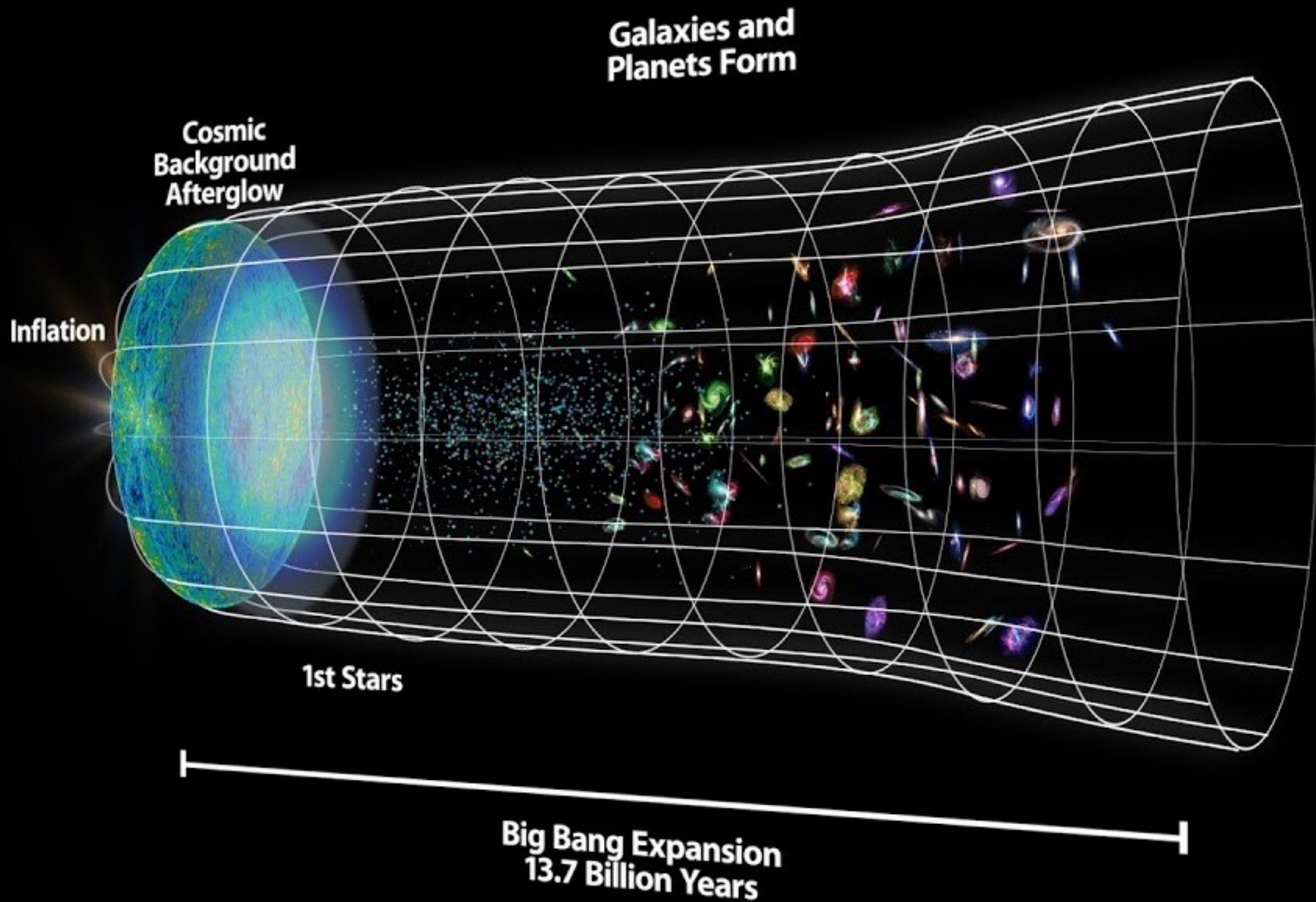


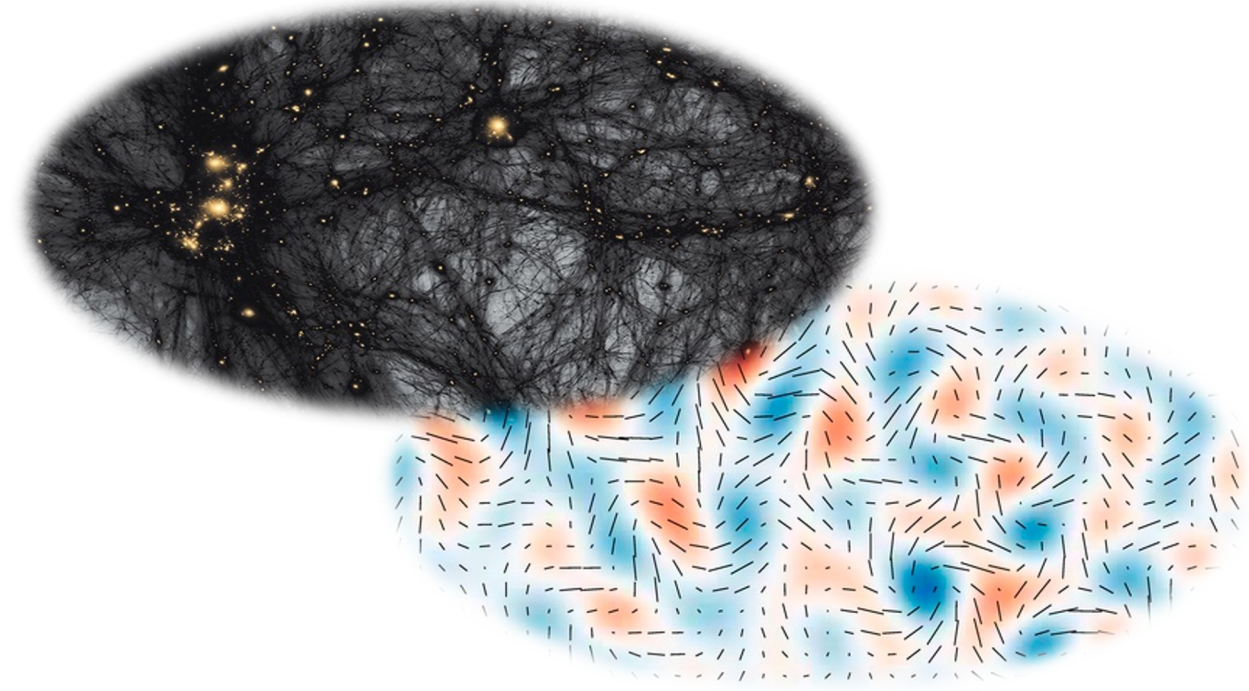
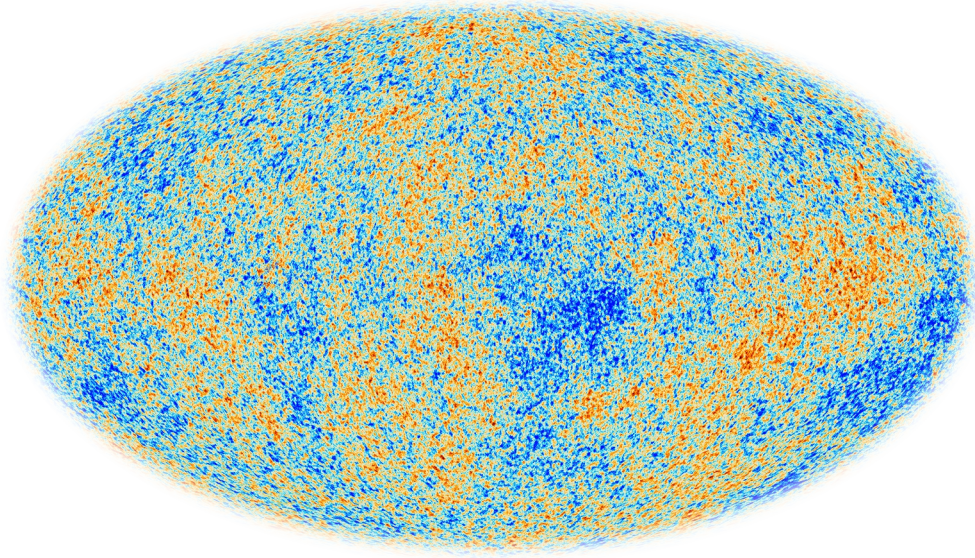
Weak Lensing Cosmology: Status and Prospects

Agnès Ferté
SLAC/KIPAC

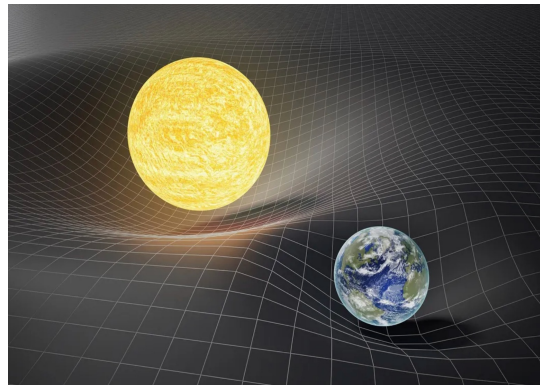
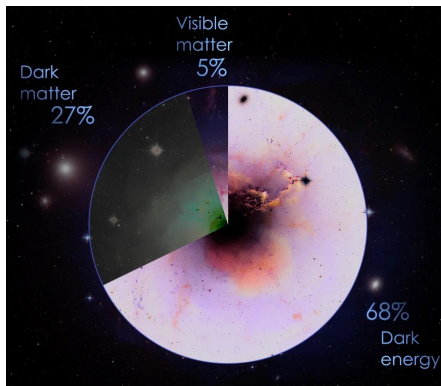


2010s

2020s



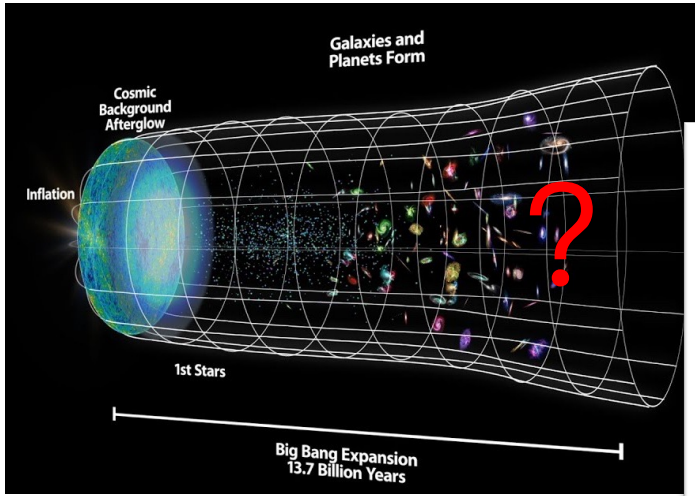
The Standard Model of Cosmology
is precisely measured



- What is causing **cosmic acceleration**?
- What is **dark matter**?
- What is the **mass of neutrinos**?
- Did **cosmic inflation** happen?

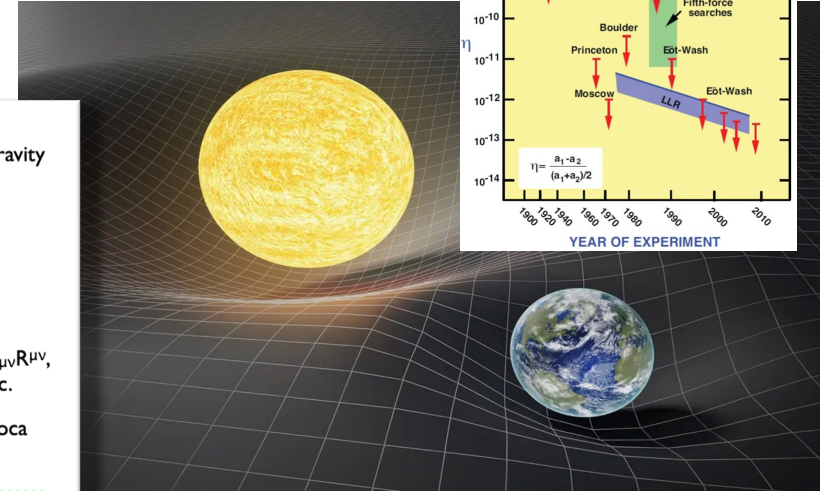
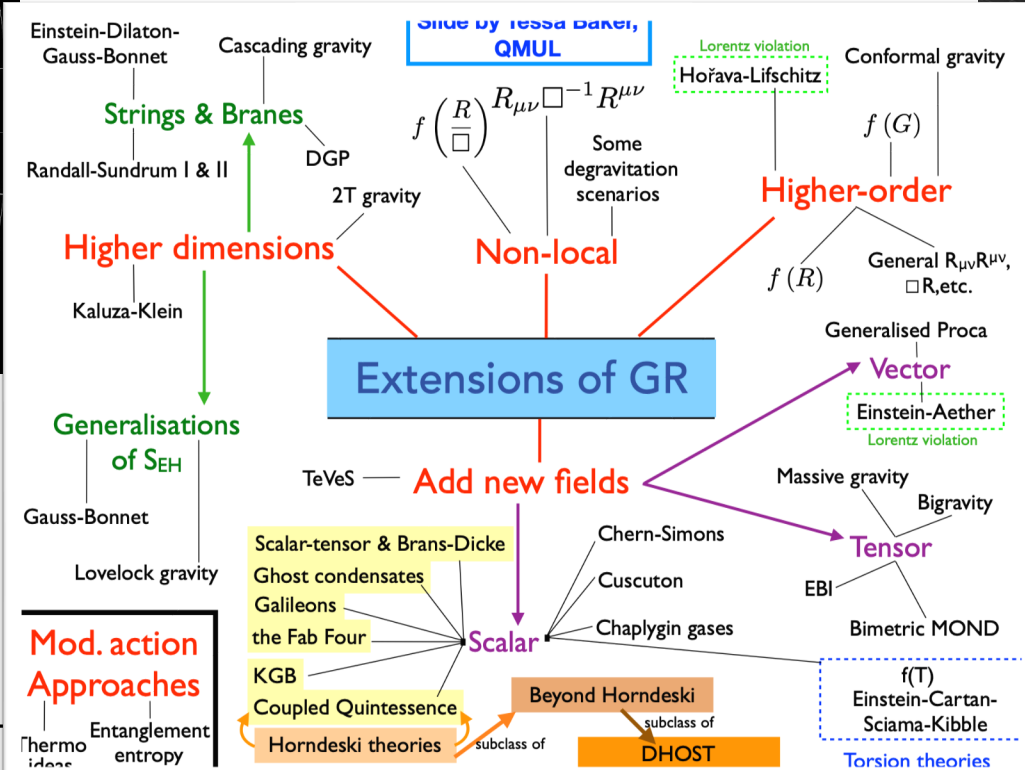
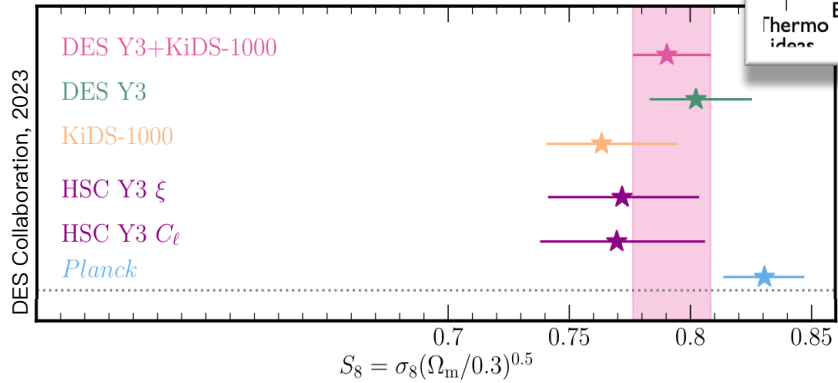
Credits: Planck collaboration, BICEP2, KIPAC/AMNH

Challenging General Relativity on cosmic scales

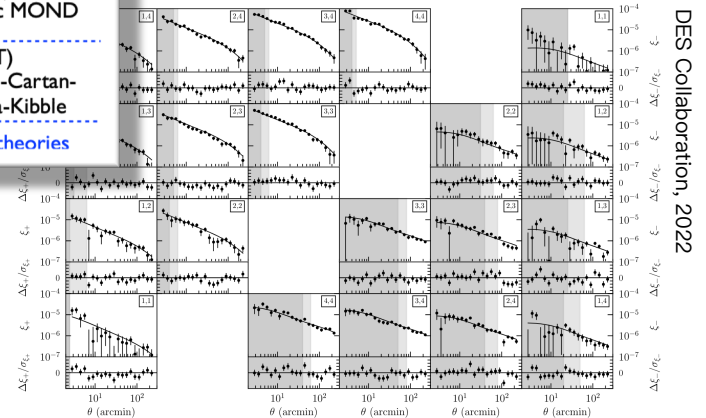


What is causing **cosmic acceleration**?

Why is there a **S_8 tension**?



Is General Relativity (GR) **correct** on cosmological scales?

