



The bright and the dark side of gravitational lensing

Daniel Gruen, NASA Einstein Fellow

with collaborators from the Dark Energy Survey

LineA Webinar, Oct 5, 2017

Structure of this talk

- Introduction
 - dark energy from geometry and structure
 - Dark Energy Survey
 - weak gravitational lensing
- DES Year 1 Results
 - control of systematic uncertainties
 - cosmology from lensing and galaxy clustering
 - matter/galaxy PDF with lensing + counts in cells

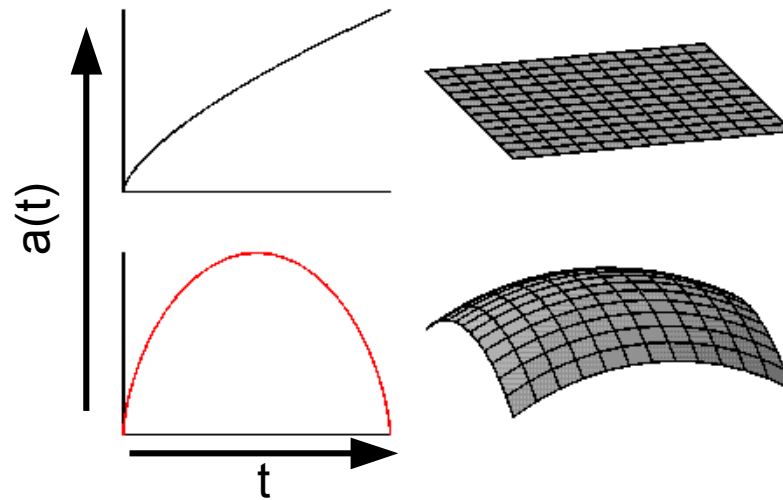
What goes up must come down?

- on large scales, Universe described as homogenous fluid in expanding space

$$\frac{\ddot{a}}{a} = -\frac{4\pi G}{3} \left(\rho + \frac{3p}{c^2} \right)$$

matter, radiation,
relativistic species:
pressure $p \geq 0$

scale factor
of Universe



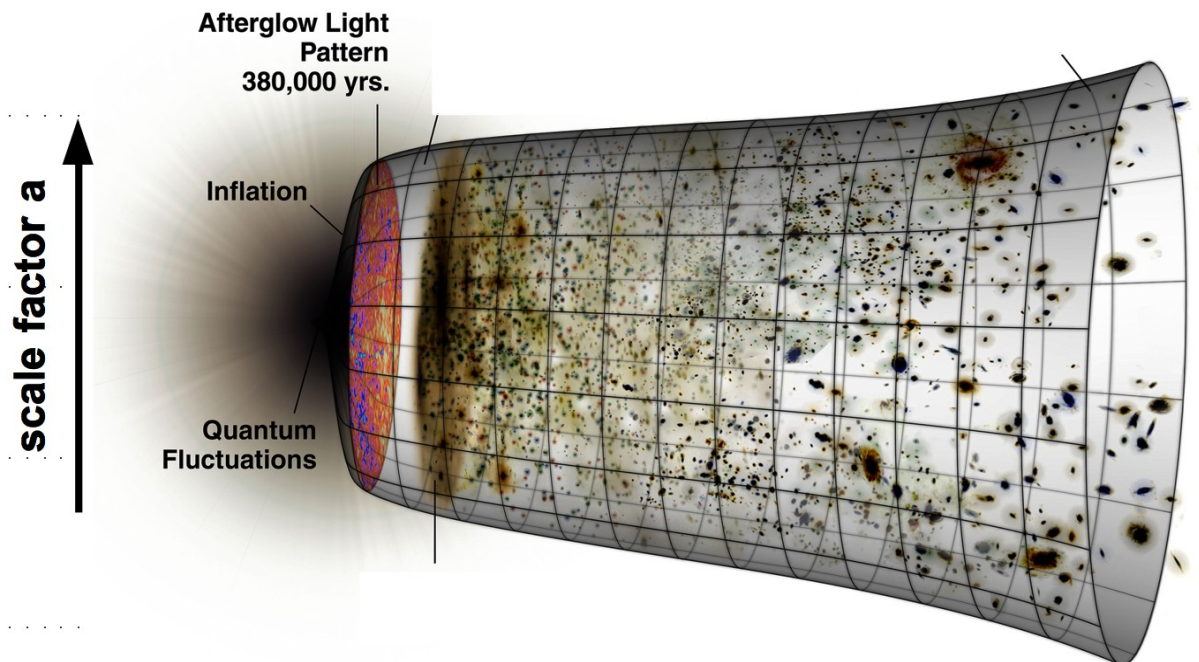
What goes up keeps getting faster!

- on large scales, Universe described as homogenous fluid in expanding space

$$\frac{\ddot{a}}{a} = -\frac{4\pi G}{3} \left(\rho + \frac{3p}{c^2} \right) + \frac{\Lambda c^2}{3}$$

scale factor
of Universe

cosmological
constant
=
vacuum
energy
=
substance
with negative
pressure,
“w= -1”



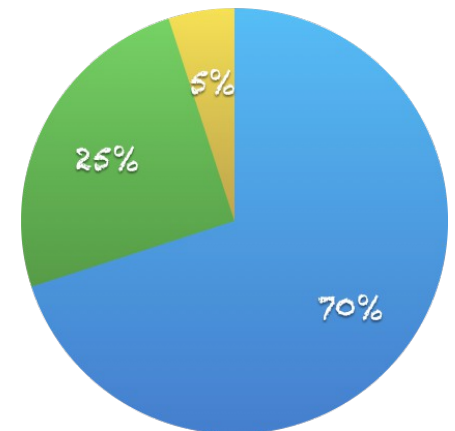
What goes up keeps getting faster!

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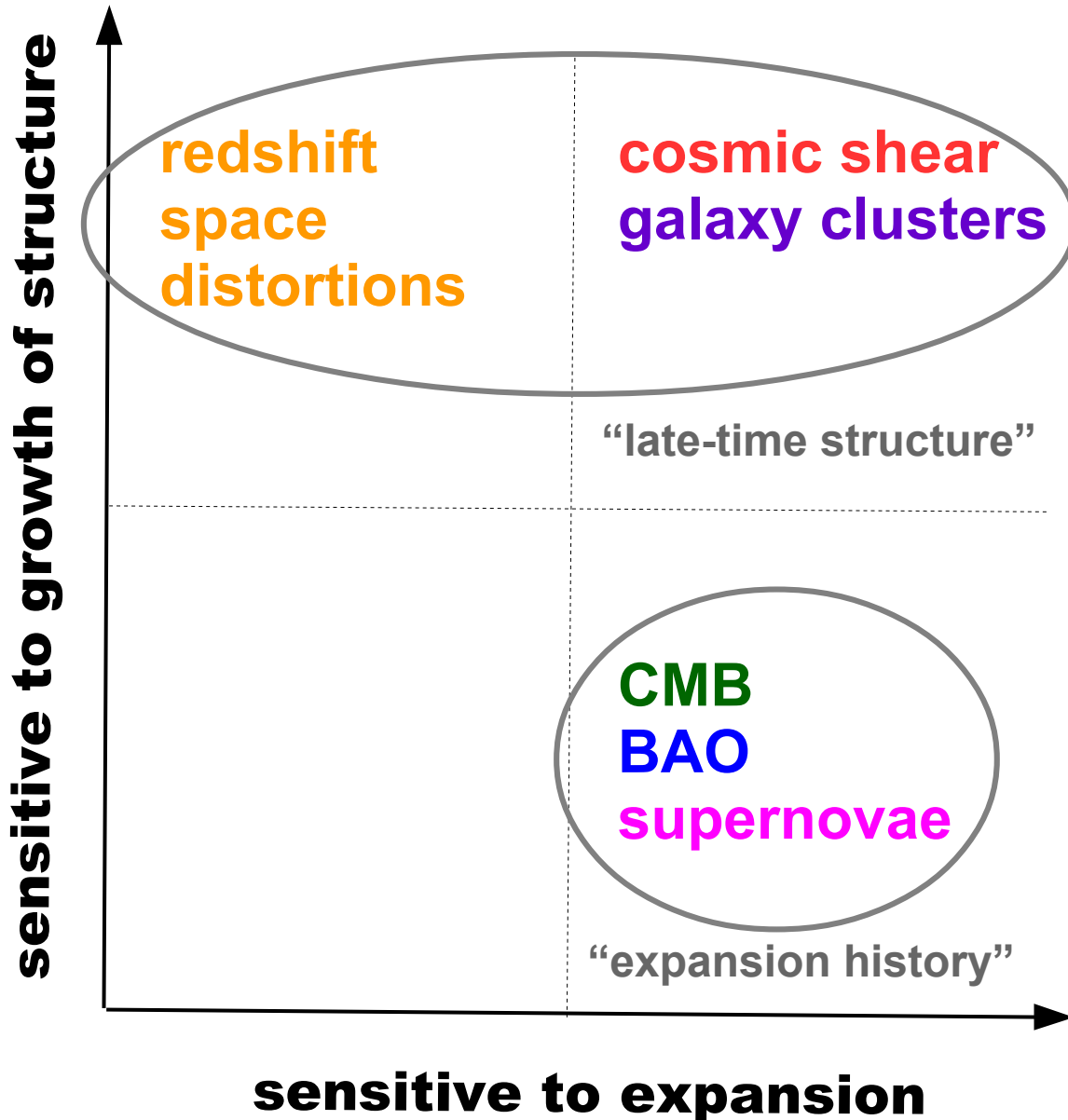
$$\frac{\ddot{a}}{a} = -\frac{4\pi G}{3} \left(\rho + \frac{3p}{c^2} \right) + \frac{\Lambda c^2}{3}$$

- Parameters of this universe:
 - Densities of matter ($\Omega_m \sim 0.3$), dark energy ($\Omega_\Lambda \sim 0.7$), baryons (~ 0.05), neutrinos
 - Amplitude of structure $\sigma_8 \sim 0.8$
 - Expansion rate H

“fiducial cosmology”



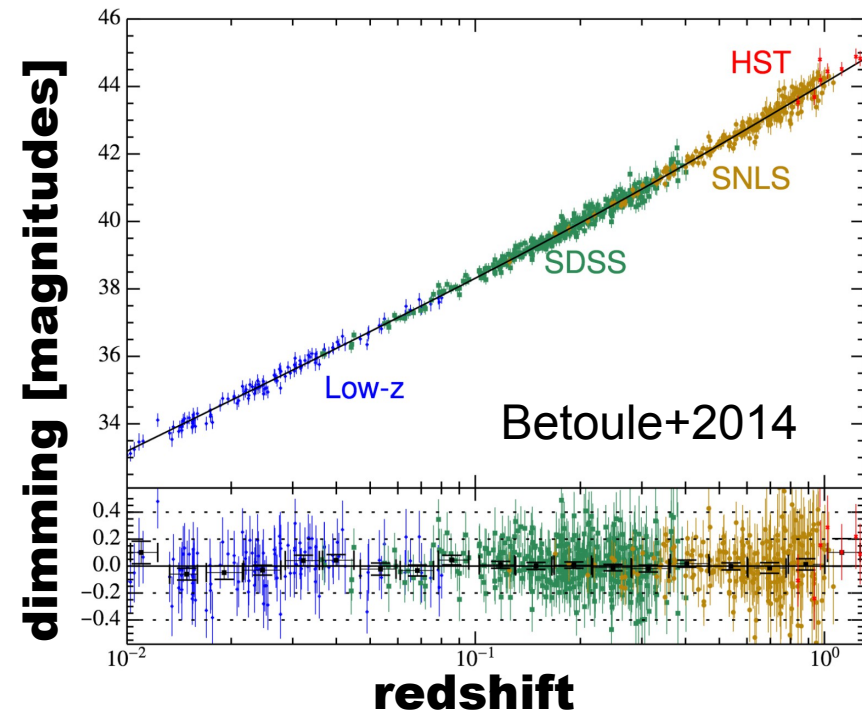
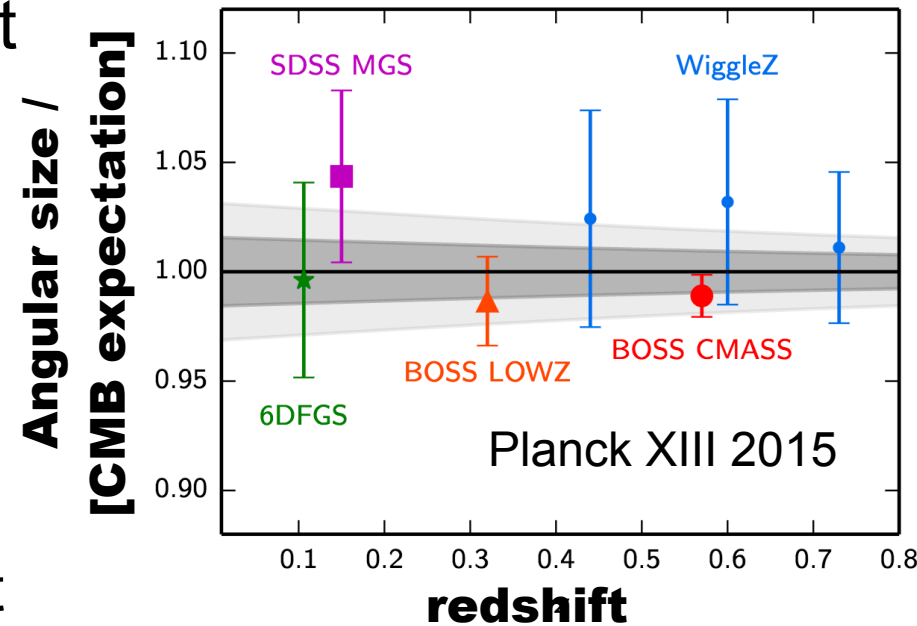
How to survey Dark Energy



Q: Do all these measurements agree with predictions in the same, fiducial Λ CDM model?

