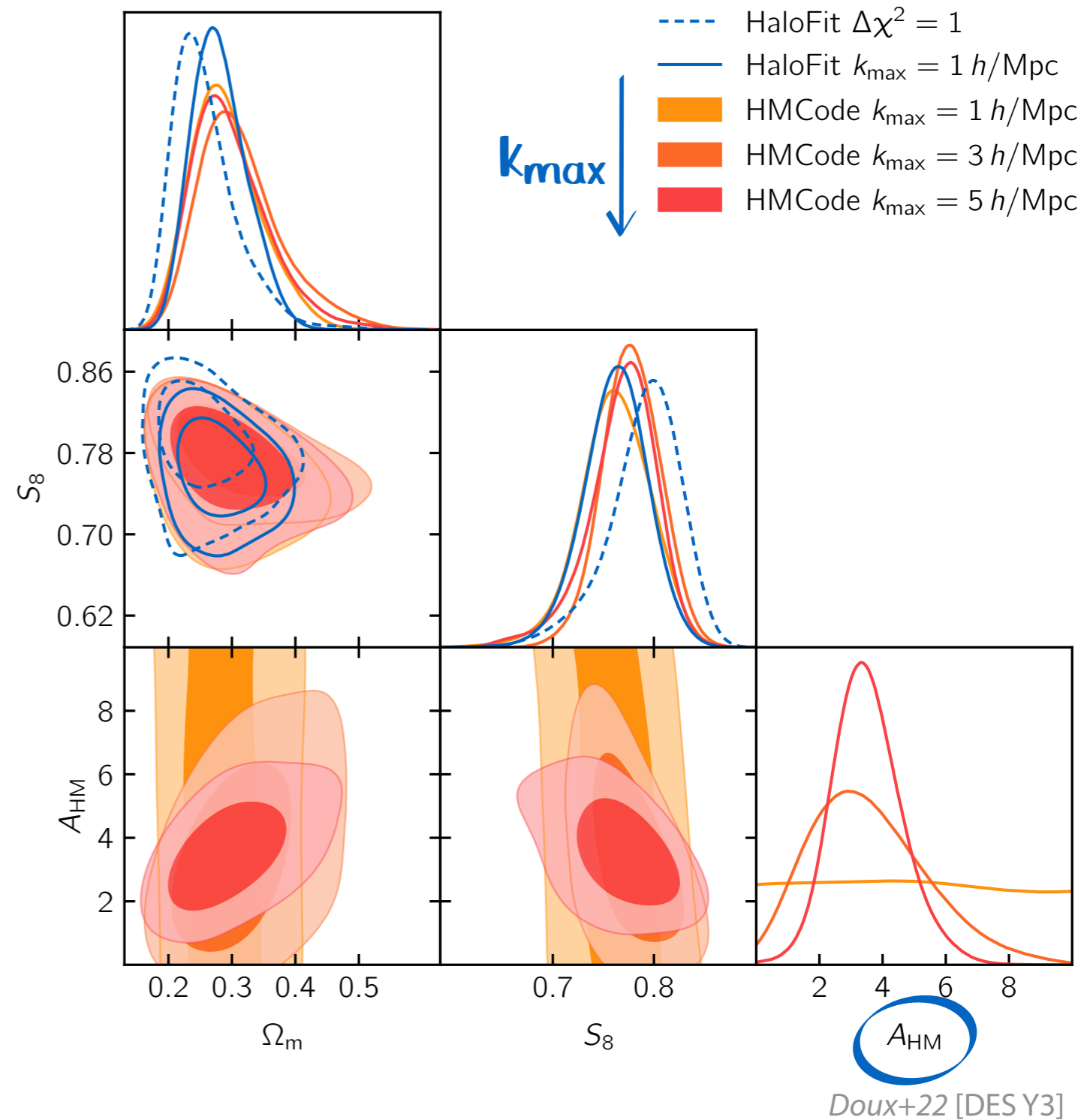
# Baryons vs scale cuts

## ► Alternative approach

- Model baryonic feedback with HMCode
  - $A_{\text{HM}}$  parameter
- Alternative scale cuts with *approximate 3D Fourier mode cut*  $k_{\text{max}}$ 
  - $k_{\text{max}}$  from 1 to 5  $h^{-1}\text{Mpc}$
  - $\ell_{\text{max}}$  from  $\sim 200$  to  $\sim 1600$