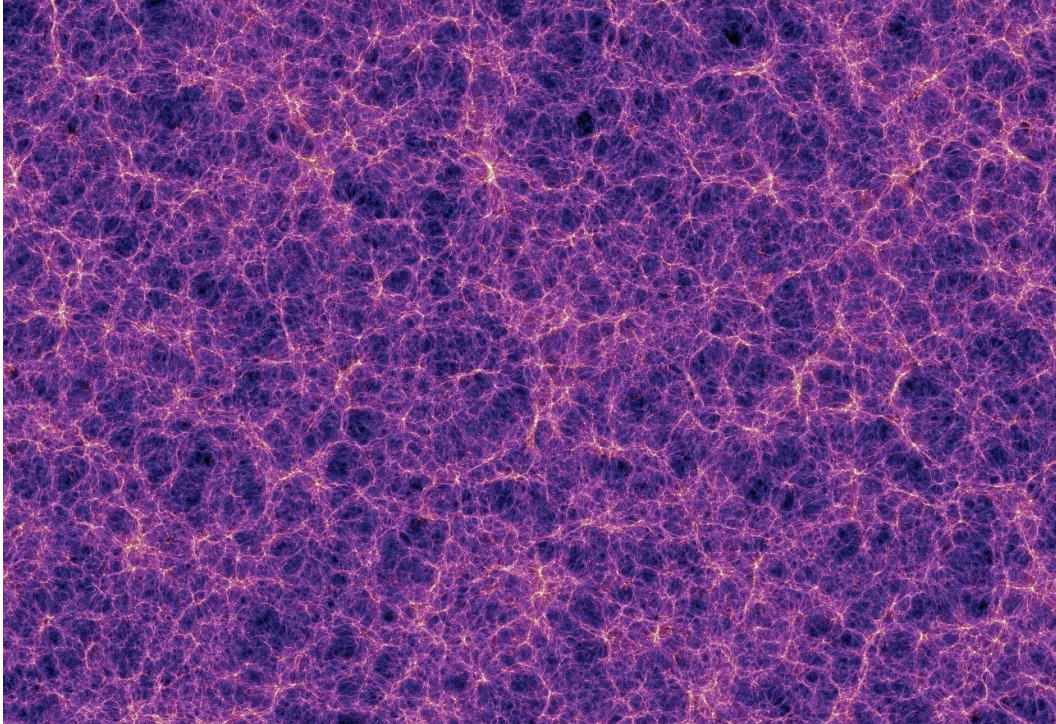


How much can we extract from our **data**?

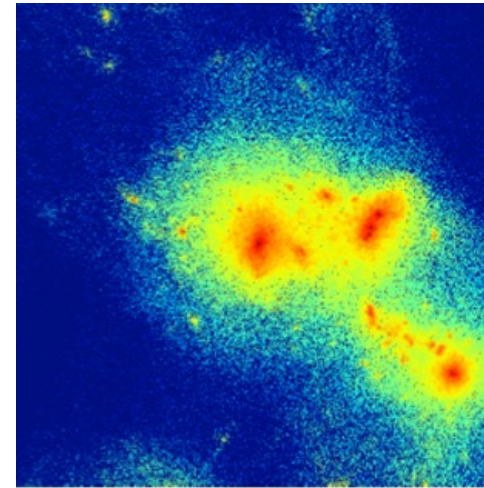
The Universe as a laboratory to test gravity

- Gravity impacts:
 - the **evolution** of matter distribution in the Universe
 - the **path of light**
- Cosmology offers a **unique** test of gravity in regime different from gravitational waves

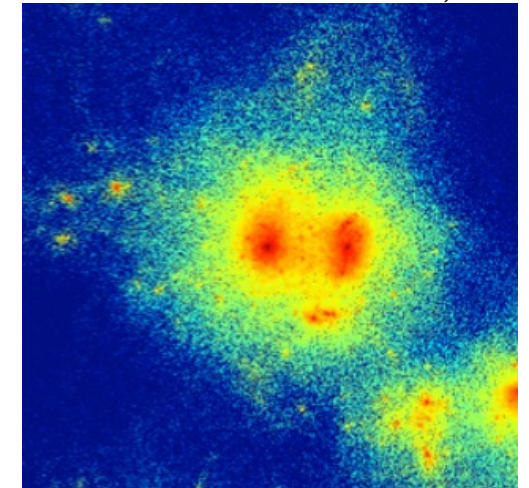
Millenium simulations



Corbett Moran et al, 2015



General Relativity

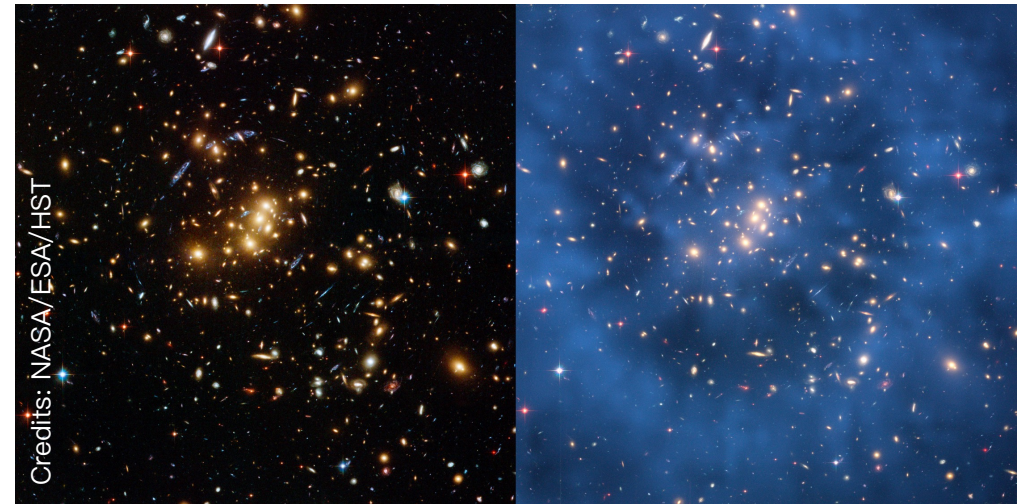
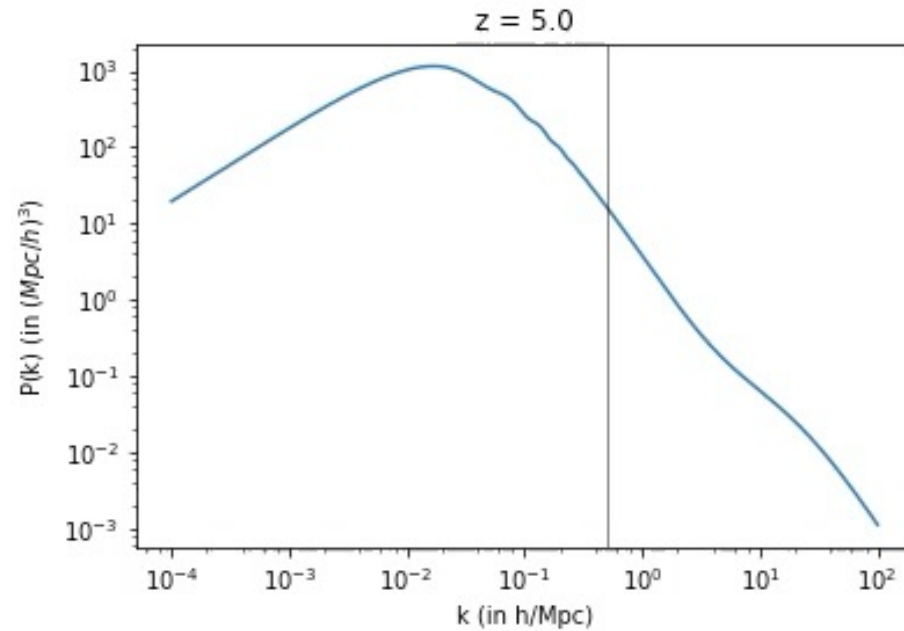


Modified gravity

Mapping matter with galaxy surveys

Use galaxies as:

- **tracers** of (dark) matter large-scale structure,
 - **background** light,
- to statistically probe the matter power spectrum $P(k,z)$



Weak lensing

By Jim Bosch



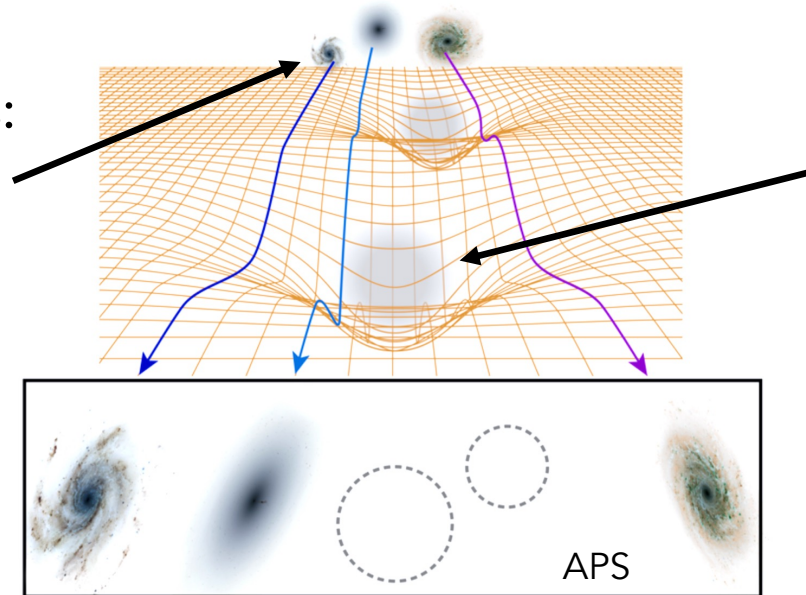
Galaxies are weakly lensed by **large-scale structures on the line of sight**

→ **Geodesics** are modified

→ **Shapes** of galaxies appear coherently more elliptical

Source galaxies ellipticities:

- ellipticity from WL $< 1\%$
- intrinsic ellipticity $\sim 30\%$
- other effects



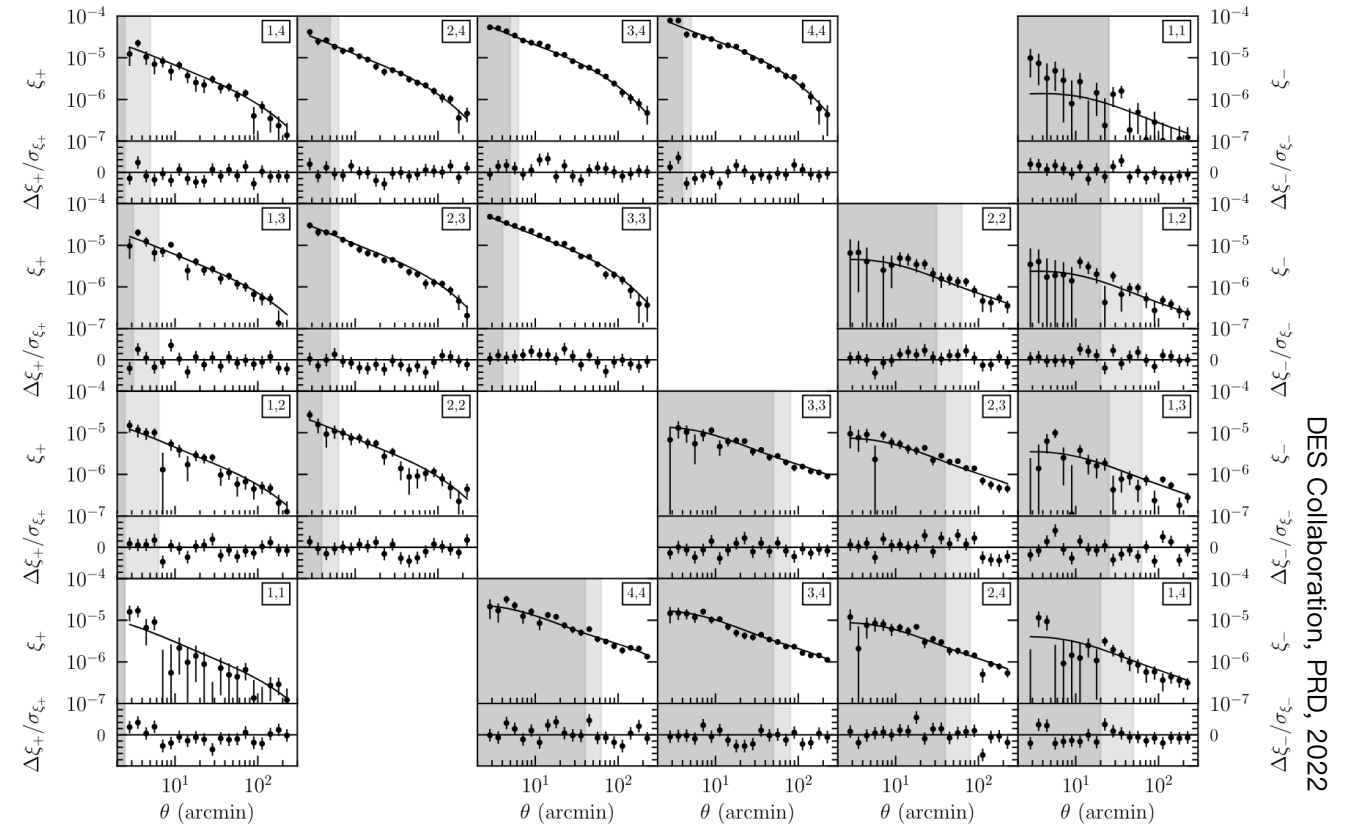
Lens galaxies position:
trace dark matter structures

Cosmic shear

Cosmic shear is summarized as:

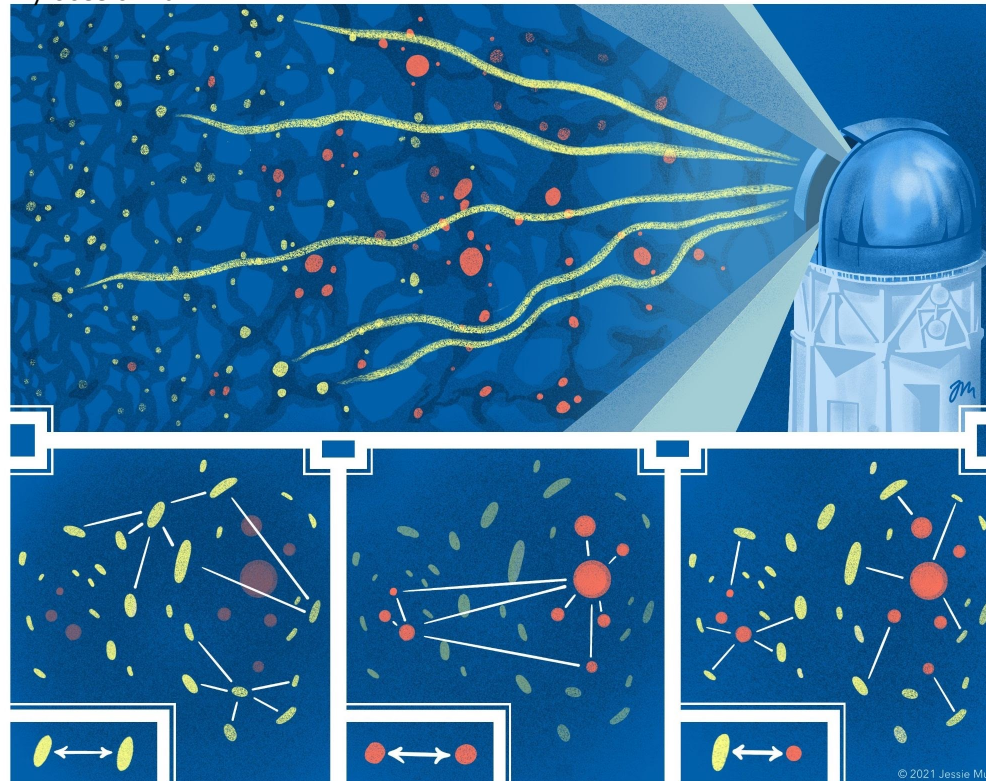
$$\xi_{\pm}(\theta) := \langle \gamma_t \gamma_t \rangle \pm \langle \gamma_{\times} \gamma_{\times} \rangle$$

→ Directly probing the matter distribution.



Fully unlocking the growth of structures from weak lensing

By Jessie Muir



Cosmic shear

$$\xi_{mm}(\theta)$$

Clustering

$$b^2 \xi_{mm}(\theta)$$

Galaxy-galaxy
lensing

$$b \xi_{mm}(\theta)$$

3x2pt is especially sensitive to S_8 , dark energy, gravity.

$$S_8 = \sigma_8 (\Omega_m / 0.3)^{0.5}$$

Weak lensing experimental landscape

2000

2010

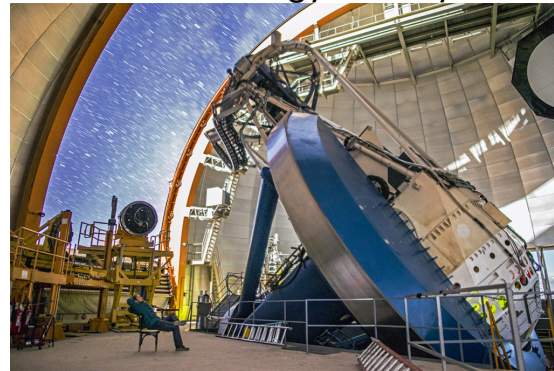
2020

First cosmic shear measurements

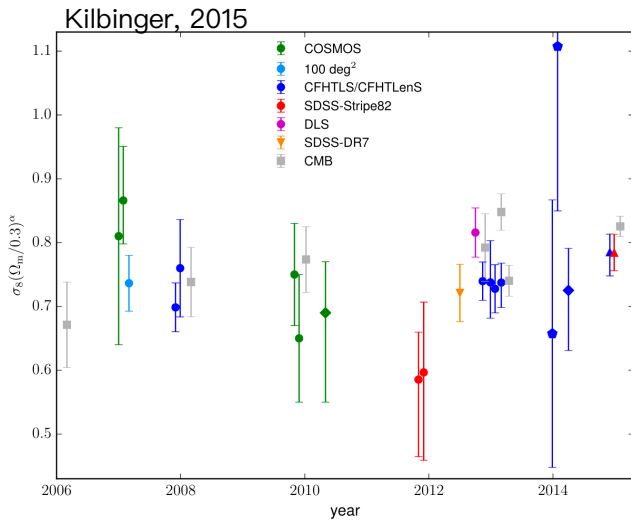
Stage-III surveys

Stage-IV surveys

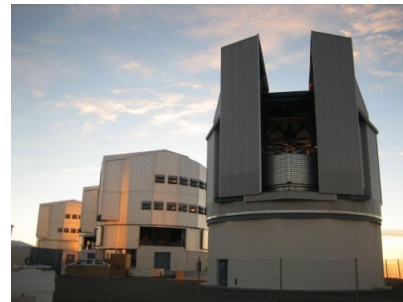
Dark Energy Survey



Vera C. Rubin Observatory



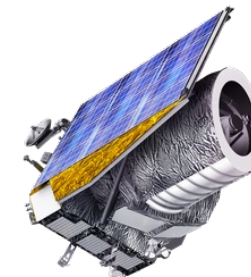
KiDS



HSC



Euclid



Roman space telescope



The Dark Energy Survey: precursor of stage-IV surveys

A wide photometric **map** of the Southern Sky:

- 6-year survey by DECam at CTIO Blanco-4m in 5 optical bands over 10% of the sky.
- 700M objects detected.