Measurements of expansion history

- Comparison of distance and redshift
- **Standard ruler:**
angle subtended by known scale
 - **CMB:** sound horizon in early Universe (380,000 years)
 - **BAO:** same scale, but expanded at later times (billions of years)
- **Standard candle:** brightness of source with known luminosity
 - **SNe:** luminosity can be determined from duration/color
- These are consistent and very tightly constrain $w=-1$, Ω_m , Ω_{DE} , flatness



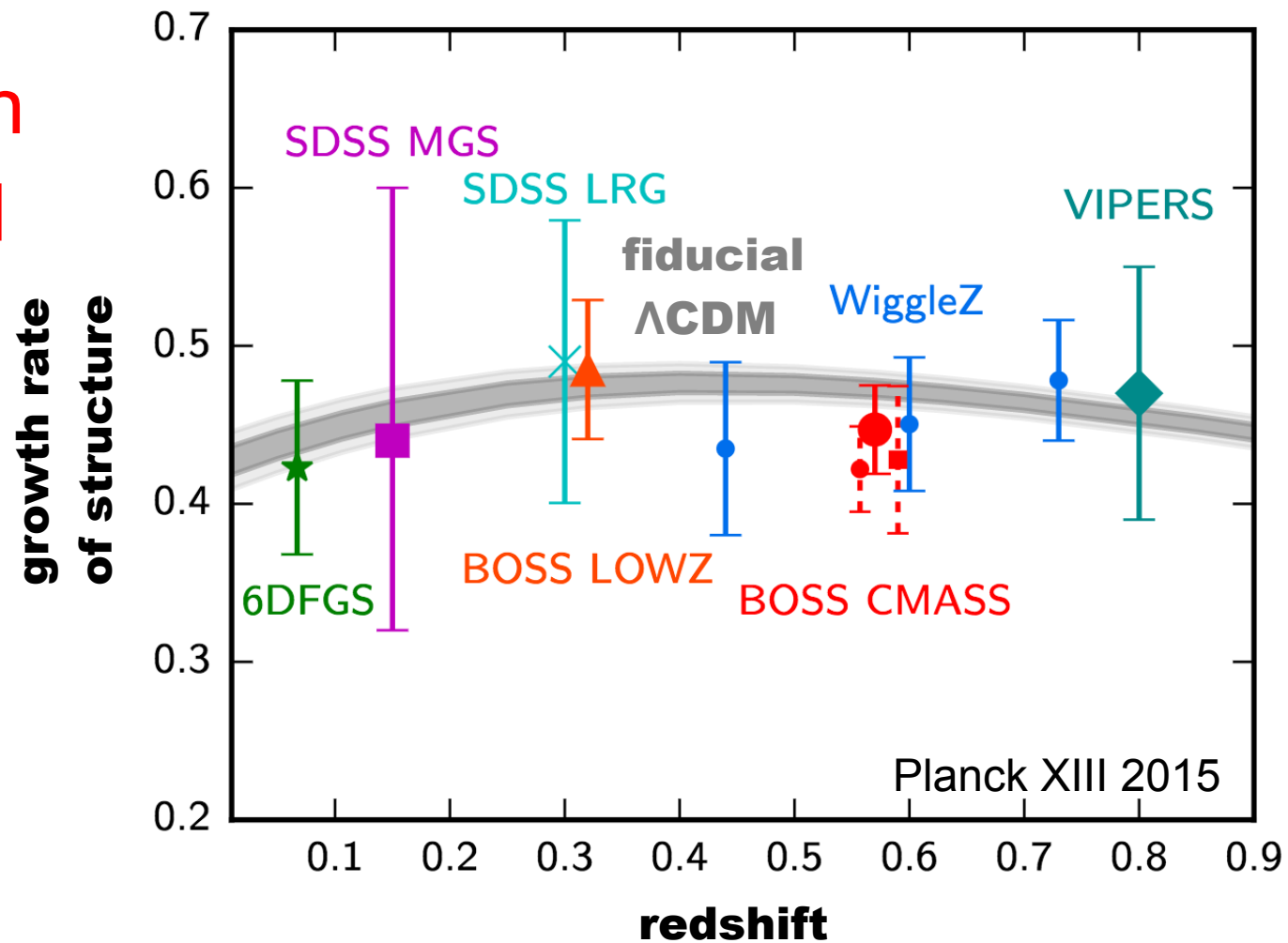
Measurement of late-time structure

- redshift space distortions

(RSD):

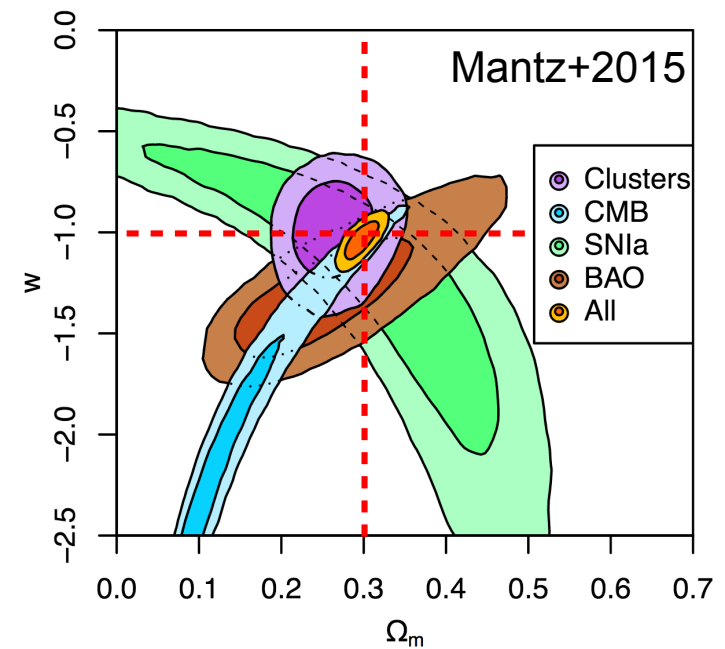
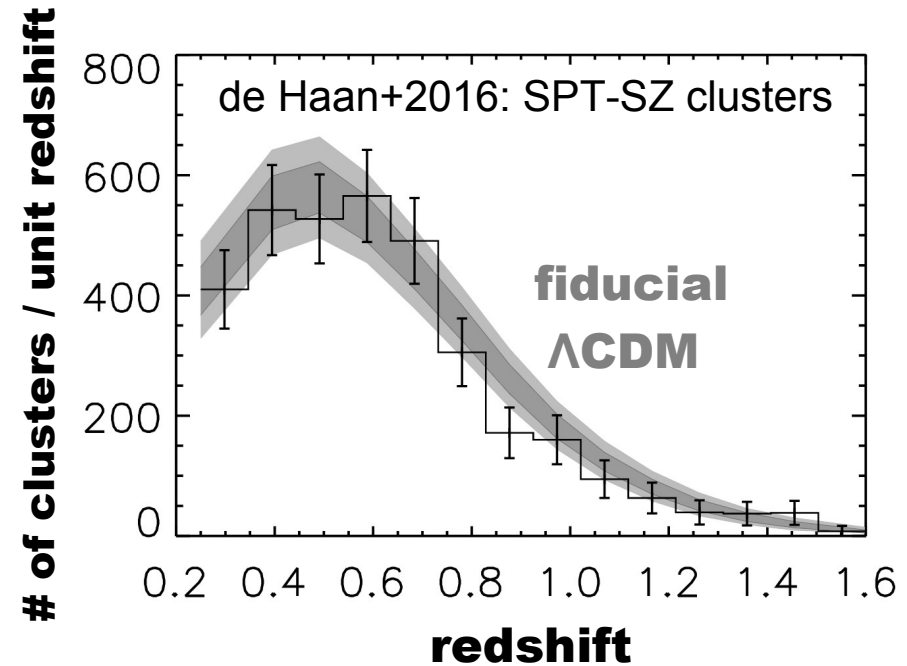
growth rate

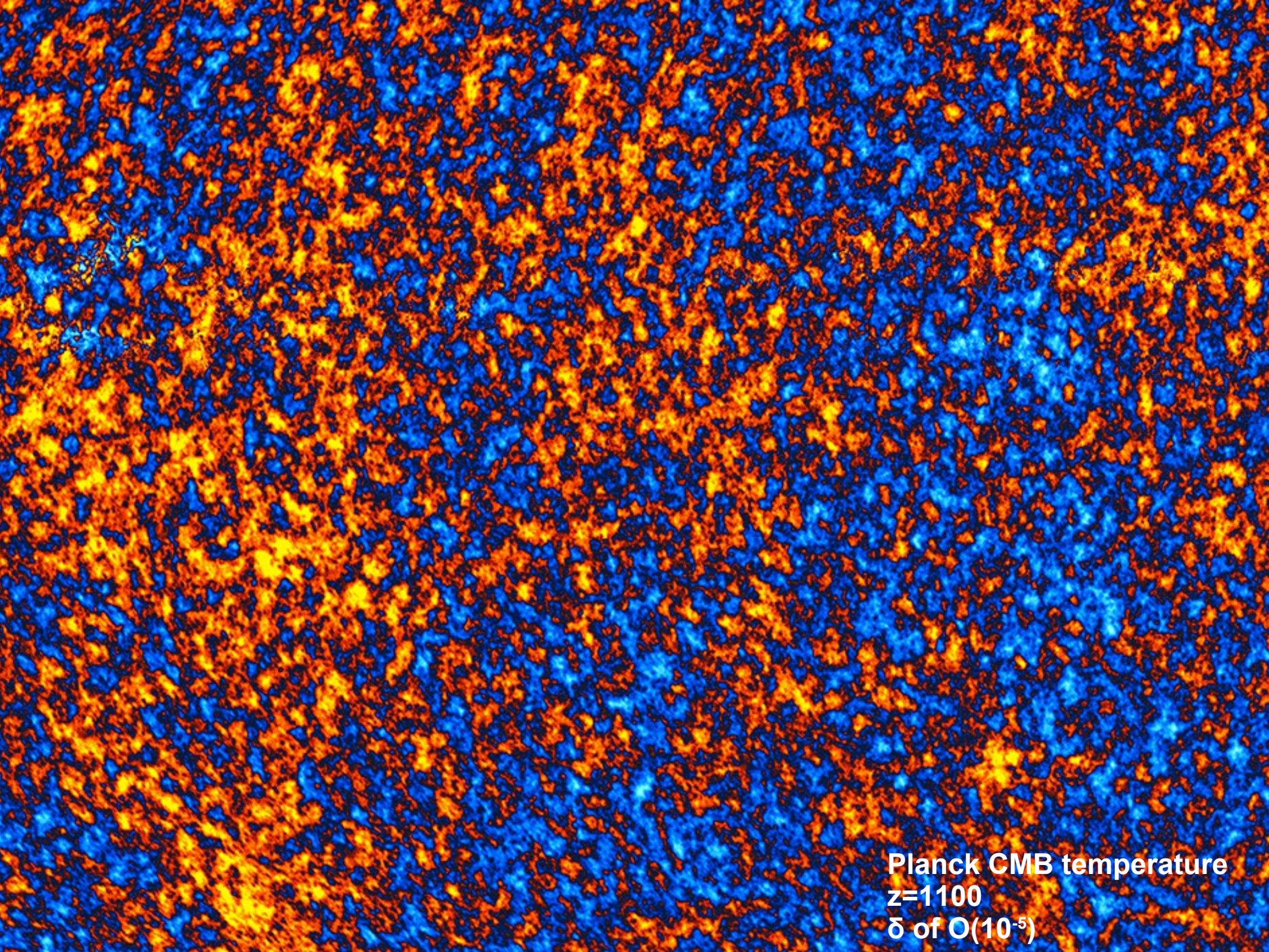
consistent with
fiducial Λ CDM



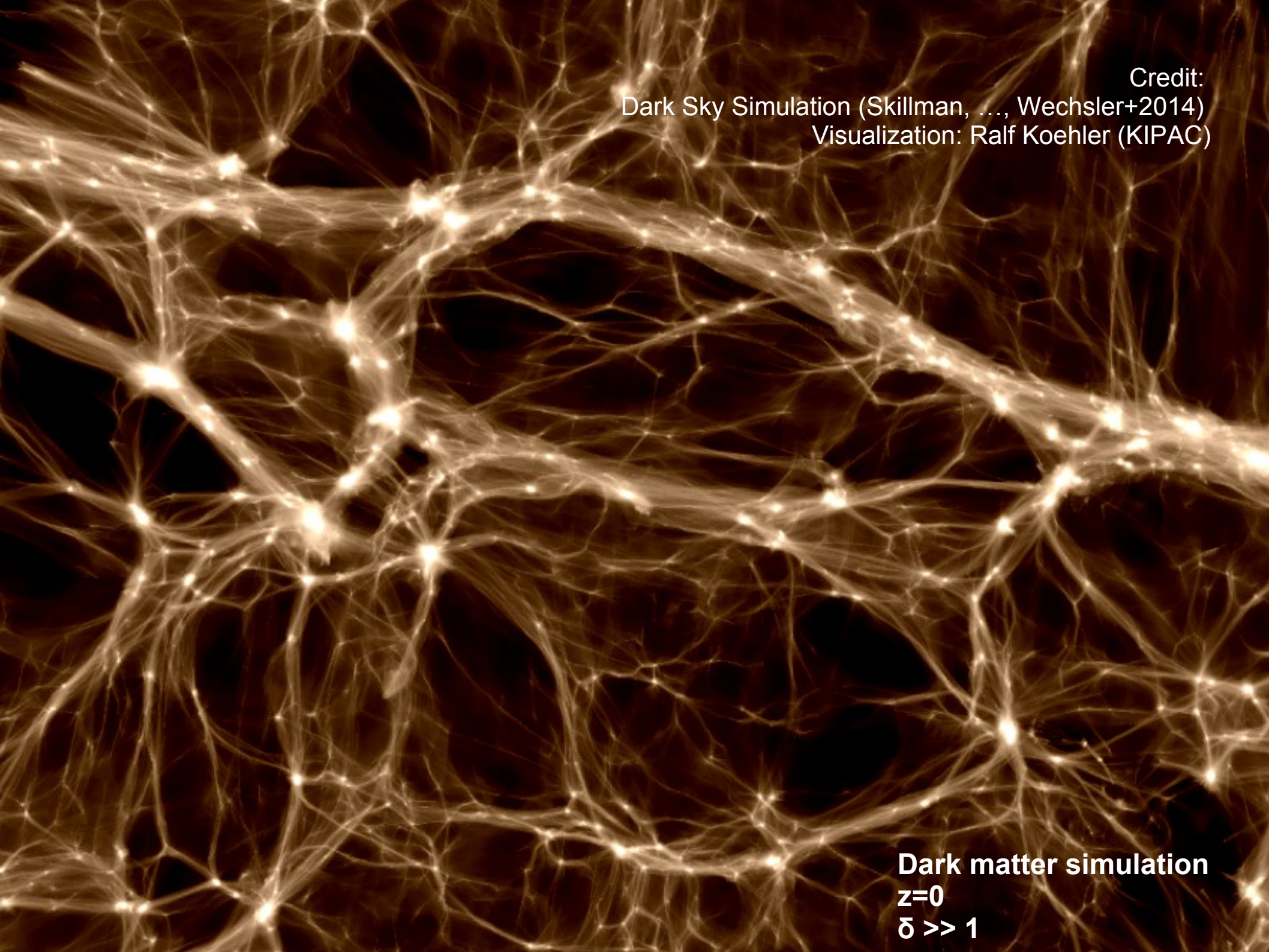
Measurement of late-time structure

- ✓ RSD
- Galaxy clusters:
count of clusters as a
function of mass and redshift
consistent with fiducial Λ CDM





Planck CMB temperature
z=1100
 δ of $O(10^{-5})$



Credit:
Dark Sky Simulation (Skillman, ..., Wechsler+2014)
Visualization: Ralf Koehler (KIPAC)

Dark matter simulation
 $z=0$
 $\delta \gg 1$

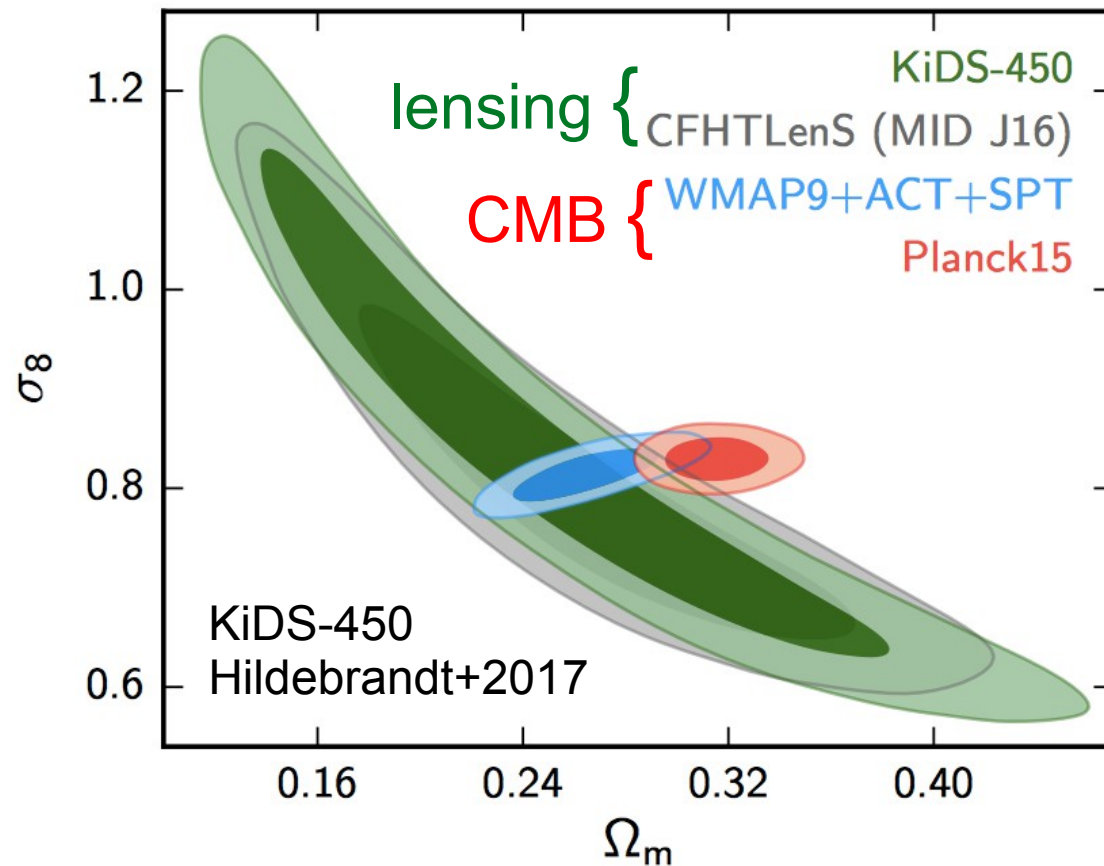
Measurement of late-time structure

- ✓ RSD
- ✓ Galaxy clusters
- cosmic shear:
 - recent studies have claimed 2-3 σ offset from Planck CMB in Ω_m - σ_8

A non-issue?