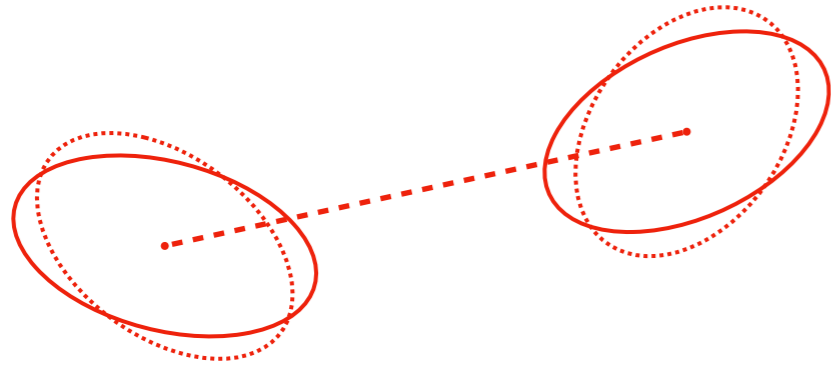
## ► DES Y3 results

- HMCode shown to recover various models on simulations
- Extra constraining power goes to baryonic feedback parameter !





# Intrinsic alignments

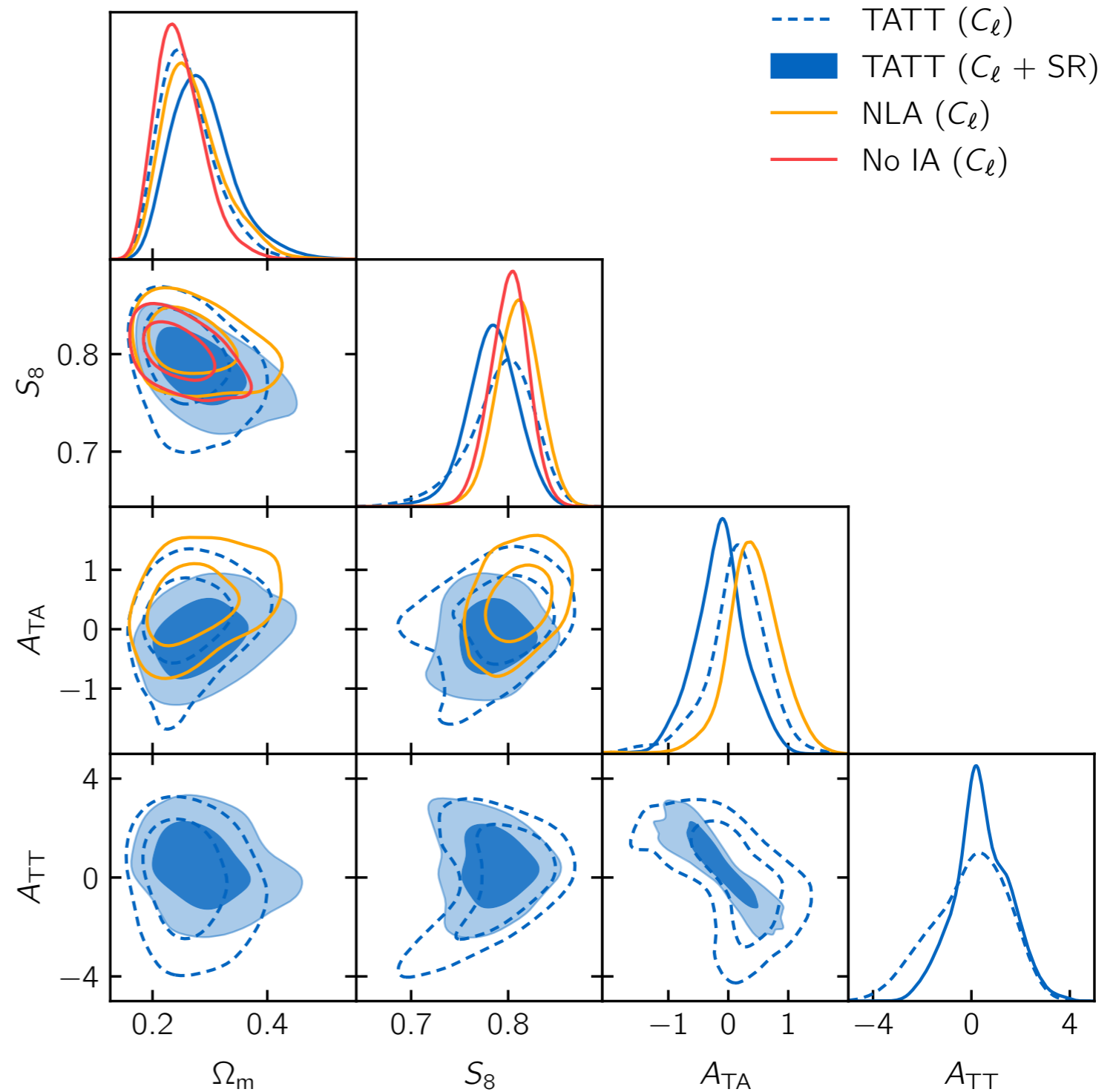


## ► IA modelling

- Tidal alignment (TA)  $\propto A_{TA}$
- Tidal torquing (TT)  $\propto A_{TT}$

## ► DES Y3 results

- Degeneracy partially broken by *shear ratios*
- More complex model (TATT) not favored by data over simpler one (NLA)