Rich science:

- Multi-probe precision Cosmology,
- Discovery of new solar system bodies,
- Mapping of surroundings of the Milky Way,
- Follow-up imaging,
- Detection of strong lensing systems.

Find our data at:

<https://des.ncsa.illinois.edu/releases/y3a2>



Picture credits: DES Collaboration

Cosmology from 3x2pt

Intrinsic galaxy

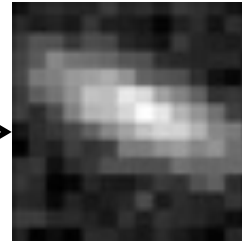


Shape measurements

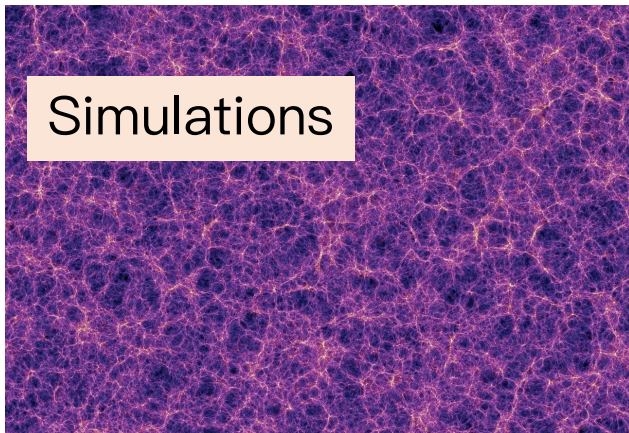
Weak lensing



Atmosphere, noise, pixels

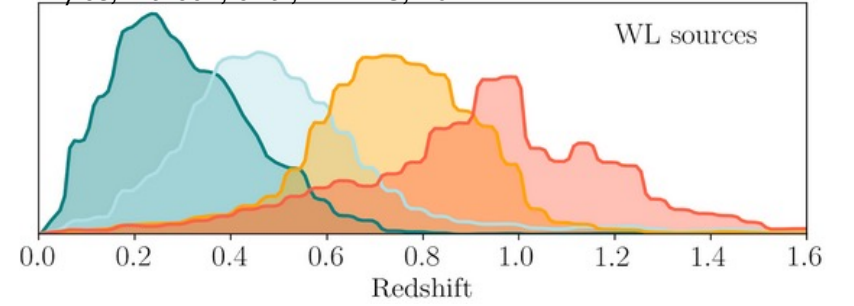


Bridle et al, 2009



Simulations

Myles, Alarcon, et al, MNRAS, 2021



Photometric redshift

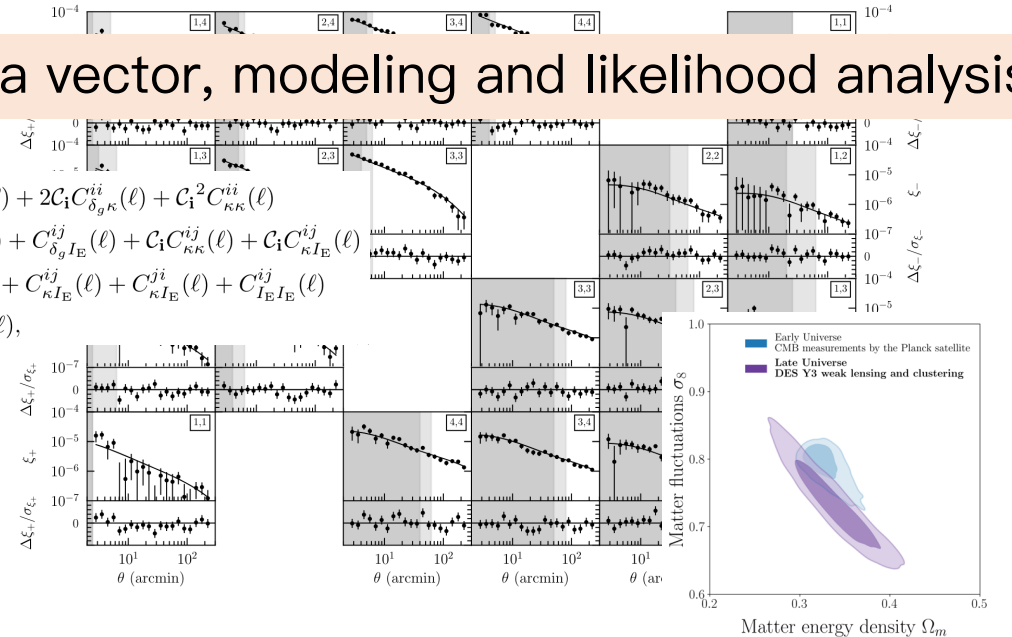
Data vector, modeling and likelihood analysis

$$C_{\delta_g \delta_g}^{ii}(\ell) = C_{\delta_g \delta_g}^{iit}(\ell) + 2C_i C_{\delta_g \kappa}^{ii}(\ell) + C_i^2 C_{\kappa \kappa}^{ii}(\ell)$$

$$C_{\delta_g E}^{ij}(\ell) = C_{\delta_g \kappa}^{ijt}(\ell) + C_{\delta_g I_E}^{ij}(\ell) + C_i C_{\kappa \kappa}^{ij}(\ell) + C_i C_{\kappa I_E}^{ij}(\ell)$$

$$C_{EE}^{ij}(\ell) = C_{\kappa \kappa}^{ijt}(\ell) + C_{\kappa I_E}^{ij}(\ell) + C_{\kappa I_E}^{ji}(\ell) + C_{I_E I_E}^{ij}(\ell)$$

$$C_{BB}^{ij}(\ell) = C_{I_B I_B}^{ij}(\ell),$$



Modeling of 3x2pt

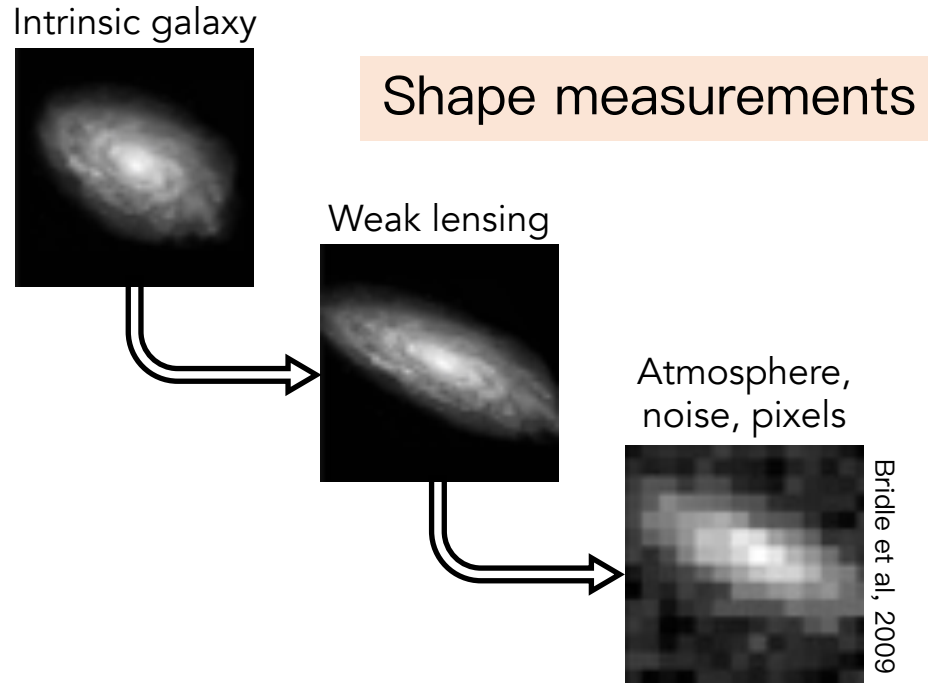
- Non-linear matter power spectrum: halofit + no baryonic feedback
- **Intrinsic alignment:** TATT model
- **Galaxy bias:** linear galaxy bias
- + non-linear, magnification, etc.

$$C_{\delta_g \delta_g}^{ii}(\ell) = C_{\delta_g \delta_g}^{ii'}(\ell) + 2C_i C_{\delta_g \kappa}^{ii}(\ell) + C_i^2 C_{\kappa \kappa}^{ii}(\ell)$$

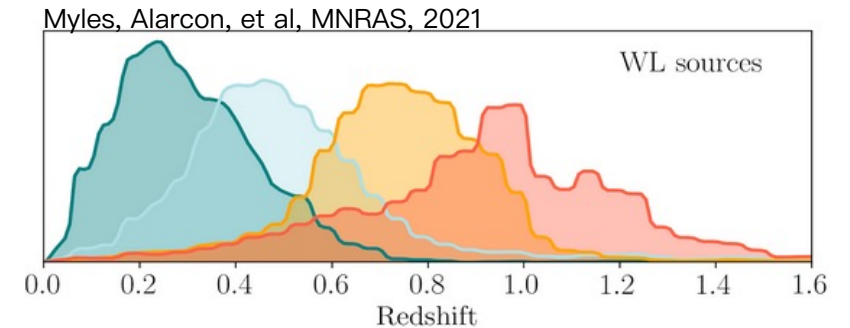
$$C_{\delta_g E}^{ij}(\ell) = C_{\delta_g \kappa}^{ij'}(\ell) + C_{\delta_g I_E}^{ij}(\ell) + C_i C_{\kappa \kappa}^{ij}(\ell) + C_i C_{\kappa I_E}^{ij}(\ell)$$

$$C_{EE}^{ij}(\ell) = C_{\kappa \kappa}^{ij'}(\ell) + C_{\kappa I_E}^{ij}(\ell) + C_{\kappa I_E}^{ji}(\ell) + C_{I_E I_E}^{ij}(\ell)$$

$$C_{BB}^{ij}(\ell) = C_{I_B I_B}^{ij}(\ell),$$



Multiplicative shear calibration parameter.

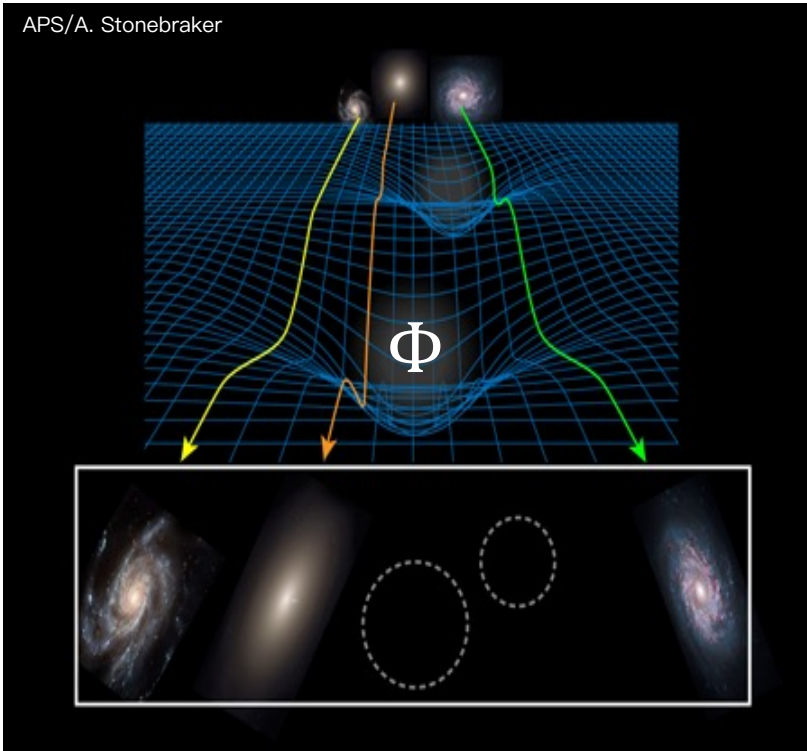


Photometric redshift

Shift and width of the $n(z)$.

Testing gravity through metric perturbations

Are modifications to the potential causing weak lensing as expected in GR?