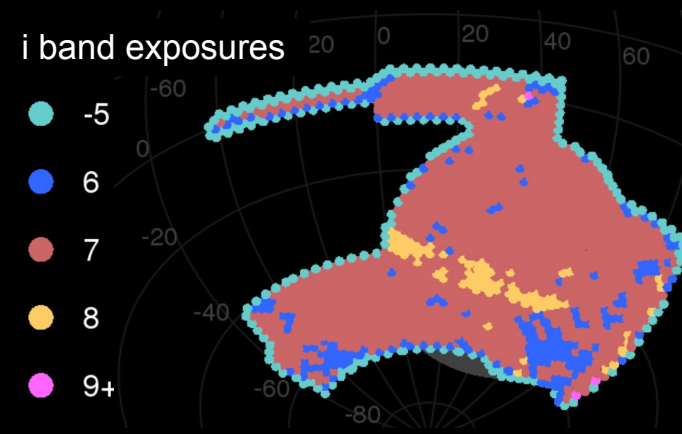
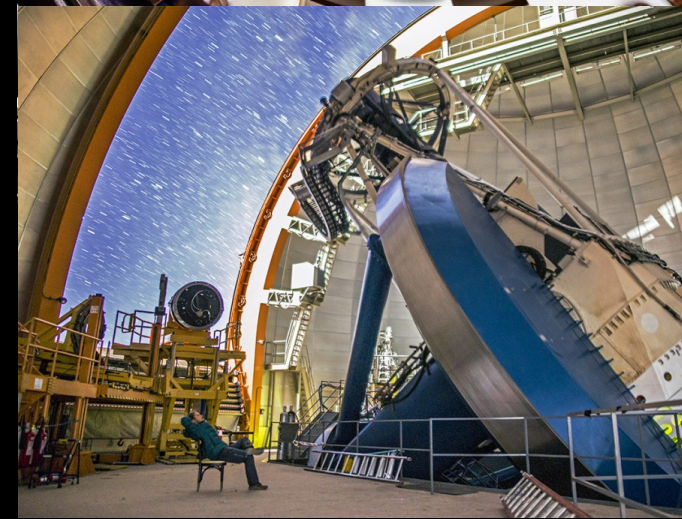
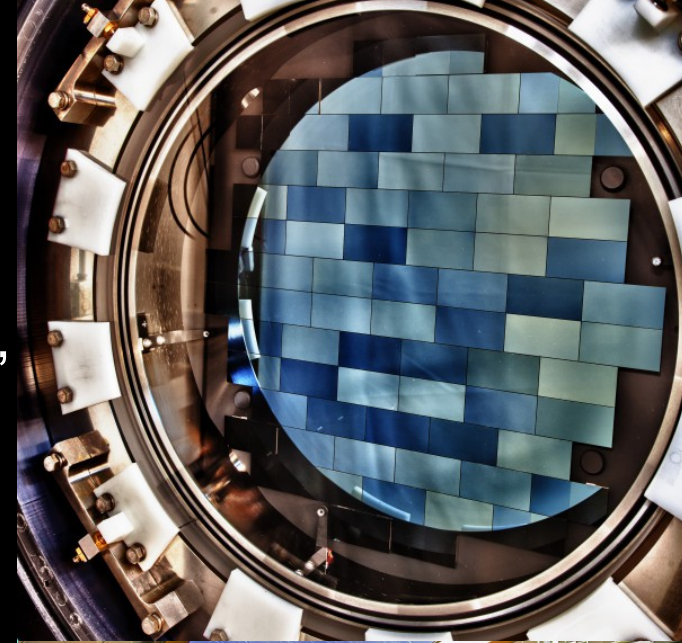
A crack in Λ CDM?

A systematic error?



The Dark Energy Survey

- 5000 sq. deg. survey in grizY from Blanco @ CTIO, 10 exposures, 5 years, >400 scientists
- Primary goal: dark energy equation of state
- Probes: Large scale structure, Supernovae, Cluster counts, Gravitational lensing
- Status:
 - SV (150 sq. deg, full depth): most science done, catalogs at <http://des.ncsa.illinois.edu>
 - Y1 (1500 sq. deg, 40% depth): data processed, results on cosmology today
 - Y3 (5000 sq. deg, 50% depth): data processed, vetting catalogs
 - Y4: data taking finished (70% depth)



Funded by:



U.S. DEPARTMENT OF
ENERGY

Office of
Science



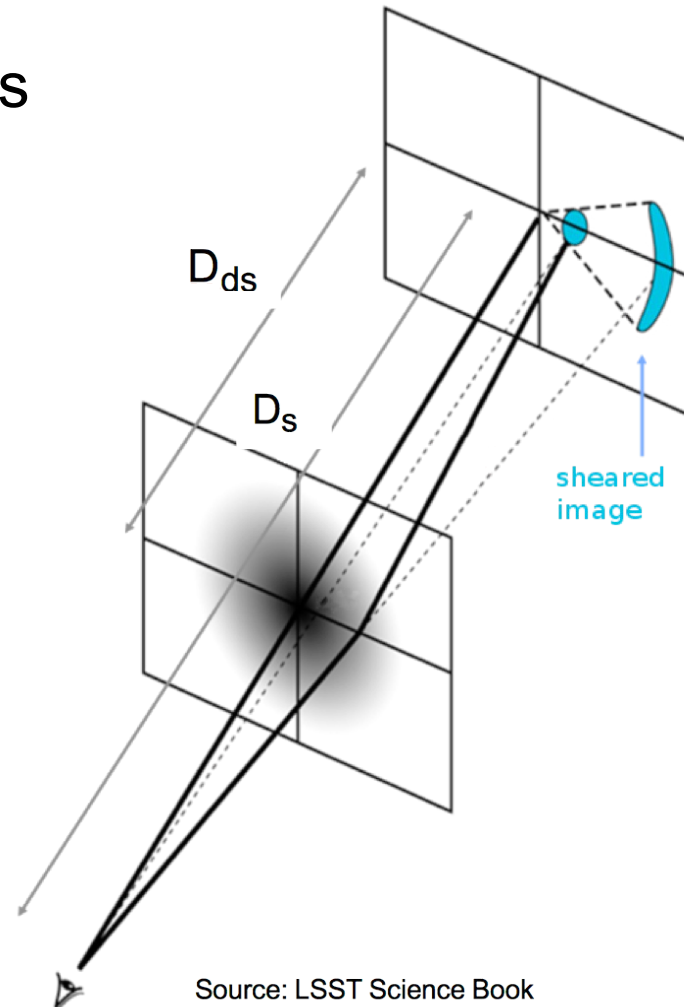
Collaborating
institutions:



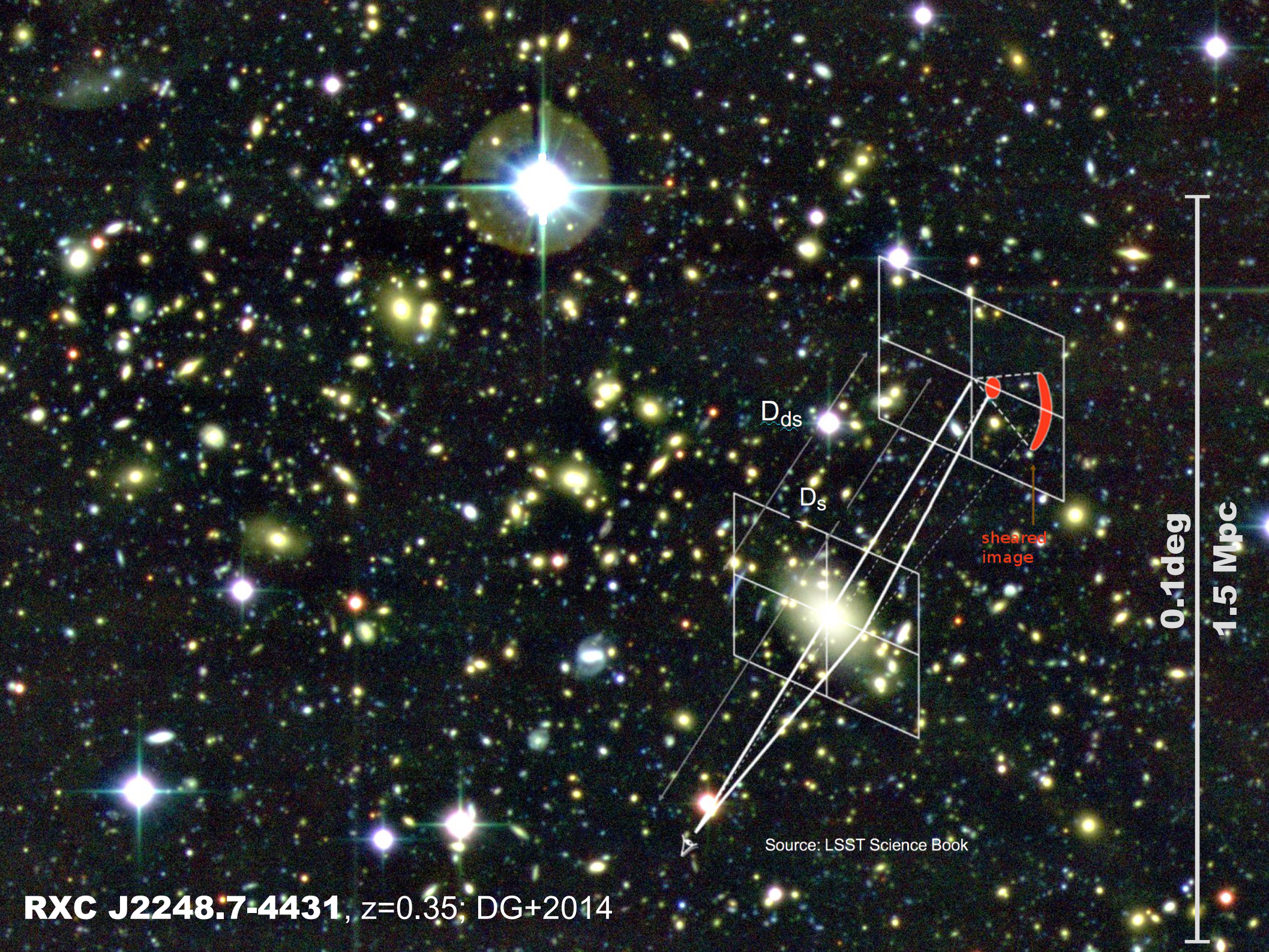
Gravitational lensing

- When light passes massive structures, it feels gravity and its path gets bent
- This causes shifting, and magnification, and shearing of the galaxy image

$$\gamma_t(\theta) = \langle \kappa(\theta') \rangle_{\theta' < \theta} - \kappa(\theta)$$
$$\kappa = \Sigma / \left[\frac{c^2}{4\pi G} \frac{D_s}{D_d D_{ds}} \right]$$



