

# Evidence for accelerated expansion of the Universe: current observations

Tim Eifler

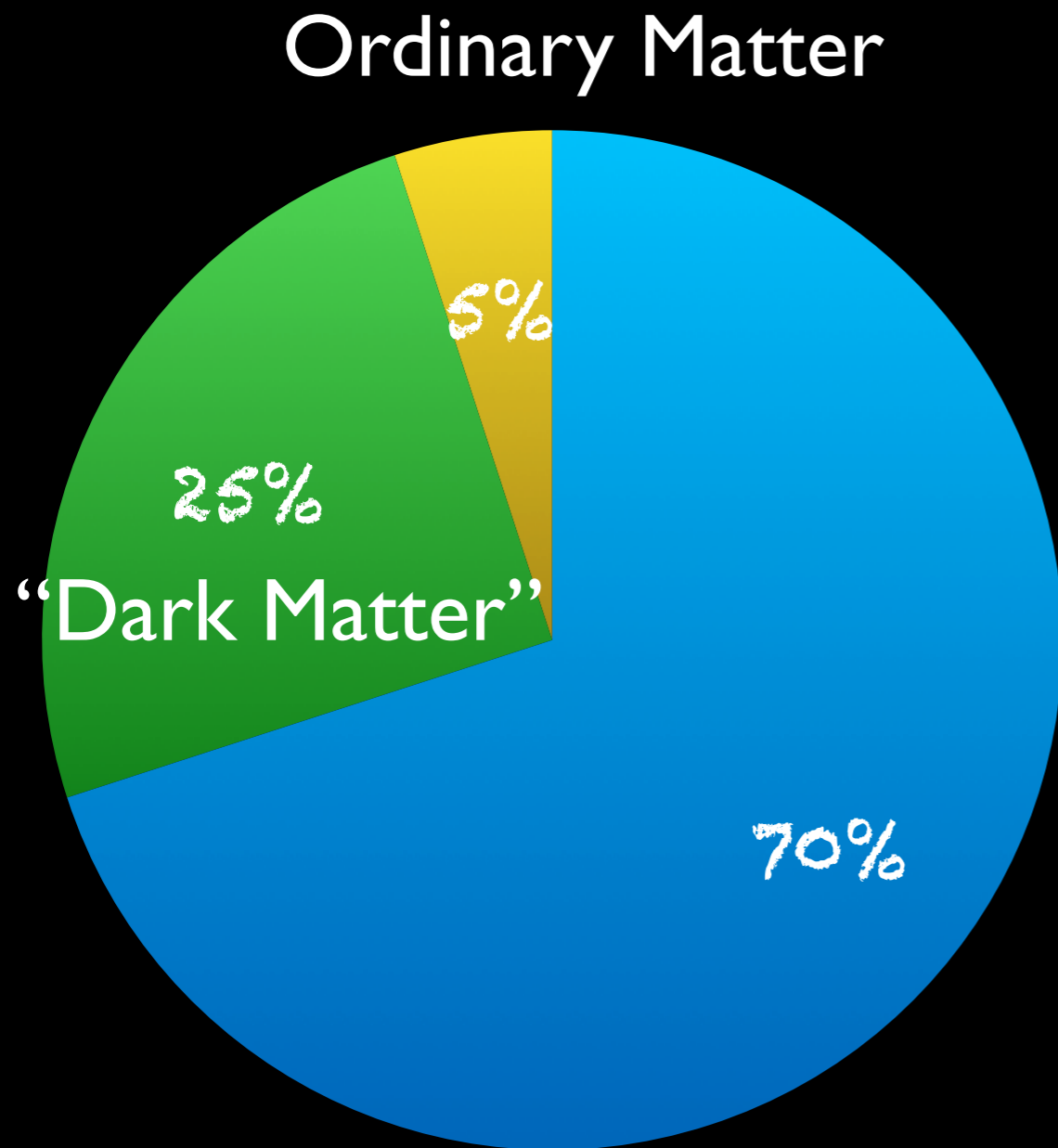
(NASA-JPL/Caltech, University of Arizona)

# Our Simple Universe

- On large scales, the Universe can be modeled with remarkably few parameters
  - age of the Universe
  - geometry of space
  - density of atoms
  - density of matter
  - amplitude of fluctuations
  - scale dependence of fluctuations

[of course, details often not quite as simple]

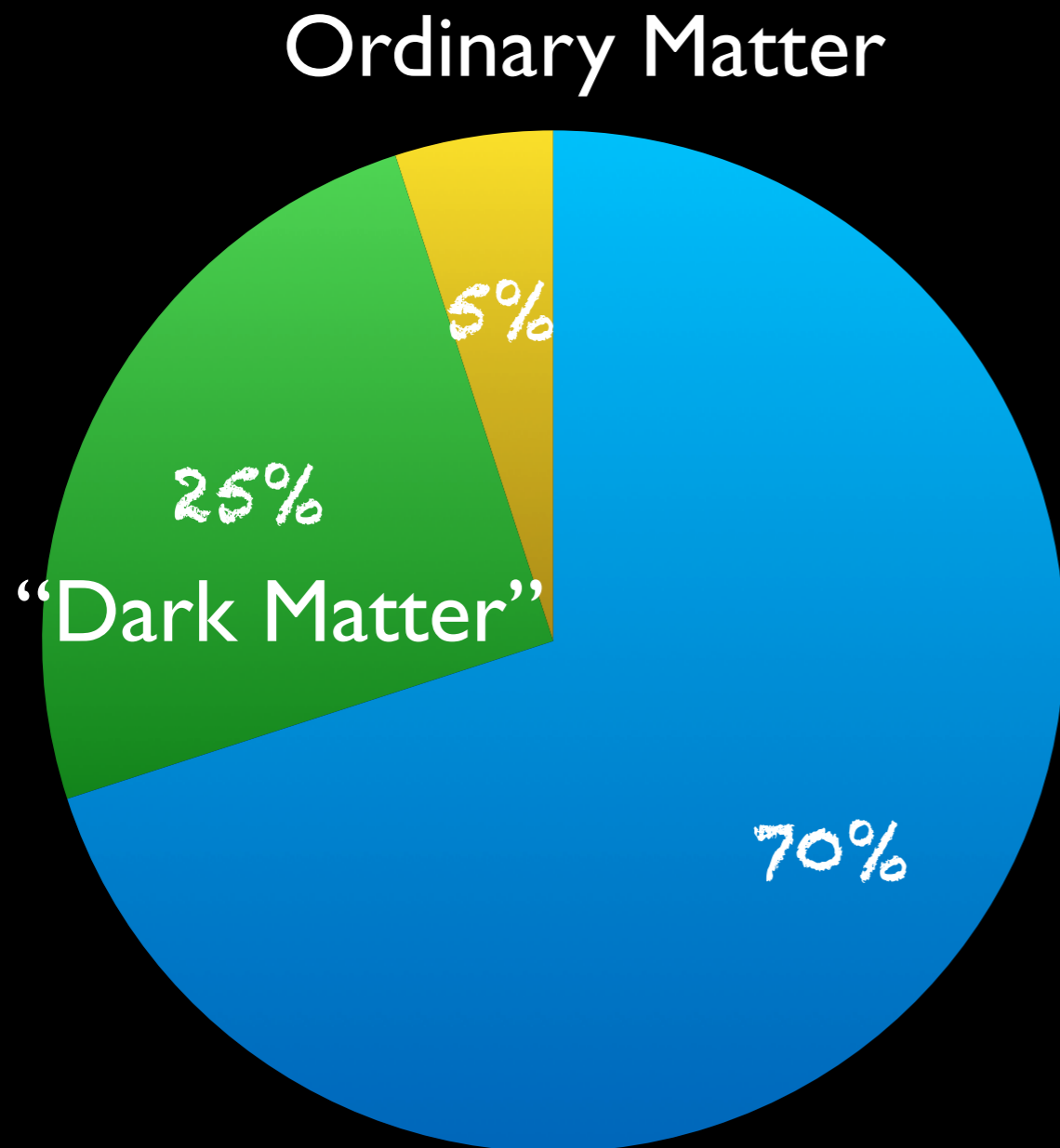
# Our Puzzling Universe



## “Dark Energy”

- accelerates the expansion
  - dominates the total energy density
  - smoothly distributed
- acceleration first measured by SN 1998

# Our Puzzling Universe



## “Dark Energy”

- accelerates the expansion
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- smoothly distributed

acceleration first measured by SN 1998

### next frontier: understand

- cosmological constant  $\Lambda$ :  $w \equiv P/\rho = -1$ ?
- magnitude of  $\Lambda$  very surprising
- dynamic dark energy varying in time and space,  $w(a)$ ?
- breakdown of GR?

# Theory Space: Breaking GR

Many new DE/modified gravity theories developed over last decade

Most can be categorized based on how they **break GR**:

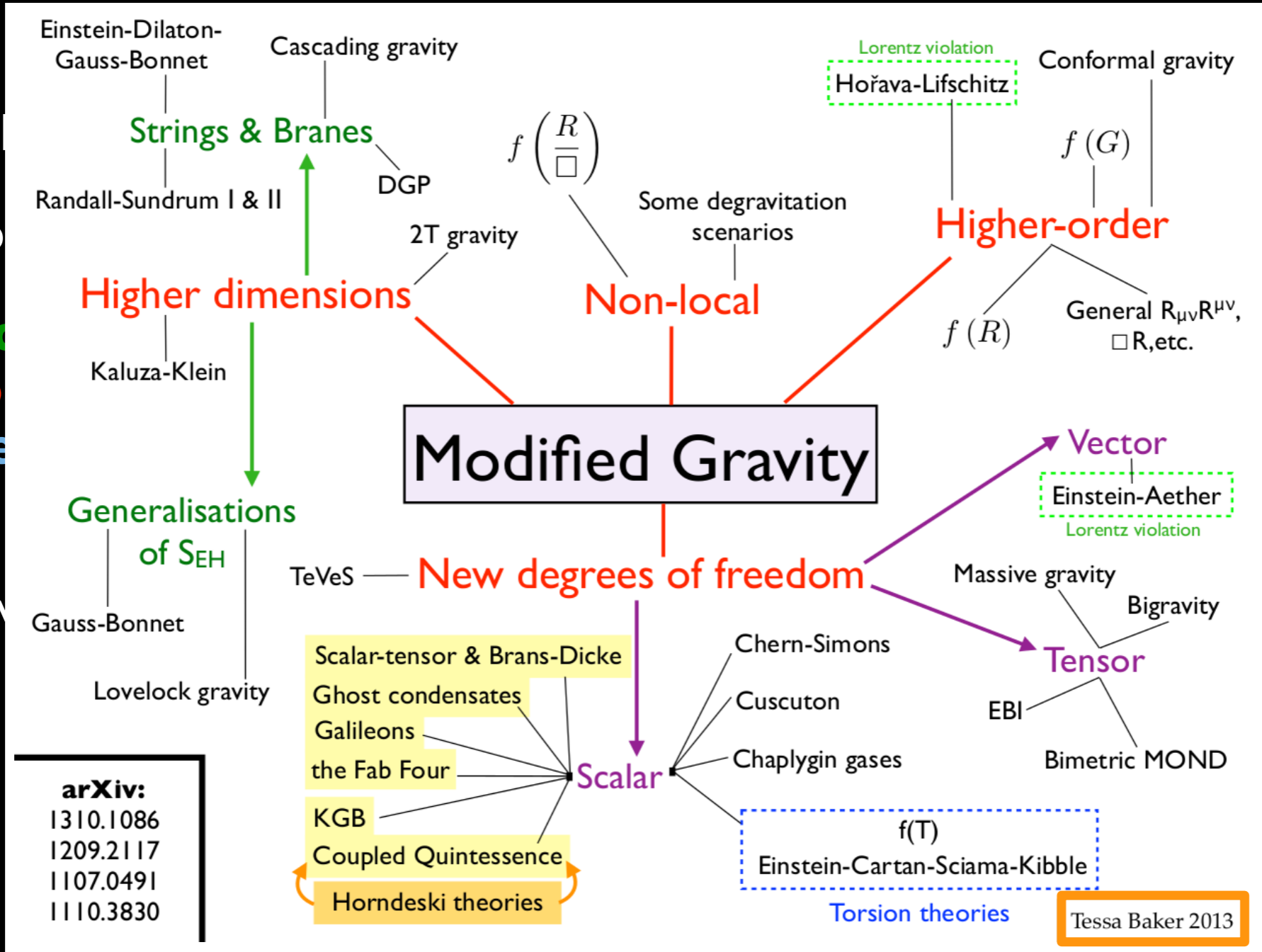
The only **local, second-order** gravitational field equations that can be derived from a **four-dimensional action** that is constructed **solely from the metric tensor**, and admitting Bianchi identities, are GR +  $\Lambda$ .

Lovelock's theorem (1969)

[subject to viability conditions]

# Theory Space: Breaking GR

Many new theories  
 Most can be derived from a formalism  
 The only local theory subject to the equivalence principle



be derived from the theorem (1969)

No favored alternative theory, theory space hard to summarize succinctly  
 Need unifying frameworks + phenomenology to compare to data

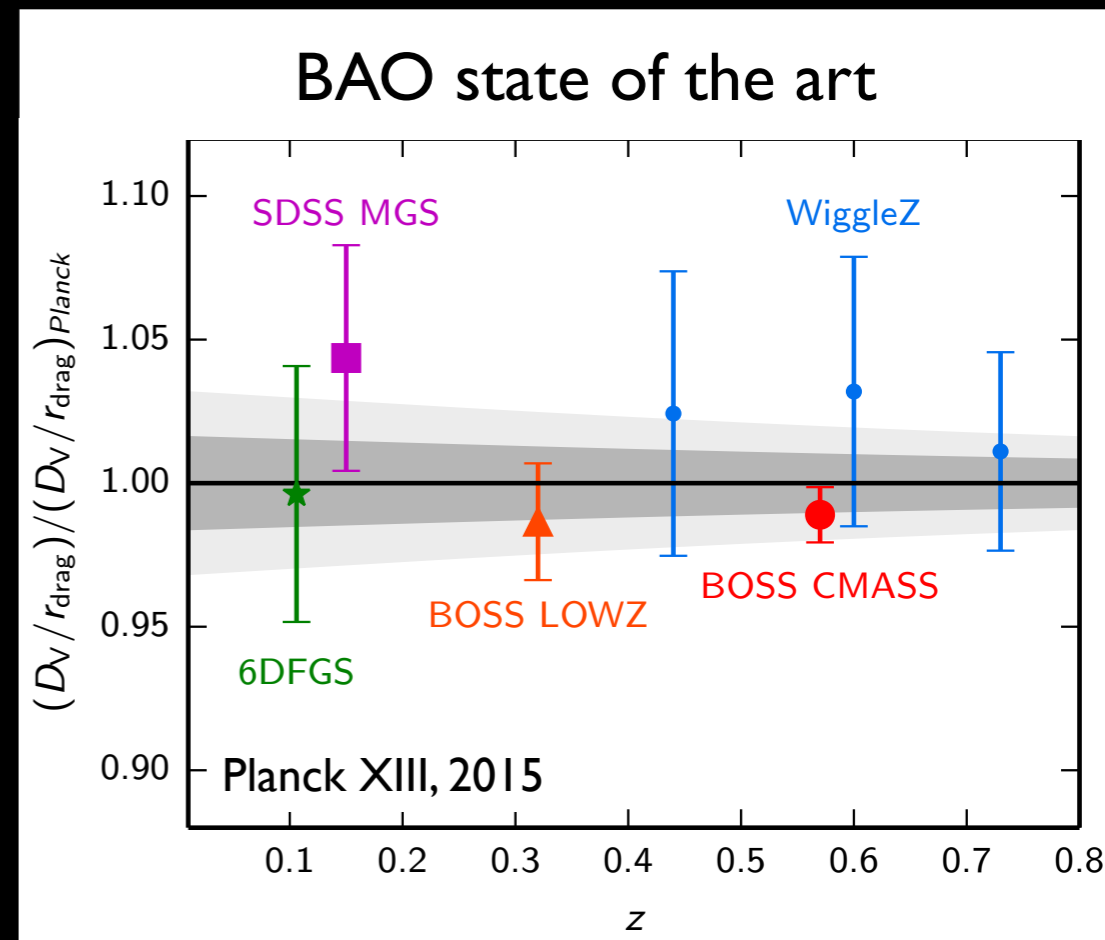
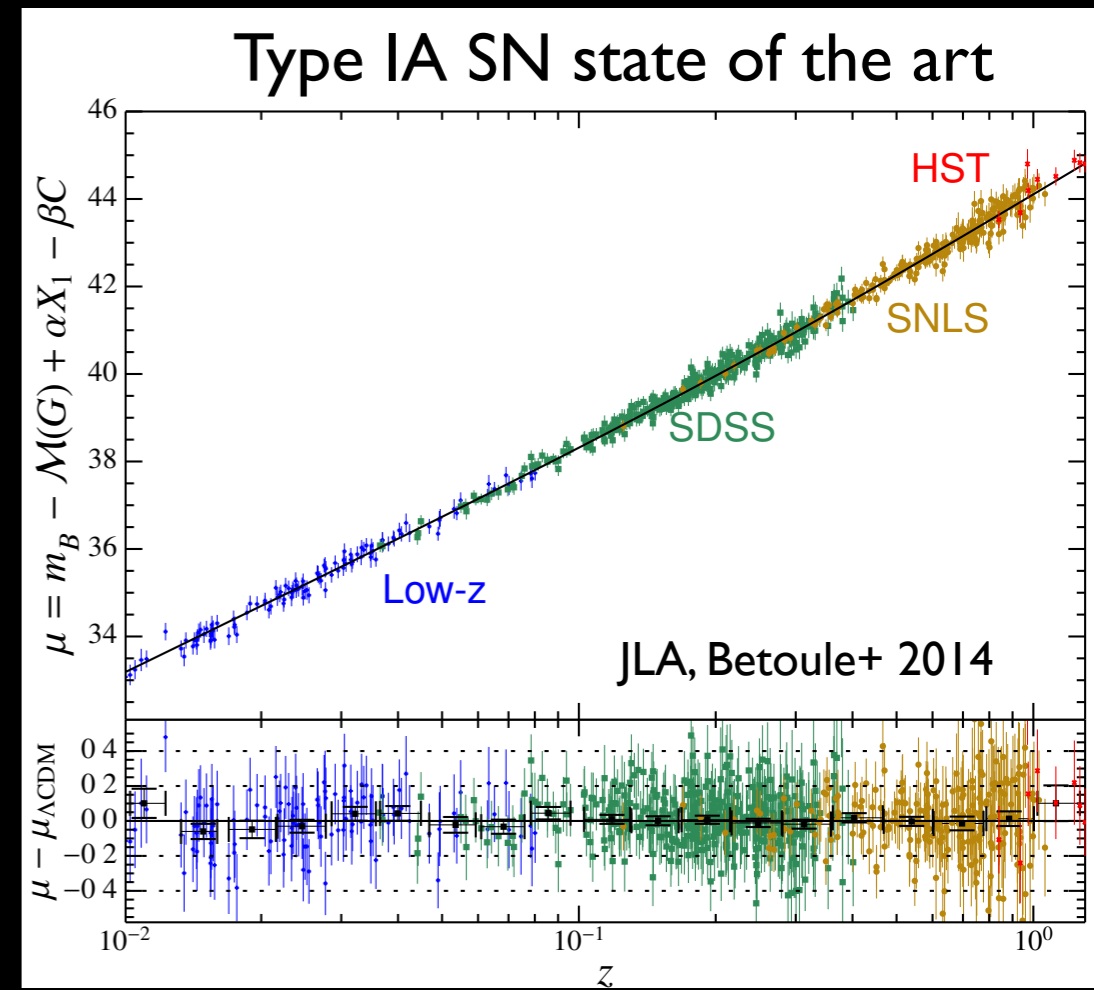
# Testing Cosmic Acceleration

important to test GR over cosmological scales

## Expansion history

$$H^2(a) = H_0^2 \left( \Omega_M a^{-3} + \Omega_{DE} a^{-3(1+w_0+w_a)} e^{-3w_a(1-a)} \right)$$

- from supernovae, CMB peaks + baryonic acoustic oscillations (BAO)
- agreement with  $\Lambda$ CDM
- limited information on dark energy/modified gravity: at most  $w_0, w_a$