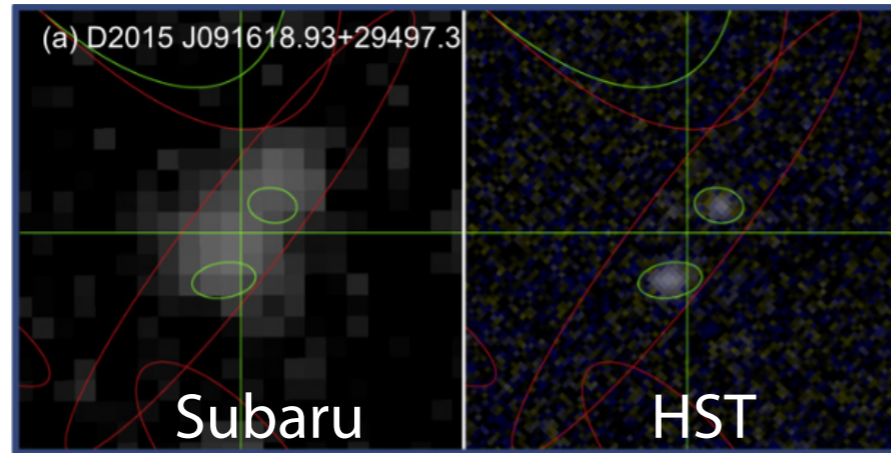
Doux+22 [DES Y3]

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# A preview of Rubin data from HSC...

62% of galaxies blended (Sanchez+21)

# Blending



Dawson+15

## ▶ Why is it an issue?

- ▶ 62% galaxies are blended at LSST's depth
- ▶ Discarding them? Statistical power ↓ and selection biases ↑
- ▶ Impacts detection and shape/flux measurements, *ie* all weak lensing science!

## ▶ Why is it difficult?

- ▶ Morphology of galaxies: Sérsic/de Vaucouleurs, bulge+disk profiles sufficient?
- ▶ Strongly tied to detection algorithm, eg *unrecognised* blends (see Manon's talk)



## ▸ Communication

- Conveners: James Buchanan and myself
- [#desc-blending](#)

## ▸ Current approaches coordinated with DM

- SCARLET: multi-band deblender using constrained optimisation *Melchior, Moolekamp++*
- METADETECT: corrects shear-dependent detection *Sheldon, Becker++*
- Synthetic source injection (SSI): pipeline being integrated to DM stack *Meyers++*

## ▸ DESC projects

- BLENDING TOOLKIT: simulation of blended images *Mendoza, Biswas, Boucaud++*
- +++

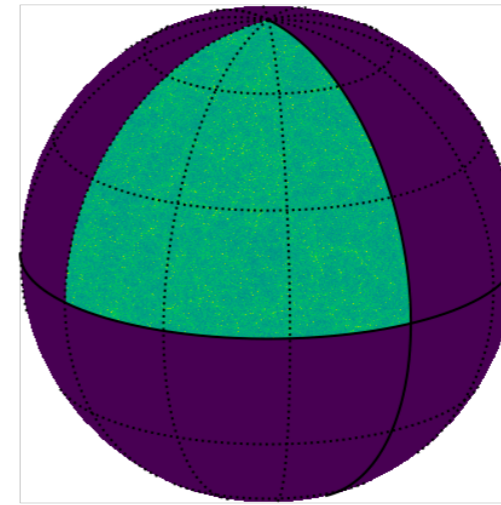
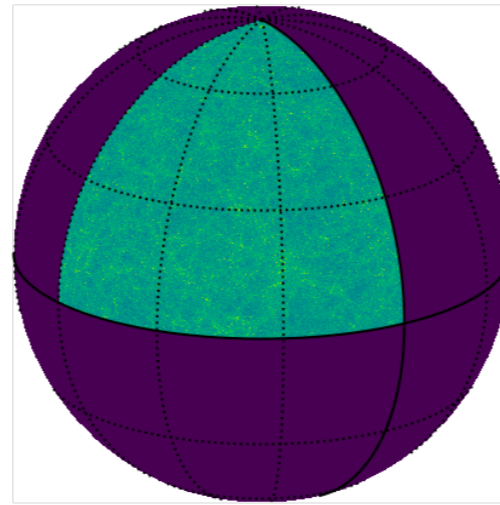
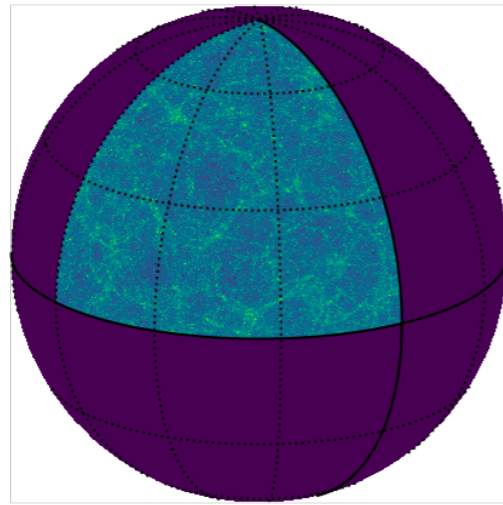
## ▸ Cross WG discussions