Source: LSST Science Book



D_{ds}

D_s

sheared image

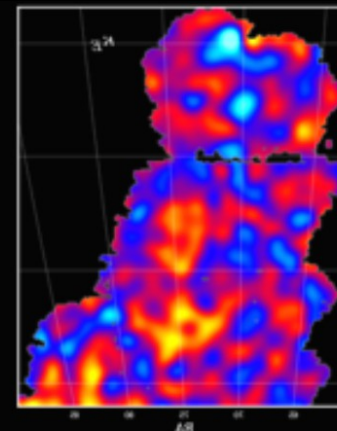
0.1deg

1.5 Mpc

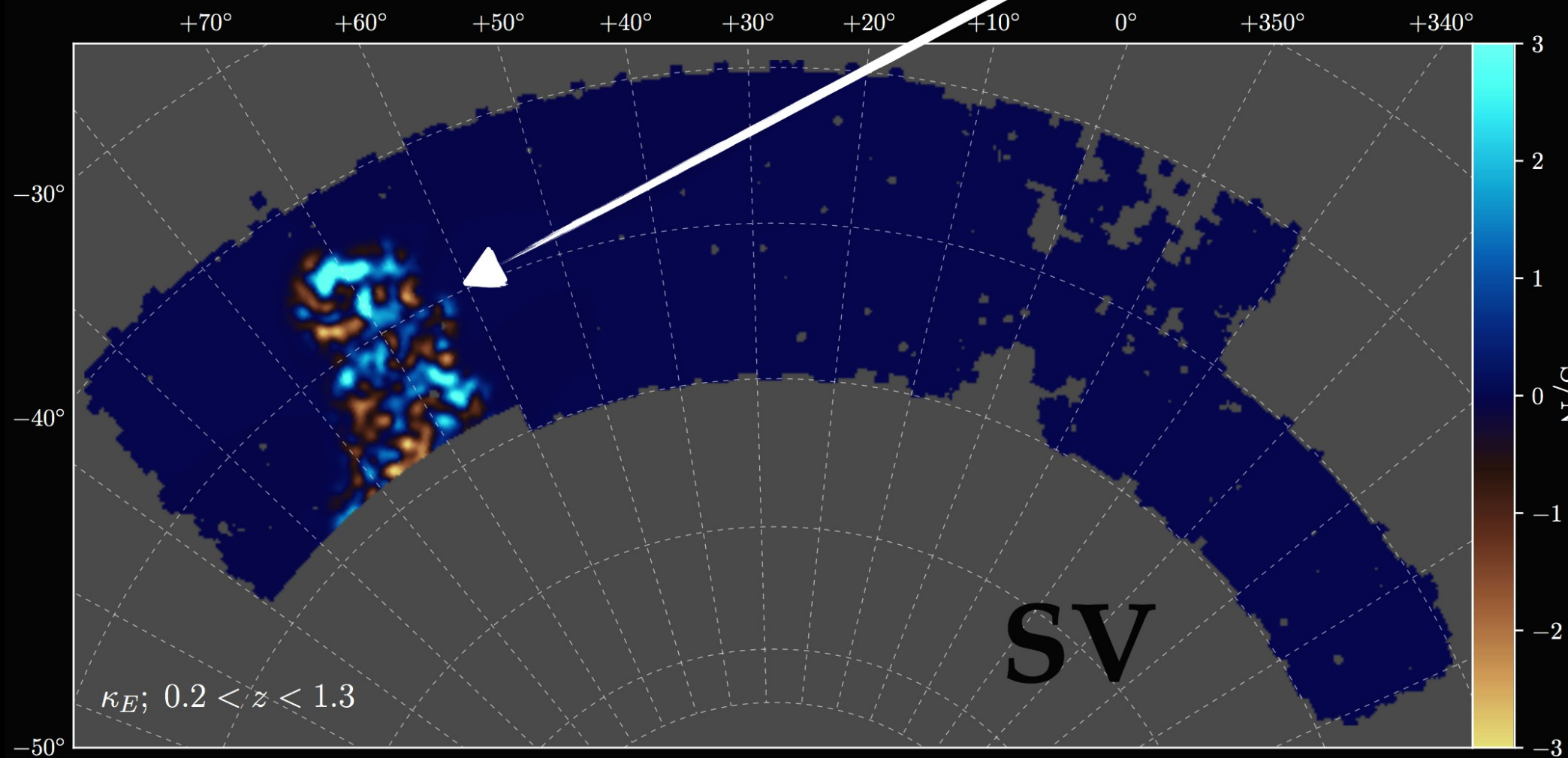
Source: LSST Science Book

RXC J2248.7-4431, $z=0.35$; DG+2014

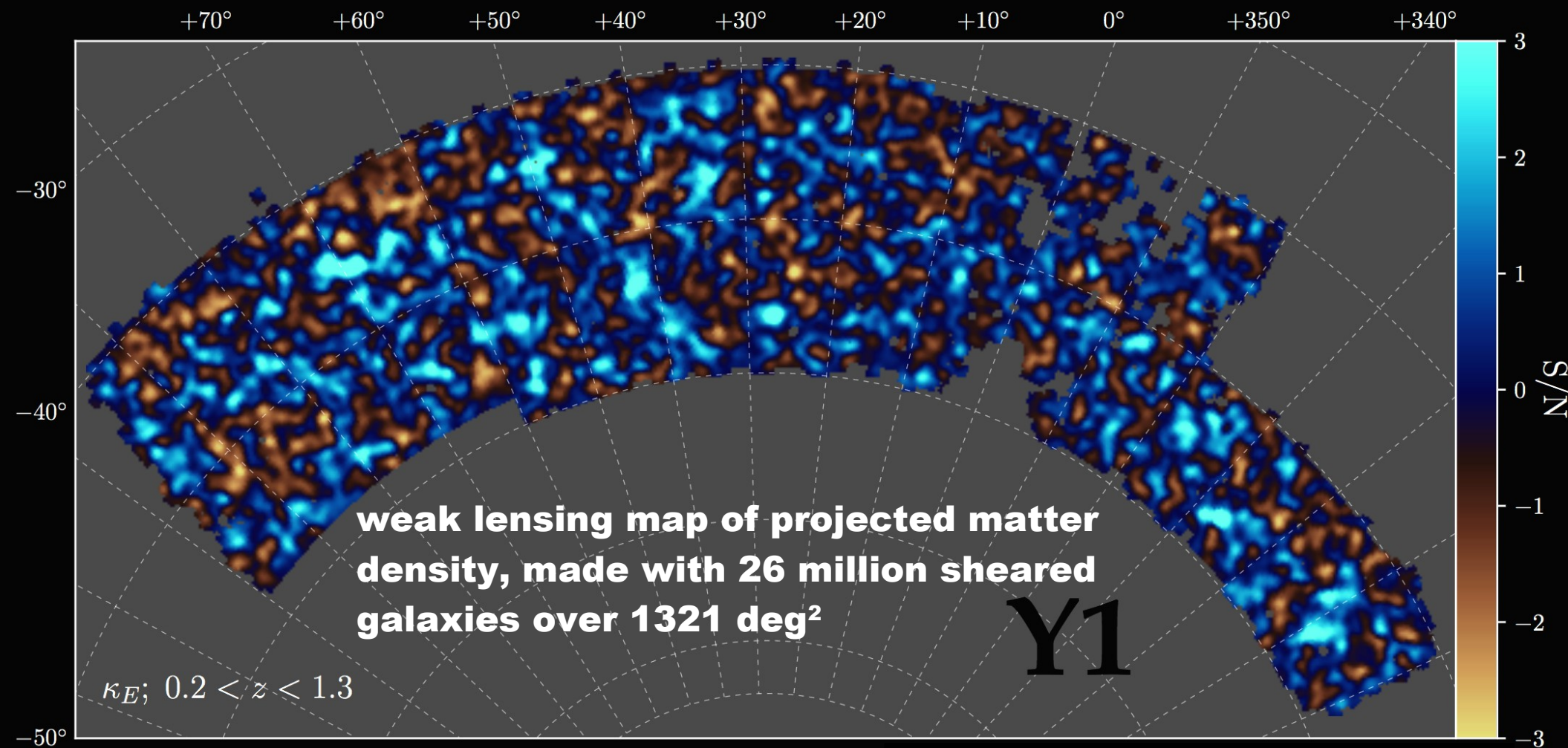
DES SV ...



Chang+;
Vikram+
2016



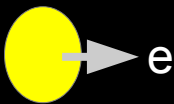
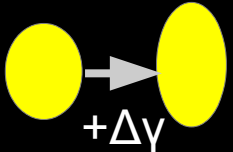
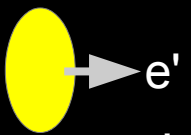
DES SV ... to Y1



With great statistical power comes great systematic responsibility

- two independent galaxy shape measurements, including novel metacalibration algorithm

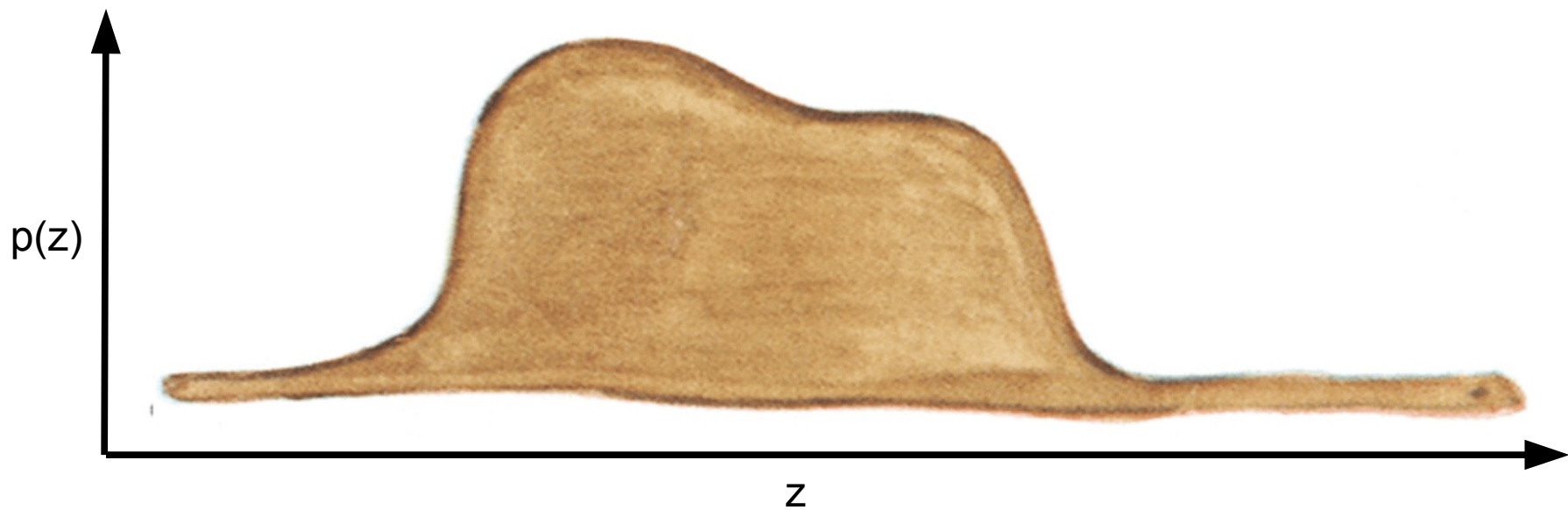
Metacalibration:

- apply biased estimator to image 
- manipulate image to include artificial (shear) signal 
- apply biased estimator to manipulated image 
→ derivative w.r.t. signal $\text{response} = \frac{e' - e}{\Delta\gamma}$
- related tricks to also correct *selection* bias

35 million galaxy shapes with systematic error <1.3% (68% C.L.)

Huff & Mandelbaum, Sheldon & Huff (2017); Zuntz, Sheldon+ (1708.01533)

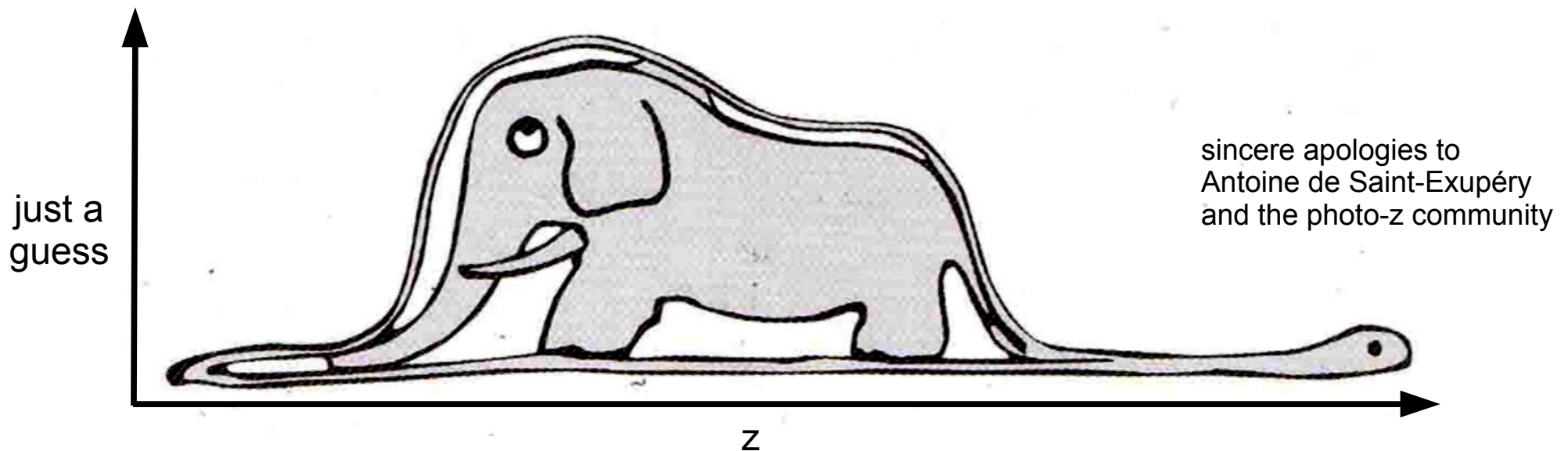
Photometric redshifts detour



Photometric redshifts are the elephant in the room

There is no “correct” photometric redshift estimate as of today:

- **template fitting** codes make arbitrary/wrong choices of templates and priors
 - no estimate for this systematic error – but it's surely $O(\text{few } \%)$!
- **machine learning** codes / **spec-z validation** uses non-representative sample
 - What is essential is invisible to the eye: these are **selected** by redshift, not just by color/magnitude → biases at $O(\text{few } \%)$ [Bonnett+2016, DG+2017]
- If you are working on photo-z without fixing those things – please reconsider



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Three ways out:

- **Clustering redshifts** – angular correlation with galaxies at known $z \propto n(z)$
- **Fully representative samples + unbiased matching** [Masters, Capac+2015 for spec-z, COSMOS/Alhambra/J-PAS/PAU for photo-z, DG+2017 for a matching method]
- **Bayesian hierarchical scheme** of priors+templates+n(z) [Leistedt+2016]

Simplification: for DES Y1 and current errors on $\langle z \rangle$, $n(z)$ shape error subdominant

Calibration of DES photo-z

COSMOS photo-z (Hoyle, DG+)

- For each source galaxy, pick closest matching COSMOS galaxy (χ^2 of griz, size)
- Run BPZ on COSMOS galaxy to assign to bin
- Use mean z_{COSMOS30} of bin as estimate of $\langle z \rangle$ of DES bin
- Uncertainty from cosmic variance + systematics of matching (sims), flux calibration, size match (data)
- ~ 0.02 mean z uncertainty

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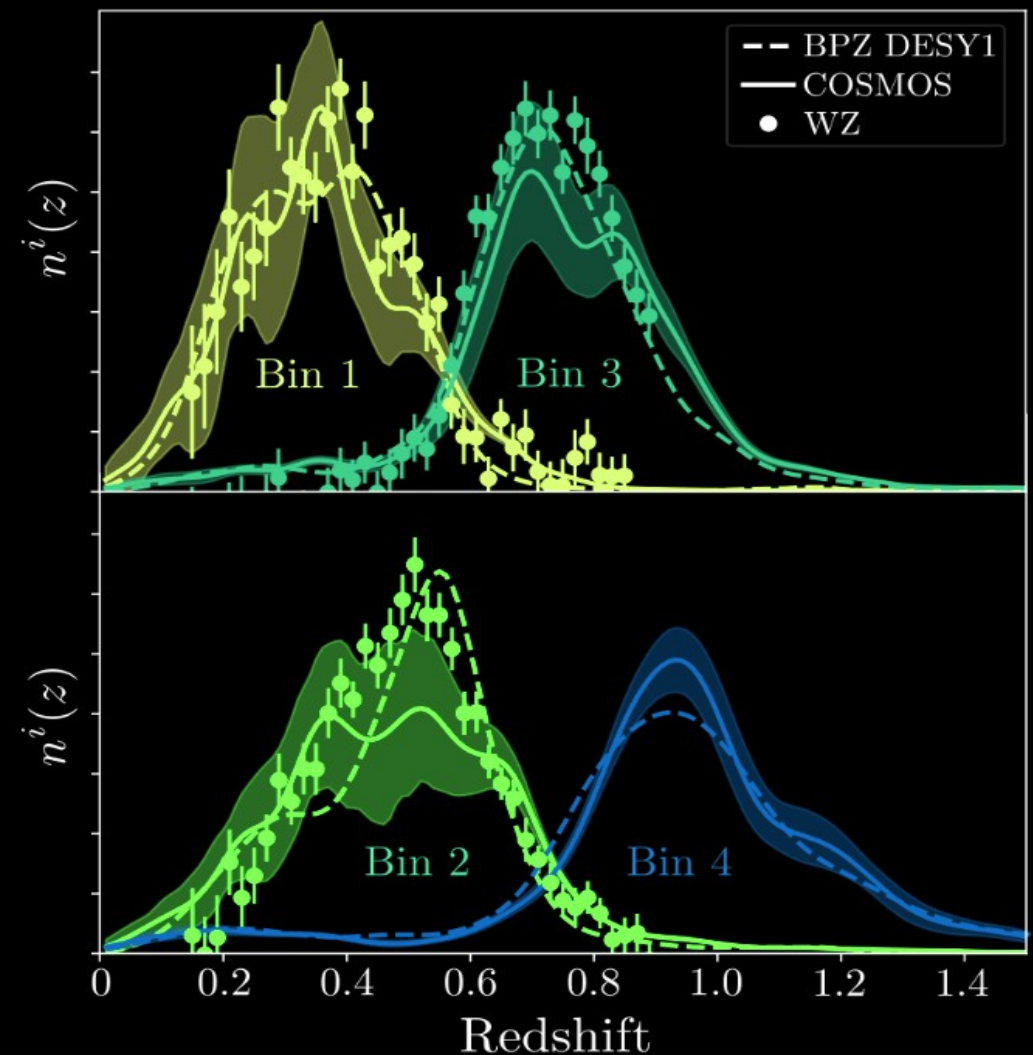
Clustering (Gatti, Vielzeuf+; Davis+)

- Measure clustering of lensing sources with redMaGiC LRGs as function of their redshift
- Shift BPZ estimate of source $n(z)$ to match these signals $\rightarrow \langle z \rangle$ of DES bin
- Uncertainty from simulations: dominated by z -evolution of galaxy bias and $n(z)$ shape mismatch
- ~ 0.02 mean z uncertainty

With great statistical power comes great systematic responsibility

- two independent galaxy shape measurements, including novel metacalibration algorithm
- two independent calibrations of photometric redshifts of four source bins

COSMOS + clustering methods agree, ~ 0.015 joint errors!