# Cosmic Structure Formation

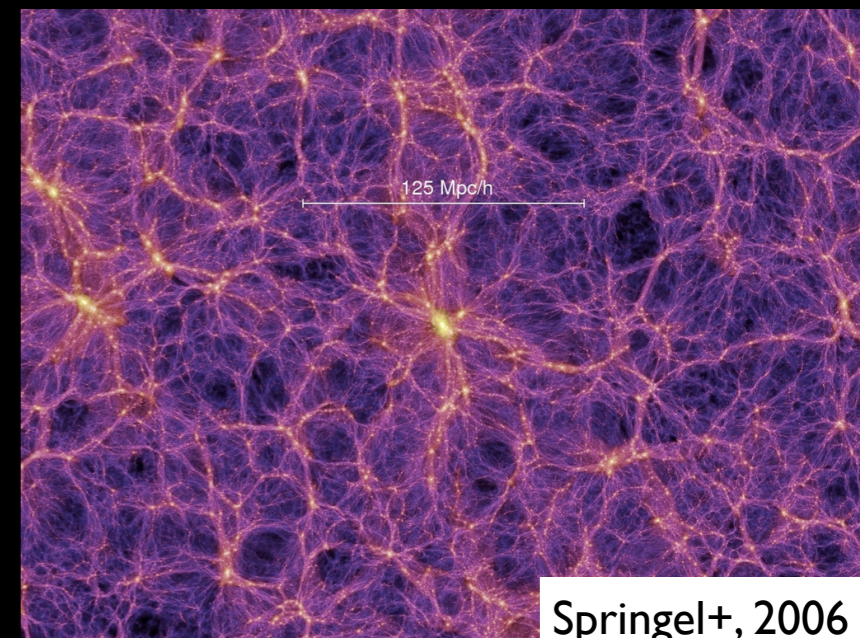
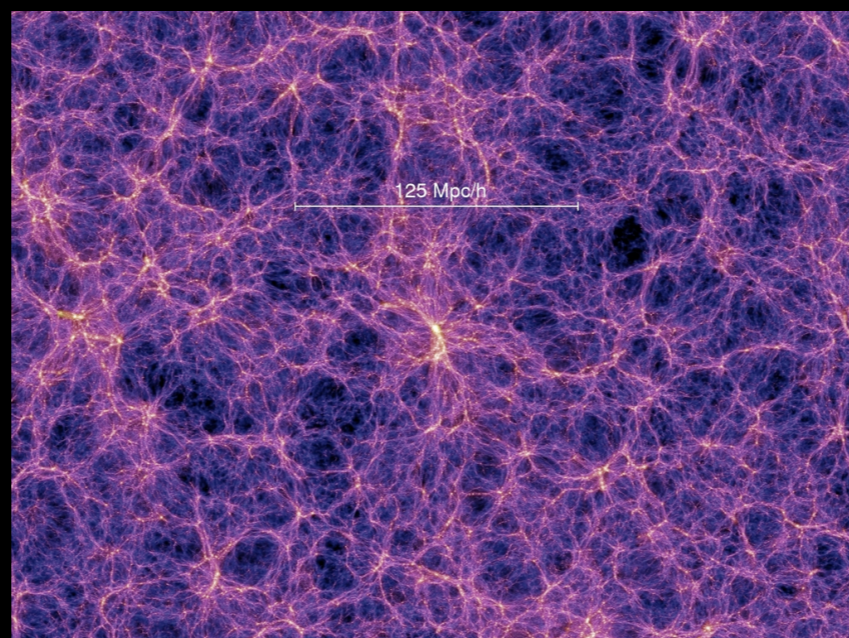
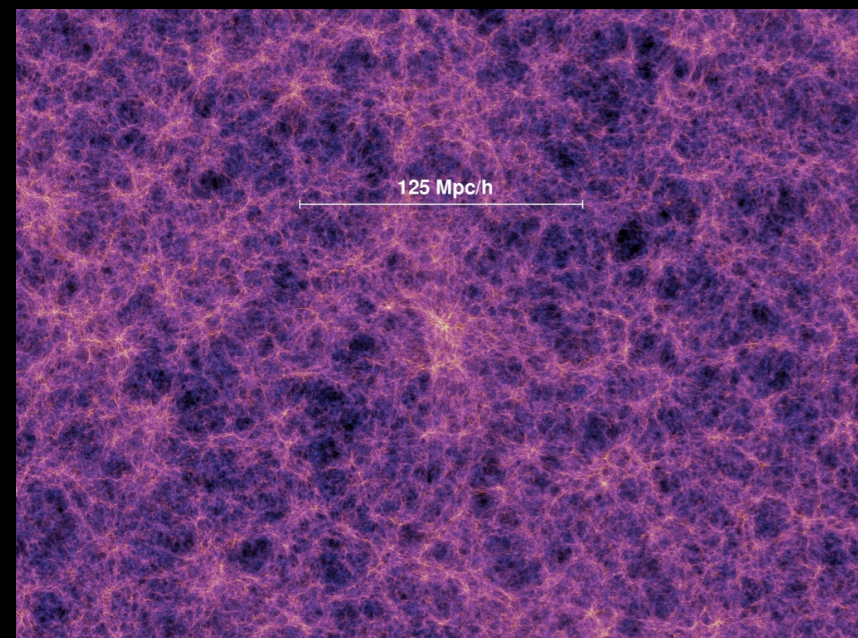
gravity drives **formation of cosmic structure**, dark energy slows it down

growth of structure contains much more information than expansion rate

linear level: perturbation theory

non-linear evolution: numerical simulations

- reliably predict *dark matter distribution, for  $w$ CDM cosmologies + individual MG models*  
time

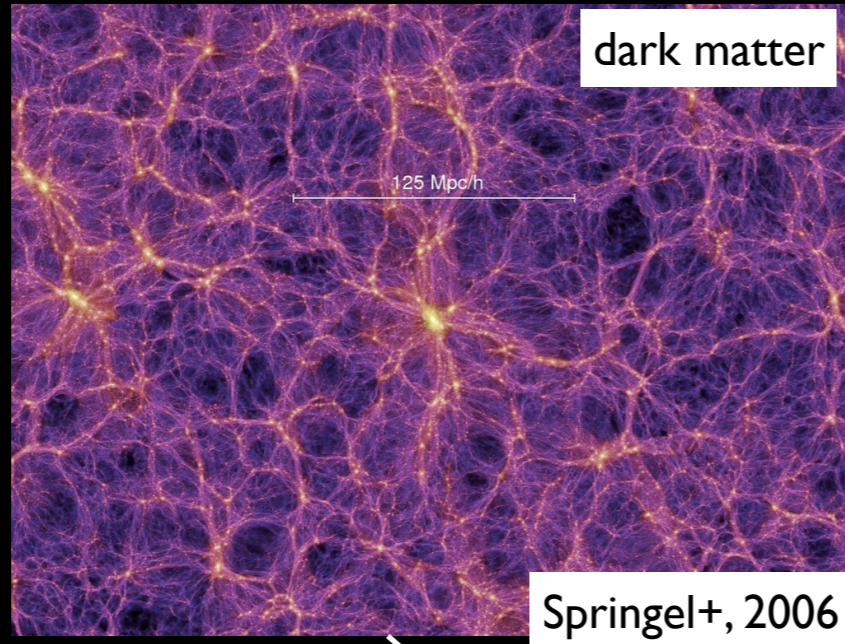




# Connect theory to data

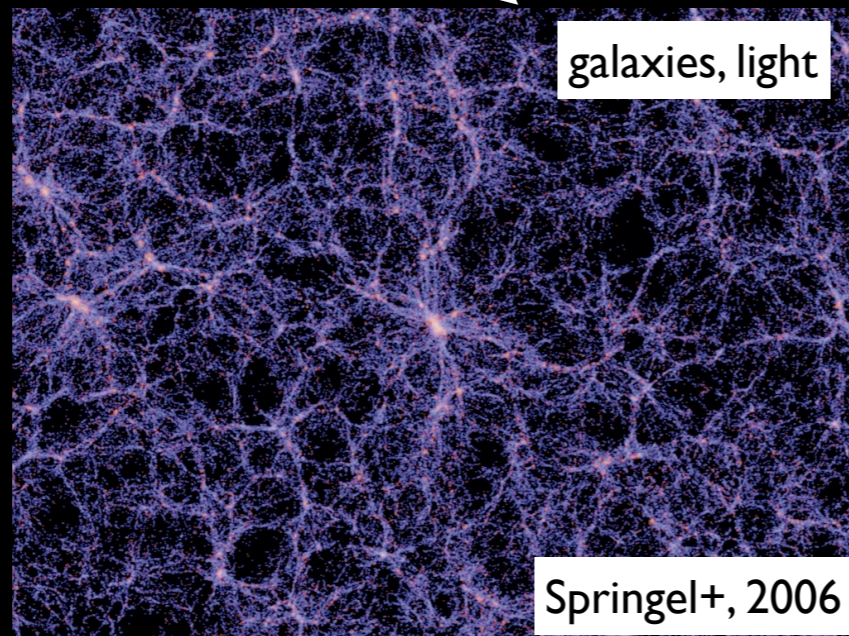
**fundamental physics**  
+ model parameters

generate initial conditions, evolve



galaxy formation models

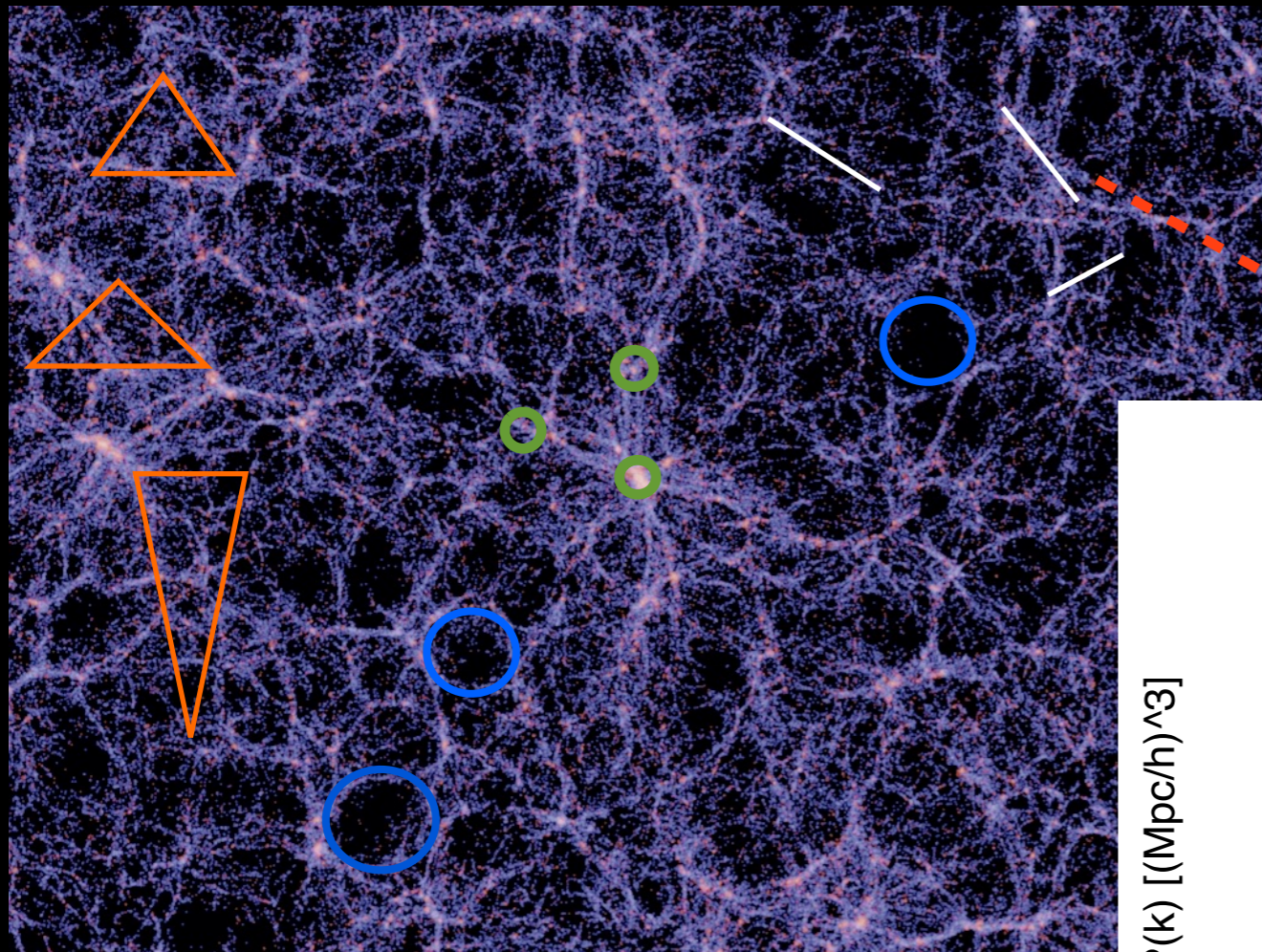
?



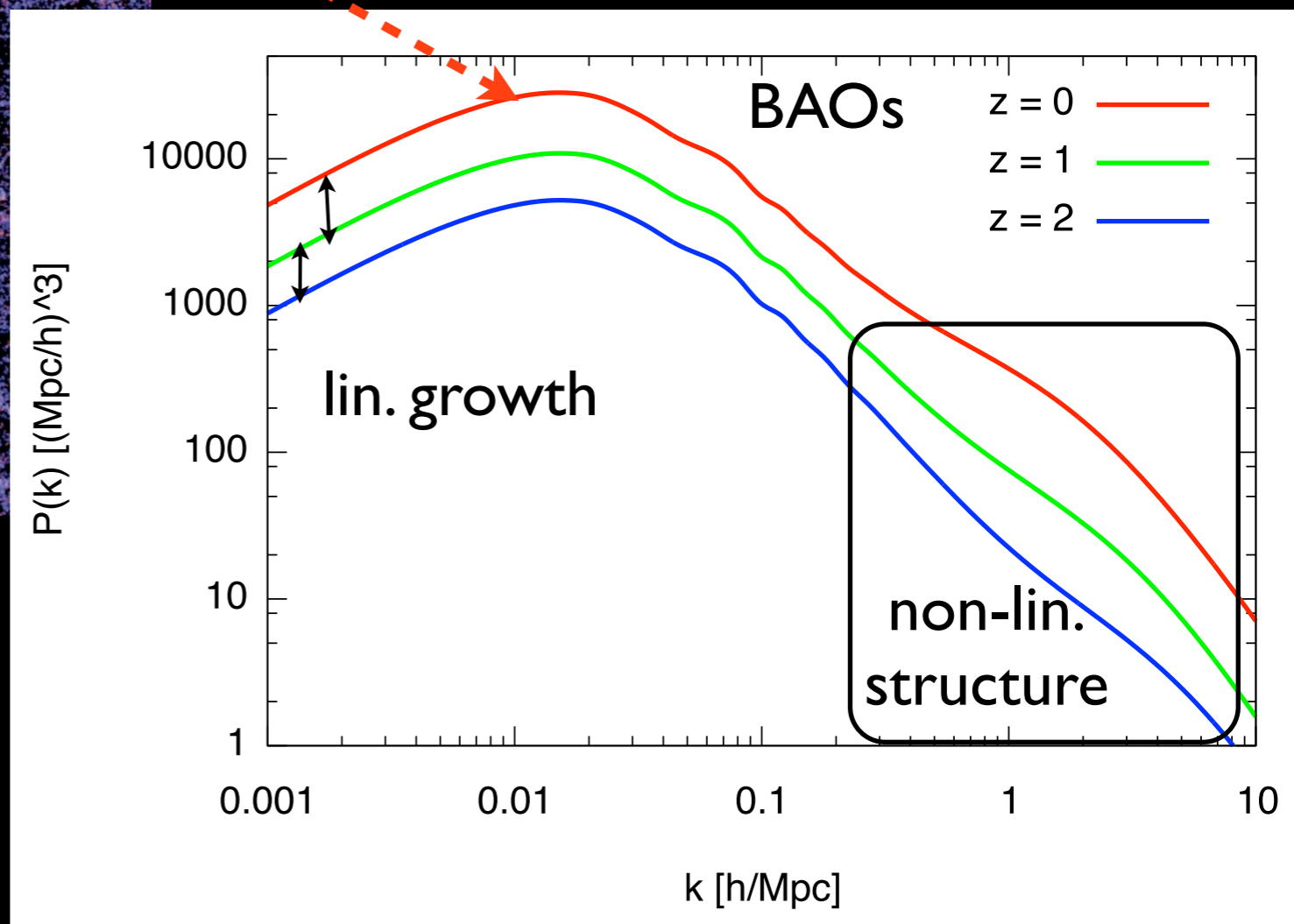
?



# What to look for in the galaxy distribution?



need redshift, understand galaxy bias

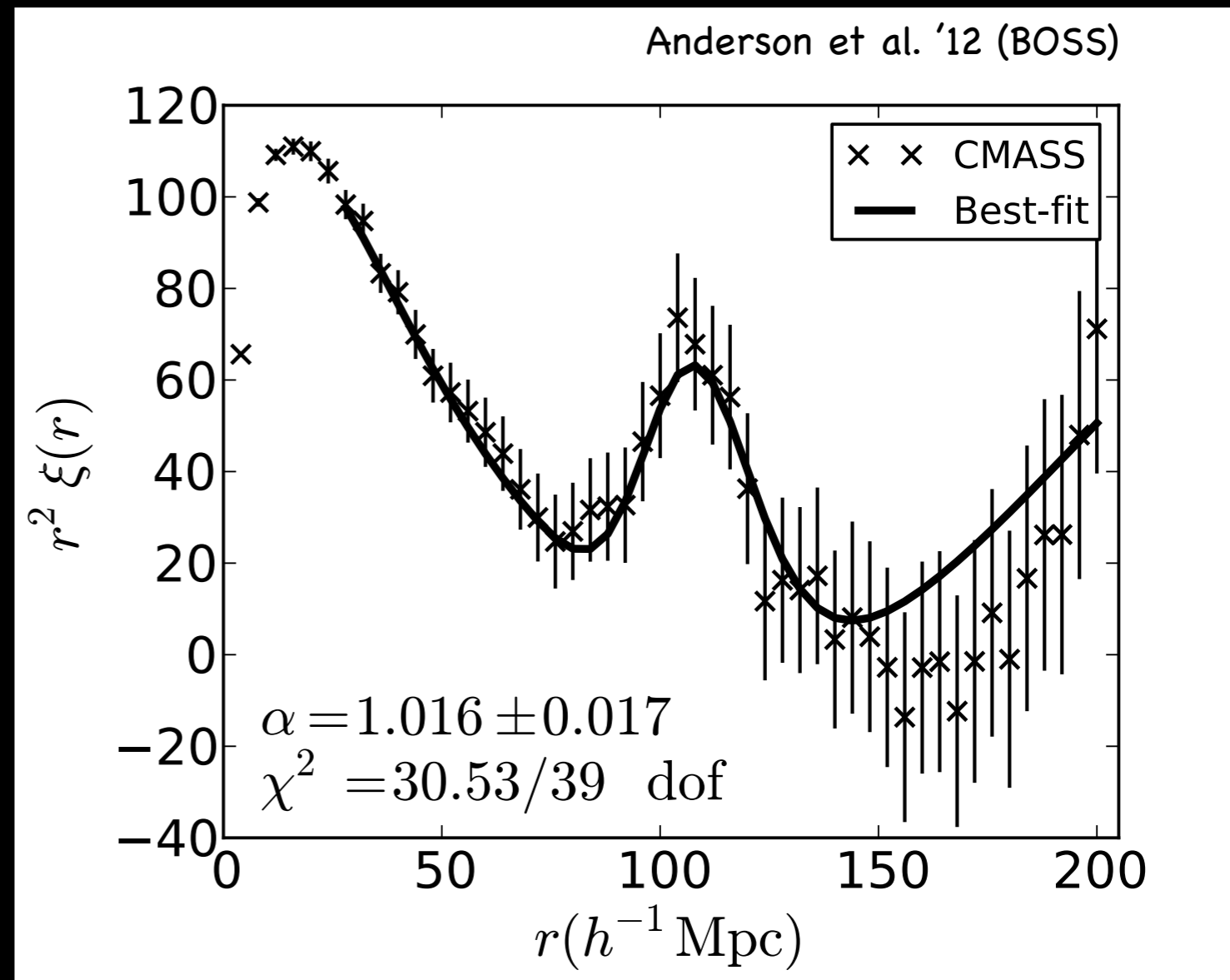


- clusters (over densities),
- voids (under densities)
- two-point correlations
- △ three-point correlations,...