$$k^2 \Phi = -8\pi G a^2 (1 + \Sigma_0 \Omega_\Lambda(t)) \rho \delta$$

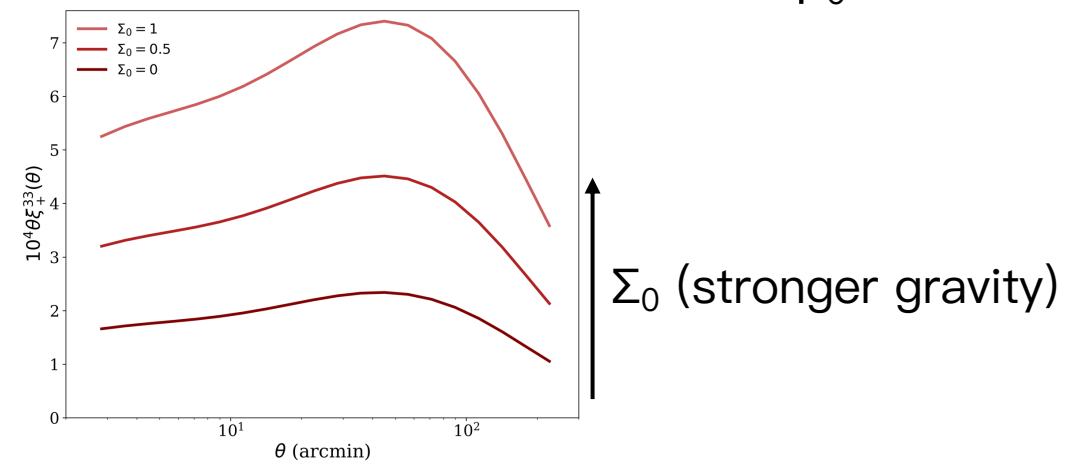
Mass = 0 : modifies **geodesics**

$\Sigma_0 = 0$ in GR

$$k^2 \psi = -4\pi G a^2 (1 + \mu_0 \Omega_\Lambda(t)) \rho \delta$$

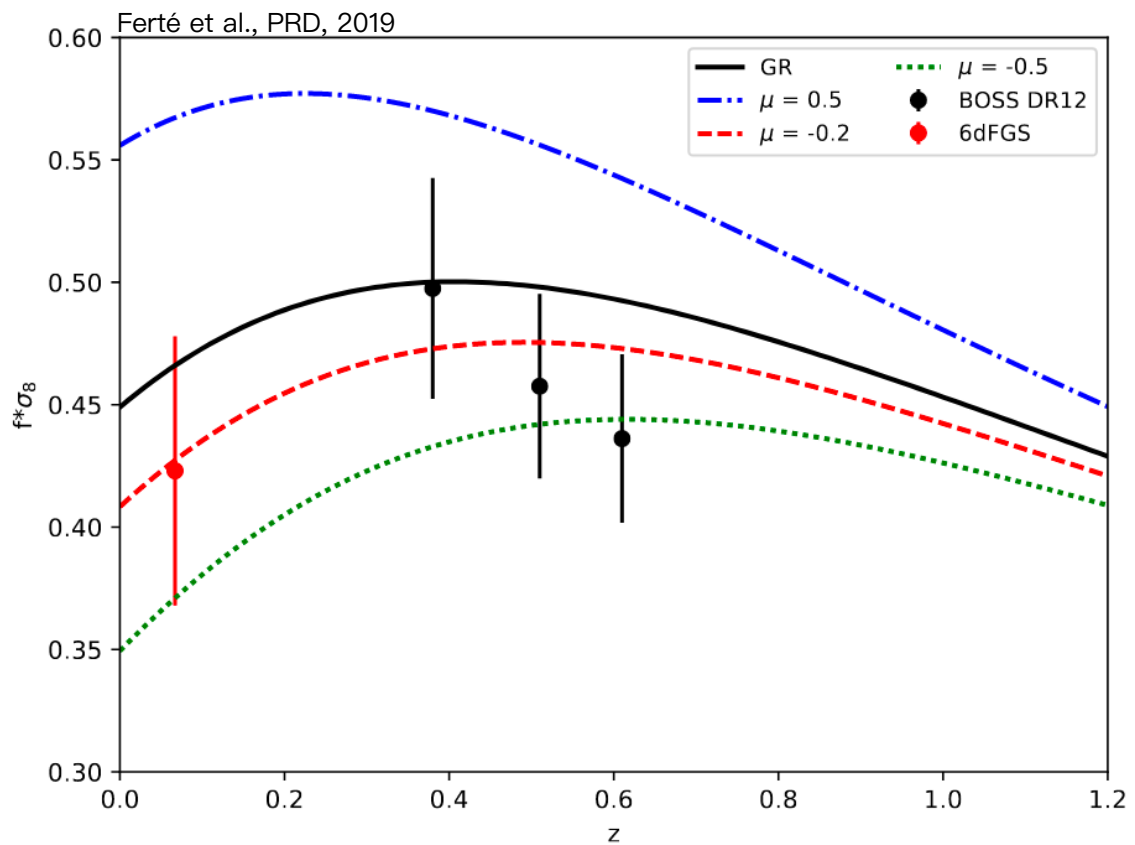
Mass $\neq 0$: modifies **dynamics**

$\mu_0 = 0$ in GR

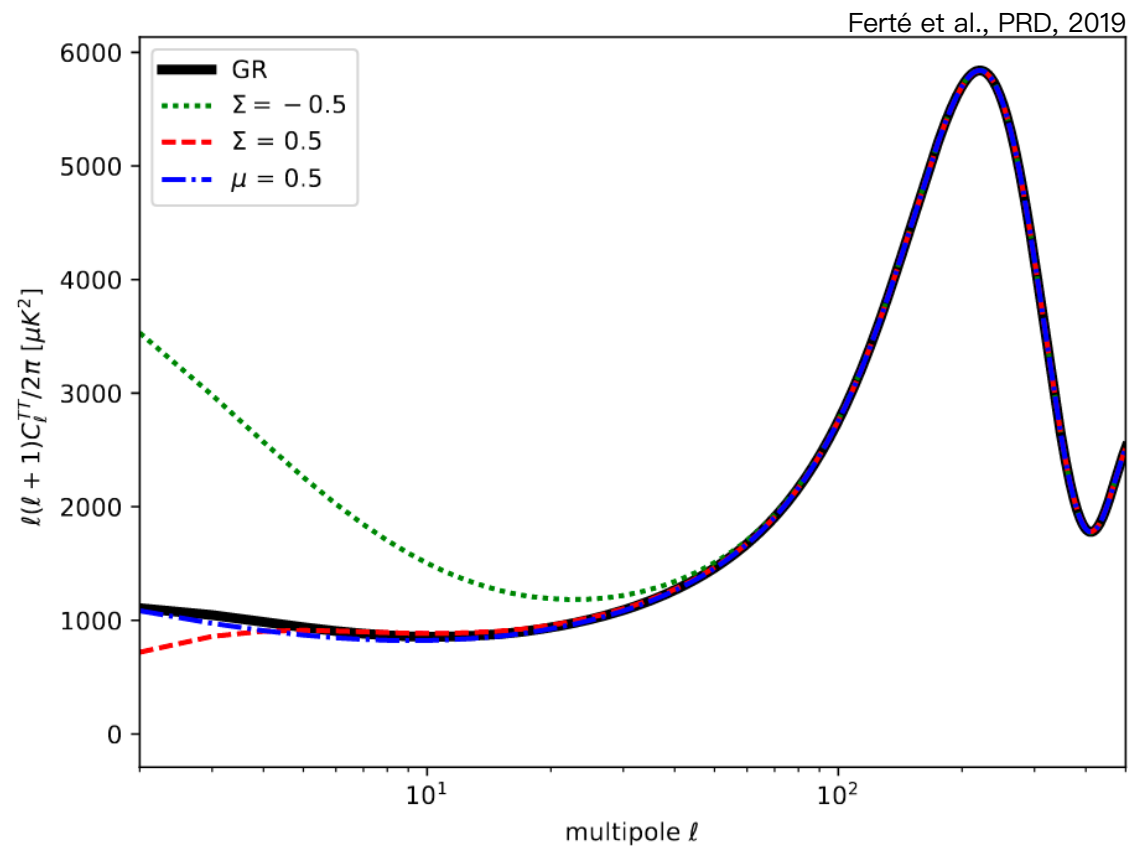


Complementary observables

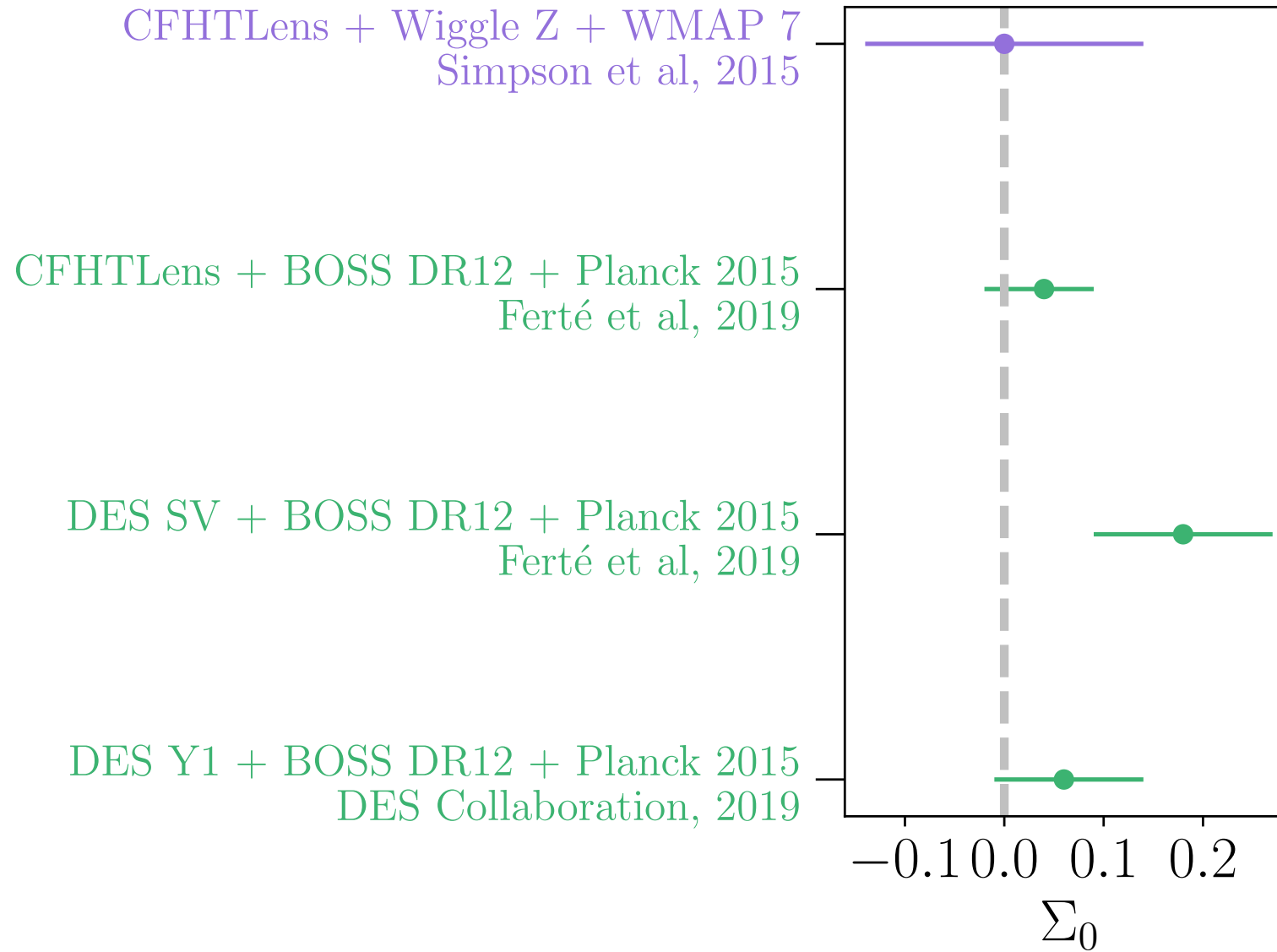
RSD $\rightarrow \mu_0$



CMB Temperature and polarization power spectra
 $\rightarrow \Sigma_0, \mu_0$



History of Σ_0 measurements



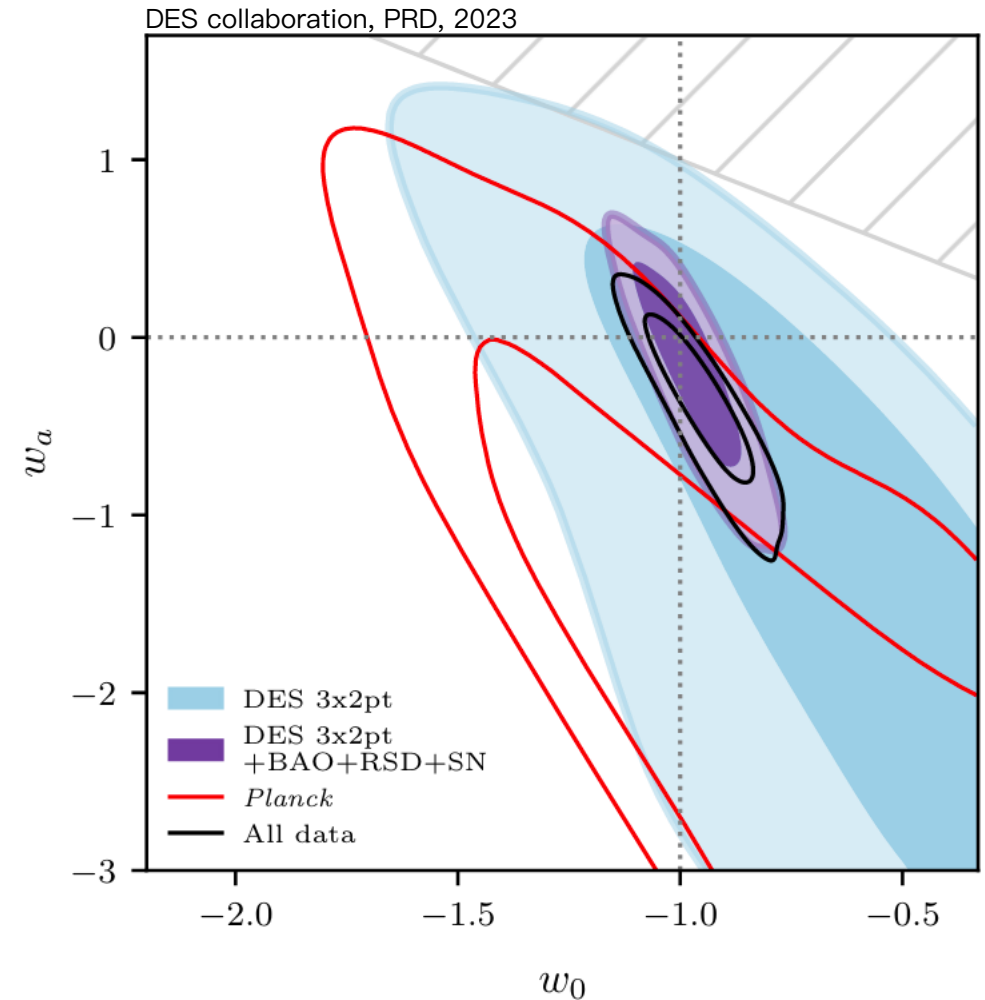
- DES extensions team

Co-leads: **AF** and Jessie Muir

Noah Weaverdyck, Otávio Alves, Sujeong Lee, Paul Rogozenski, Danielle Leonard, Angela Chen, David Sanchez-Cid, Anderson Souza, Marco Raveri, Andrew Liddle, Dragan Huterer, Leonardo Giani, Eleonora Di Valentino, Jonathan Blazek, Cyrille Doux, Vivian Miranda, Ken Herner, ...

- **Extensions to Λ CDM considered:**

- Time dependent dark energy equation of state
- Non-zero spatial curvature
- Sterile neutrinos
- Phenomenological $\sigma_8(z)$ test
- **Σ, μ test of gravity**

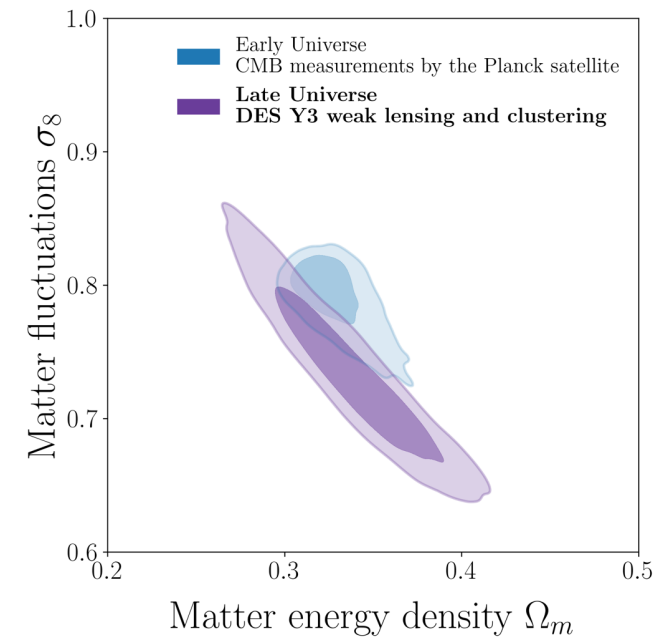
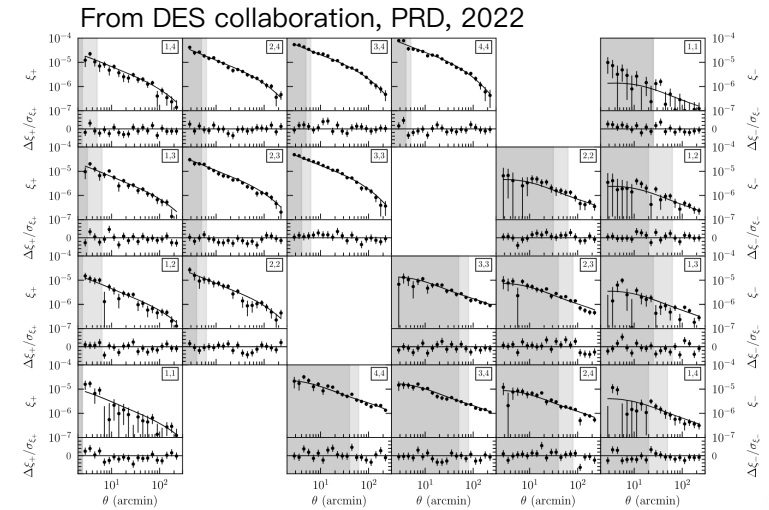


DES Year 3 3x2pt data

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

Precise measurements of the 3x2pt data vector

- **Source galaxies:**
Largest shape catalog to date = **100M galaxies**
- **Lens galaxies:**
Optimized for w, 4 z-bins used out of 6.
- DES Y3 3x2pt measurements and Λ CDM results:
→ Cosmology with 4% precision
DES collaboration, PRD, 2022 + 29 papers

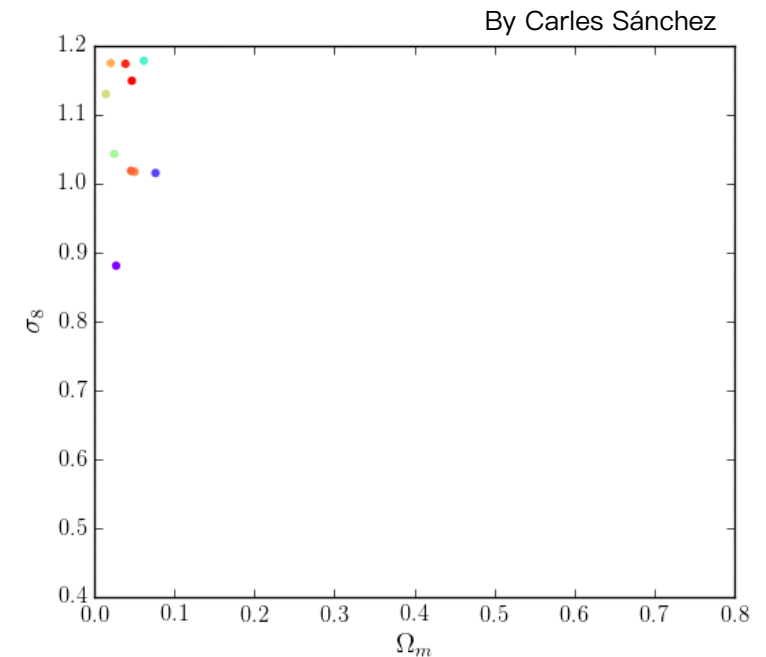


Estimation of non-standard physics parameters through Bayesian analysis

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

↑
Sampling of the likelihood

- Use CosmoSIS with the **Polychord** sampler.
validated for DES in *Lemos, Weverdyck et al (incl. AF), arxiv:2202.08233*
- 6 cosmological parameters + **extended parameters**
+ 22 nuisance parameters
- Run 700+ chains on HPC
Use of NERSC, TACC, Sherlock @ Stanford U, GATTACA @ JPL

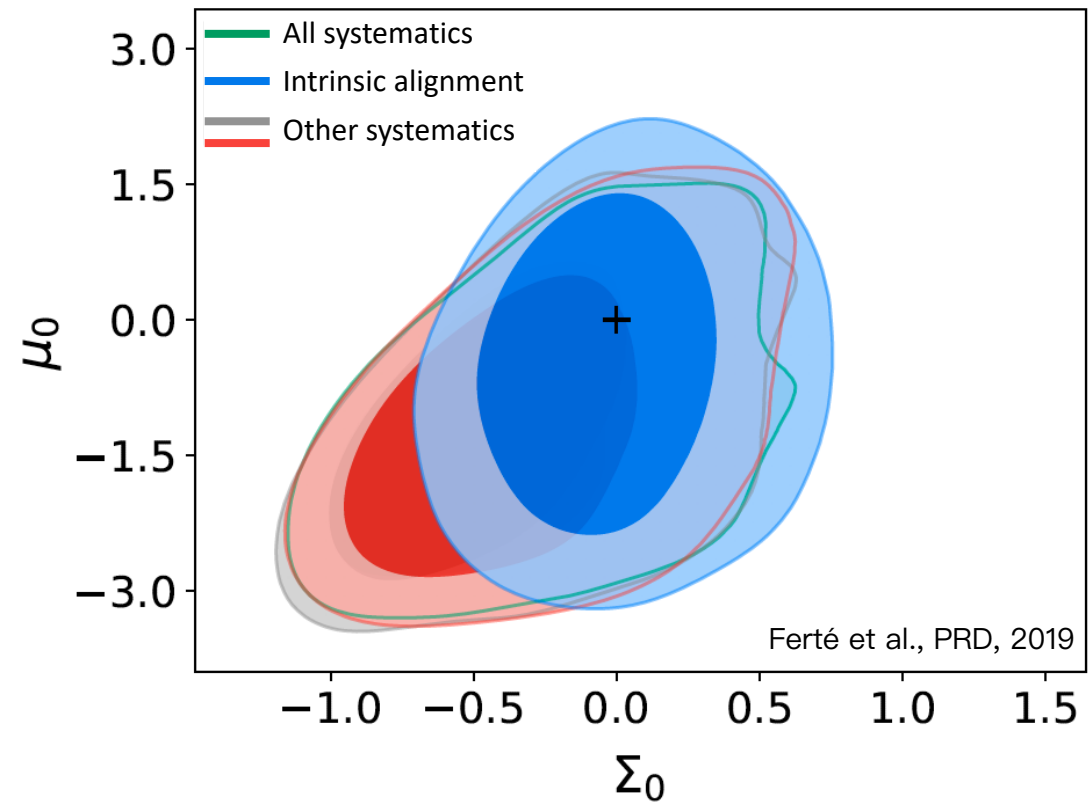


3x2pt modeling in Σ, μ

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

Accurate modeling of the data vector in extended models

- **Propagation** of the Weyl and matter power spectra to 3x2pt in Σ, μ :
MGCamb $P(k, z) \rightarrow$ 3x2pt
- Consistent modeling of intrinsic alignment, galaxy bias, observational effects.
- Impact of non-linearities & baryonic feedback mitigated through **scale cuts**.
- Analysis **blinded** at the level of the parameters and validated against systematics.