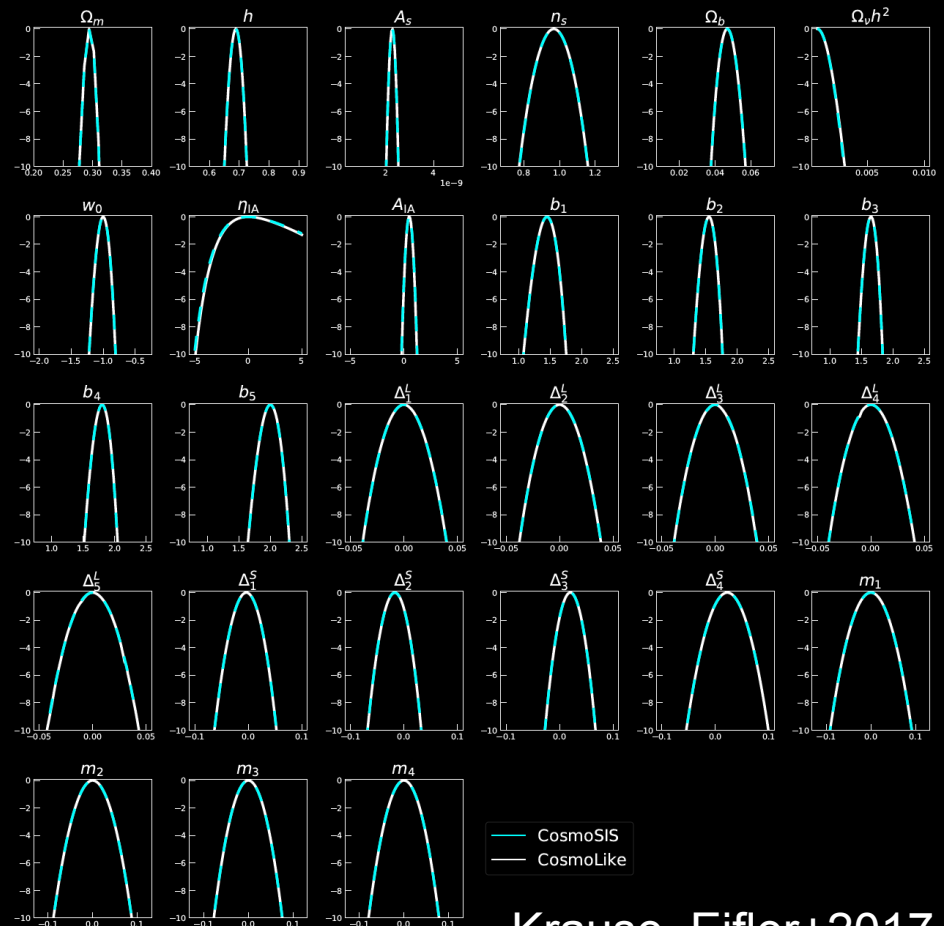


With great statistical power comes great systematic responsibility

- two independent galaxy shape measurements, including novel metacalibration algorithm
- two independent calibrations of photometric redshifts of four source bins
- two independent inference pipelines

CosmoLike (Krause+Eifler) and
CosmosSIS (Zuntz+):

~equal predictions / ~equal constraints

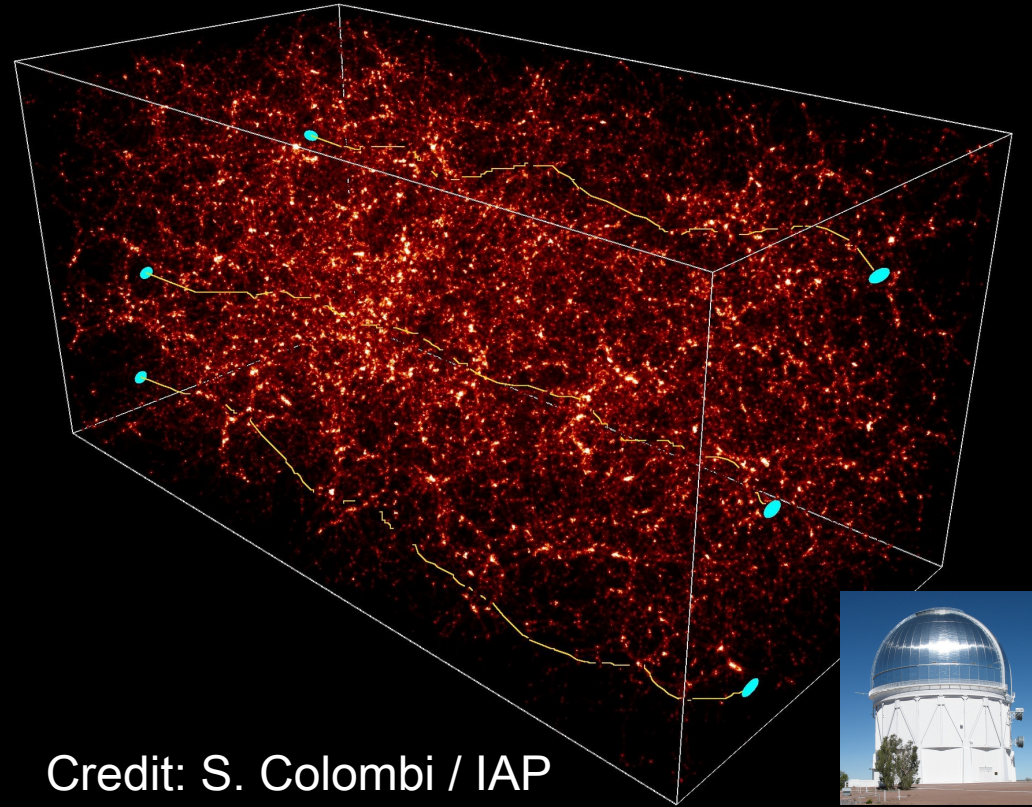


Krause, Eifler+2017

Measurements: cosmic shear

Troxel+ (1708.01538)

- Light from distant galaxies passes the same foreground structure

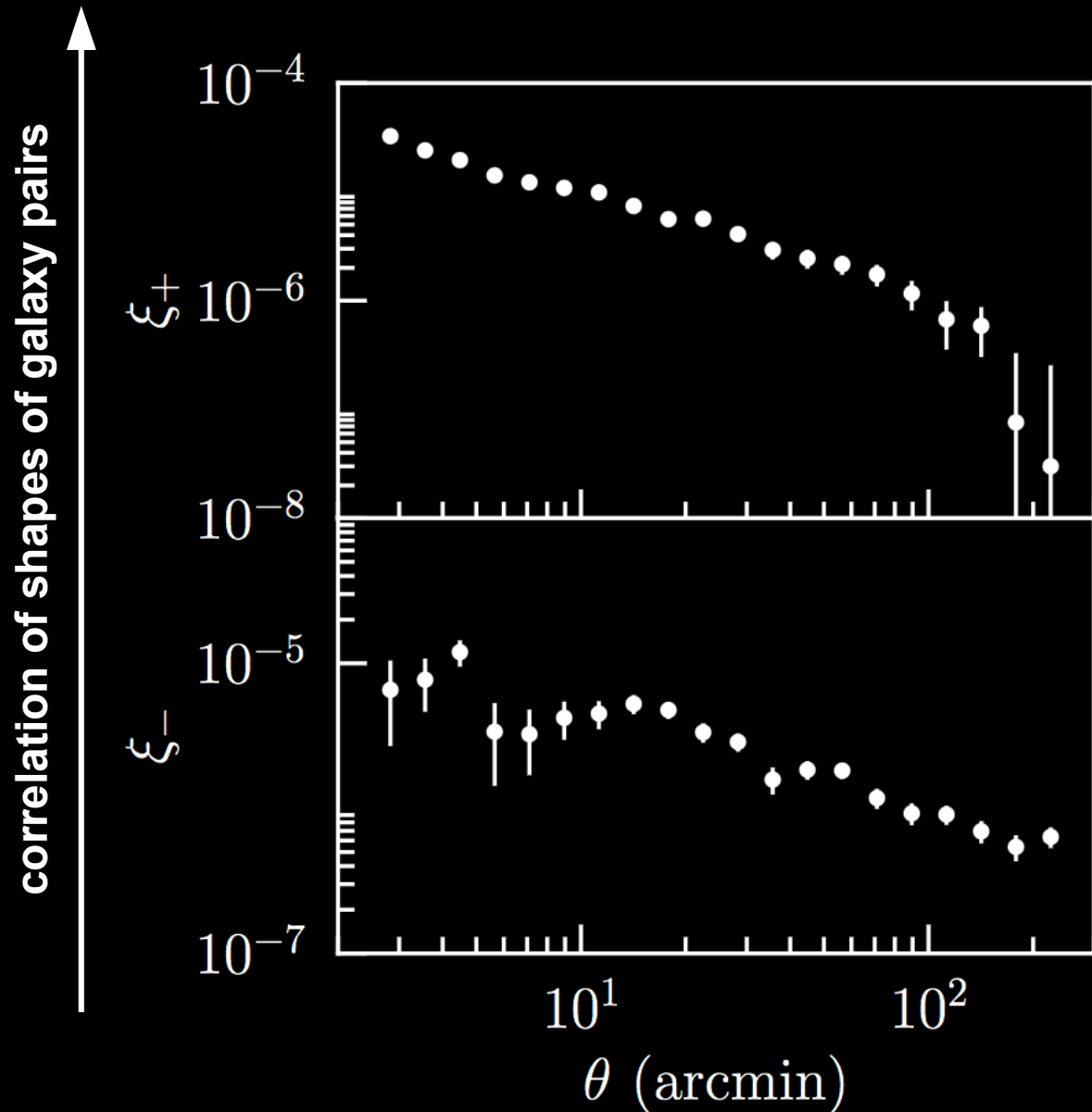
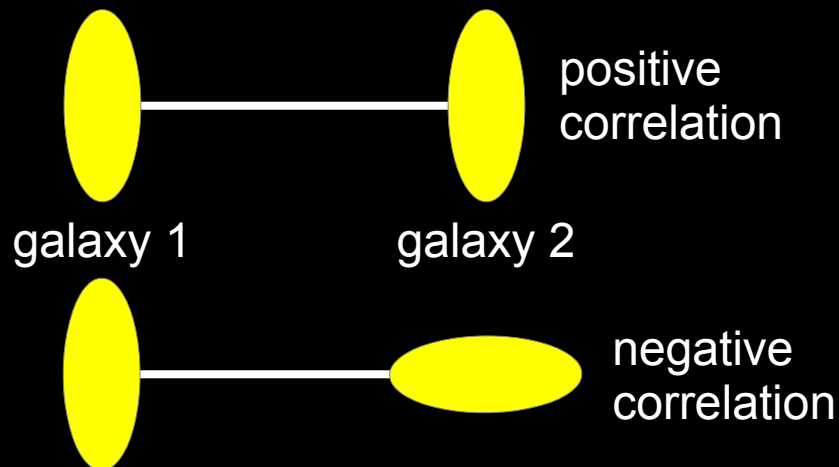


Credit: S. Colombi / IAP

Measurements: cosmic shear

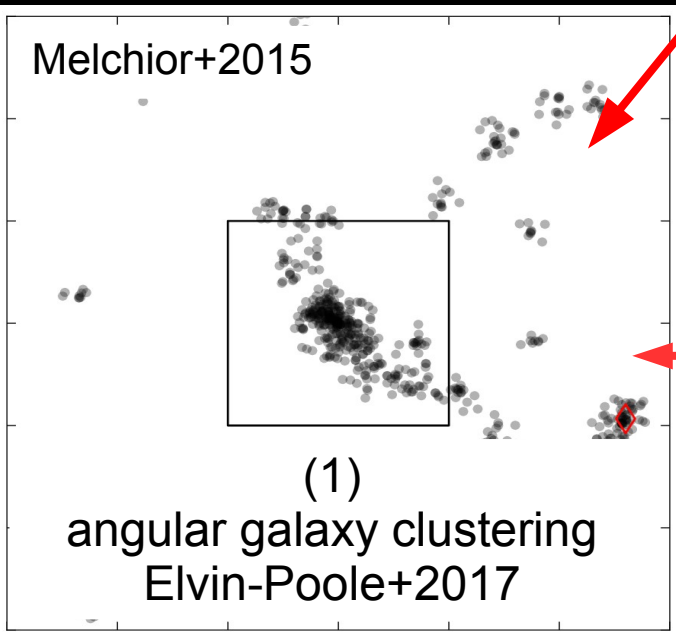
Troxel+ (1708.01538)

- Light from distant galaxies passes the same foreground structure
- We measure their shapes
- We measure the correlation of shapes of galaxy pairs



galaxy field

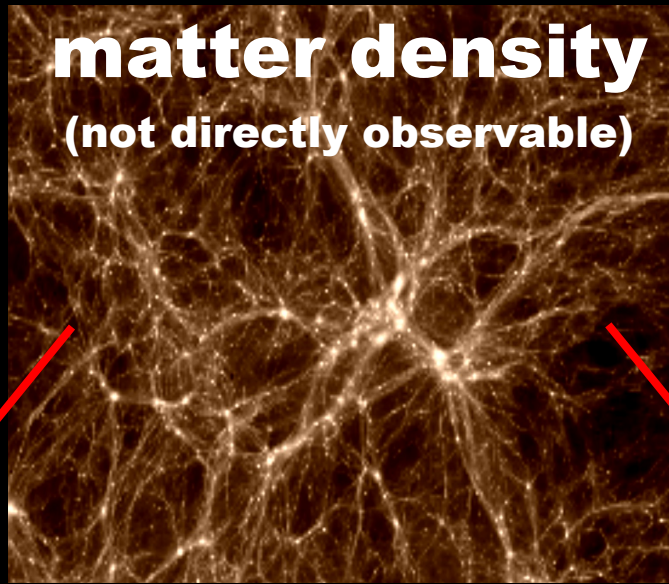
Melchior+2015



(1)

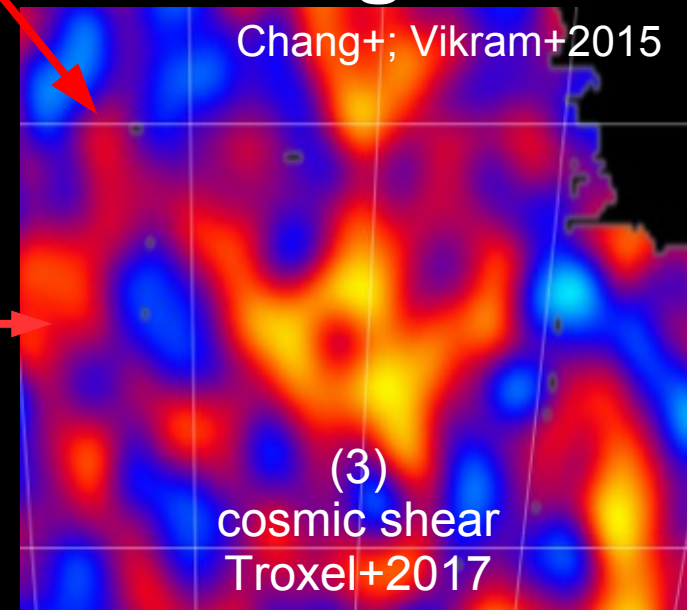
angular galaxy clustering
Elvin-Poole+2017

matter density
(not directly observable)



lensing convergence

Chang+; Vikram+2015



(3)

cosmic shear
Troxel+2017

(2)
galaxy-galaxy lensing
Prat, Sanchez+2017

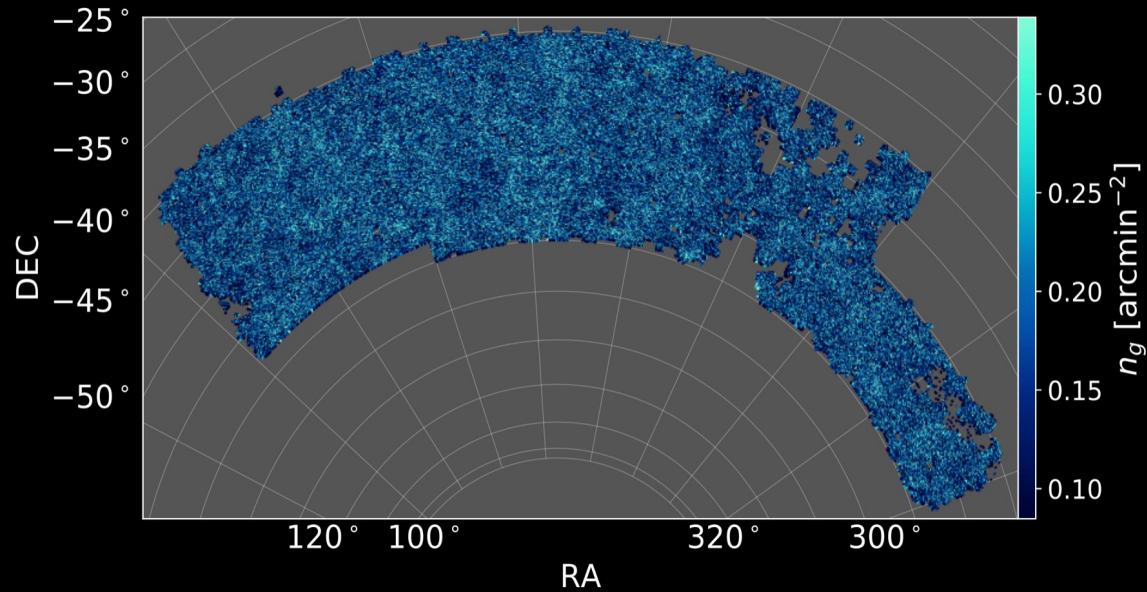
combination of these three two-point functions maximizes use of information and jointly and robustly constrains nuisance parameters