# LSS Probes of Dark Energy

## Galaxy Clustering

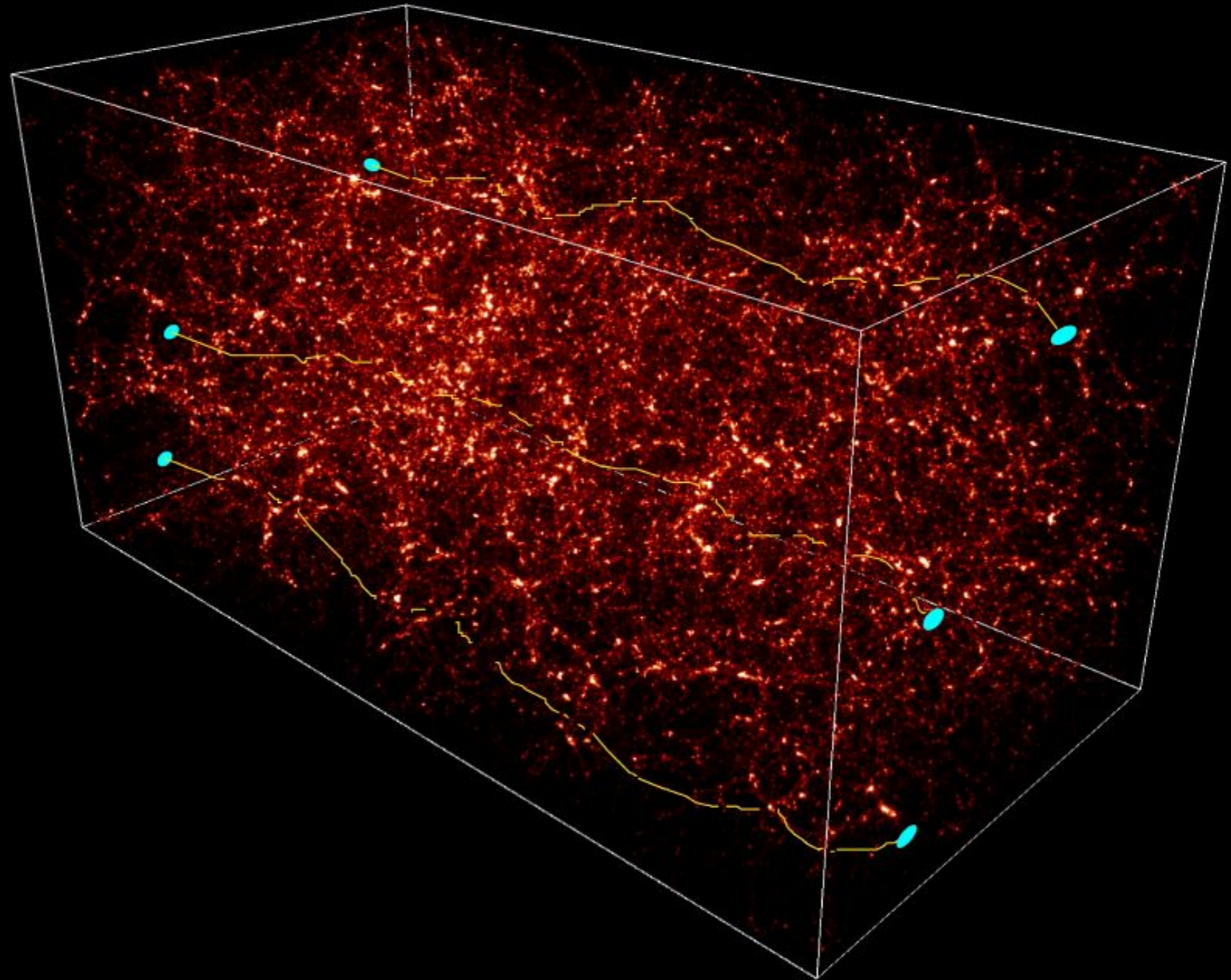
- measure BAOs + shape of correlation function
- → growth of structure, expansion history
- Key systematic: **galaxy bias**



# LSS Probes of Dark Energy

*DEFLECTION OF LIGHT RAYS CROSSING THE UNIVERSE, EMITTED BY DISTANT GALAXIES*

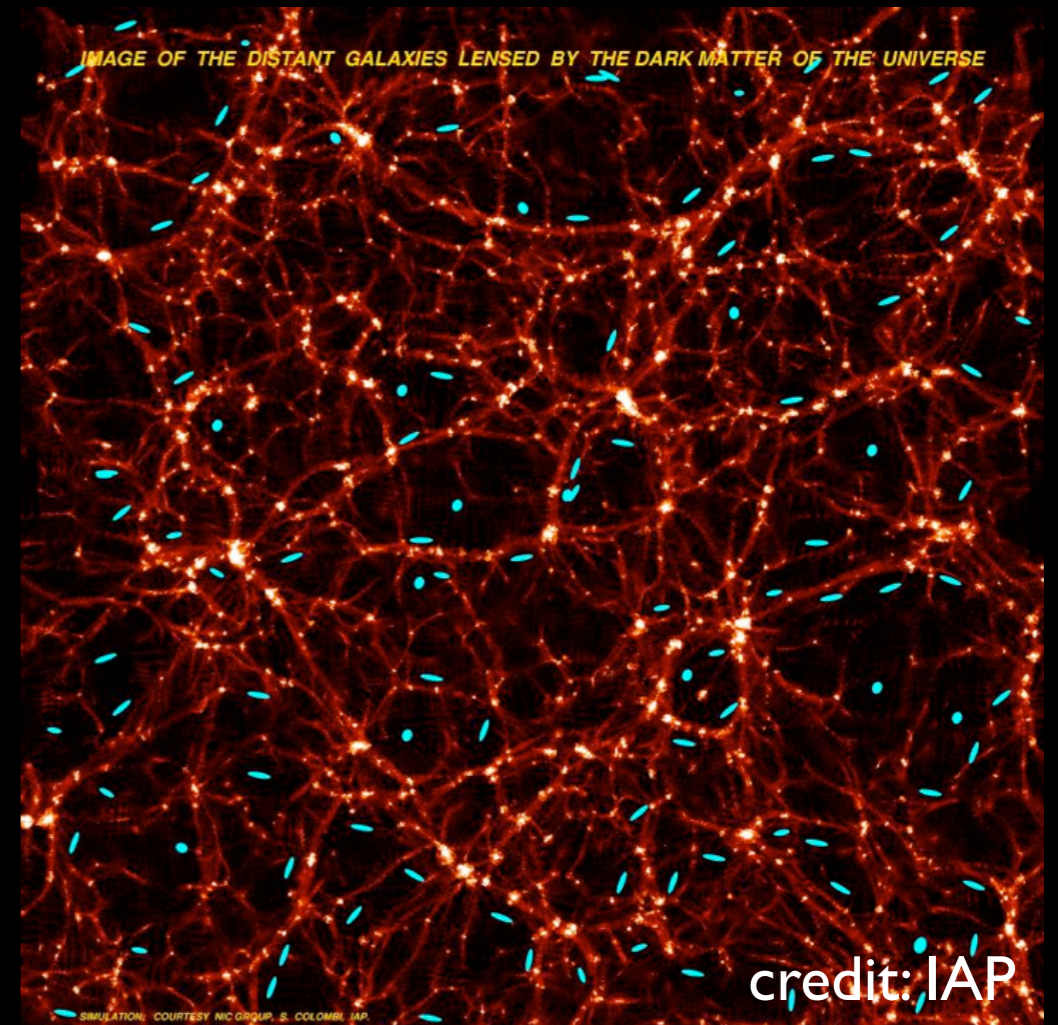
Weak  
Gravitational  
Lensing



# LSS Probes of Dark Energy

## Weak Gravitational Lensing

- light deflected by tidal field of LSS
  - coherent distortion of galaxy shapes “shear”
- shear related to projected matter distribution
- key systematics
  - shape measurements
  - assume random intrinsic orientation, average over many galaxies
- measure **shear correlation function/power spectrum**
  - probes *total* matter power spectrum (w/ broad projection kernel)
- measure average (tangential) **shear around galaxies/clusters**
  - probes halo mass



# ~Optical Dark Energy Surveys

## **Spectroscopic galaxy surveys**

determine redshifts of select galaxies

### **Galaxy Clustering**

galaxy positions, types, redshifts

### **Supernovae**

light curve, redshift

### **Galaxy Clusters**

cluster centers, redshifts,  
member galaxies

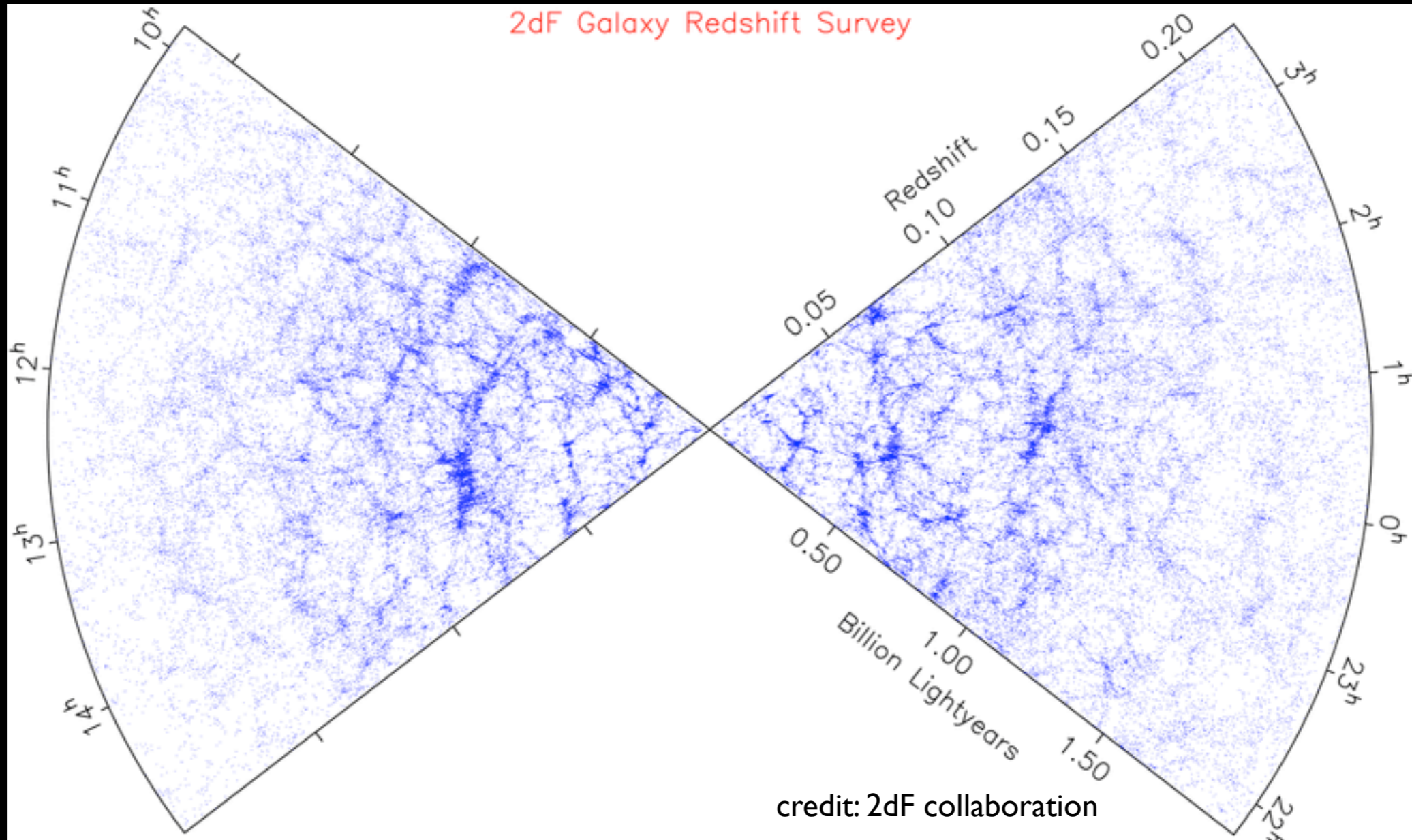
### **Weak Lensing**

galaxy positions, shapes,  
types, redshifts

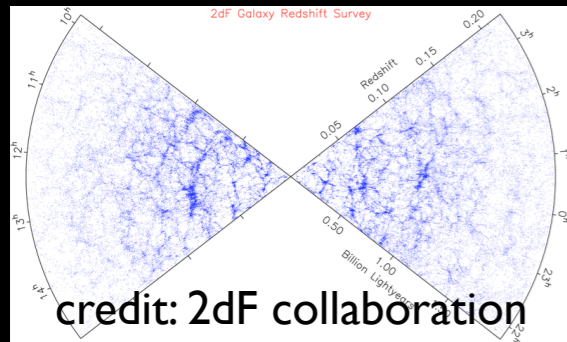
# Spectroscopic Dark Energy Surveys

the early days: SDSS, 2-degree Field survey(2dF):

$\mathcal{O}(10^5 - 10^6)$  low-redshift galaxies

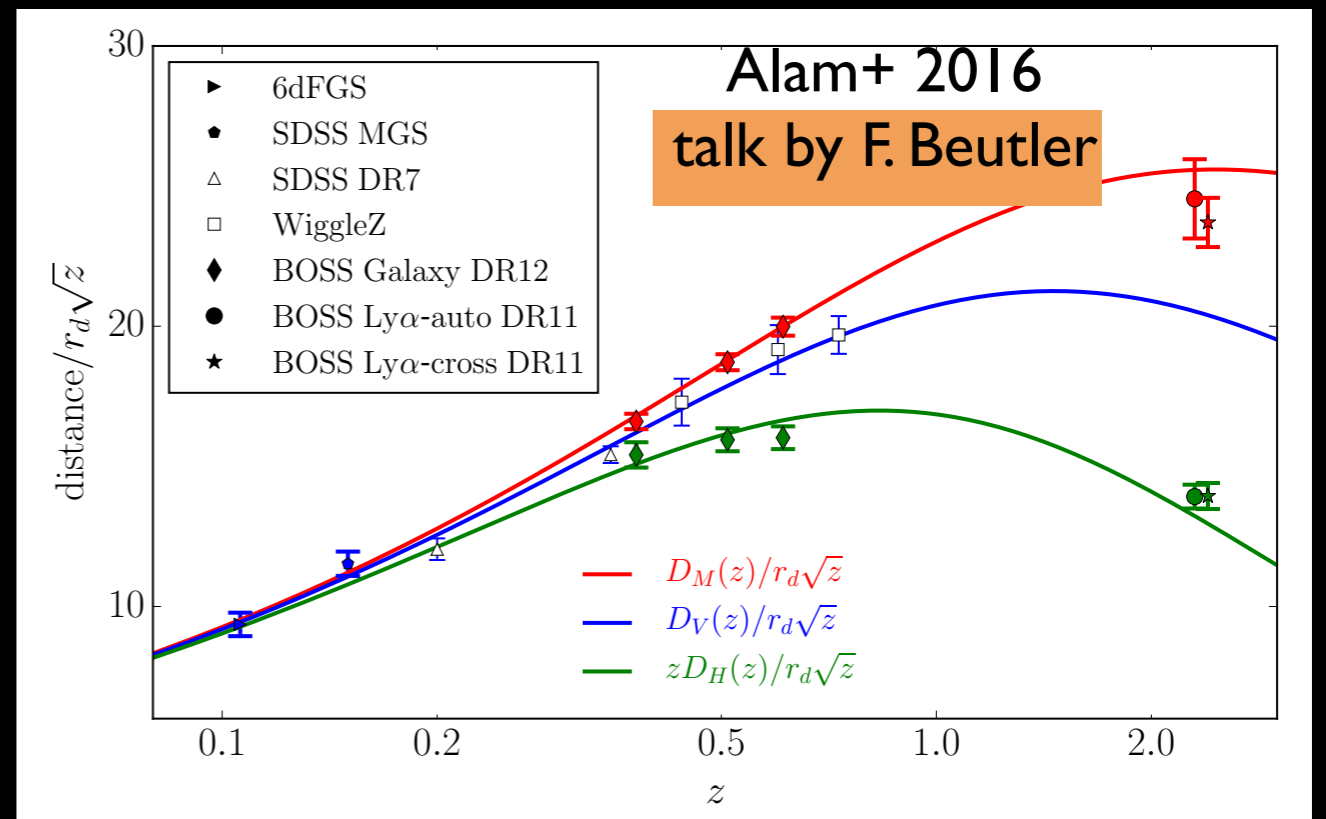
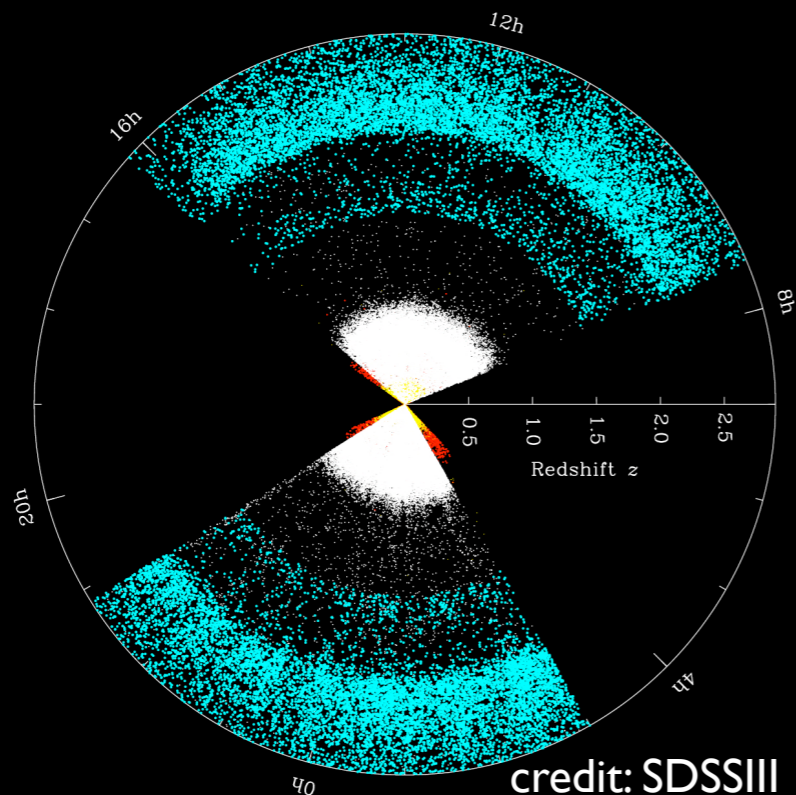


# Spectroscopic Dark Energy Surveys



the present: BOSS, WiggleZ, ...

$\mathcal{O}(10^6)$  intermediate-redshift galaxies

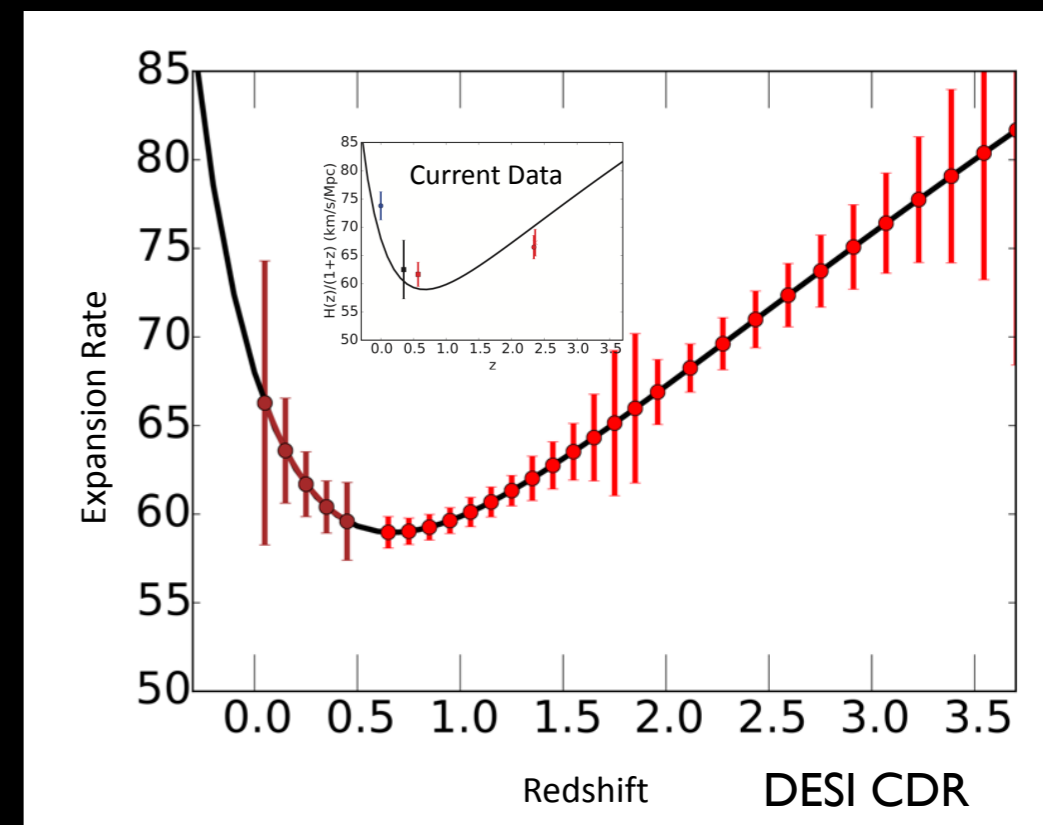
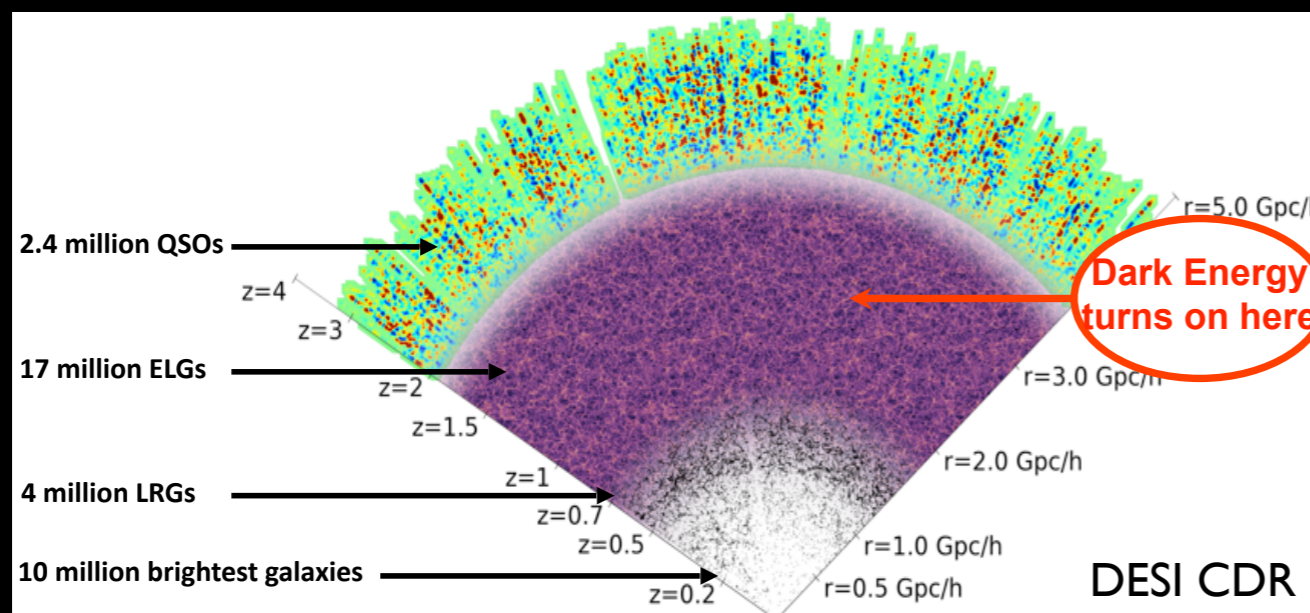
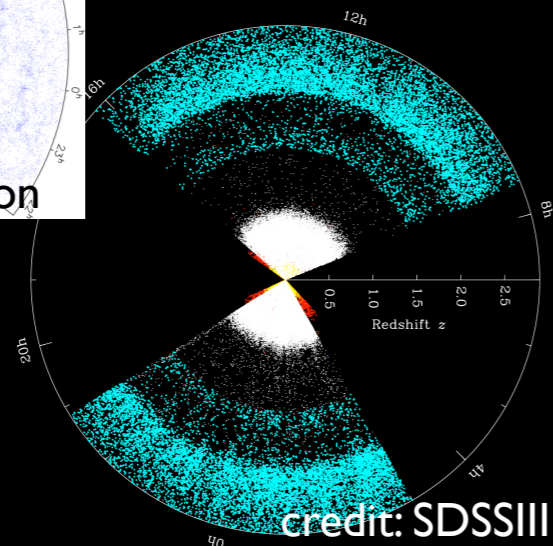
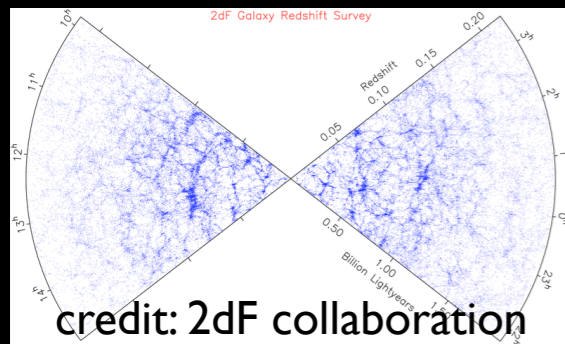