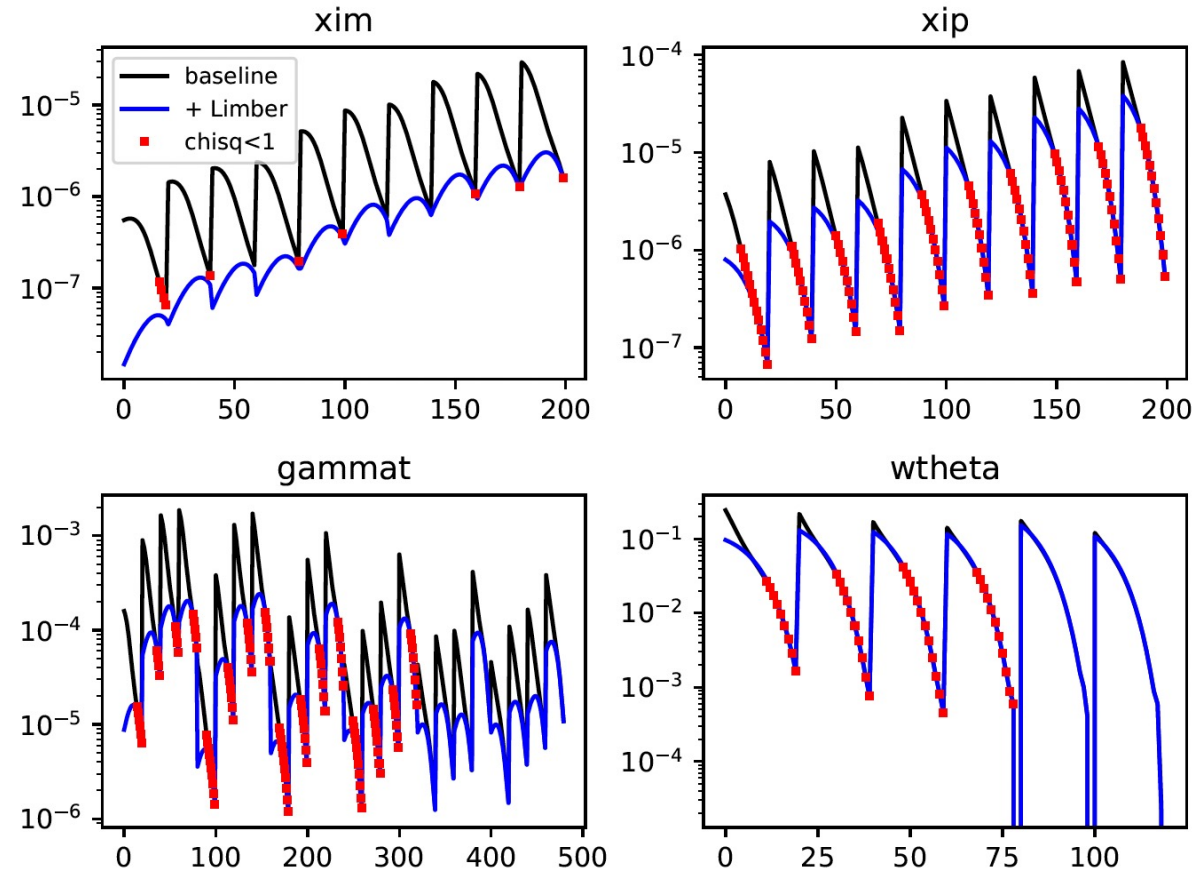
Non-linear power spectrum

Non-linear evolution of matter distribution is described using N-body simulations in LCDM.

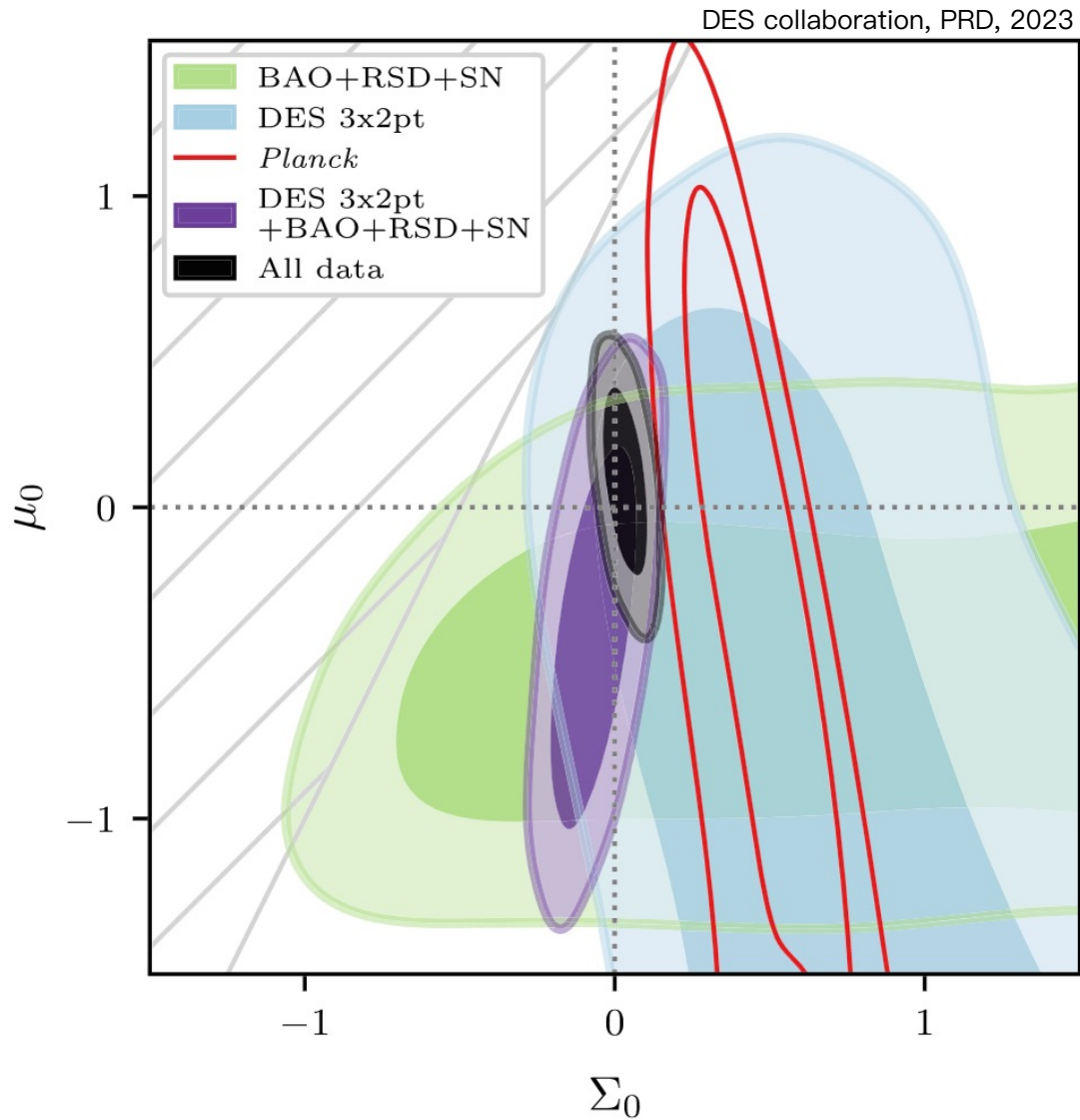
Approach:

$$\Delta\chi^2 \equiv (\mathbf{D}_{\text{NL}} - \mathbf{D}_{\text{lin}})^T \mathbf{C}^{-1} (\mathbf{D}_{\text{NL}} - \mathbf{D}_{\text{lin}}) < 20$$

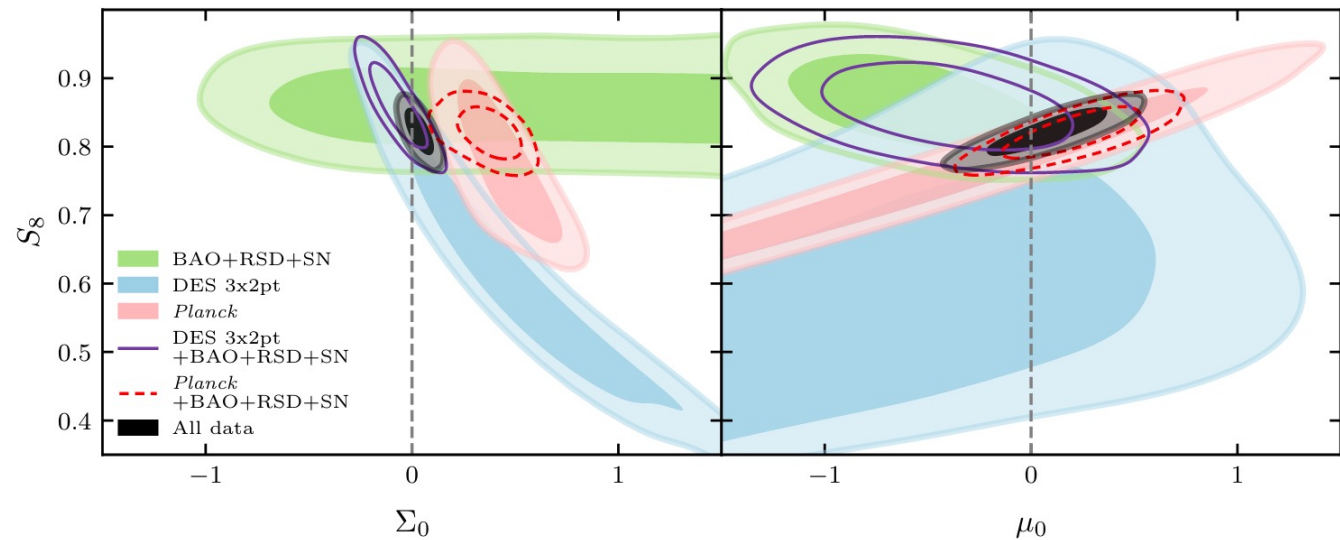
→ Use **255 data points** from 462 data points used in the LCDM analysis.



DES Year 3 results on tests of gravity



- DES Year 3 3x2pt constrain Σ_0 :
 - **consistent with GR,**
 - limited by scale cuts.
- Planck 2018 in tension?
- Our chains are available at <https://dev.des.ncsa.illinois.edu/releases/y3a2/Y3key-extensions>



Further tests of gravity

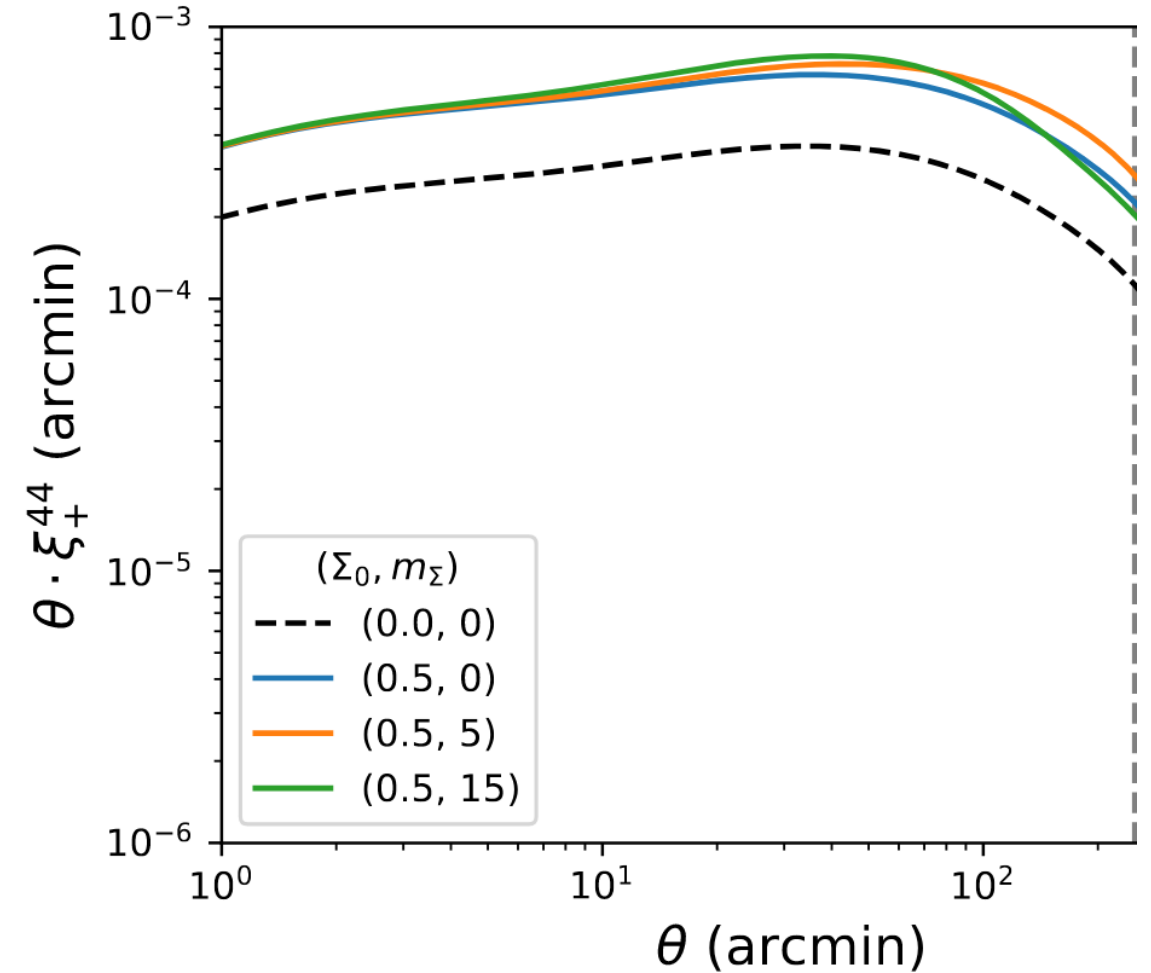
- **Scale**–dependant $\Sigma, \mu(a, k)$:
Work with student David Shlivko in 2019.
Model added to MGCamb and validation.

$$\Sigma(a, k) = 1 + \Sigma_0 \cdot \frac{\Omega_{\Lambda}^{GR}(a)}{\Omega_{\Lambda 0}^{GR}} \cdot \left[1 + \left(\frac{M_{\Sigma}}{k} \right)^2 \right]$$

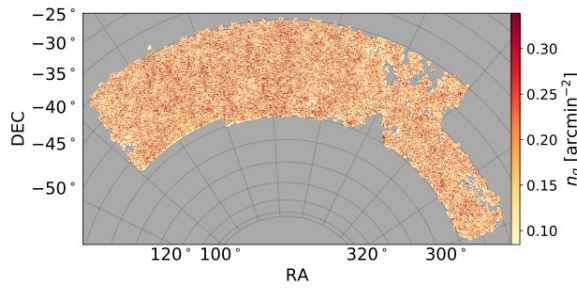
Shlivko, AF et al, in prep

- Other **time** dependence of Σ, μ .
- Other **theories**: f(R), dilaton, ...