- [#desc-blxpz](#) : impact of blending on photometric redshift distributions
- [#desc-blxcl](#) : impact of blending on cluster cosmology

# Beyond two-point functions

## ► Higher-order statistics topical team

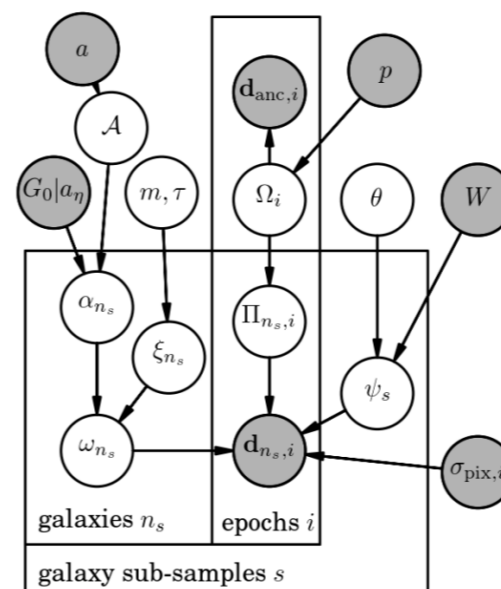
- Modelling of HOS: peaks, voids, 1D PDF, topological features, etc.
- Robustness to systematics



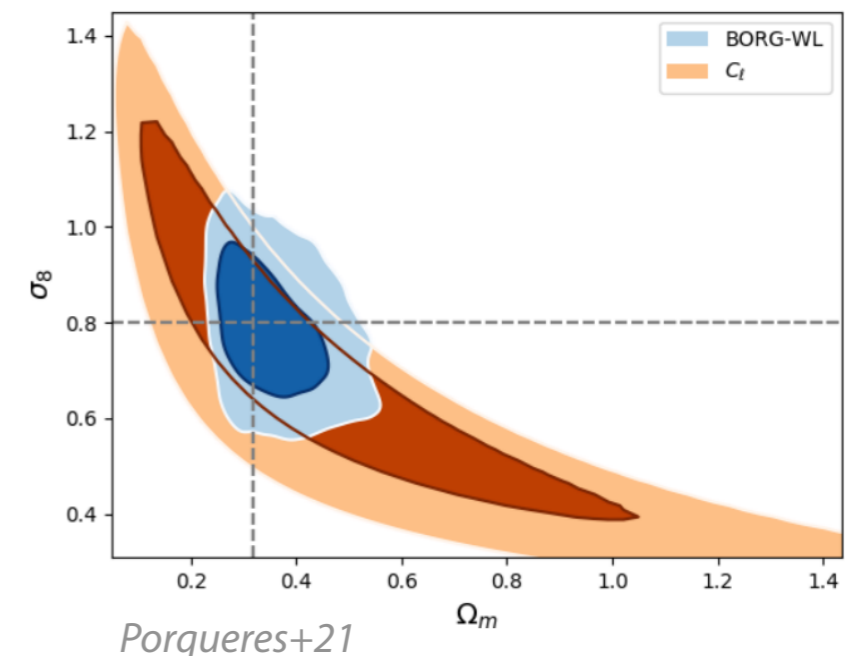
Computed from  
SLICS-HR  
(Harnois-Déraps)

## ► Bayesian pipelines topical team

- Cosmology to field to images forward-modelling
- Requires fast simulations/sampling techniques (eg differentiable sims)



Schneider+15



Porqueres+21

# Take-away messages

- ▶ Many algorithmic developments from DES Y3
  - ▶ PSF, deep-fields, joint redshift and shear calibration, internal consistency
- ▶ Modelling uncertainties
  - ▶ Intrinsic alignments
  - ▶ Small-scale matter power spectrum
    - ▶ Non-linearities and baryonic feedback
    - ▶ More data > more stringent scale cuts > constraints ??
- ▶ Weak lensing with Rubin
  - ▶ Blending impact on detection/measurement
  - ▶ Capturing more information with higher-order statistics and Bayesian pipelines, if modelling available...

A night sky filled with stars and the Milky Way galaxy. In the foreground, two observatory domes are visible. The dome on the right is illuminated with a bright red light, while the one on the left is in silhouette. The text "Thanks!" is centered in the sky.

Thanks!