# Spectroscopic Dark Energy Surveys

the future: Dark Energy Spectroscopic Instrument (DESI)

$\mathcal{O}(10^7)$  intermediate+high- $z$  galaxies



# ~Optical Dark Energy Surveys

## Spectroscopic galaxy surveys

determine redshifts of select galaxies

## Photometric galaxy surveys

image all galaxies to lim. brightness, in multiple bands

## Time domain surveys

repeated observations with suitable cadence

### Galaxy Clustering

galaxy positions, types, redshifts

### Supernovae + Strong Lensing

light curve, redshift

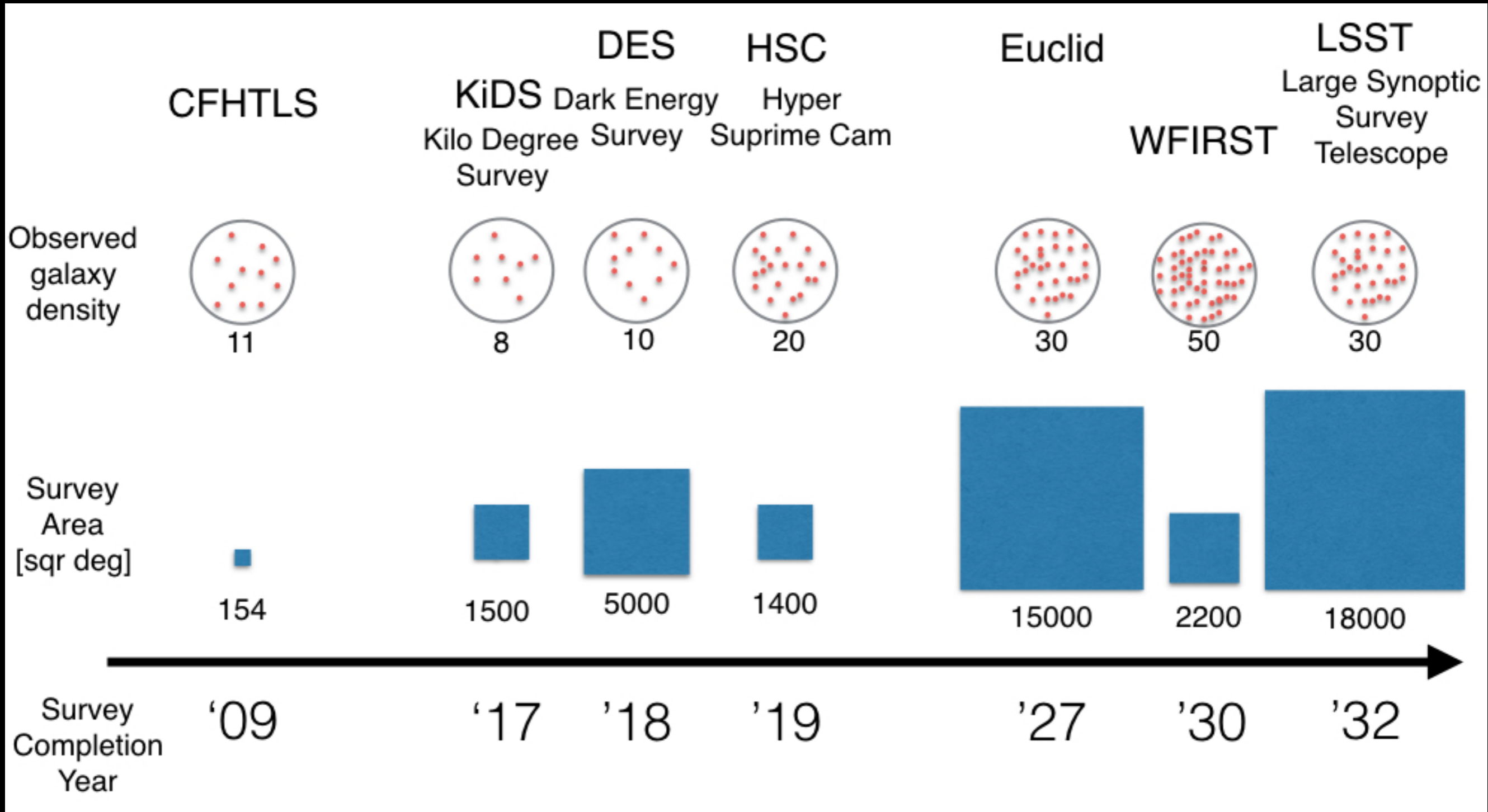
### Galaxy Clusters

cluster centers, redshifts,  
member galaxies

### Weak Lensing

galaxy positions, shapes,  
types, redshifts

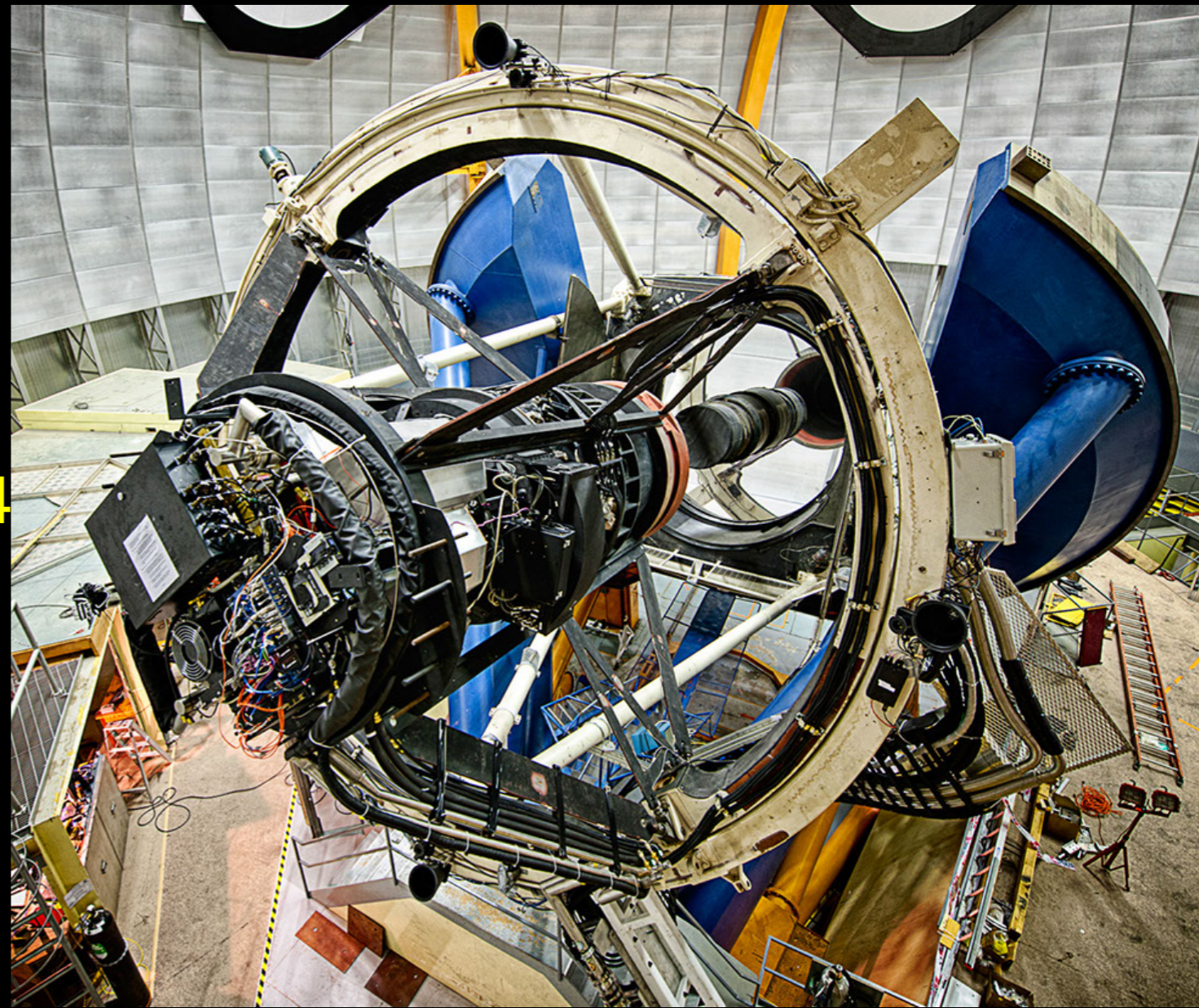
# Photometric Dark Energy Surveys



# The Dark Energy Survey

- **Probe origin of Cosmic Acceleration:**
  - Distance vs. redshift
  - Growth of Structure
- **Two multicolor surveys:**
  - 300 M galaxies over 5000 sq deg, grizY to 24<sup>th</sup> mag
  - 3000 supernovae (27 sq deg)
- **New camera for CTIO Blanco 4 telescope**
  - DECam Facility instrument
- **Survey started Aug. 2013**
  - Finished 5 seasons, 105 nights per season (Aug-Feb)

DECam on the CTIO Blanco 4m



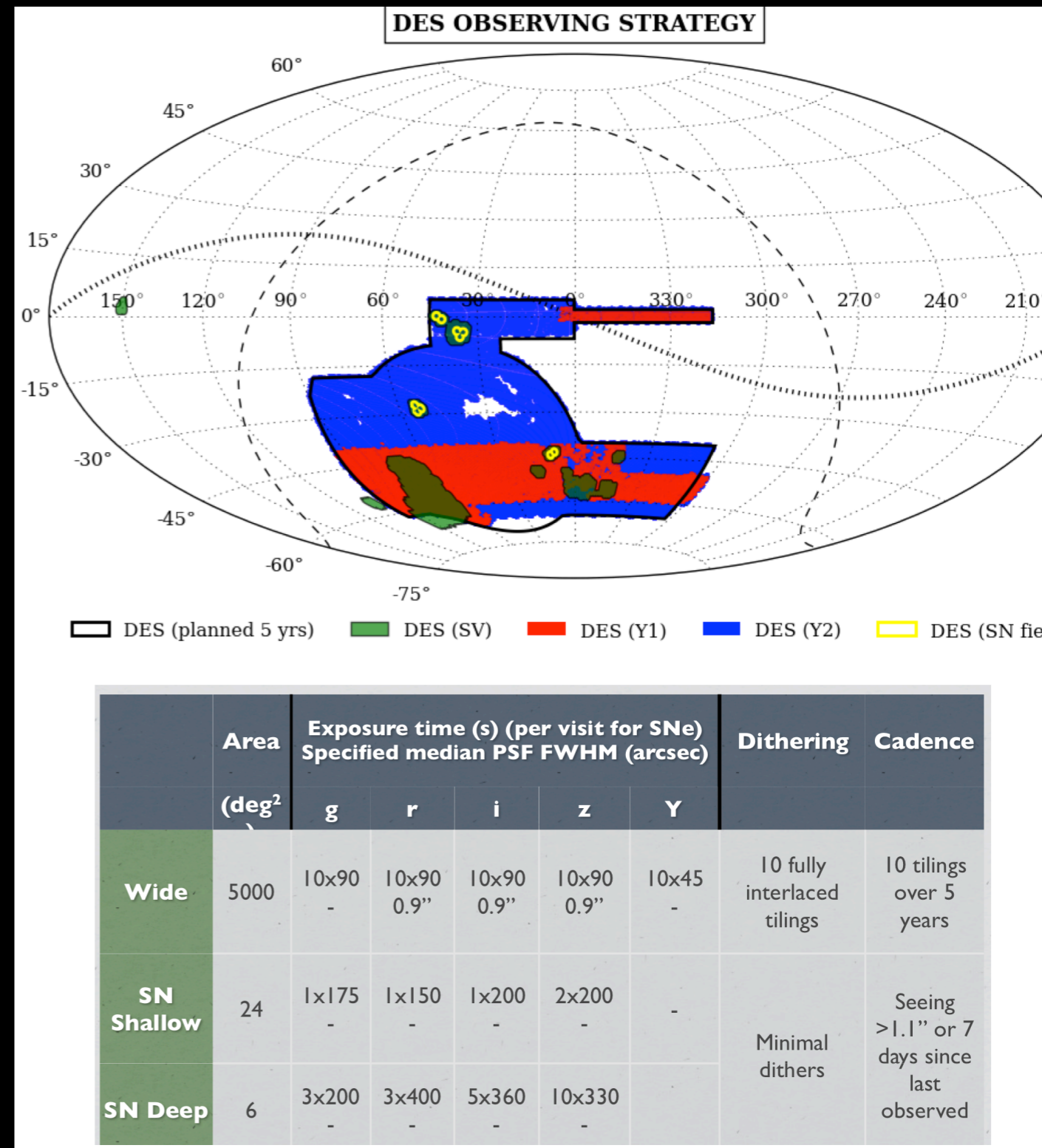
# Dark Energy Survey: Progress

SV (150 sq .deg., full depth)  
science done, catalogs public

Y1 (1500 sq. deg., 40% depth)