→ Application to DES Y3 3x2pt *AF et al, in prep*



Final analysis of DES 3x2pt



Y1 cosmology

Y3 cosmology

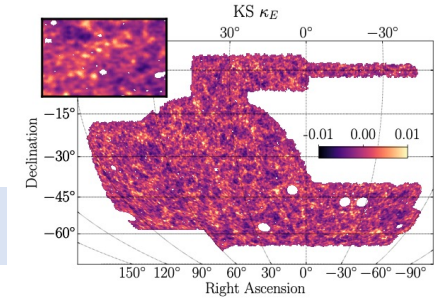
Y6 cosmology

2013

2019

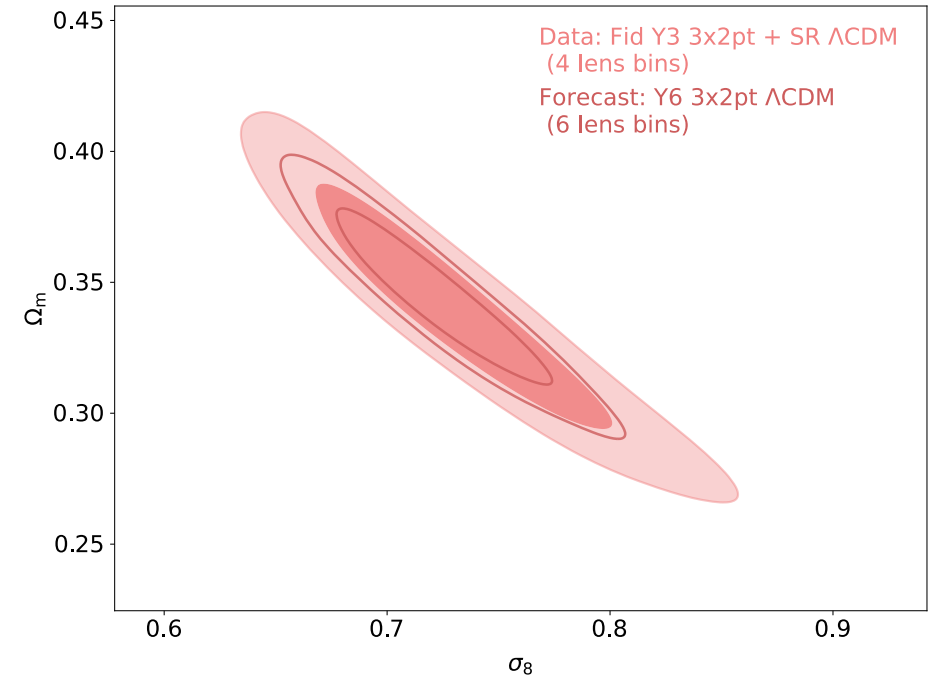
2023

Data taking



DES Y6:

- The largest shape catalogs with expected **150M source galaxies**
- The only 3x2pt from same survey

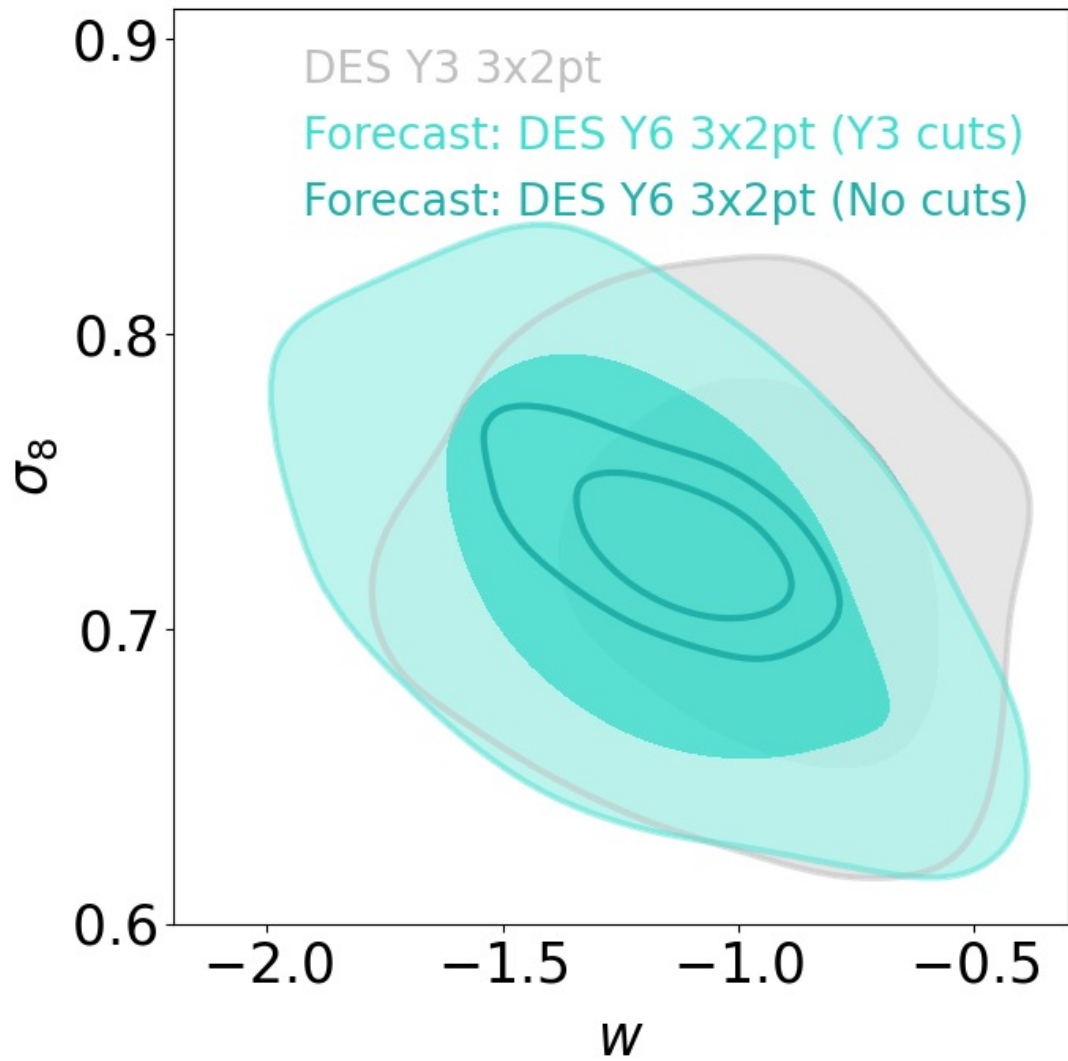


Picture credits:

J. Elvin-Poole, M. Crocce et al, PRD, 2018

Jeffrey, N., Gatti et al., MNRAS, 2021

Solving challenges for DES Y6 cosmology



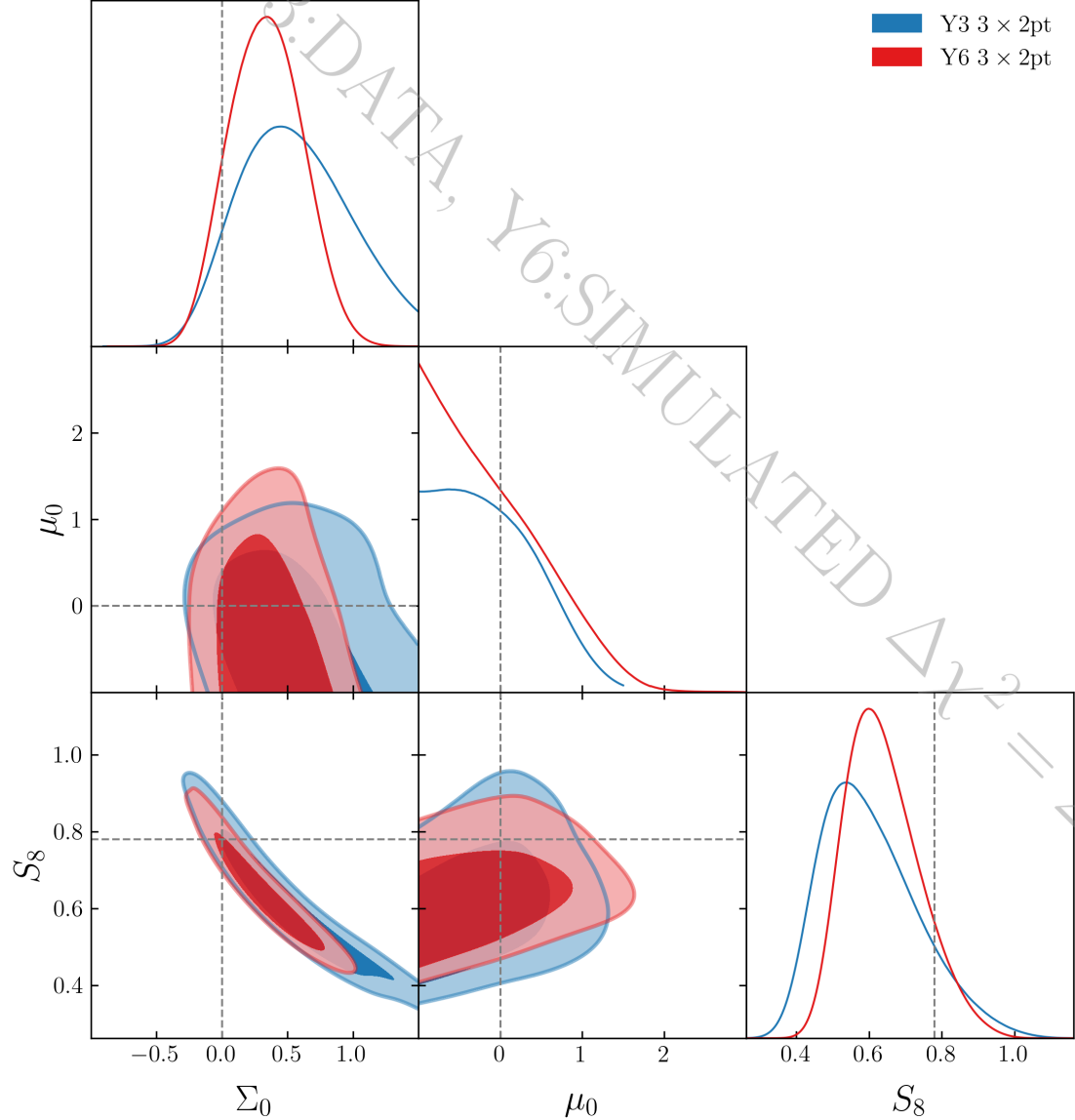
Y6 modeling team **co-leads**:
David Sanchez-Cid, Jonathan Blazek

New **precise** data also means pushing modeling **choices**:

- HMCode for baryonic feedback,
- use of **non-linear galaxy bias model** is one of the planned improvements from DES Y3.

DES Y6 tests of gravity

Preliminary plot from Sujeong Lee

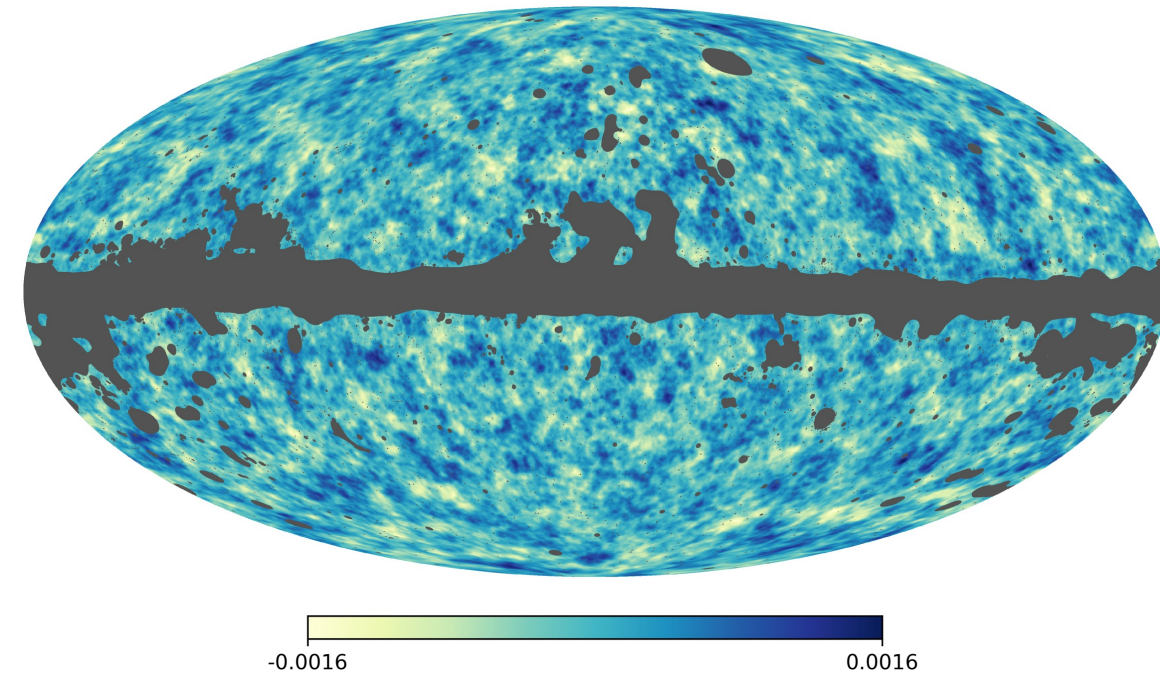


Promising results for tests of Σ, μ and early dark energy

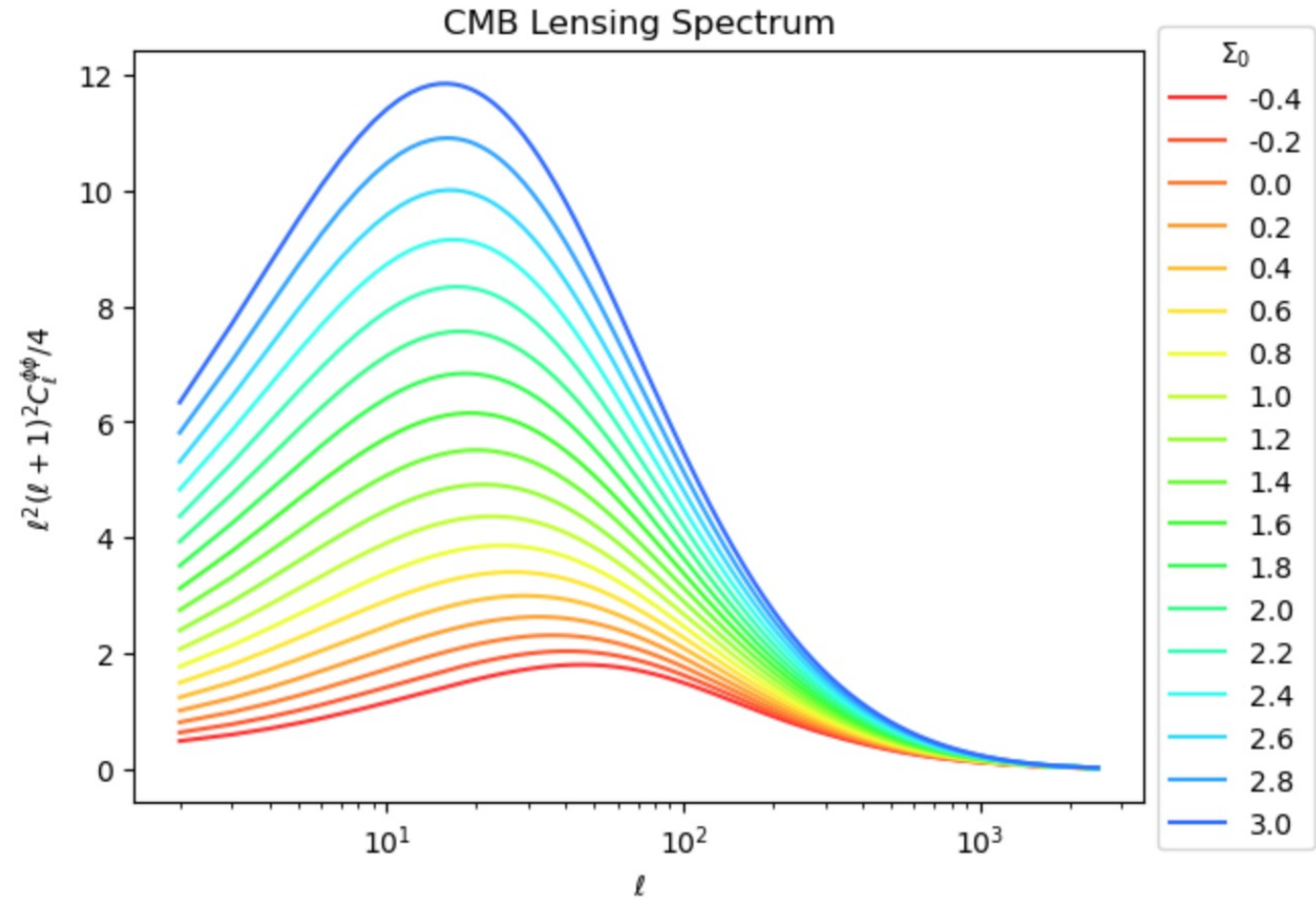
Y6 Extensions team **co-leads**:
Sujeong Lee, Otávio Alves, Marco Raveri

CMB lensing to test gravity

Planck collaboration, A&A, 2020



- Lensing of the Cosmic Microwave Background: sensitive to Σ_0
- More and more **precise** measurements of CMB lensing