[Hu&Jain 2004, Huterer+2006, Bernstein+2009, Joachimi&Bridle 2010, van Uitert+2017, Joudaki+2017]

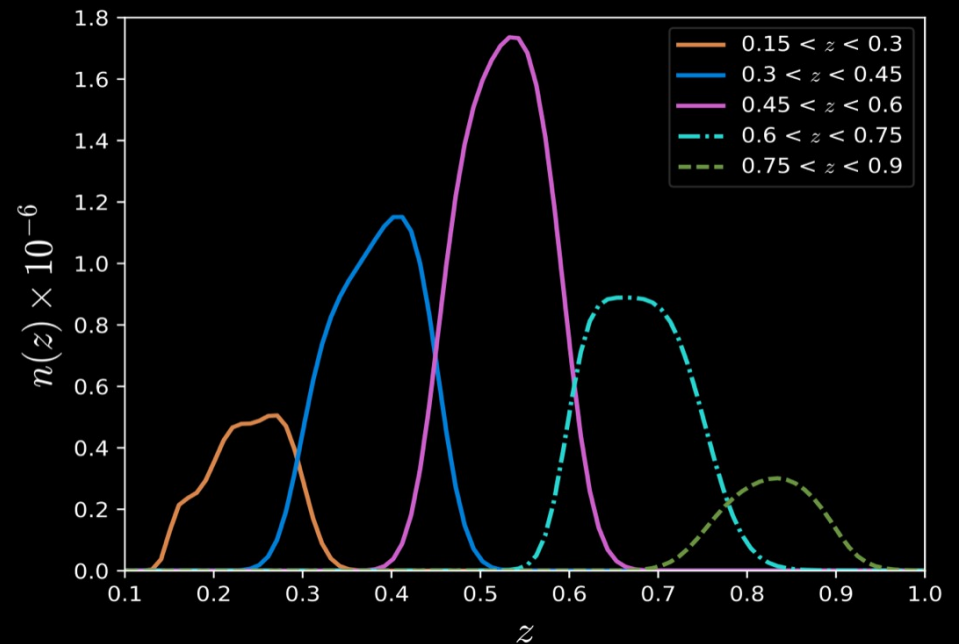
**largest individual data sets and joint constraints from these three probes for the first time:
DES Collaboration+2017**

DES Year 1 Lens Galaxy Sample: redMaGiC

- 660,000 redMaGiC (bright, red) galaxies with excellent redshifts
Rozo, Rykoff+2016



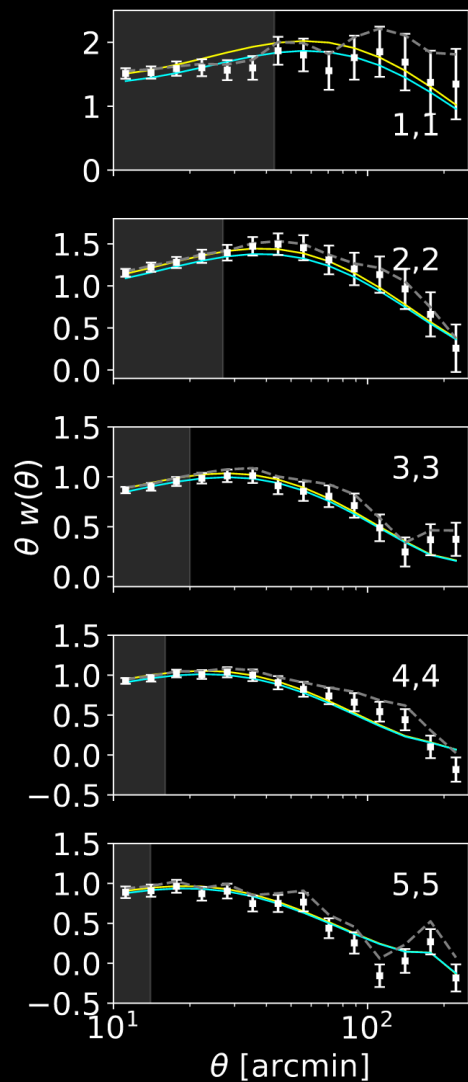
- Measure angular clustering in 5 redshift bins
- Use as lenses for galaxy-galaxy lensing



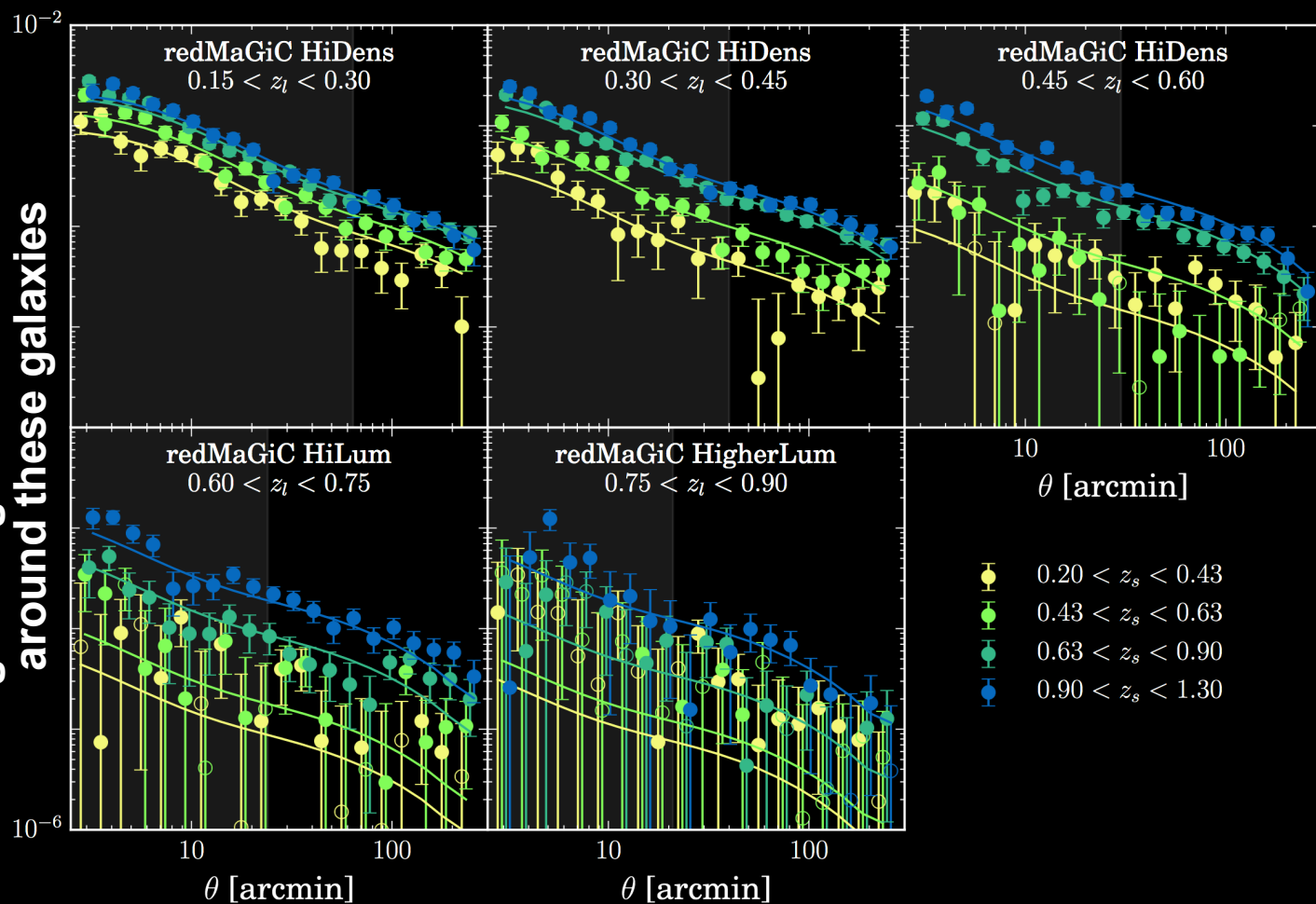
Measurements: galaxy clustering and galaxy-galaxy lensing

Elvin-Poole+ (1708.01536); Prat, Sanchez+ (1708.01537)

clustering of galaxies in 5 redshift bins between $z=0.15 \dots 0.90$



tangential gravitational shear around these galaxies



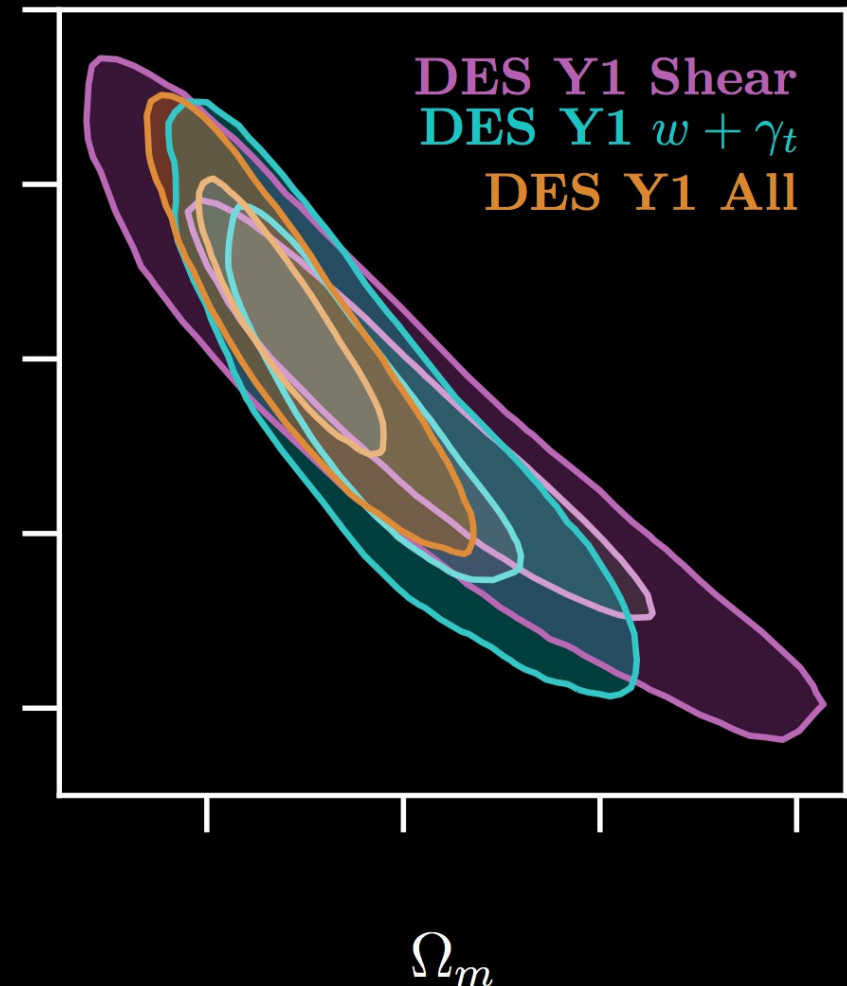
Consistency of the individual constraints in Λ CDM

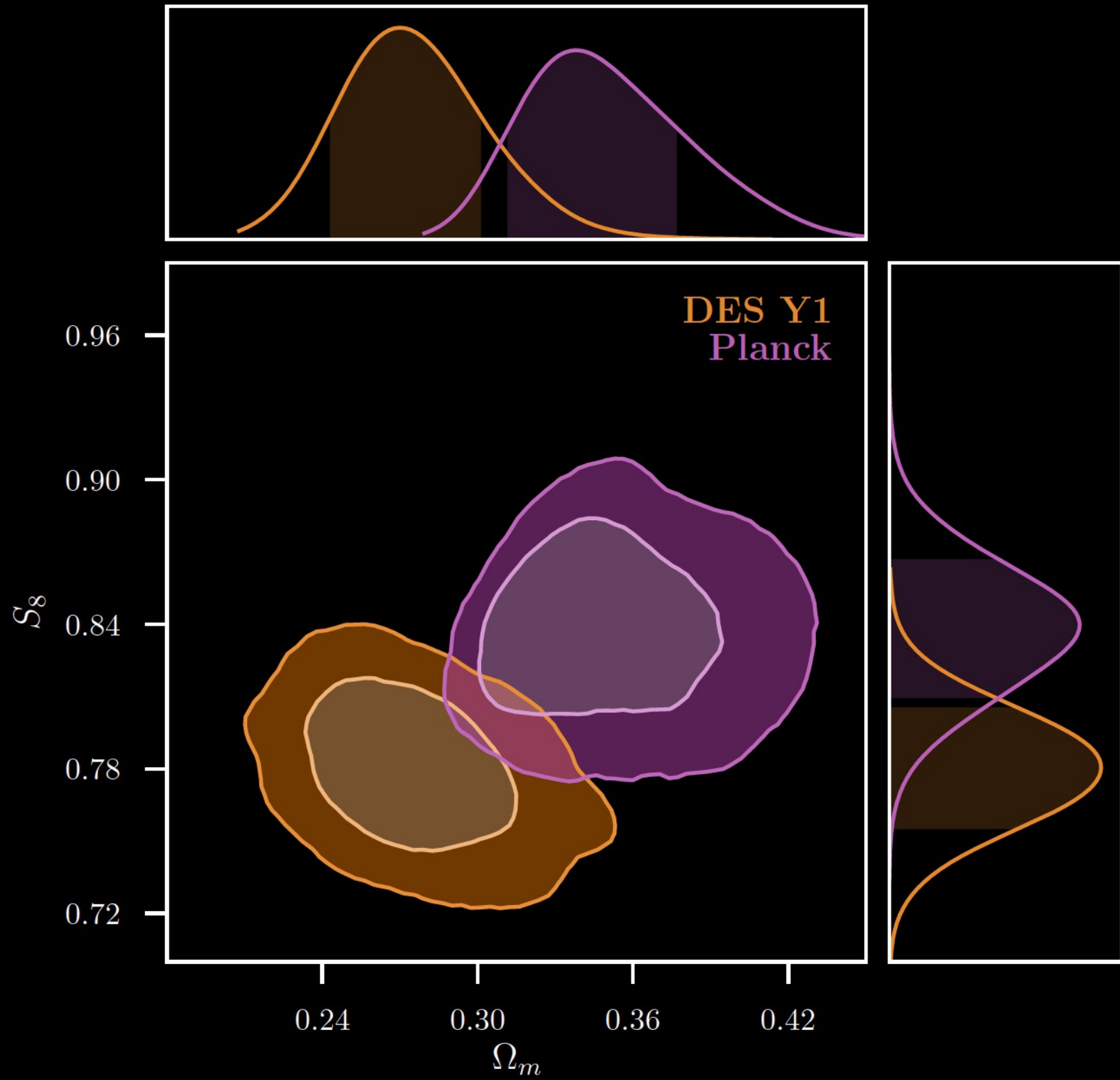
- Cosmic shear and redMaGiC clustering + lensing yield consistent cosmological constraints

- Criterion:
Bayes Factor

$$R = \frac{P(\vec{D}_1, \vec{D}_2 | M)}{P(\vec{D}_1 | M) P(\vec{D}_2 | M)} = 2.8 > 0.1$$