Y3 (5000 sq. deg., 50% depth)  
data processed, vetting  
catalogs

Y5 observations completed  
Y5.5 in 2018B

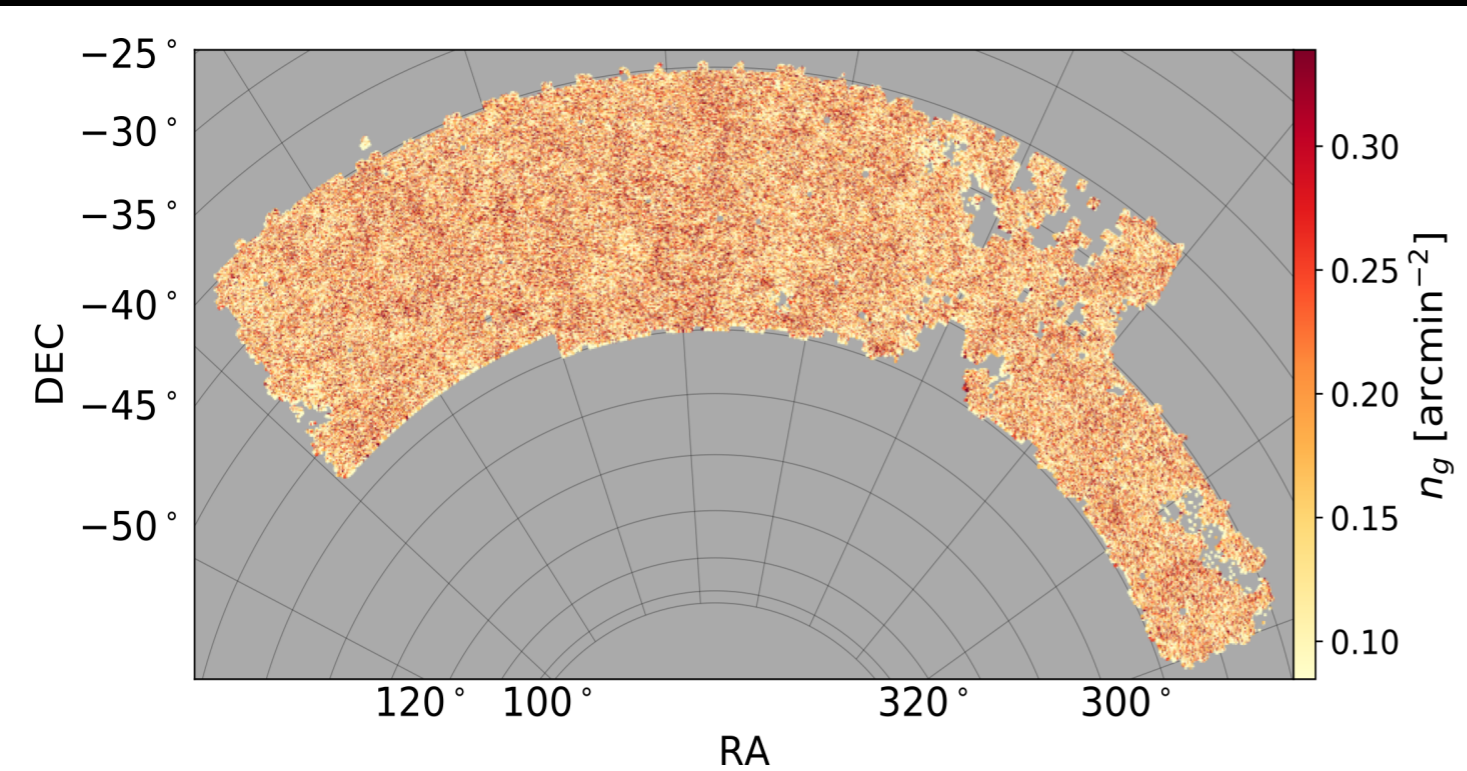


Major El Nino affected Year 3

# Dark Energy Survey Collaboration

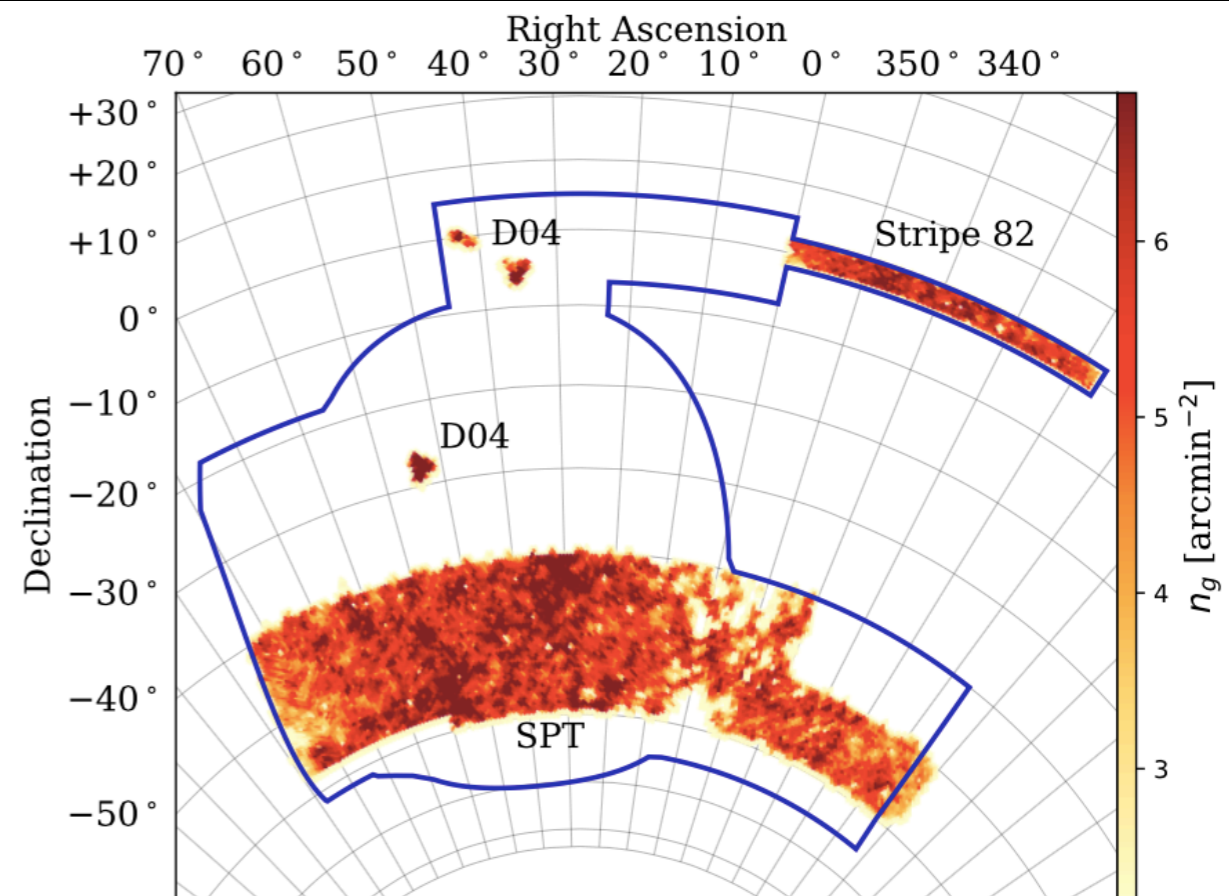


# DES Year 1 Galaxy Samples



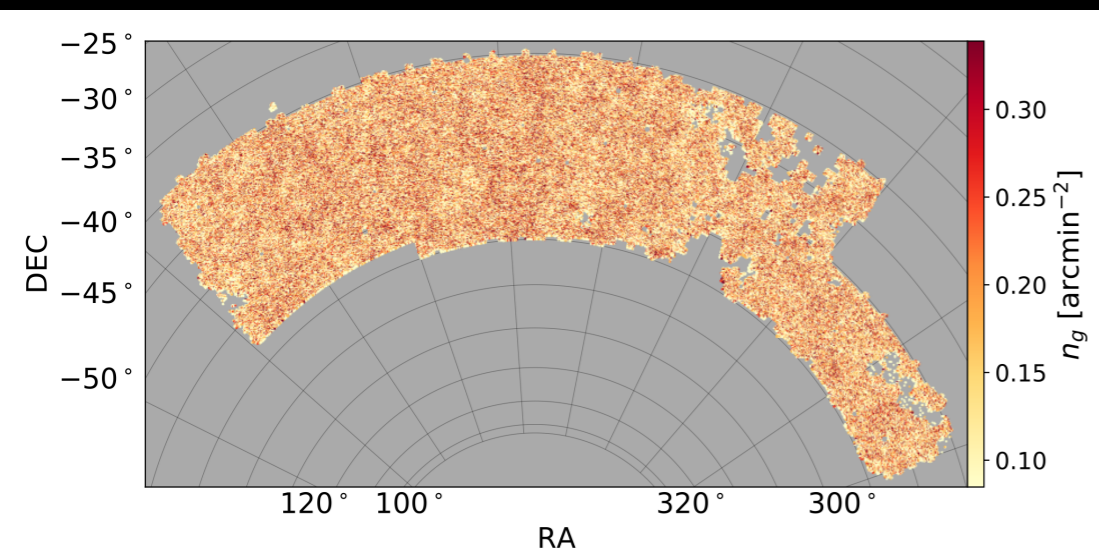
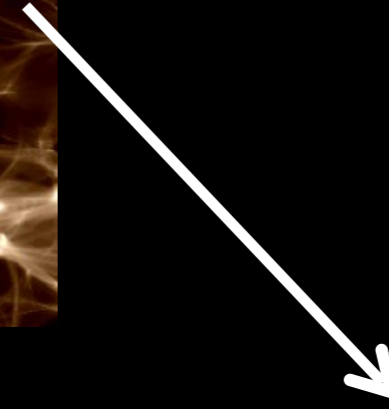
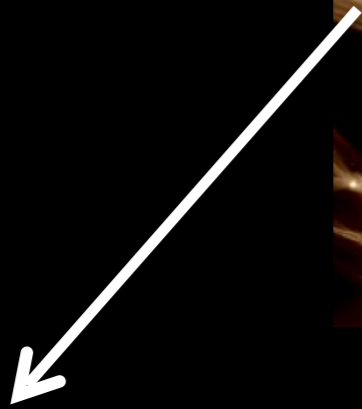
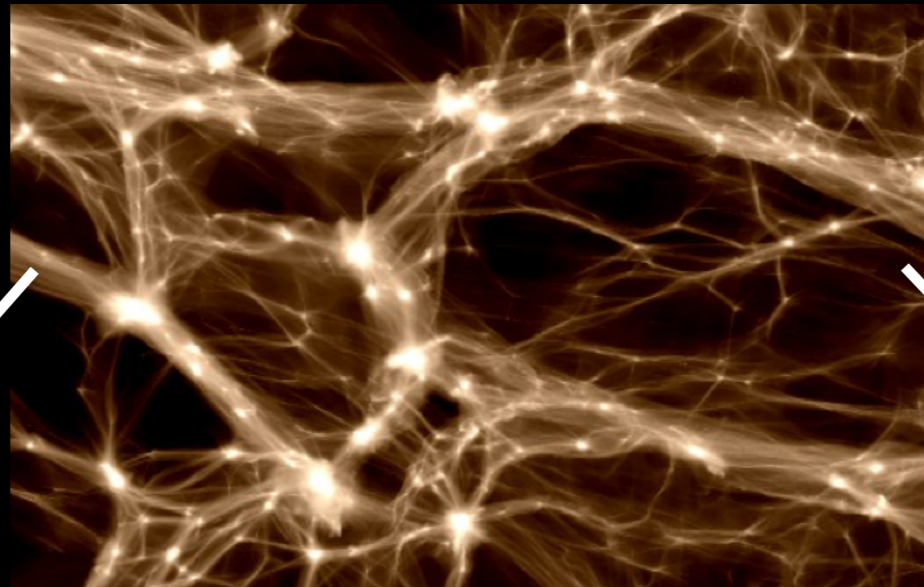
- 26 million source galaxies
- 4 redshift bins
- Sources for cosmic shear & galaxy-galaxy lensing

- 660,000 redMaGiC galaxies with excellent photo-z's
- Measure angular clustering in 5 redshift bins
- Use as lenses for galaxy-galaxy lensing

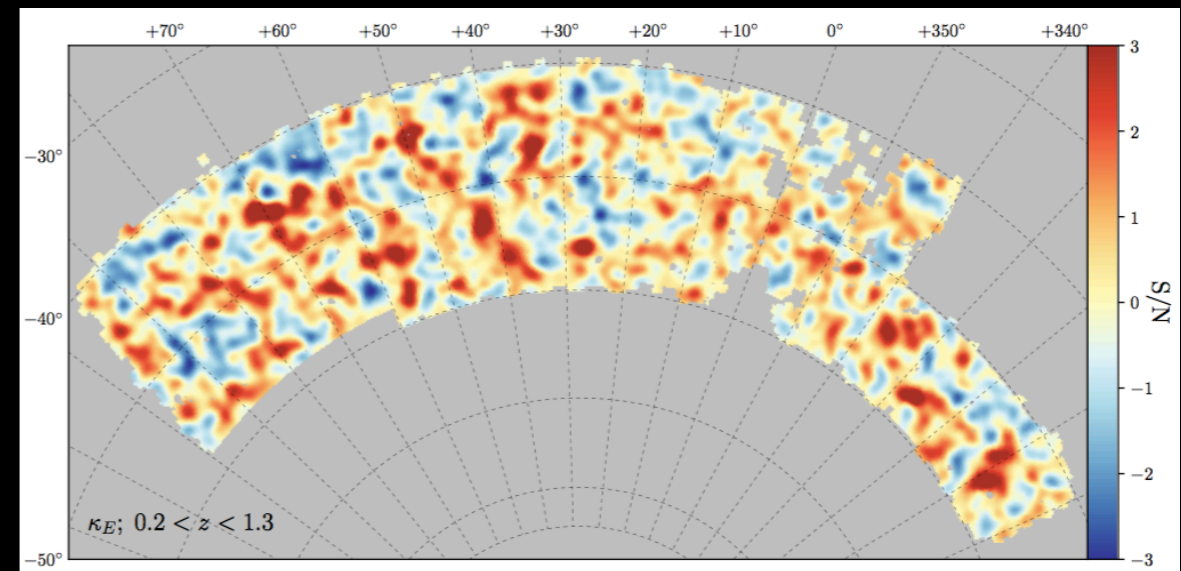


First Year of Data: ~1800 sq. deg. Analyzed 1321 s.d. after cuts

# DES Year 1 Cosmology Analysis



galaxies x galaxies:  
angular clustering



lensing x lensing:  
cosmic shear

galaxies x lensing:  
galaxy-galaxy lensing

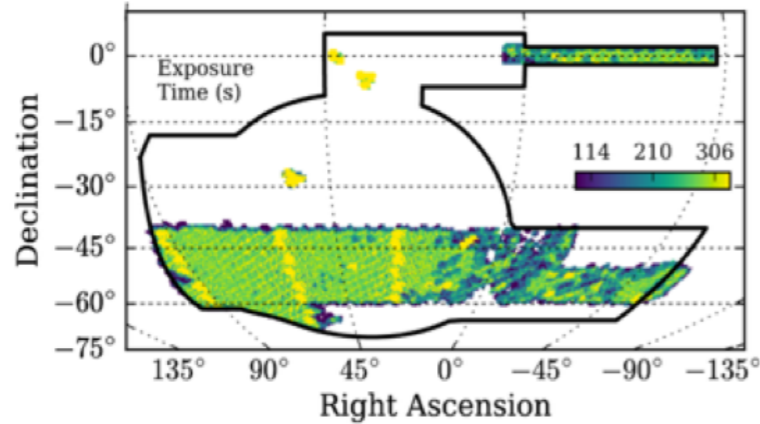


# DES Year 1 Cosmology Analysis

- **Angular clustering:** autocorrelation of 660,000 luminous red galaxies with excellent photo-z's, in 5 redshift bins
- **Cosmic shear weak lensing:** shear-shear correlation functions from 26 million galaxy shapes in 4 redshift bins
- **Galaxy-galaxy lensing:** correlate red galaxy positions (foreground lenses) with source galaxy shear

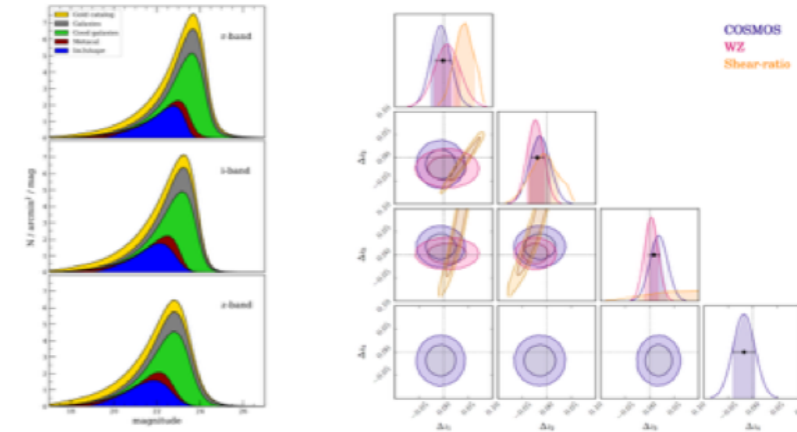
# With great statistical power comes great systematic responsibility

Unprecedented size and depth of photometric data



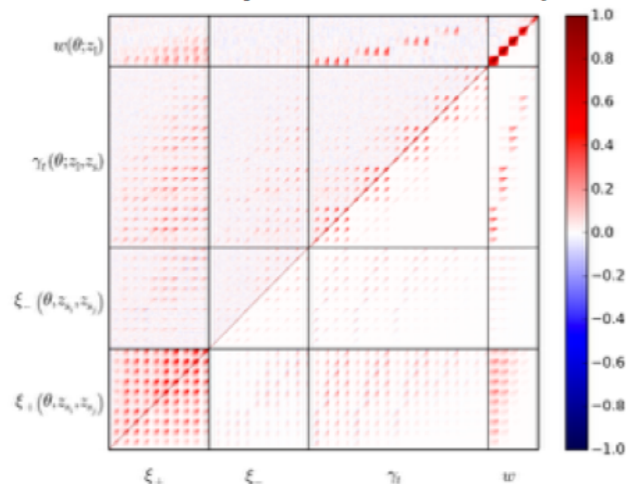
Drlica-Wagner, Rykoff, Sevilla+

Two independent shape & photo-z catalogs and calibrations



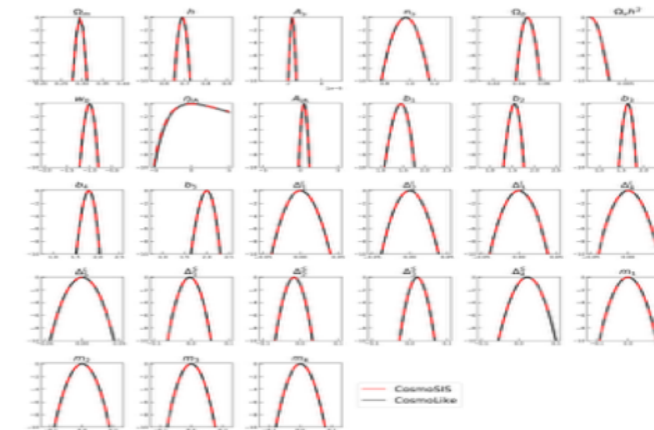
Zuntz, Sheldon+, Samuroff+  
Cawthon+, Davis+, Gatti, Vielzeuf+, Hoyle, Gruen+

Full, validated treatment of covariance and nuisance parameters (including  $v$ )



Krause, Eifler+, MacCrann, DeRose+

Theory and simulation tested, blind, analysis with two independent codes, CosmoLike and CosmoSIS



# Measurements: shear catalogs

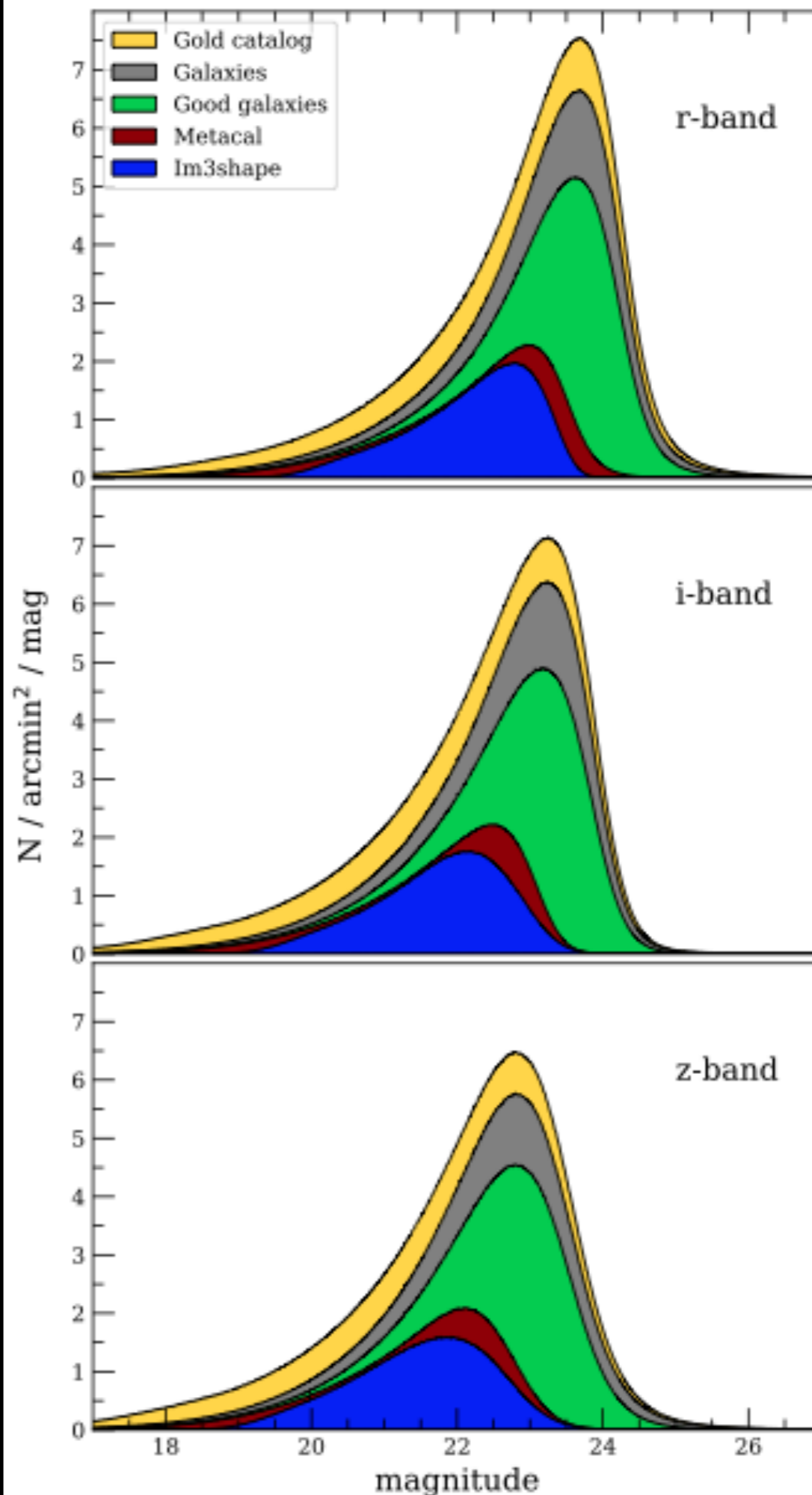
(Huff+17, Sheldon+17, Zuntz+17)

## Metacalibration

- New estimator measuring shear response internally by deconvolving, shearing, deconvolving.
- Uses g, r, i bands.
- 35 M galaxies (26 M for cosmology).

## im3shape

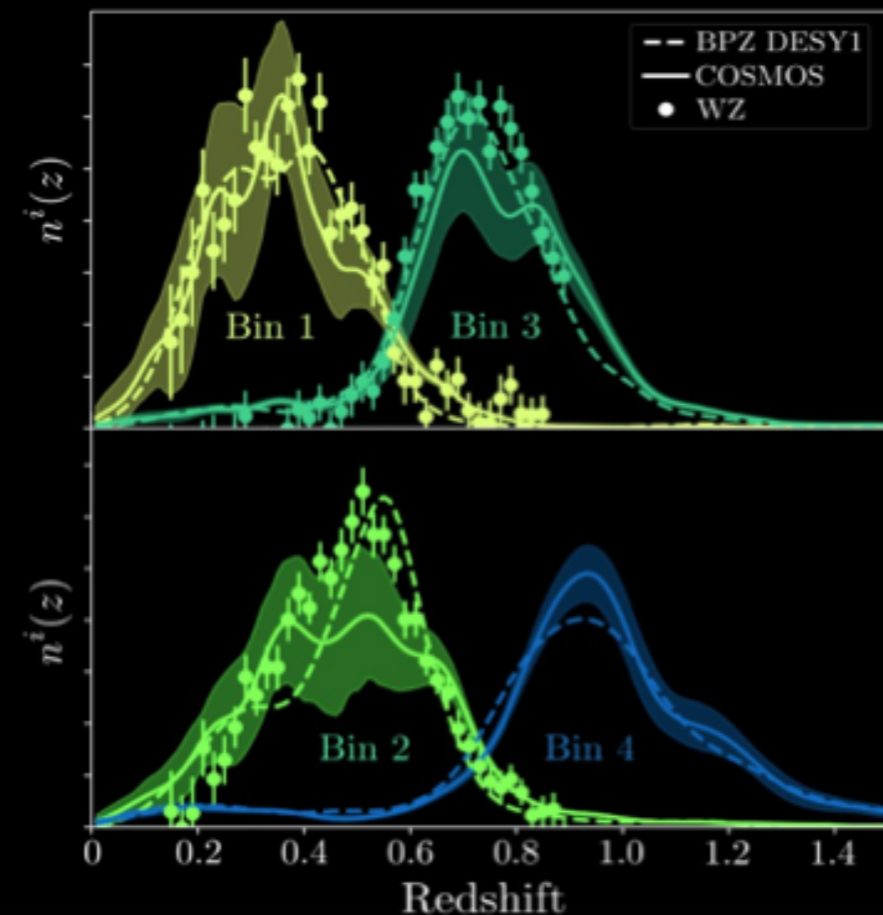
- Best-fit bulge & disc models, calibrated with simulations.
- Uses only r-band.
- 22 M galaxies (18 M for cosmology).