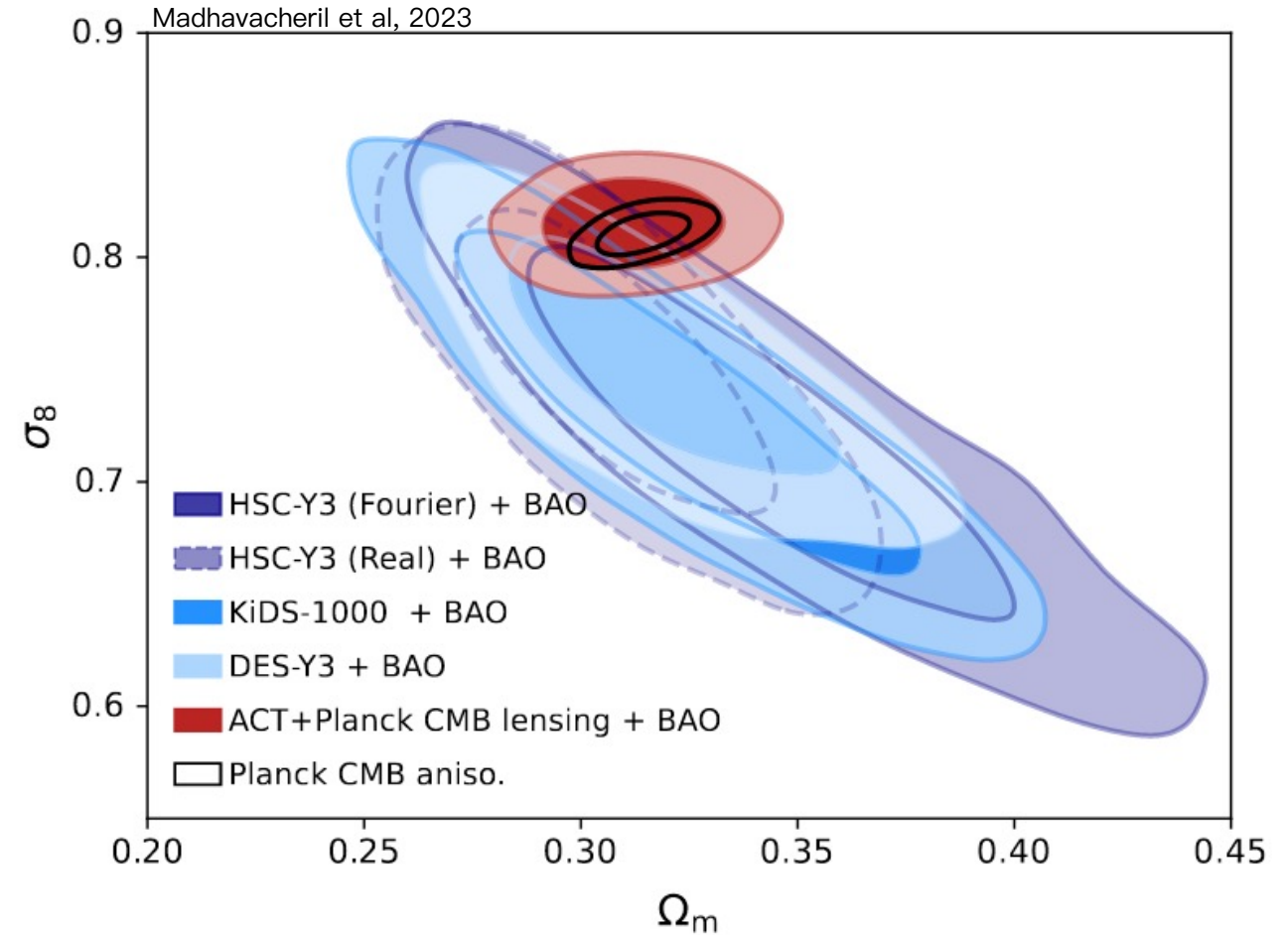


ACT DR6 lensing data



Photo Credit: Jon Ward

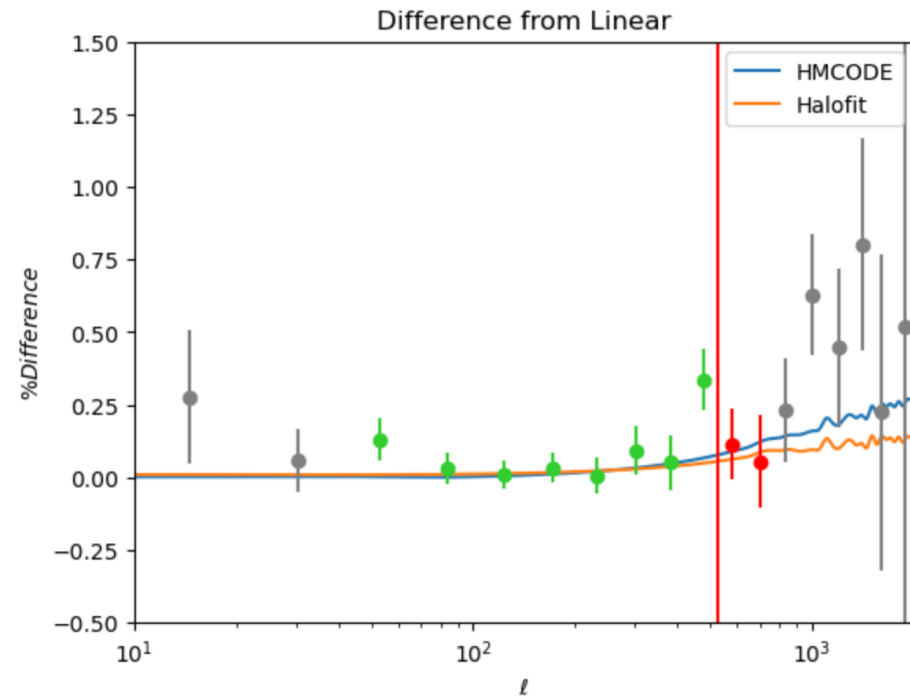
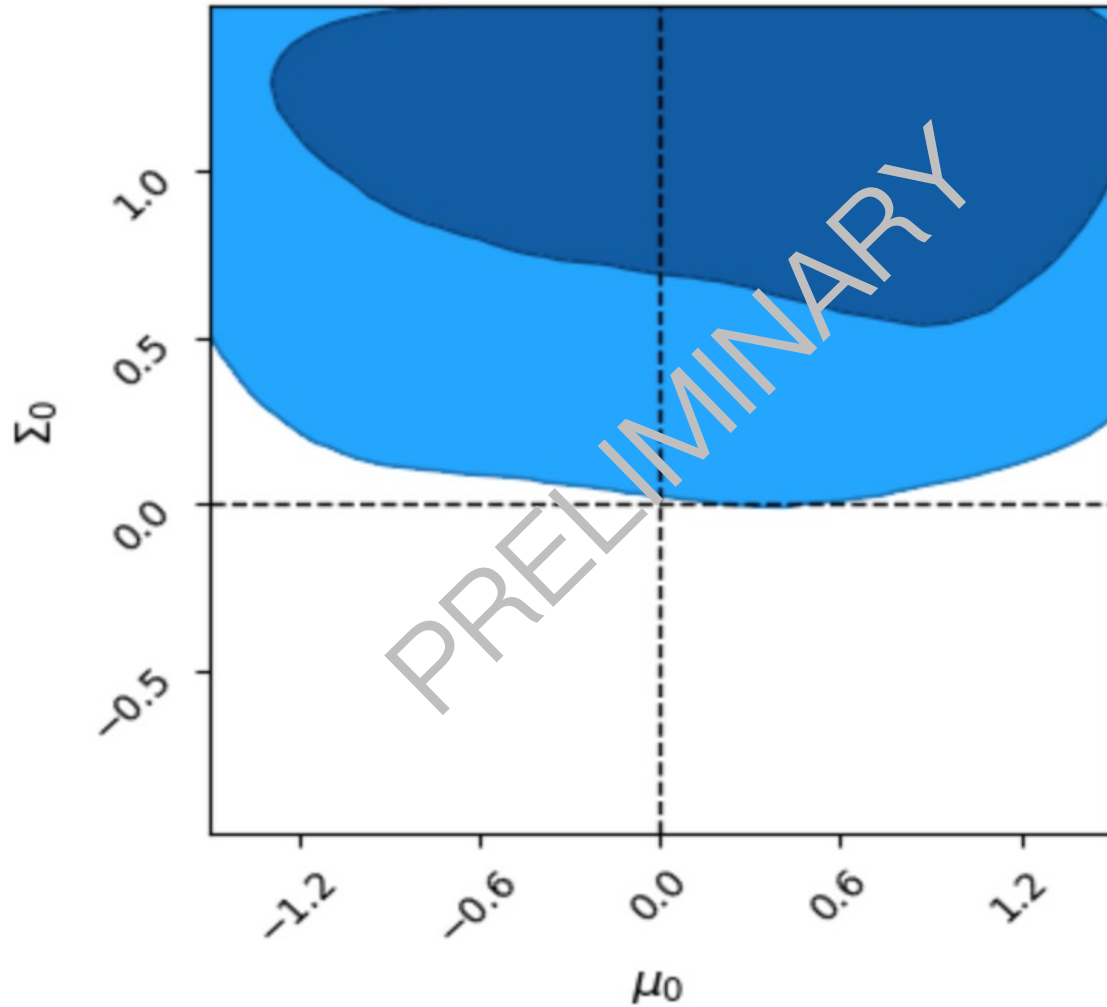
43 σ measurement of CMB lensing with ACT data



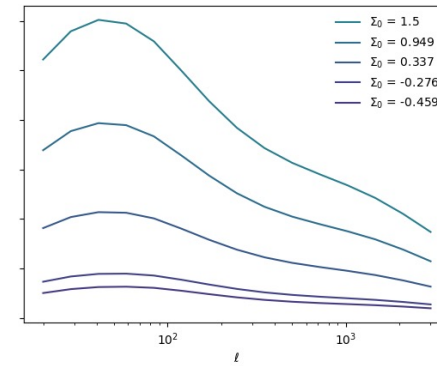
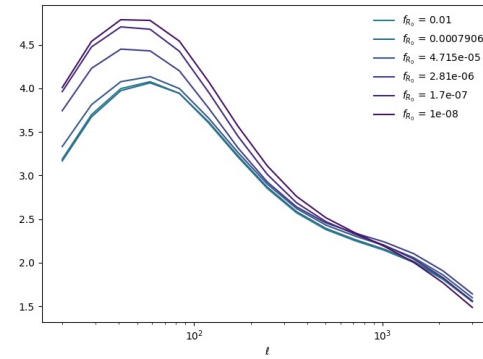
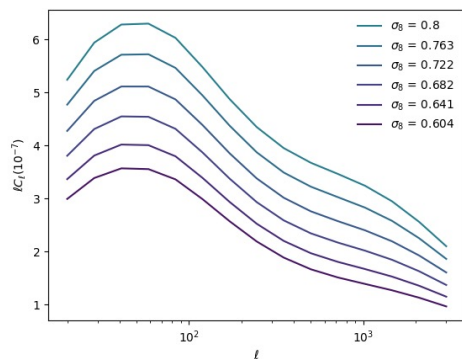
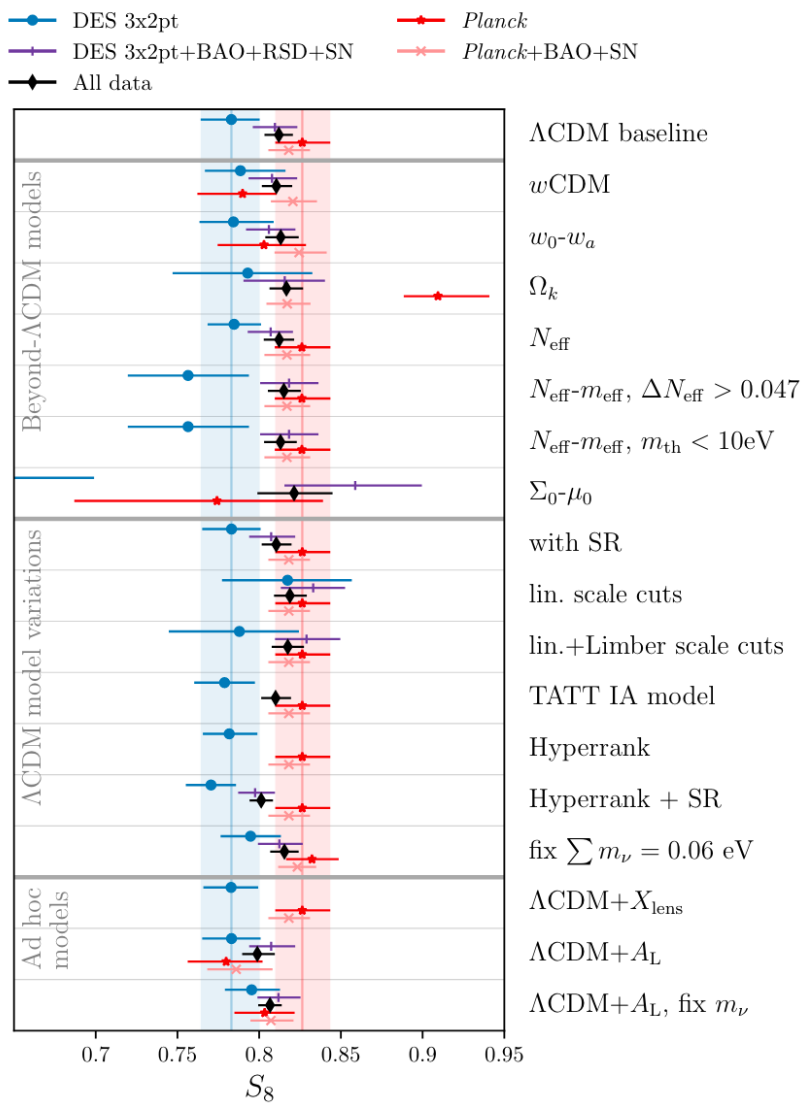
ACT DR6 lensing results on Σ, μ

Work with student David Dzingeleski

- Non-linear **scale cuts**: remove 2 data points.
- Results from ACT DR6 lensing:
 - High Σ_0 from ACT data
 - Adding RSD: consistent GR.
- Exciting prospects to test Σ_0 in the future



The σ_8 tension



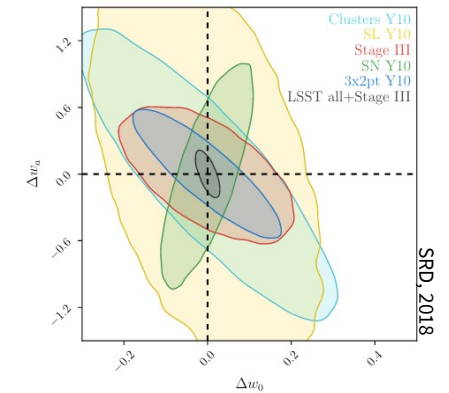
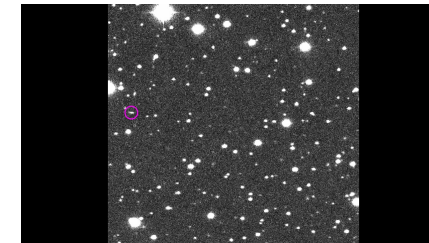
σ_8 tension between CMB from Planck and Weak lensing measurements:

- No clear solutions to σ_8 tension from beyond- Λ CDM models.
- Data not precise enough.

Rubin Observatory will map the entire Southern sky every 3 nights

LSST = a fast wide deep survey:

- Galaxy survey **cosmology** (static sky)
- **Changing** phenomena:
solar system bodies, asteroids, SN, AGN, etc (transient sky)

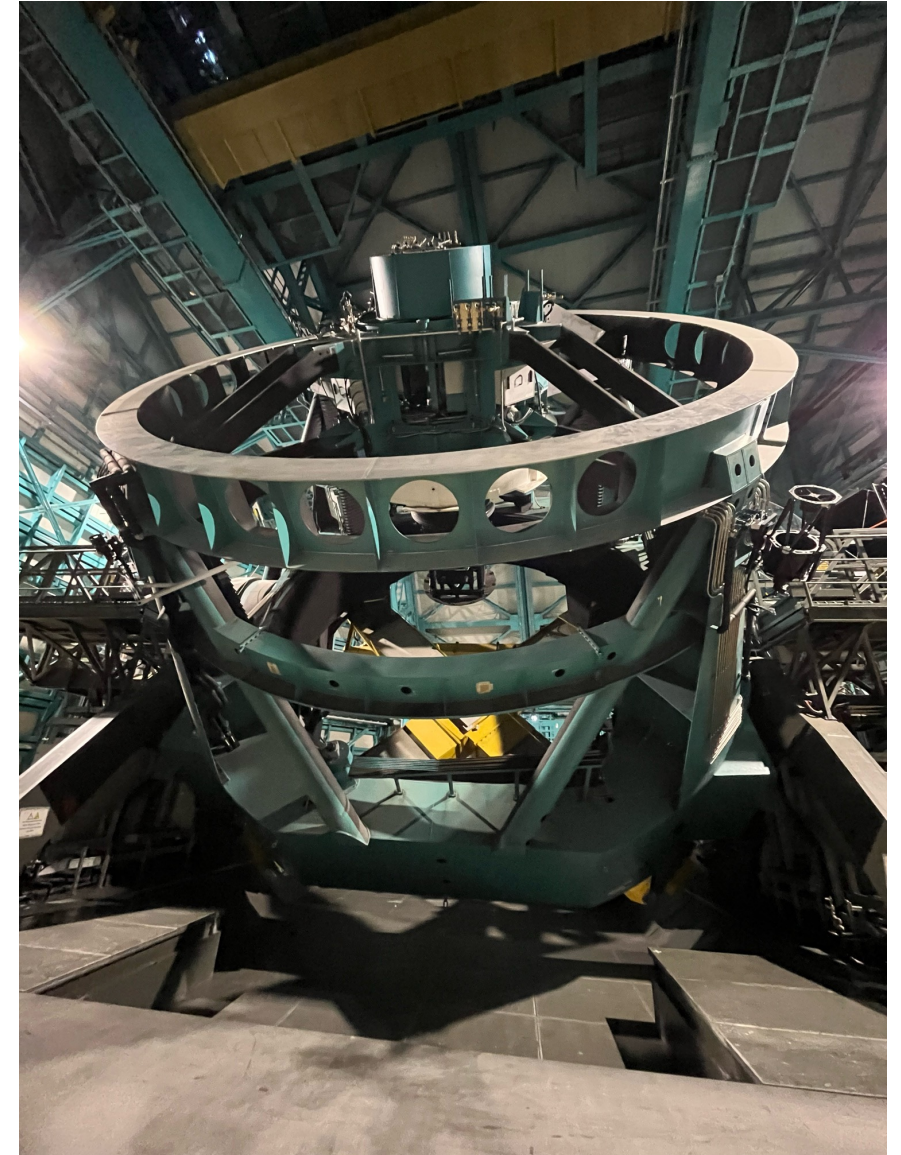


Rubin Observatory & **you**:

- Science Collaborations: organized efforts around science with LSST data.
- Community forum: <https://community.lsst.org/>
- The Rubin Observatory is a US and Chilean Project with in-kind contributions:
 - From the US and Chile
 - From the international community including France through IN2P3—CC and software contribution