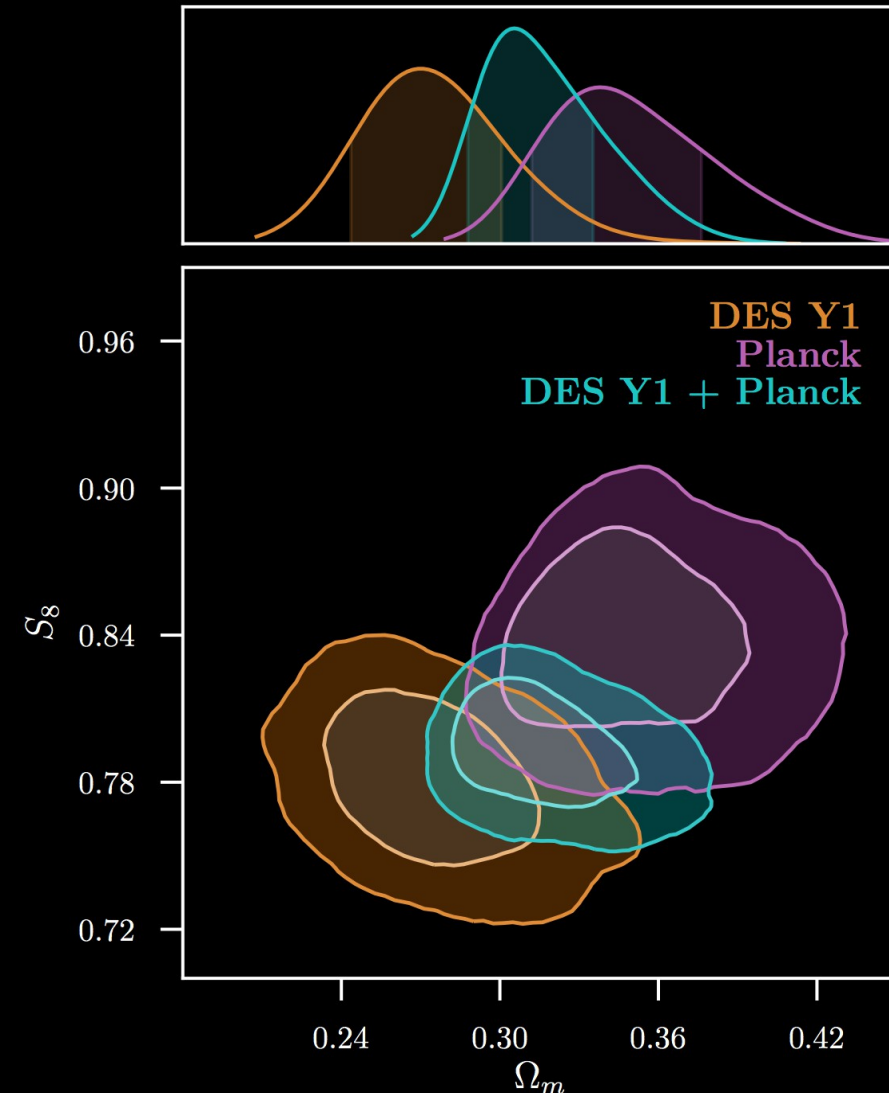
- passing 11 other null tests, we unblind



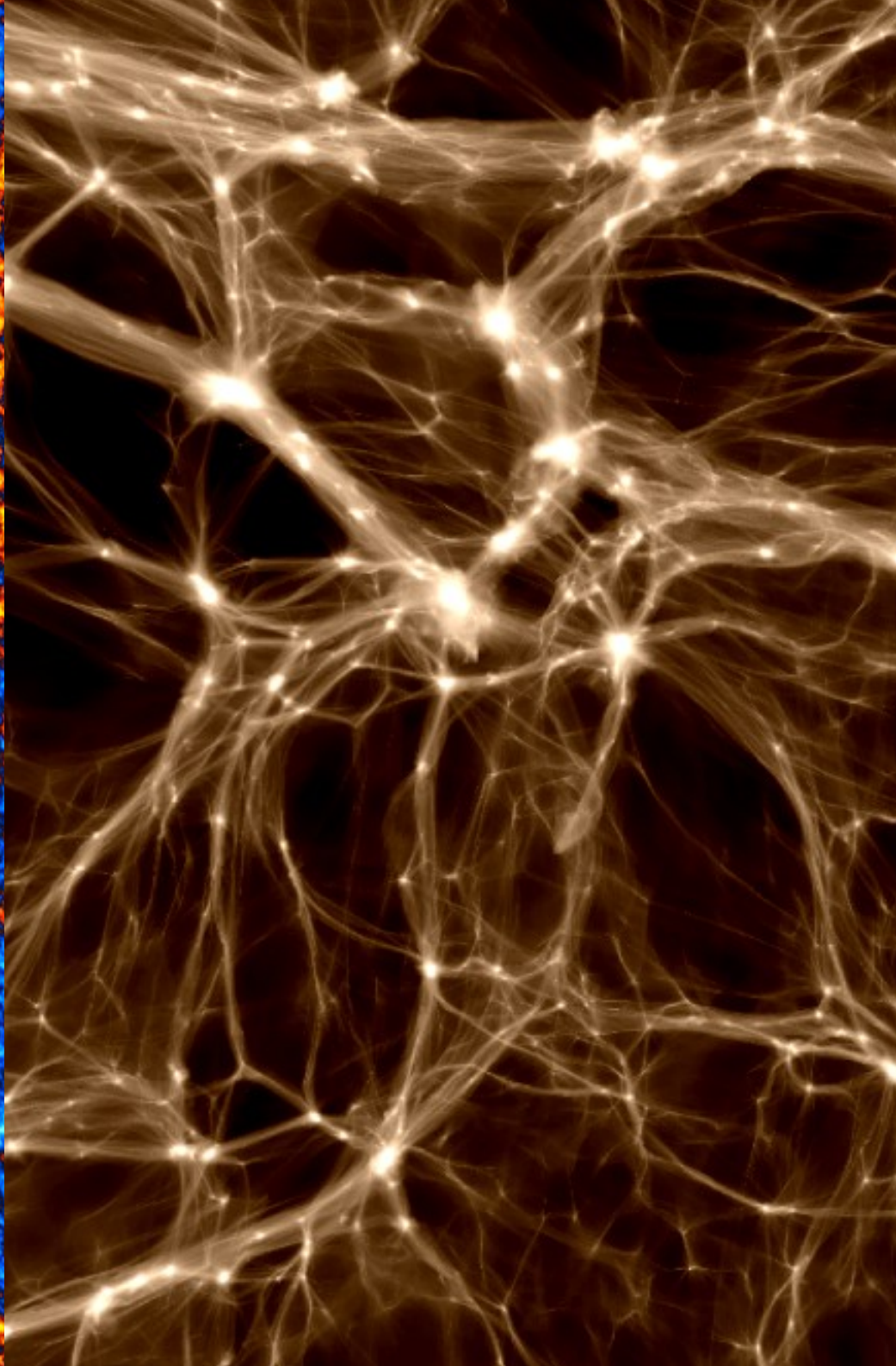
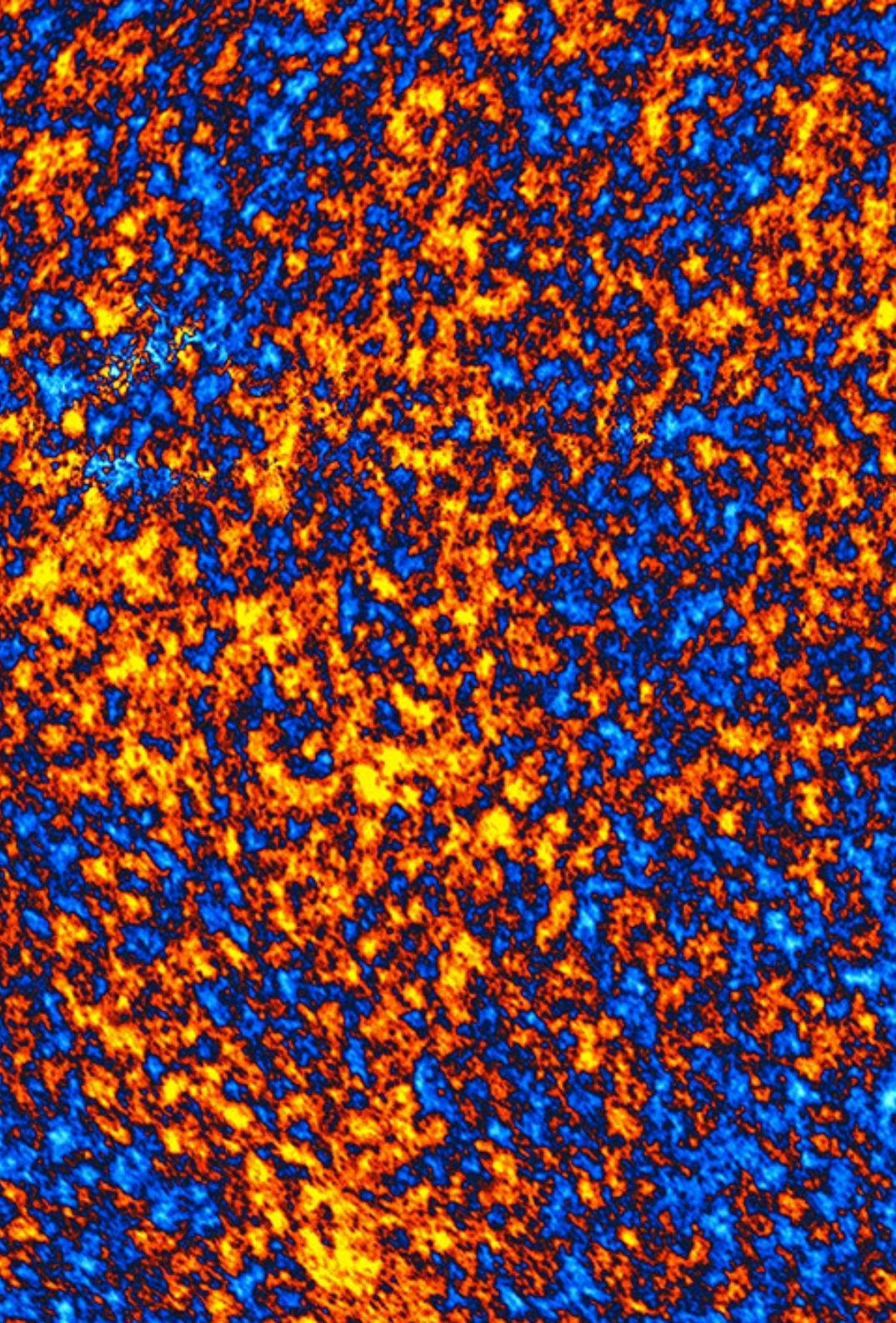


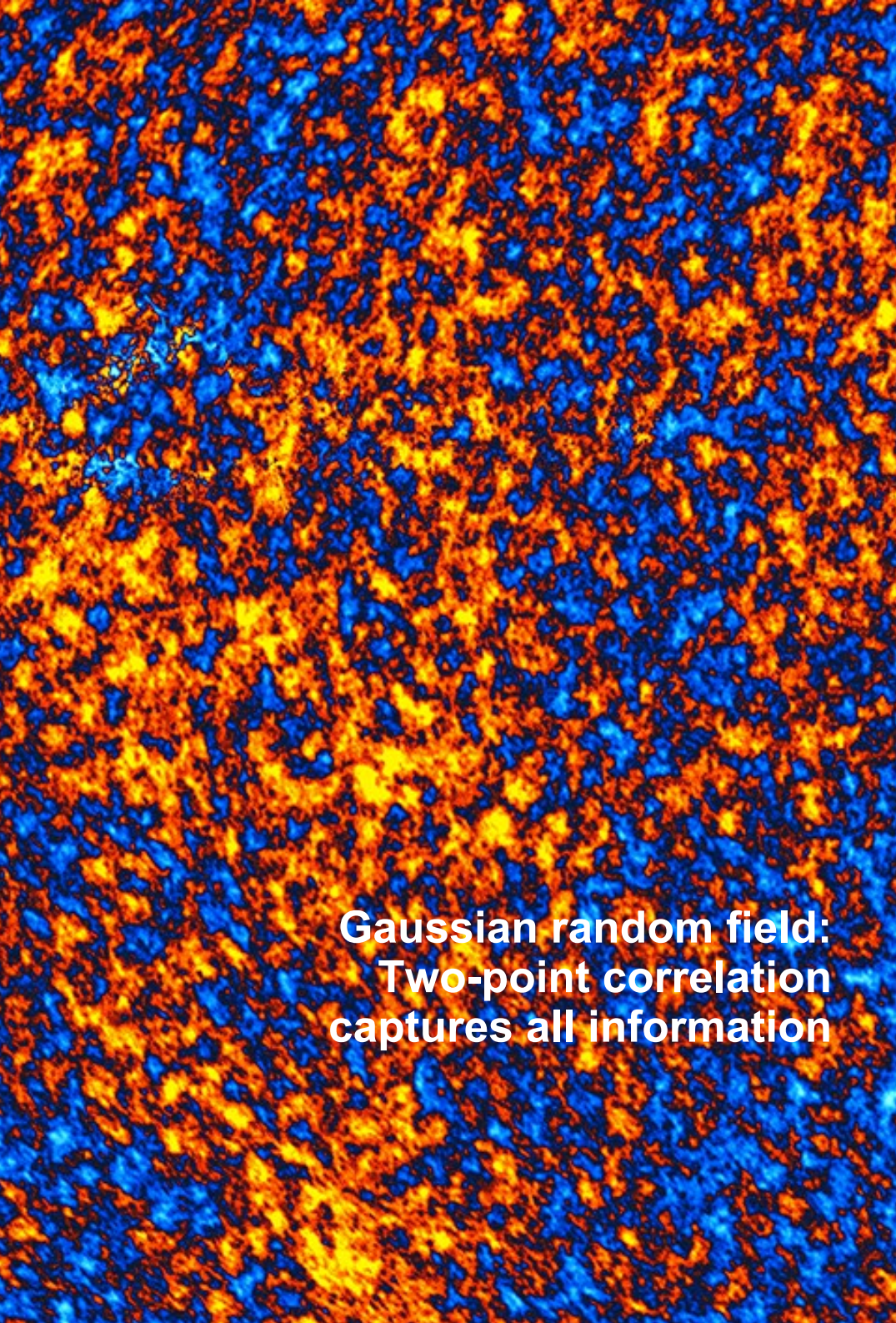
Key result: Consistency of late Universe with Planck in Λ CDM

- DES and Planck constrain matter density and S_8 with equal strength
- Difference in central values $1-2\sigma$ in the same direction as earlier lensing results
- Bayes Factor 4.2 – no evidence for inconsistency
- Combination with Planck + BAO + SNe yields