# With great statistical power comes great systematic responsibility

- unprecedented combination of area and depth
- two independent galaxy shape measurements, including novel metacalibration algorithm
- two independent calibrations of photometric redshifts

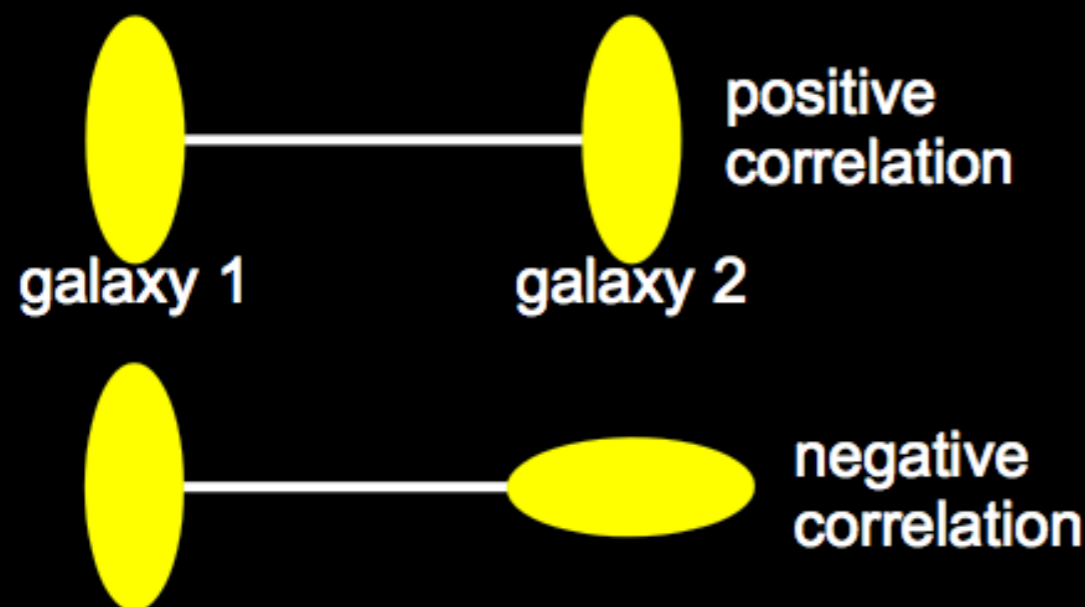
- Matching galaxy population to COSMOS galaxies with known redshift: Hoyle, Gruen+ (1708.01532)
- Clustering of galaxy population with galaxies with known redshift: Davis+ (1707.08256)
- Methods agree,  $\sim 0.015$  joint errors!



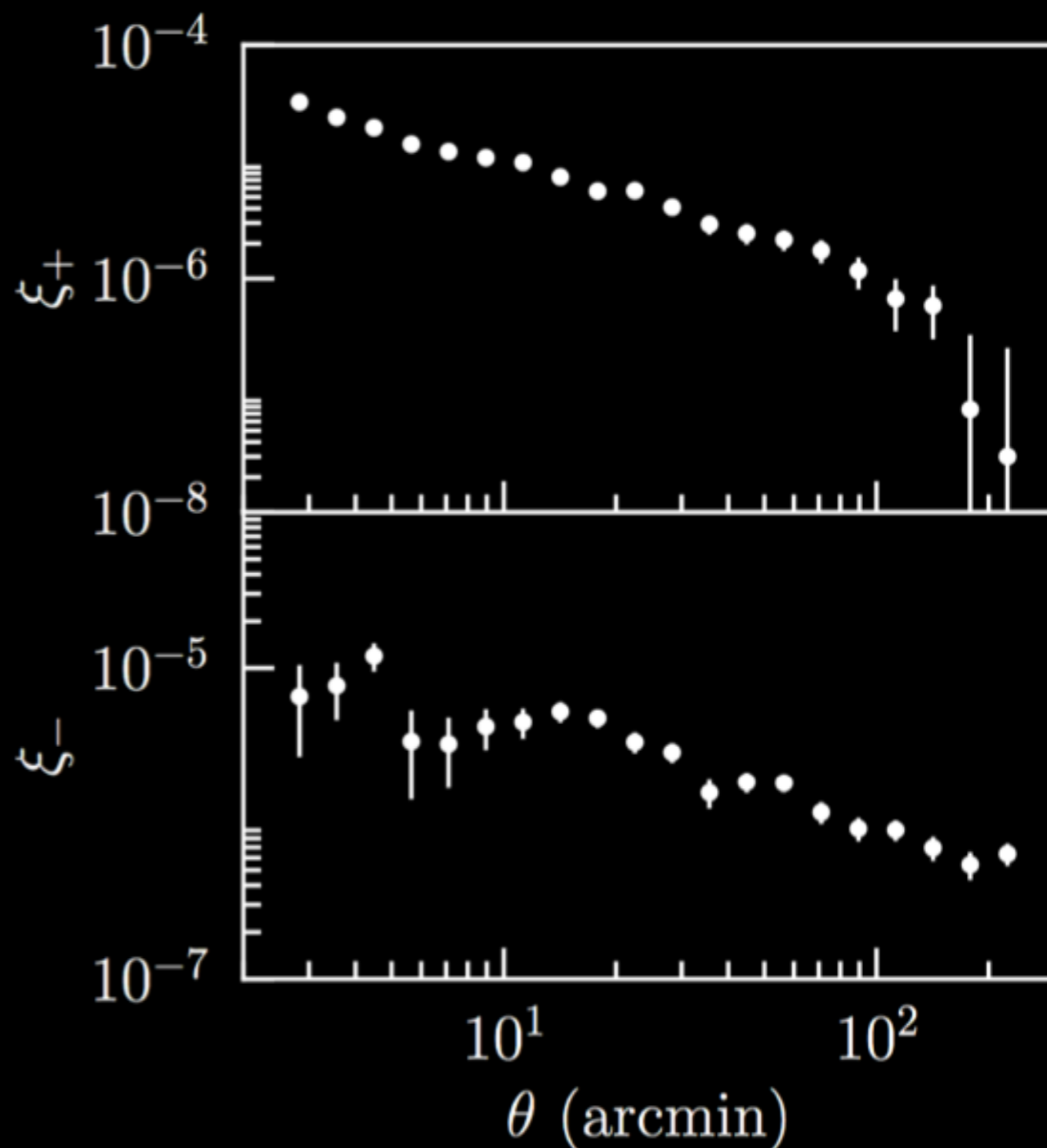
# Measurements: cosmic shear

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



correlation of shapes of galaxy pairs

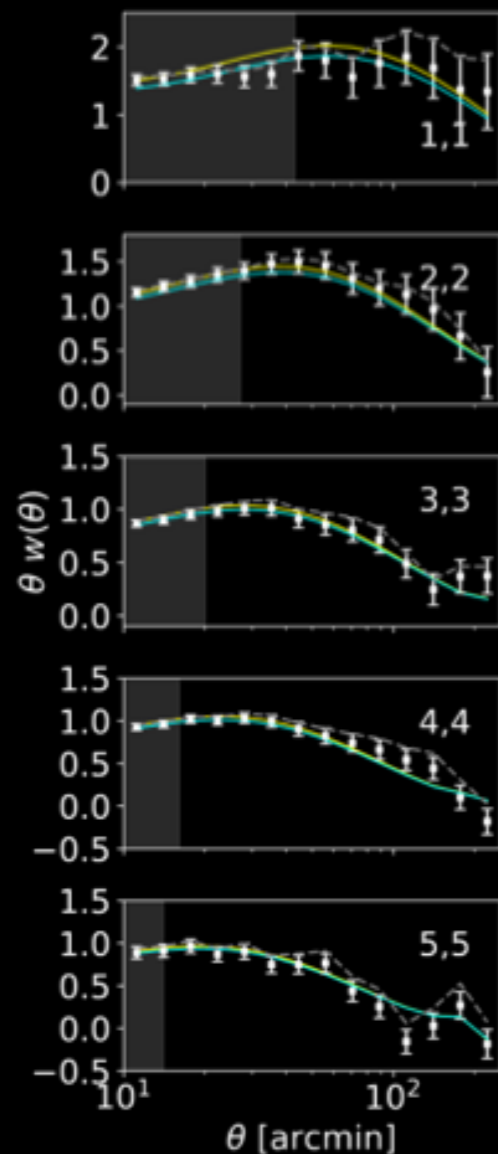


# Measurements: galaxy clustering and galaxy-galaxy lensing

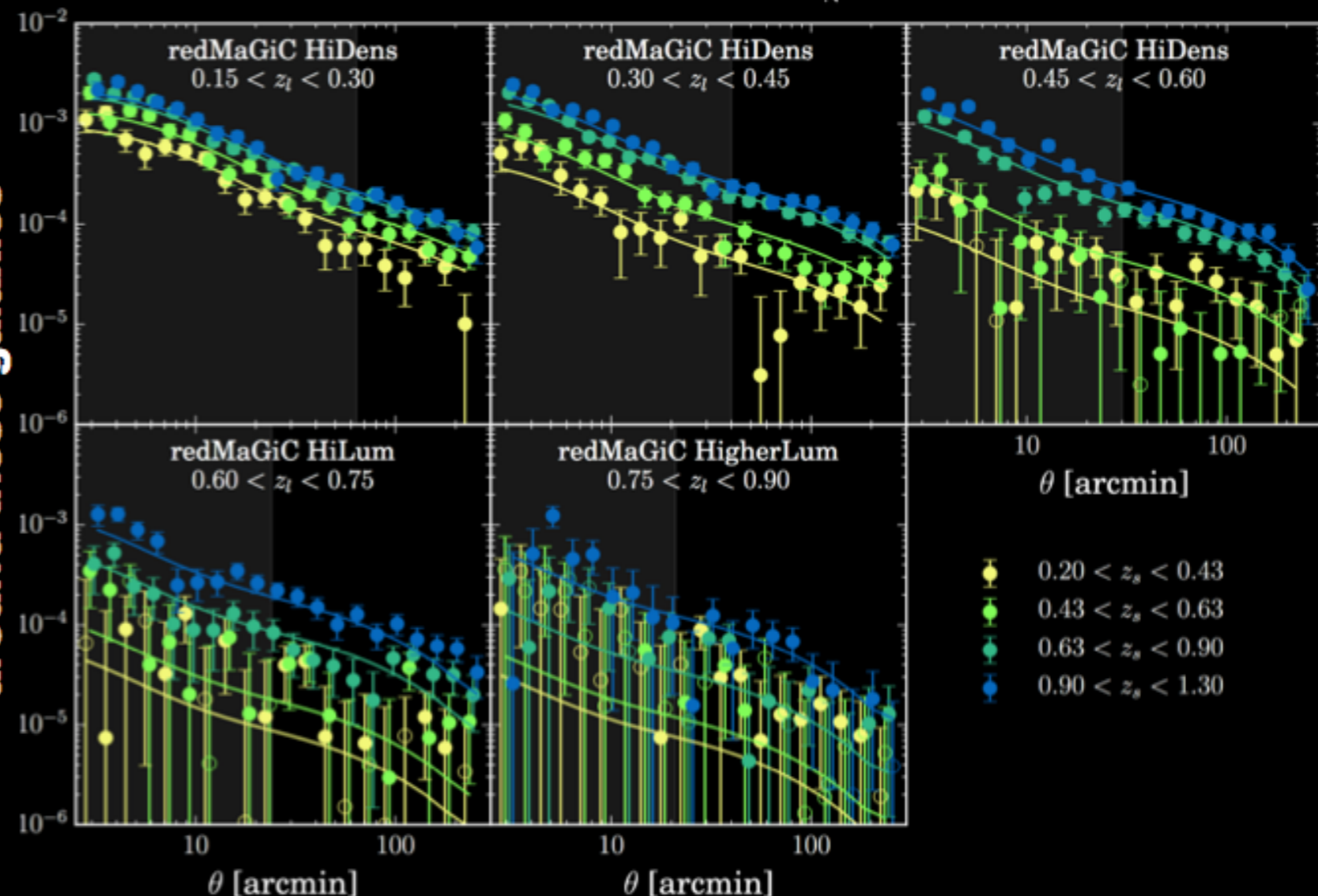
Elvin-Poole+ (1708.01536); Prat, Sanchez+ (1708.01537)

- Lens galaxies: redMaGiC LRGs with high-quality photometric redshift estimates

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

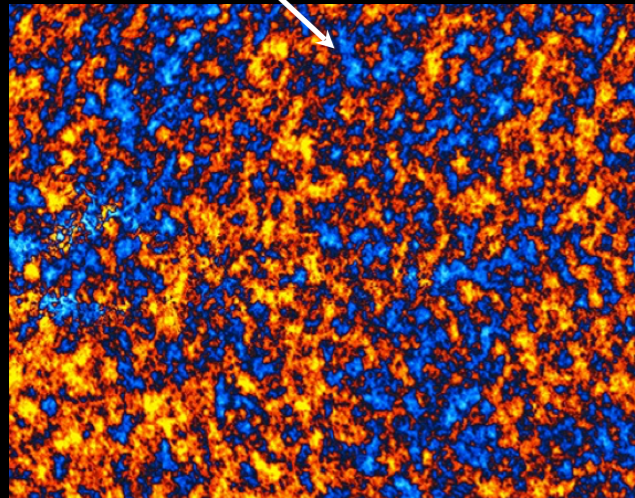


tangential gravitational shear around these galaxies

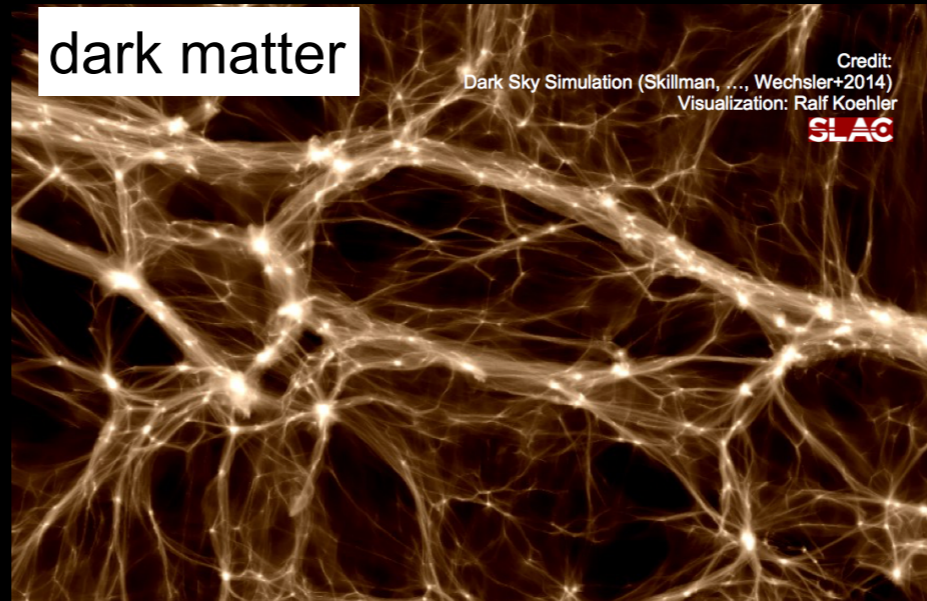


# Cosmology Analysis: Modeling

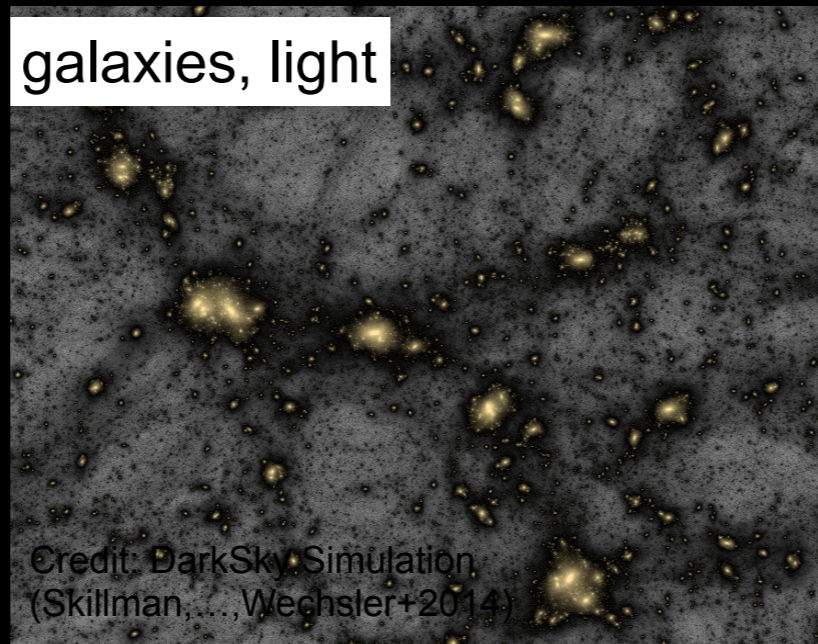
Cosmological model  
+ model parameters



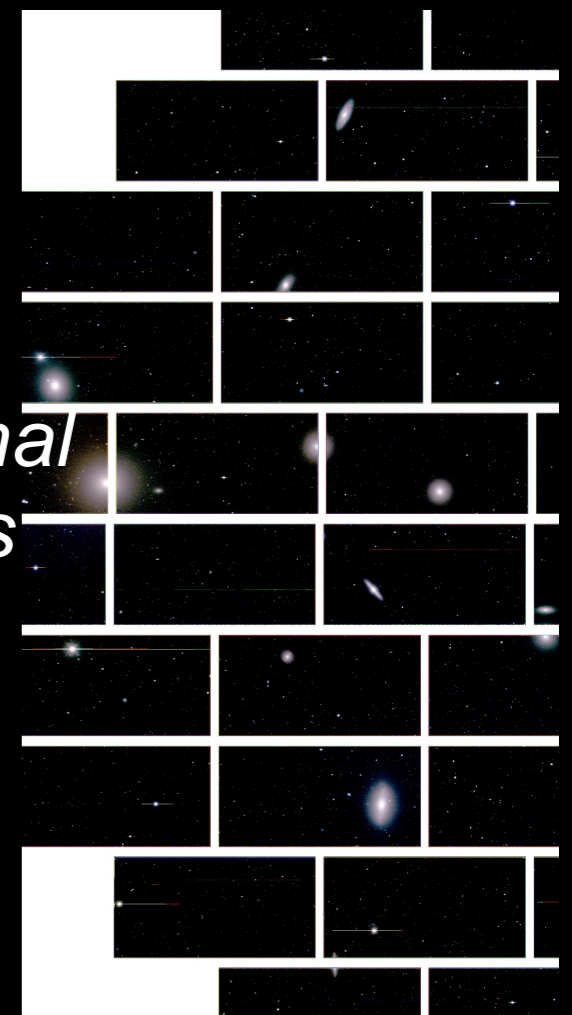
evolve



*galaxy formation*



*observational systematics*



# Multi-Probe Methodology

from data vector  $\mathbf{D}$  to parameters  $\mathbf{p}$

$$L(\mathbf{D}|\mathbf{p}) \propto \exp\left(-\frac{1}{2} [(\mathbf{D} - \mathbf{M}(\mathbf{p}))^T \mathbf{C}^{-1} (\mathbf{D} - \mathbf{M}(\mathbf{p}))]\right)$$

- **model data vector**, incl. relevant systematics
  - implementation details should not contribute to error budget
  - are the systematics parameterizations sufficient for DES-Y1?
- **covariance** for ~450 data points
- **sampler** - don't get the last step wrong...

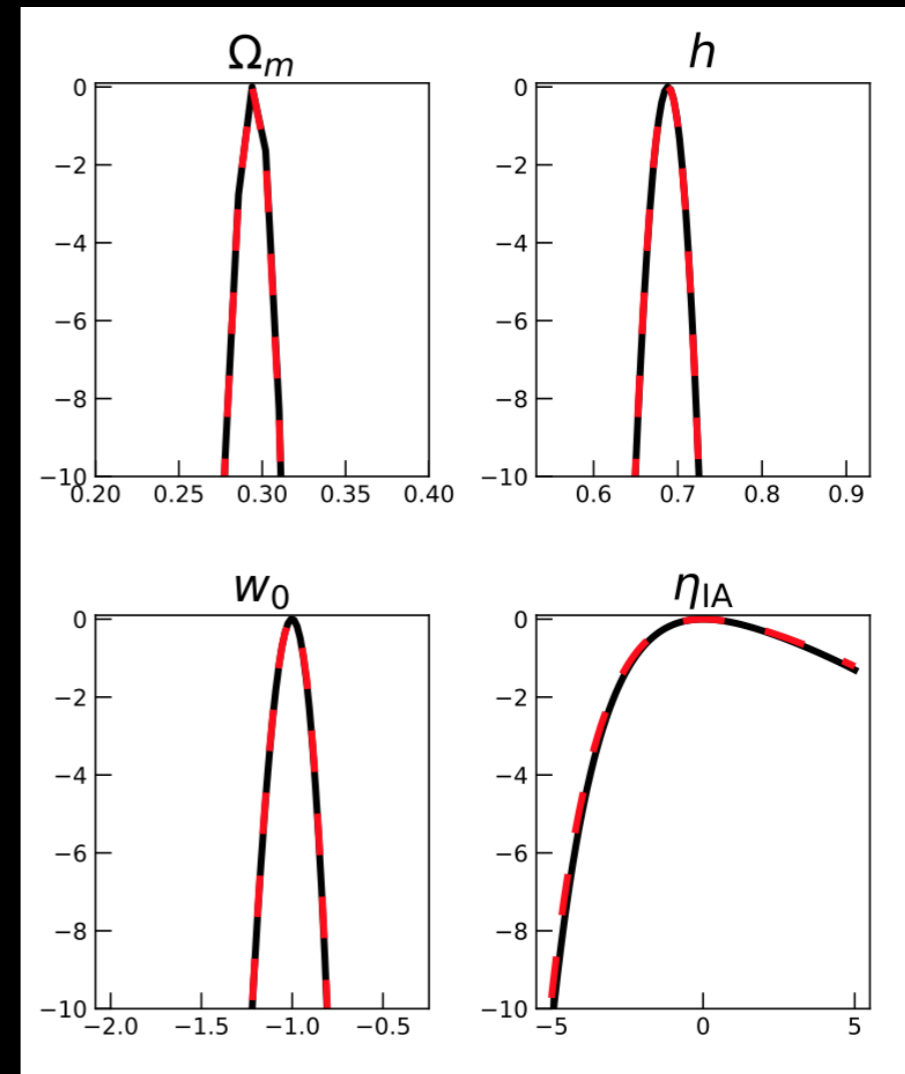
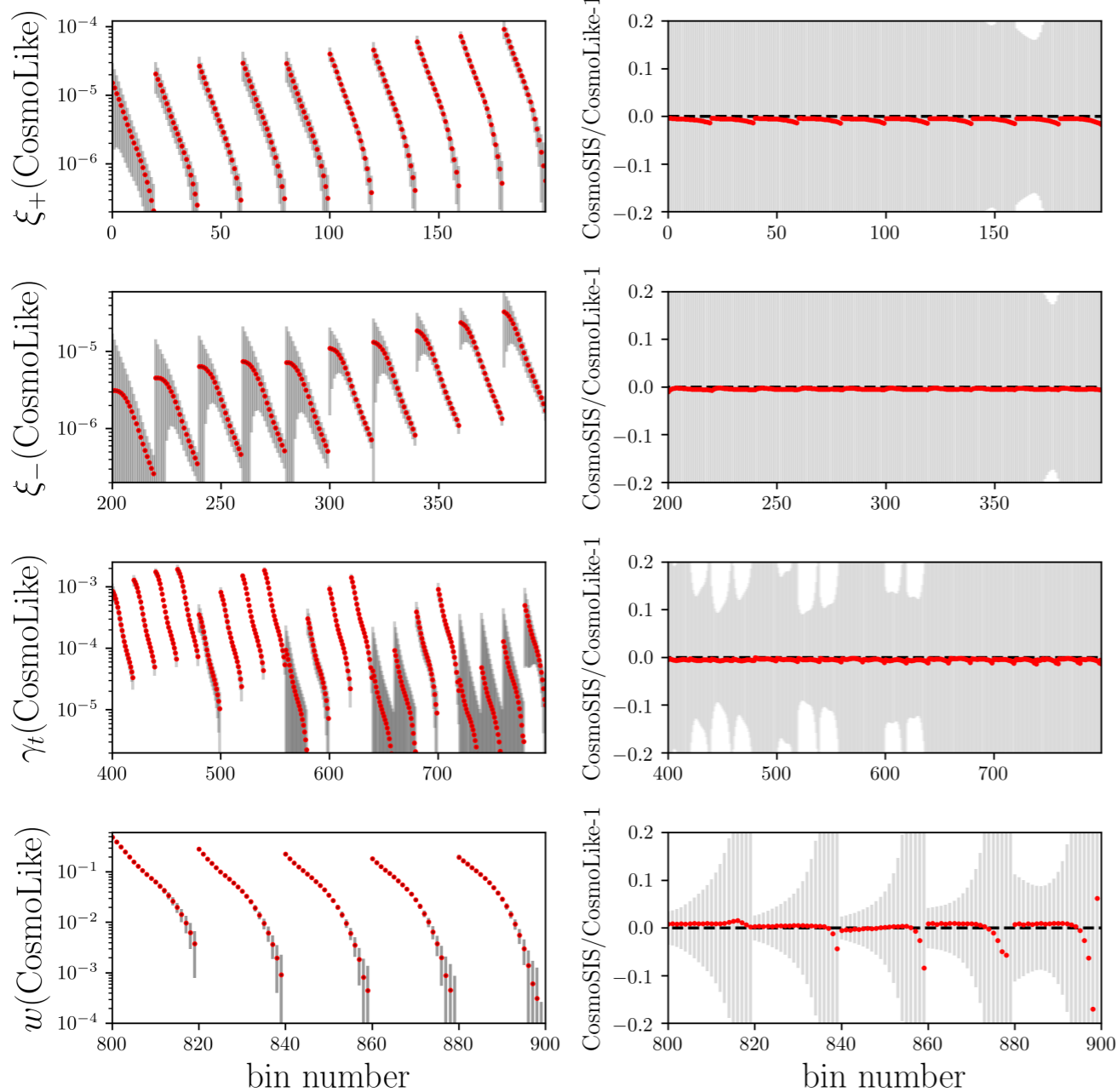
methods paper: validate **model + implementation**,  
**covariance**, **sampling**



# Cosmology Pipeline Validation

data vector

log(L) for variation of  
1 parameter



(+22 other parameters)

# Systematics Modeling + Mitigation

baseline systematics marginalization (20 parameters)

- **linear bias** of lens galaxies, per lens z-bin
- **lens galaxy photo-zs**, per lens z-bin
- **source galaxy photo-zs**, per source z-bin
- **multiplicative shear calibration**, per source z-bin
- **intrinsic alignments**, power-law/free amplitude per per source z-bin

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-> this list is known to be incomplete

how much will **known, unaccounted-for** systematics bias Y1 results?

-> choice of parameterizations  $\neq$  universal truth

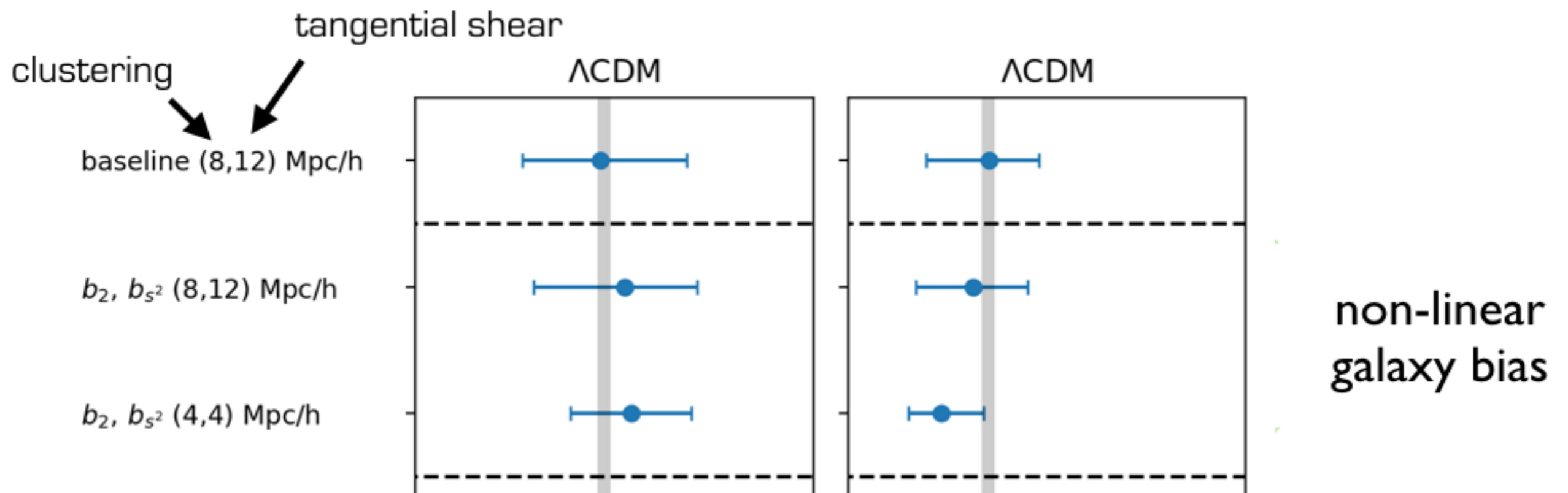
are these **parameterizations sufficiently flexible** for Y1 analyses?

# Angular Scale Cuts: remove known, unaccounted-for systematics

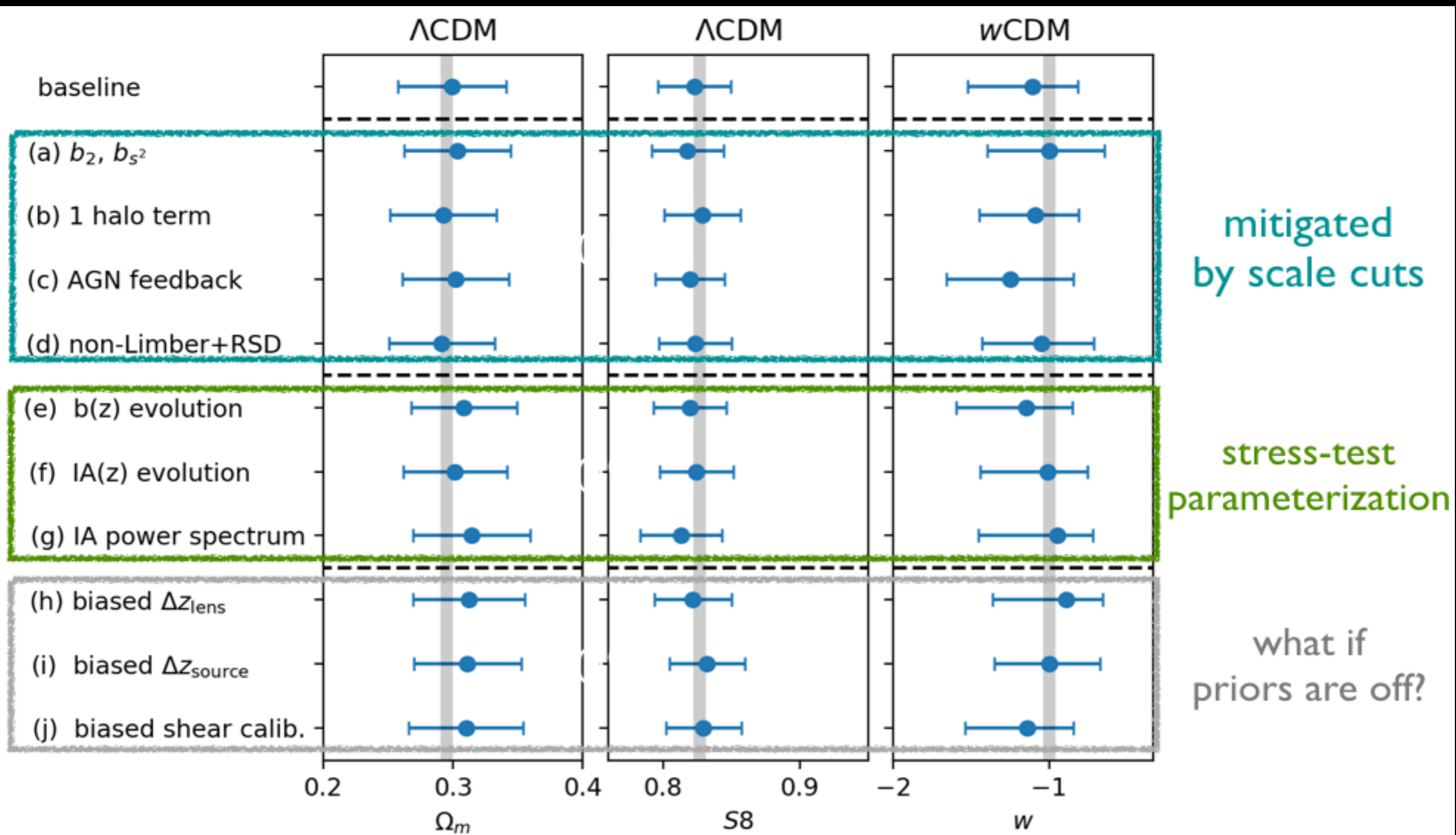
-> this list is known to be incomplete

how much will known, unaccounted-for systematics bias Y1 results?

Example: generate input 'data' incl. 2<sup>nd</sup> order galaxy bias  
enhances clustering signal on small physical scales  
determine scale cuts to minimize parameter biases



# Systematics Mitigation: imperfect parameterizations



# Analysis Validation: Mock Catalogs -> Cosmology

DeRose+ (in prep.):

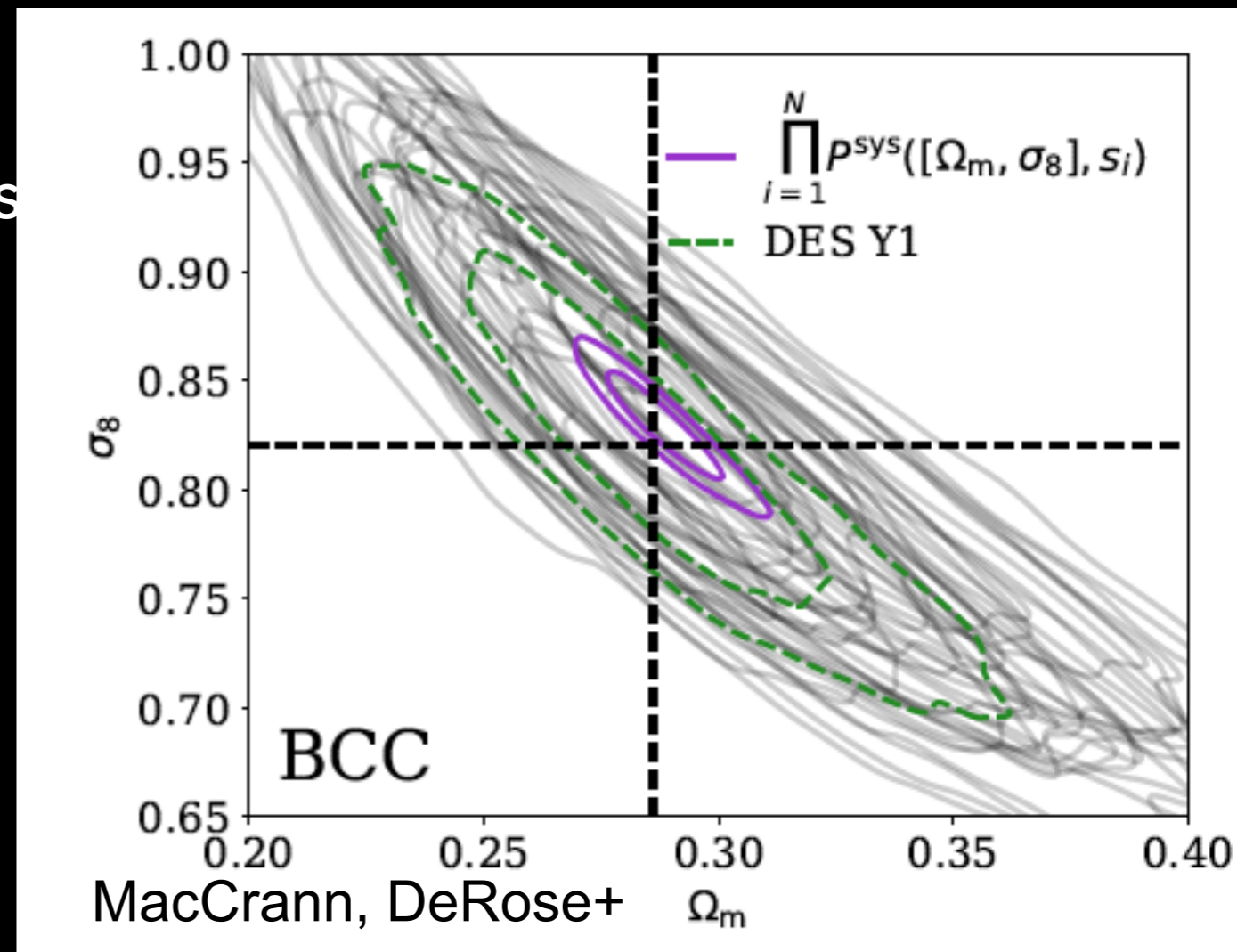
Realistic DES mock catalogs including galaxy properties and DES-specific observational effects

MacCrann, DeRose+ 2018:

Measure 3x2pt on mock catalogs  
(with known cosmology)

Analyze with DES cosmology  
pipeline

Recover input cosmology!



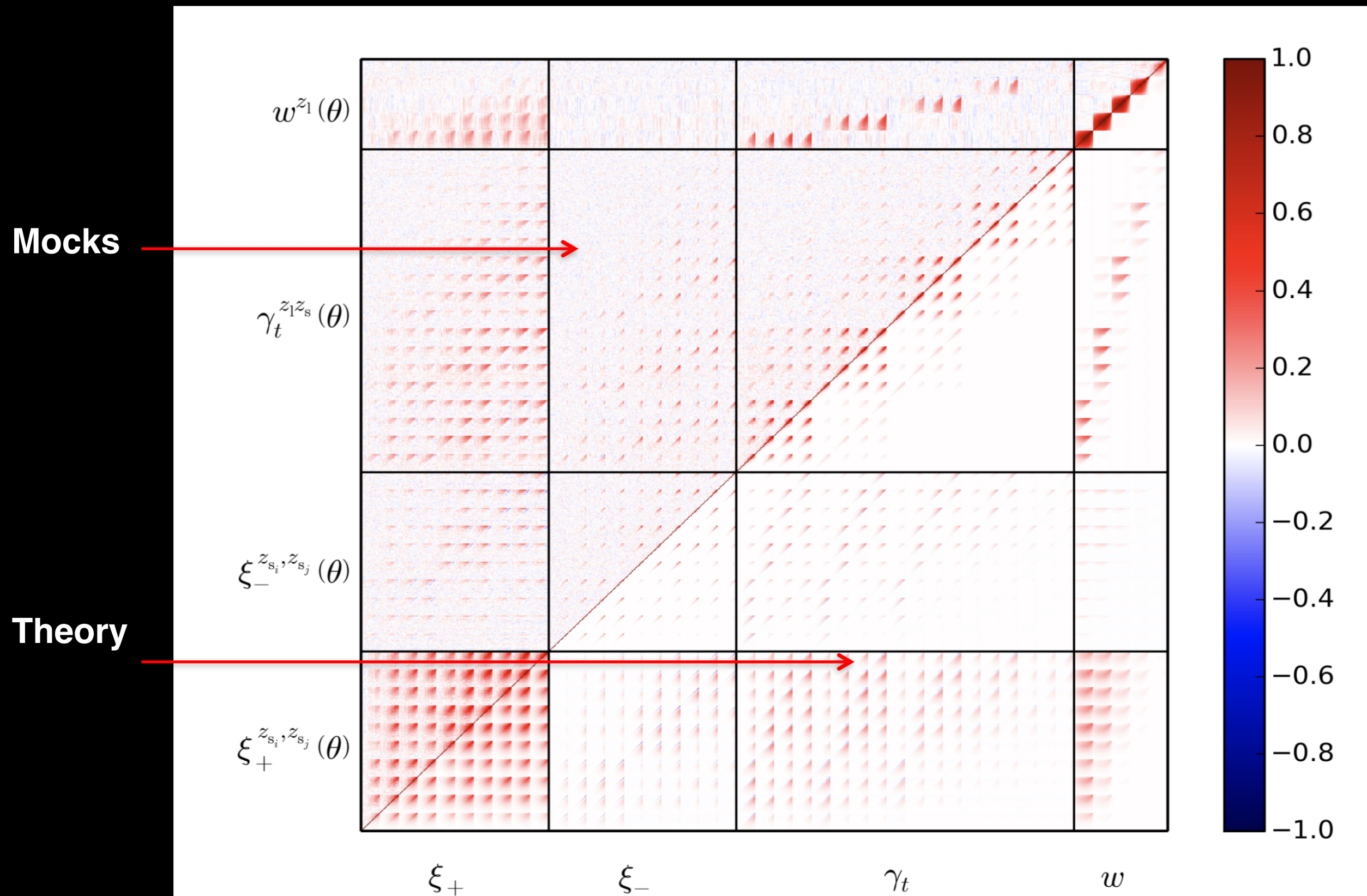
# Covariance Validation

Oliver Friedrich, Lucas Seco, Nick Kokron, Rogerio Rosenfeld, many others

DES-Y1 analysis uses halo model covariance matrix

- Validation method:
  - produce 1200 DES-like areas mocks with different geometries: circular and DES-like mask
  - estimate covariance matrix from these mocks
- Validation metric:
  - parameter uncertainties, determined in simulated analyses

# Covariance Validation





# Multi-Probe Blinding

Goal: minimize confirmation bias

Implementation: two-staged blinding process

- shear catalogs scaled by unknown factor, until catalogs fixed
- cosmo params shifted by unknown vector, until full analysis fixed
- (do not overplot measurement + theory)
- (clearly state any post-unblinding changes in paper)

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## Post-Unblinding Updates

- shear catalog blinding removed by meta-calibration
  - best-kept secret in DES
- include survey footprint in shot/shape noise model
  - updates to evidence ratios,  $\chi^2$
  - $\chi^2/\text{dof} = 1.16$
  - parameter values ~unaffected

# When to Combine Probes?

- Adopted Bayesian Evidence Ratio  $R$  as criterion to compare hypotheses  $H_0$  and  $H_1$

$$R = \frac{P(\mathbf{D}|H_0)}{P(\mathbf{D}|H_1)} = \frac{P(H_0|\mathbf{D}) \cancel{P(H_1)}}{P(H_1|\mathbf{D}) \cancel{P(H_0)}} \quad \text{equal prior on } H_0, H_1$$