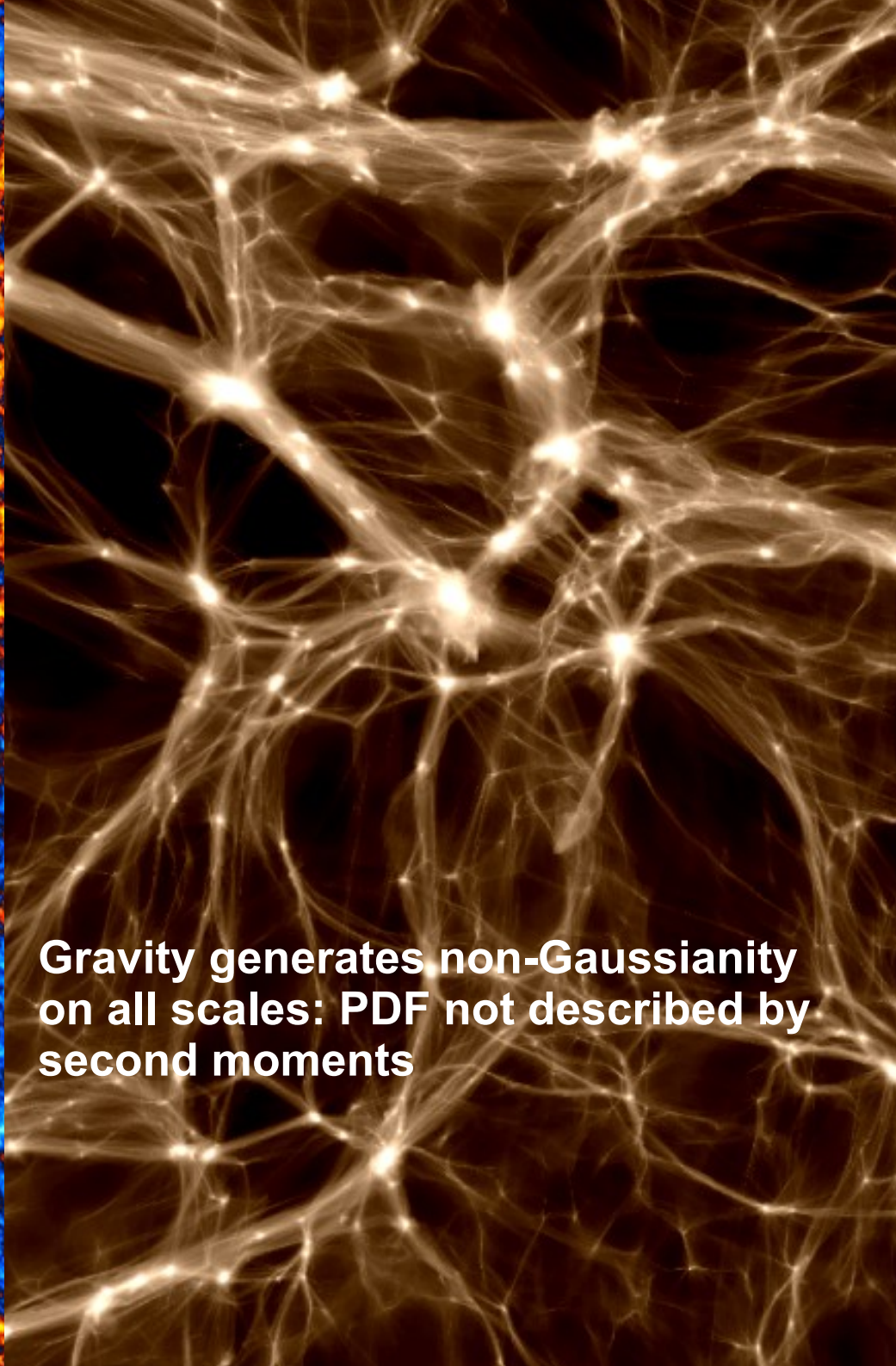


$$\Omega_m = 0.301^{+0.006}_{-0.008} \quad S_8 = 0.799^{+0.014}_{-0.009} \quad w = -1.00^{+0.04}_{-0.05}$$





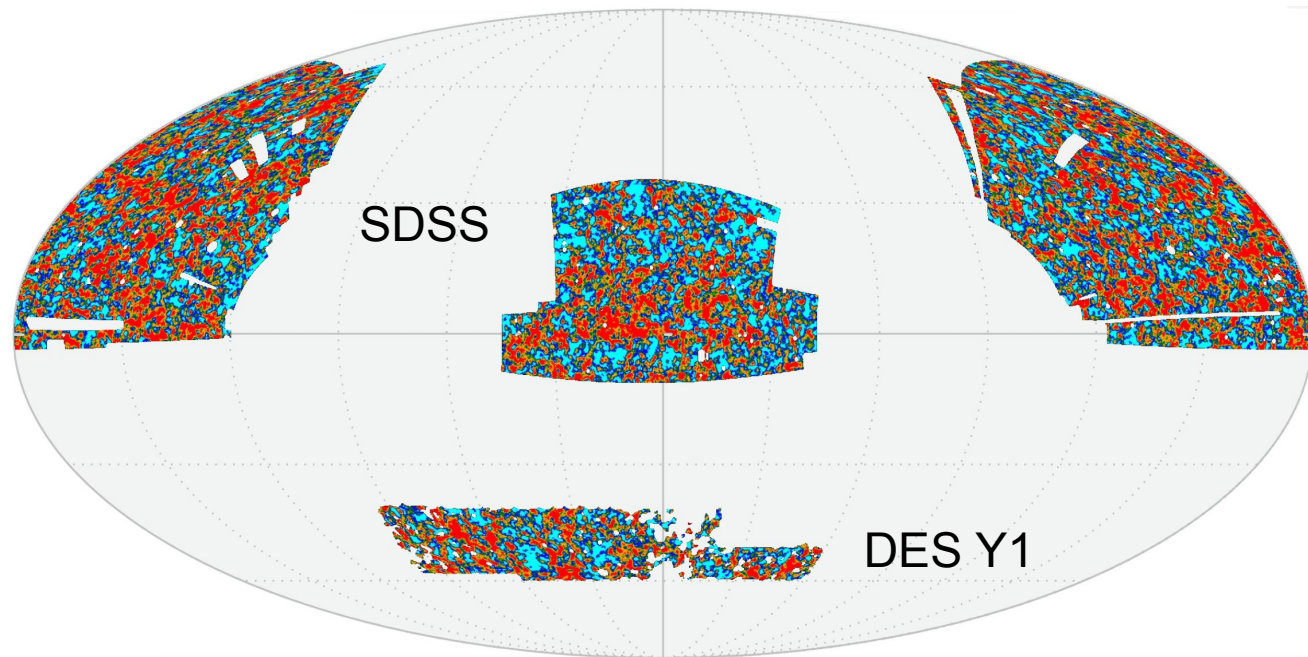
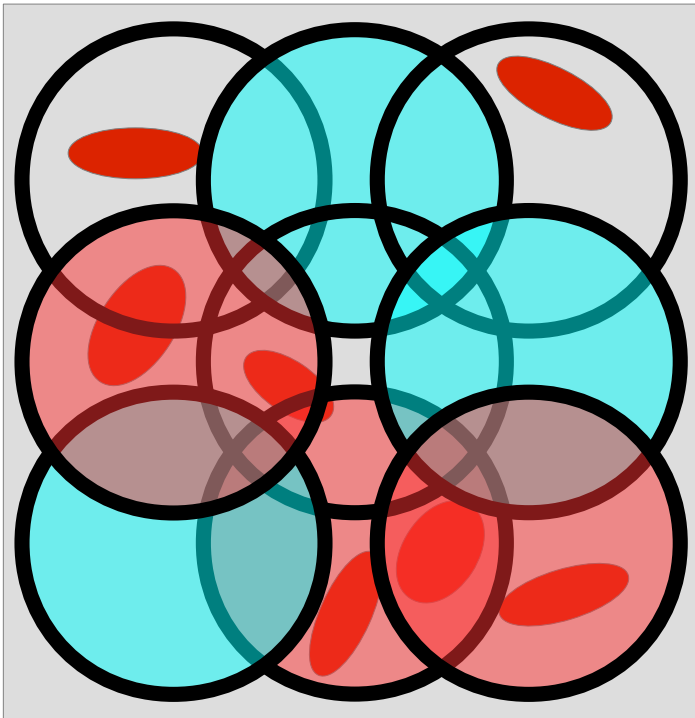
**Gaussian random field:
Two-point correlation
captures all information**



**Gravity generates non-Gaussianity
on all scales: PDF not described by
second moments**

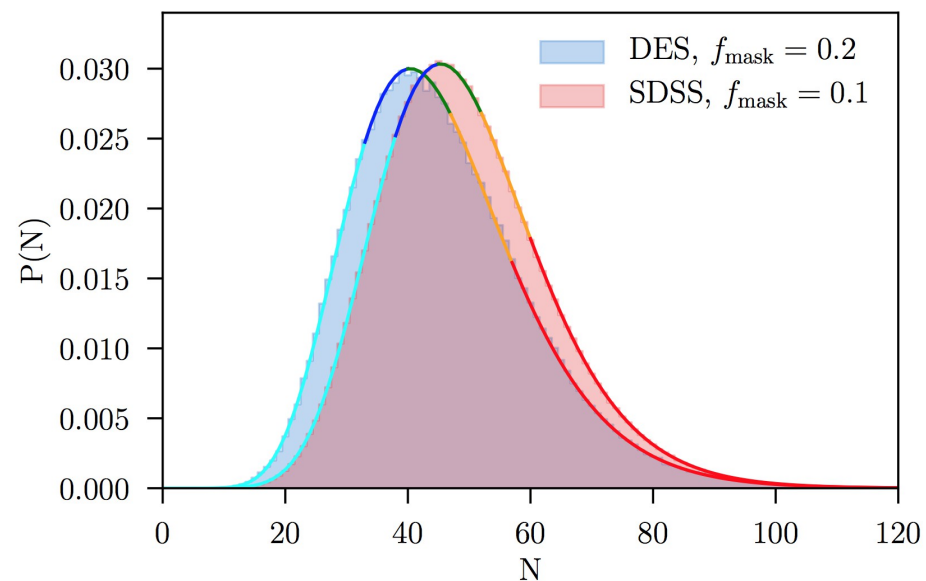
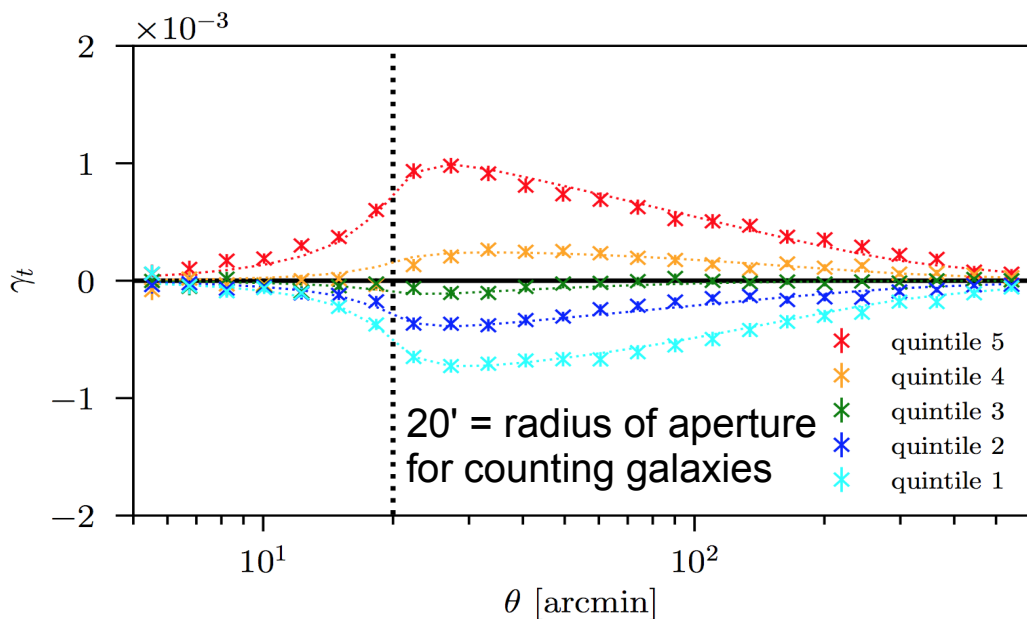
Going beyond two-point functions: Density PDF from lensing + counts in cells

- Step 1: split lines of sight into quintiles of redMaGiC galaxy count – underdense to overdense



Going beyond two-point functions: Density PDF from lensing + counts in cells

- Step 1: split lines of sight into quintiles of redMaGiC galaxy count
- Step 2: measure shear around and mean counts in quintiles – there is an asymmetry / skewness!



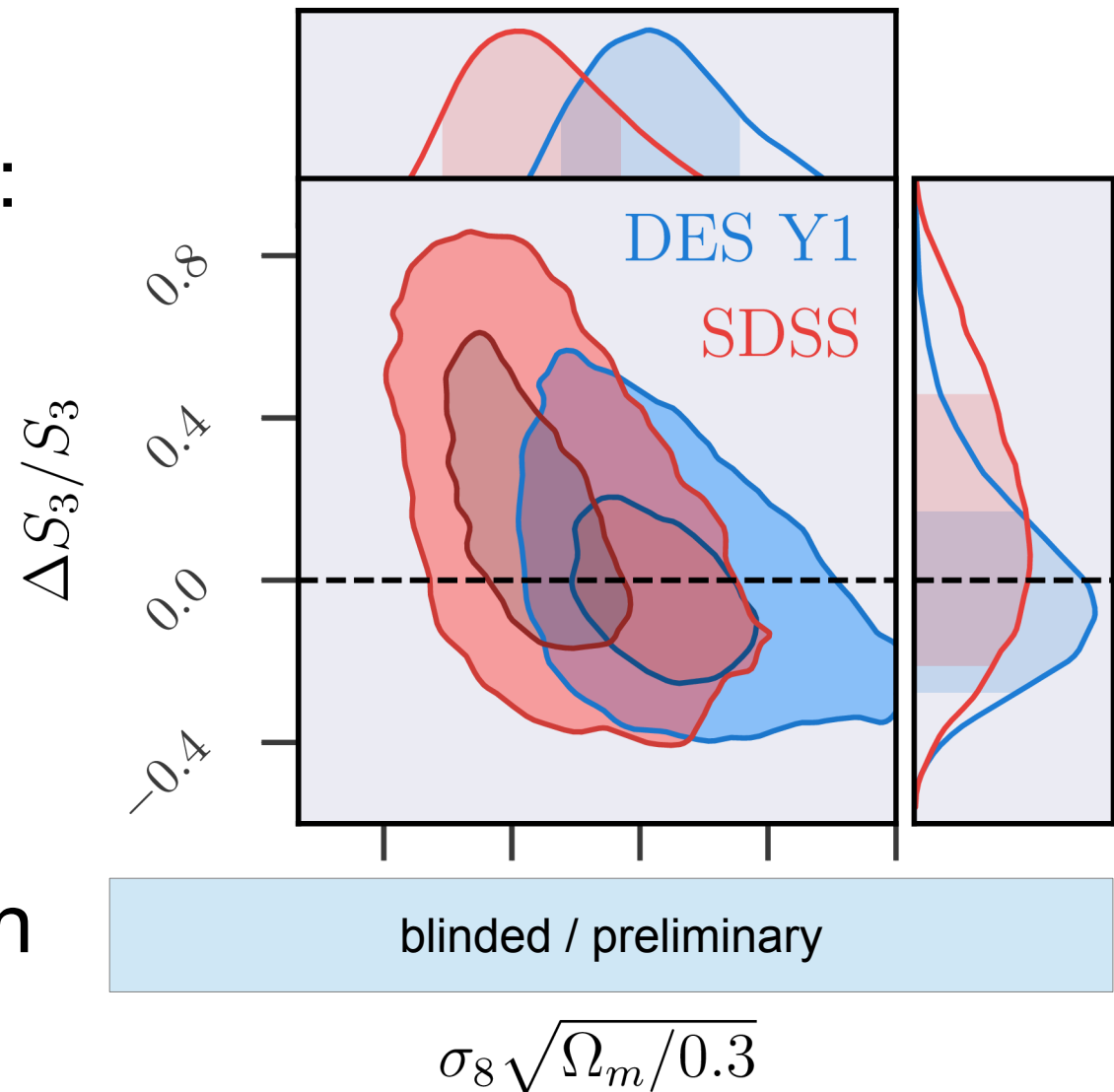
Going beyond two-point functions: Density PDF from lensing + counts in cells

- Step 1: split lines of sight into quintiles of redMaGiC galaxy count N
- Step 2: measure shear around and mean counts in quintiles
- Step 3: model these signals via joint PDF of matter and galaxy density

$$\langle \gamma_t \rangle (N) = \int p(\delta_m | N) \langle \gamma_t \rangle (\delta_m) d\delta_m$$

Lensing + counts in cells: skewness of matter PDF

- Lensing + counts in cells jointly constrain:
 - Cosmology
 - Bias + Stochasticity
 - Skewness of matter density: $S_3 \equiv \frac{\langle \delta^3 \rangle}{\langle \delta^2 \rangle^2}$
- Skewness agrees with Λ CDM prediction at $\sim 20\%$ uncertainty



Summary

- Wide range of probes from early & late Universe, geometry & structure, agree on fiducial Λ CDM cosmology
- DES has added the most precise measurement of structure in the evolved Universe
 - Control of systematics with improved, independent methods
 - Competitiveness and consistency with Planck CMB in Λ CDM, insignificant offset in the direction of other lensing studies
 - Precise joint measurements close to $\Omega_m = 0.30$, $\sigma_8 = 0.80$, $w = -1.0$
- Different statistics (matter PDF!) and much more data (Y3!) soon
- Even the dark side (systematics, studies of underdensities) of lensing looks rather bright!