- $H_0$  is favored with  $R:1$  odds over  $H_1$ .
- Jeffreys scale:  $R > 3.2$  substantial evidence,  $R > 10$  strong evidence
- For combining probes:

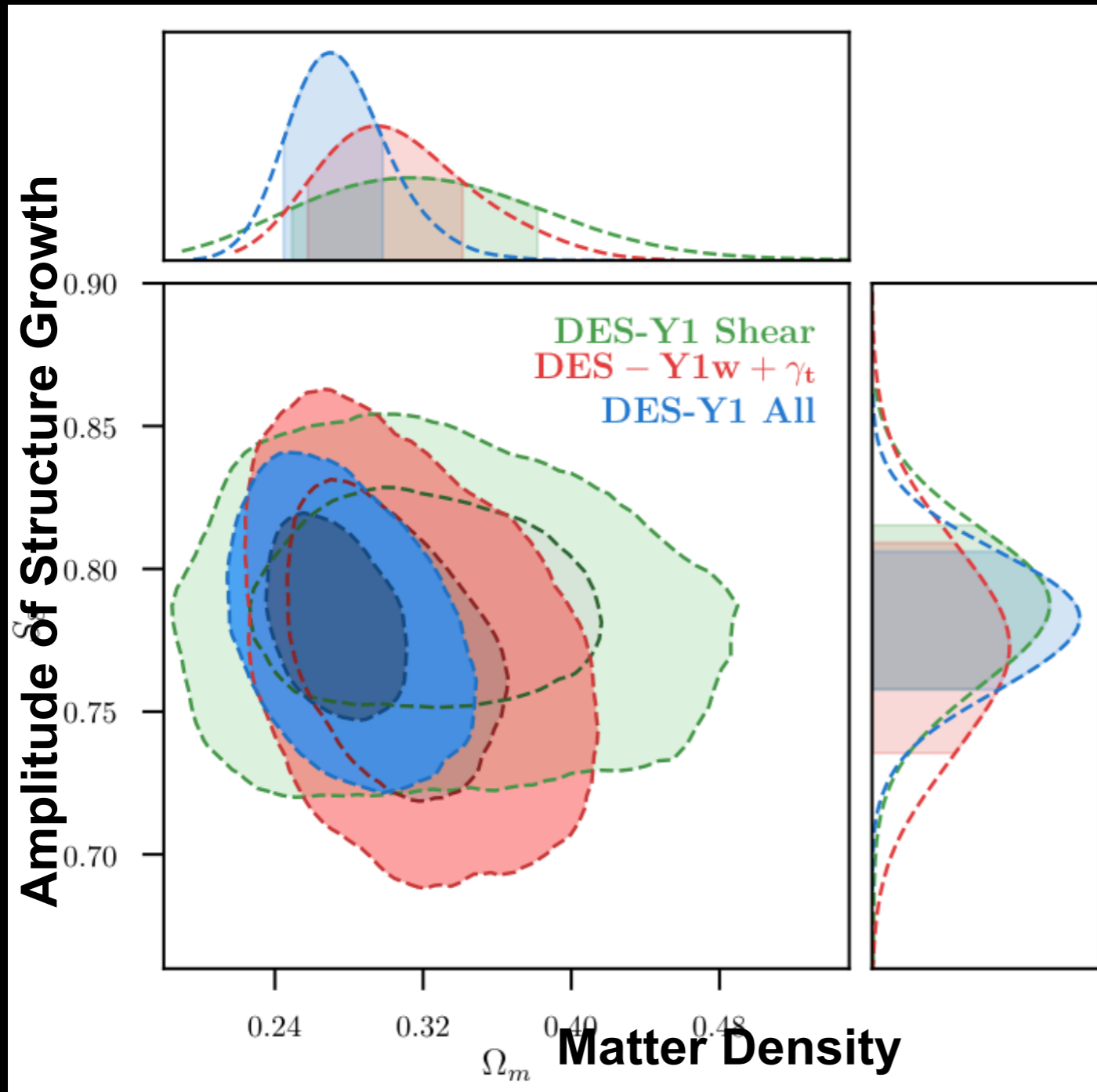
$H_0$  = 'data sets described by same model parameters'

$H_1$  = 'data sets described by different model parameters'

$$R = \frac{P(\mathbf{D}_1, \mathbf{D}_2|H)}{P(\mathbf{D}_1|H)P(\mathbf{D}_2|H)} \quad \text{Combine iff } R > 0.1$$

( $R < 0.1$ : strong evidence for inconsistency)

# Multi-Probe Constraints: LCDM

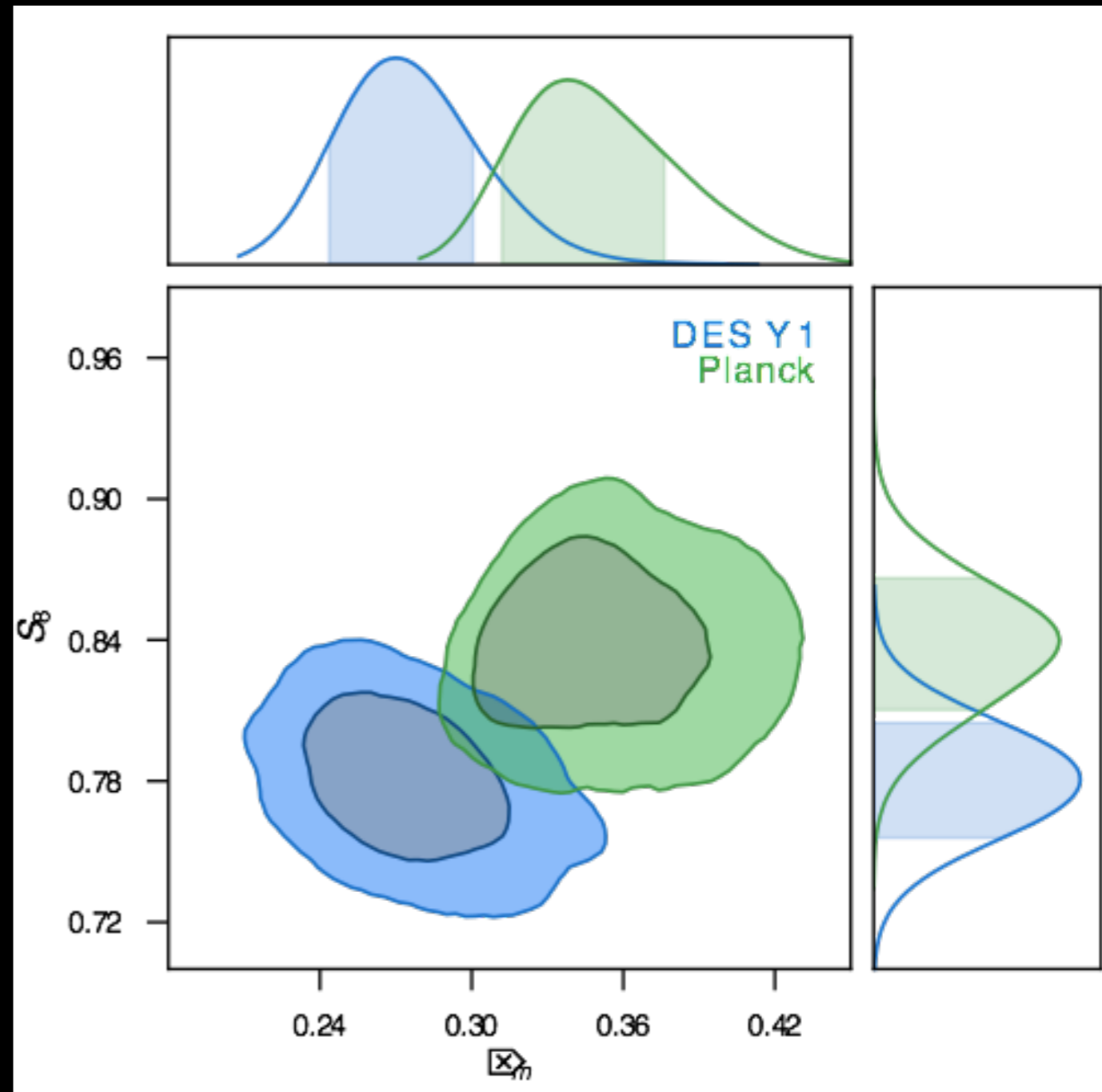


- DES-Y1 most stringent constraints from weak lensing
- marginalized 4 cosmology parameters, 10 clustering nuisance parameters, and 10 lensing nuisance parameters
- consistent ( $R = 583$ ) cosmology constraints from weak lensing and clustering in configuration space

# Comparison of DES 3x2 with Planck CMB: low-z vs high-z in $\Lambda$ CDM

- note: contours marginalized over  $M_\nu=[0.06, 1]eV$
- DES-3x2pt and Planck (TT+lowP, without CMB lensing) constrain  $S_8$  and  $\Omega_m$  with comparable strength
- Central values differ by  $>1\sigma$ , in same direction as KiDS
- Bayes factor  $R = 6.6$ , “substantial” evidence for consistency in  $\Lambda$ CDM

Amplitude of Structure Growth



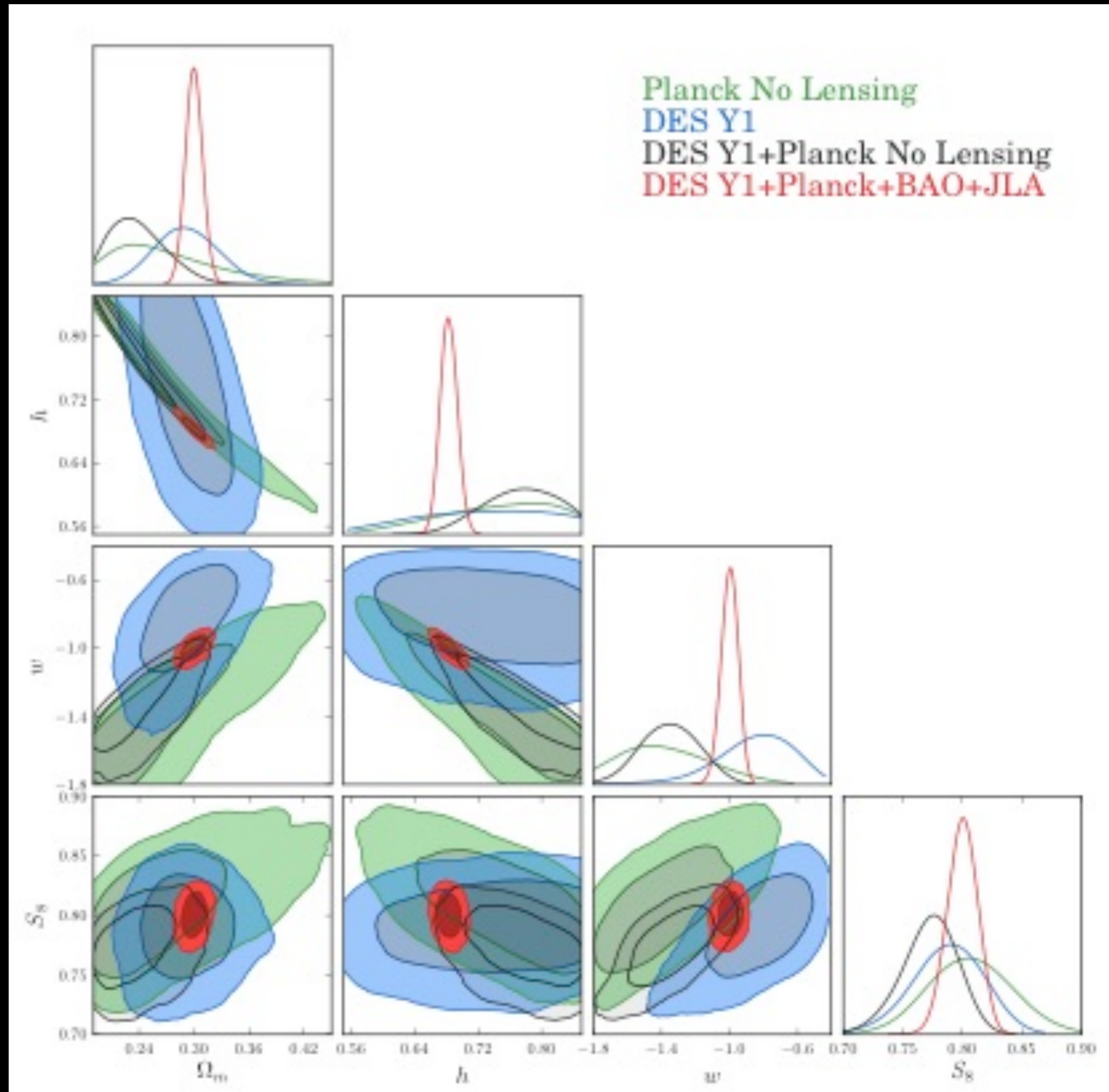
Matter Density

DES Collaboration 1708.01530  
(numbers from revised version)

# Combine multiple data sets: wCDM

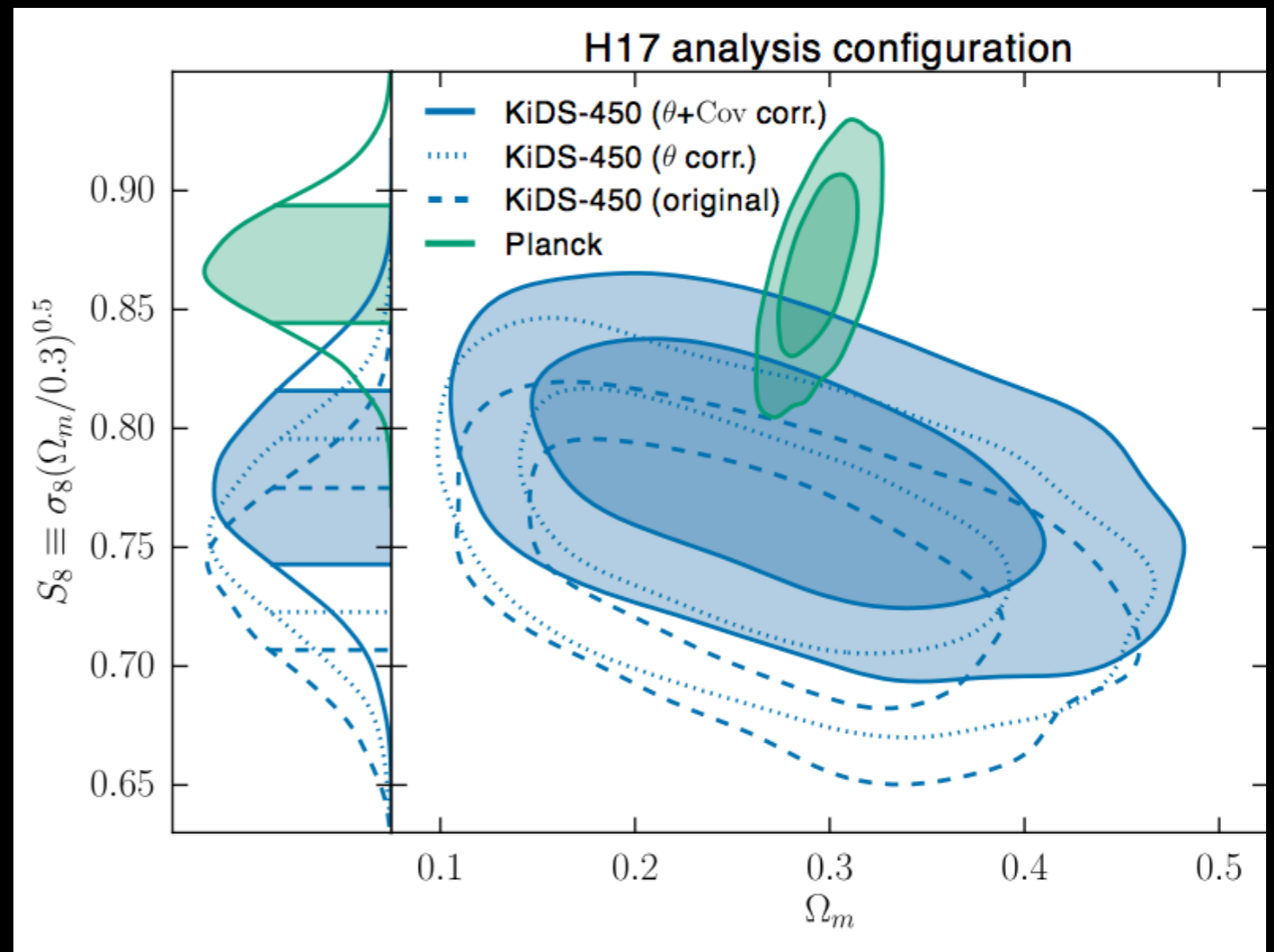
- DES-3x2pt+Planck does not favor wCDM
- $(w, h, M_v)$  highly degenerate for DES-3x2pt/Planck alone
- DES-3x2pt+BAO+SN consistent with Planck in wCDM
- combination disfavors wCDM ( $R_w = 0.1$ ), yields

$$w = -1.00^{+0.04}_{-0.05}$$



# Consistency of Cosmic Shear Measurements

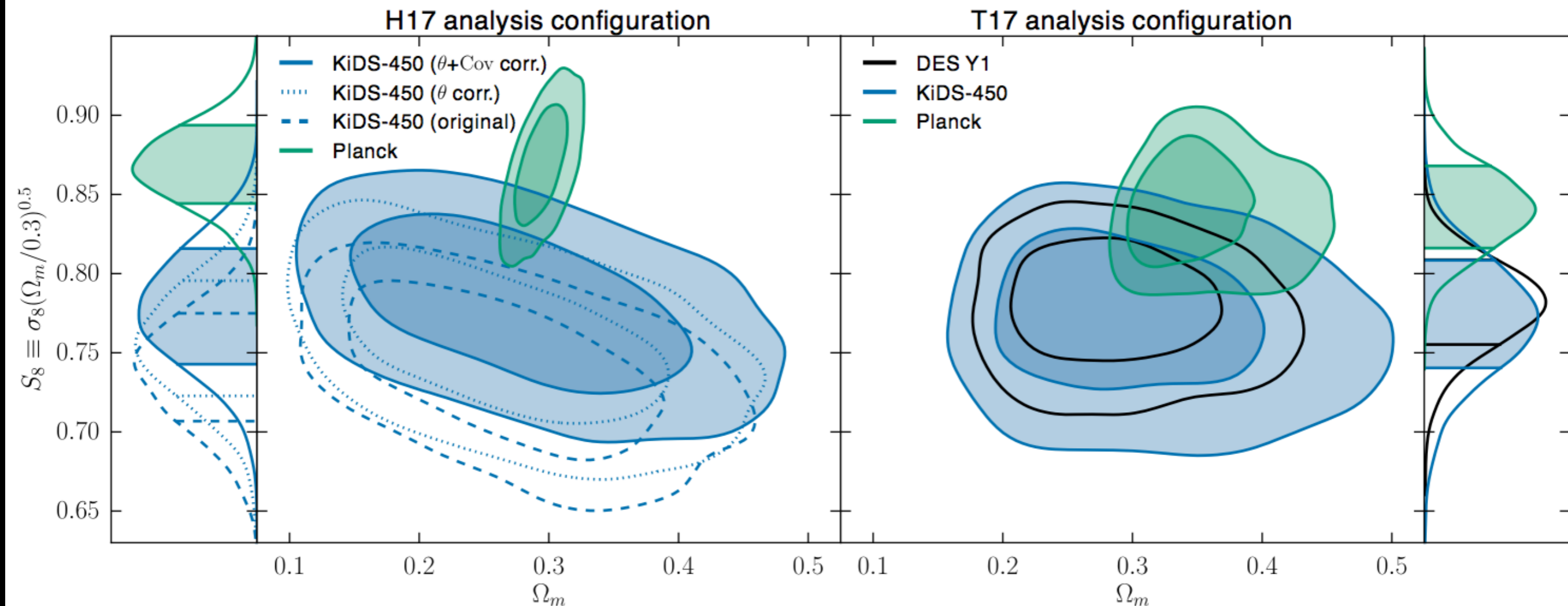
- applied shape noise correction from DES-Y1 revision to KiDS-450 (Hildebrandt+2017)
  - $\chi^2 = 121$  (118 dof)  
before:  $\chi^2 = 161$
- updated marginalization of multiplicative shear calibration
- applied known update to effective angular bin centers



# Consistency of Cosmic Shear Measurements

Modeling, priors + scale cuts  
as in KiDS-450 (Hildebrandt+ 2017)

Modeling, priors + scale cuts  
as in DES-Y1 (Troxel+ 2017)





# Conclusions

- LCDM is a minimal and robust model and hard to break
- Only  $\sim 2$  sigma tensions (except for perhaps  $H_0$ ), e.g. DES Y1 results consistent with Planck CMB in  $\Lambda$ CDM.
- DES Y1 has published 20 papers on the first 20% of the total DES volume  $\rightarrow$  60% data volume analysis is ongoing
- Information gain for DES will not just come from data volume but even more so from methodology... it's early days for optical multi-probe analyses
- The future with JWST, LSST, Euclid, WFIRST, DESI, 4MOST, ELTs, and many others optical/NIR instruments is extremely **exciting/challenging** for cosmology