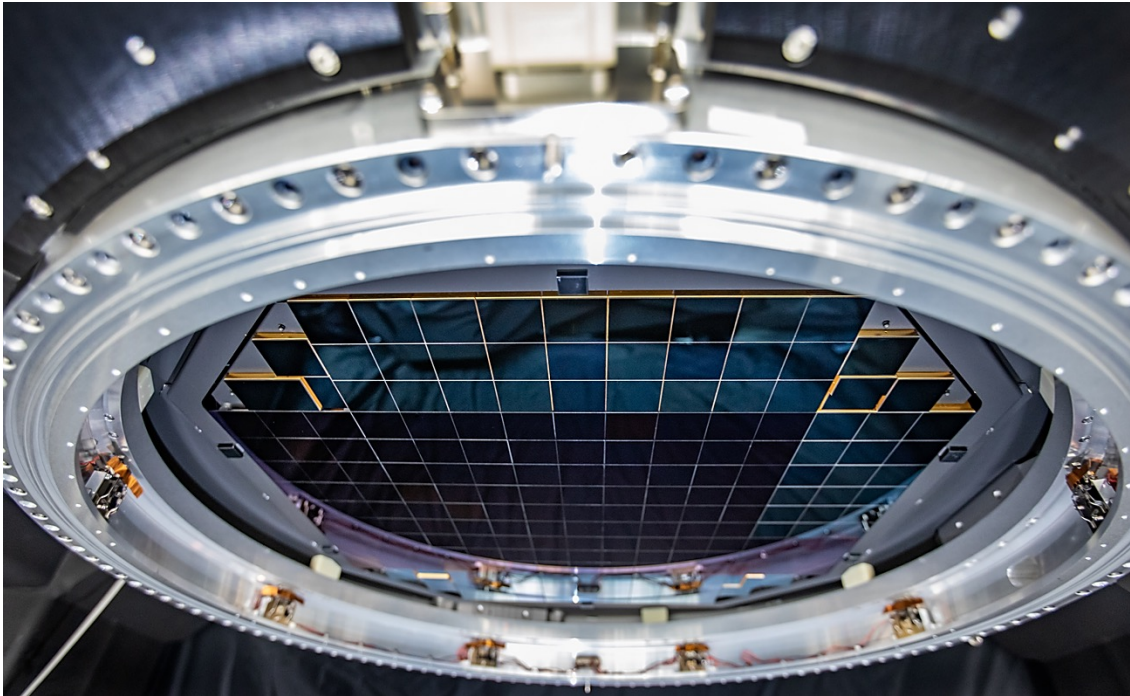
A new addition to Cerro Pachón

- The Rubin Observatory under **construction** since 2015 at Cerro Pachón at 2,660m elevation
- The Simonyi Survey Telescope Mount Assembly:
 - On and moving.
 - **Camera:** ComCam on the telescope, the camera LSSTCam is still at SLAC: shipping soon!
- Currently taking data with the software at the summit with AuxTel.



LSSTCam: the largest digital camera

- **189 4k x4k CCDs** (ITL and e2v) of 16 amplifiers.
- All assembled with lenses and filters @ SLAC.
- Last tests before shipping by air and road to the summit.
- Correction of detector effects and calibration in Rubin DM.



Processing and releasing TB of data

Raw Data: 20TB/night



Sequential 30s images covering the entire visible sky every few days



Prompt Data Products

Alerts: up to 10 million per night

Raw & Processed Visit Images, Difference Images, Templates

Transient and variable sources from Difference Image Analysis

Solar System Objects: ~ 6 million

Data Release Data Products

Final 10yr Data Release:

- Images: 5.5 million x 3.2 Gpixels
- Catalog: 15PB, 37 billion objects



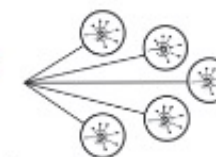
via nightly alert streams



via Prompt Products DB



via Data Releases



Community Brokers

Rubin Data Access Centres (DACs)

USA (USDF)
Chile (CLDF)
France (FRDF)
United Kingdom (UKDF)

Independent Data Access Centers (IDACs)

Rubin Science Platform (RSP)

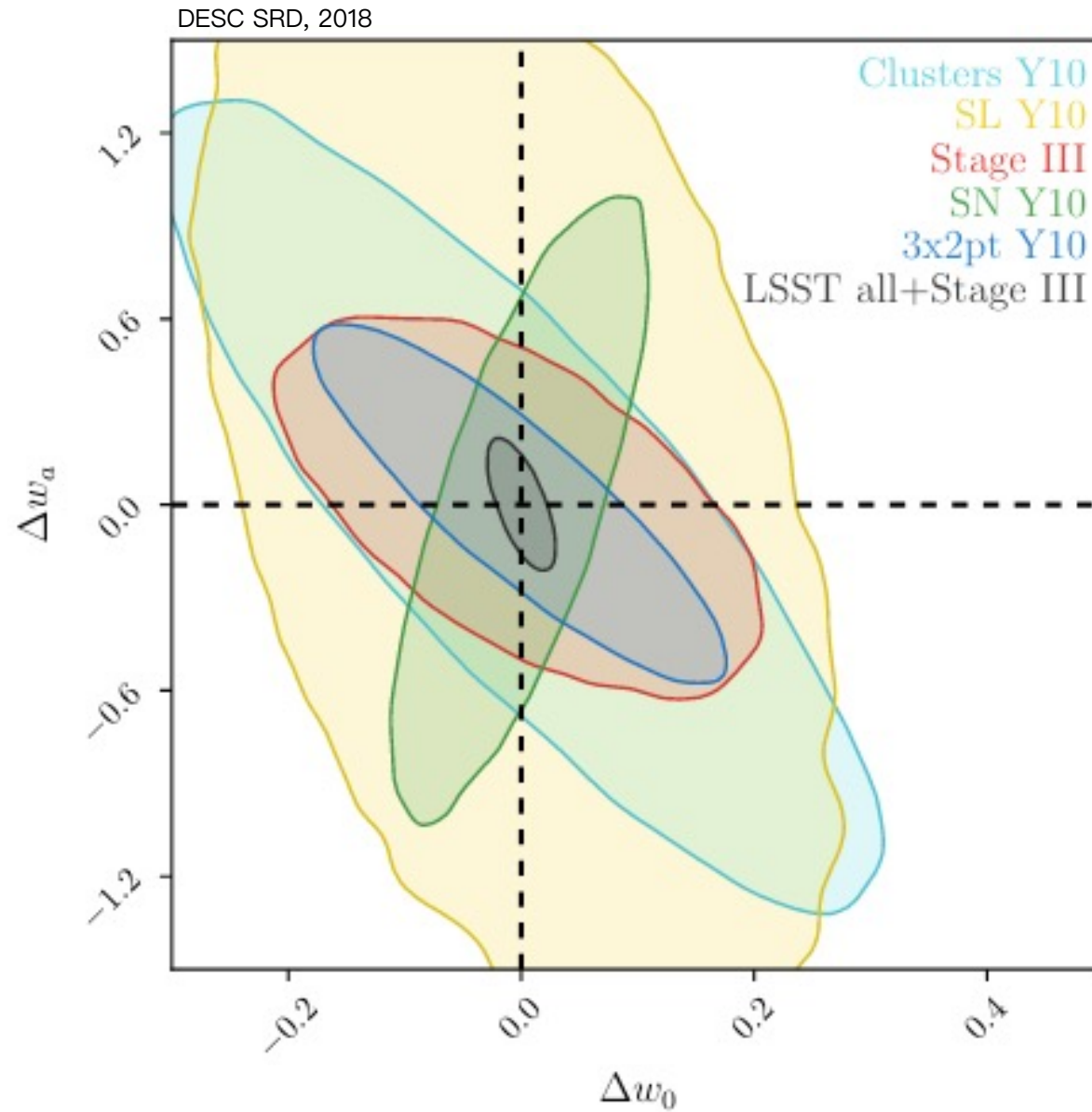
Provides access to LSST Data Products and services for all science users and project staff

Access to proprietary data and the Science Platform require Rubin data rights

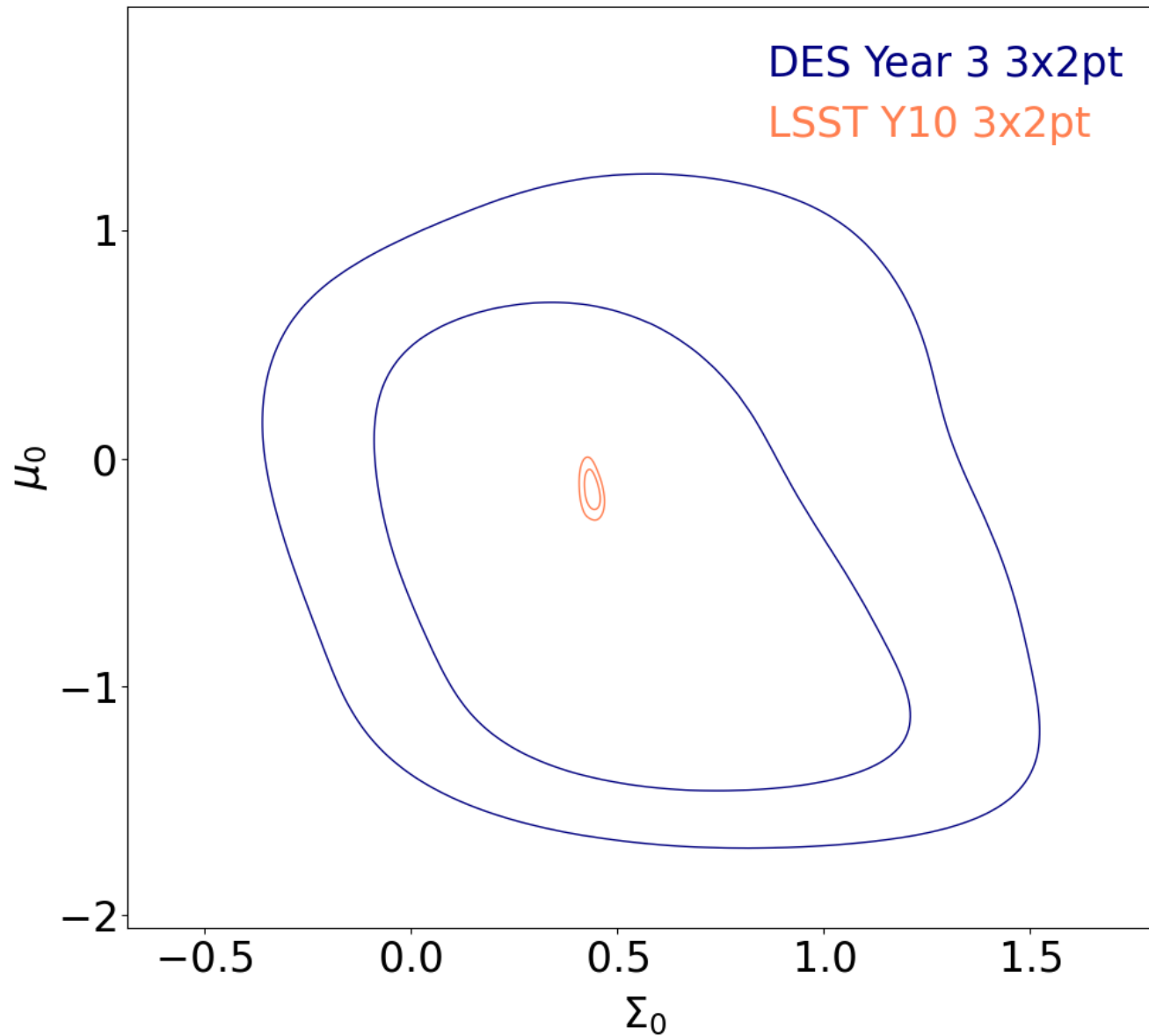


Slide by Leanne Guy

LSST multi-probes for dark energy



Future of weak lensing and tests of gravity



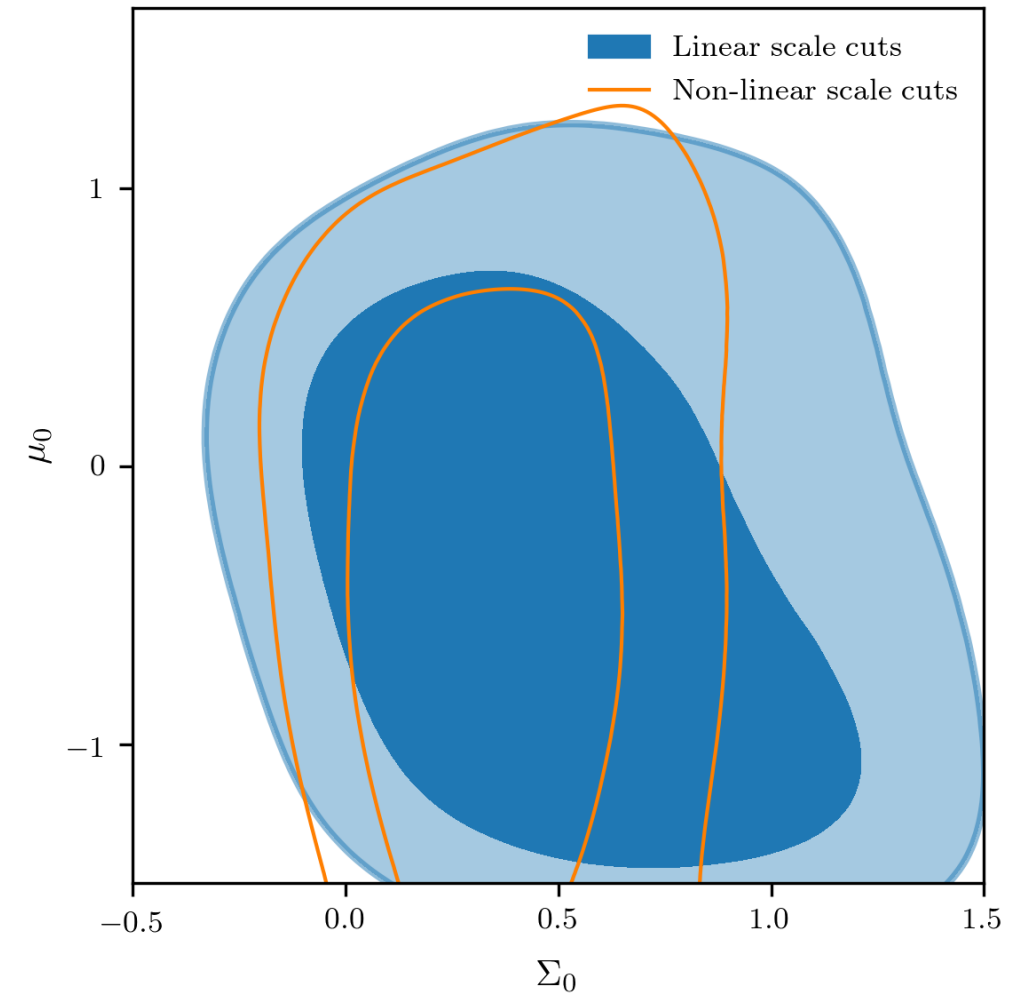
Observed f_{sky} x 5
galaxies x 10
➔ $\sigma(\Sigma, \mu)$ / 10

Forecasts updated from *AF* et al, 2019

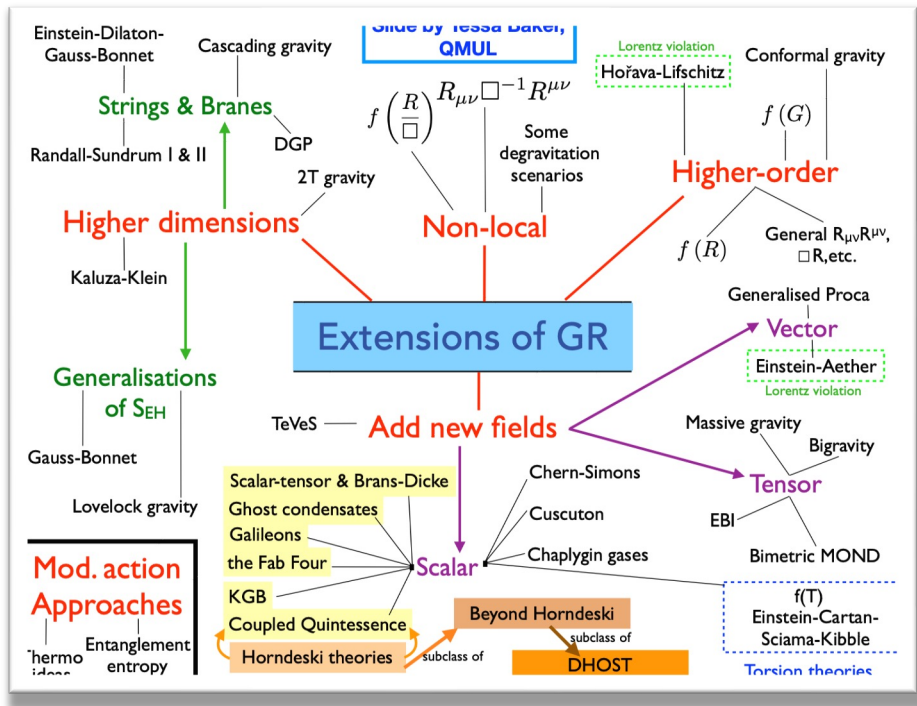
Challenges to test gravity with stage-IV surveys

Analyzing the **data**:

- Computationally Expensive:
 - More efficient parameter estimation algorithms,
 - Emulators,
 - Data compression.
- How to describe physical systematics in modified gravity?
- Need to use smaller scales.



Challenges to test gravity with stage-IV surveys



Not a clear direction in **theory** space:

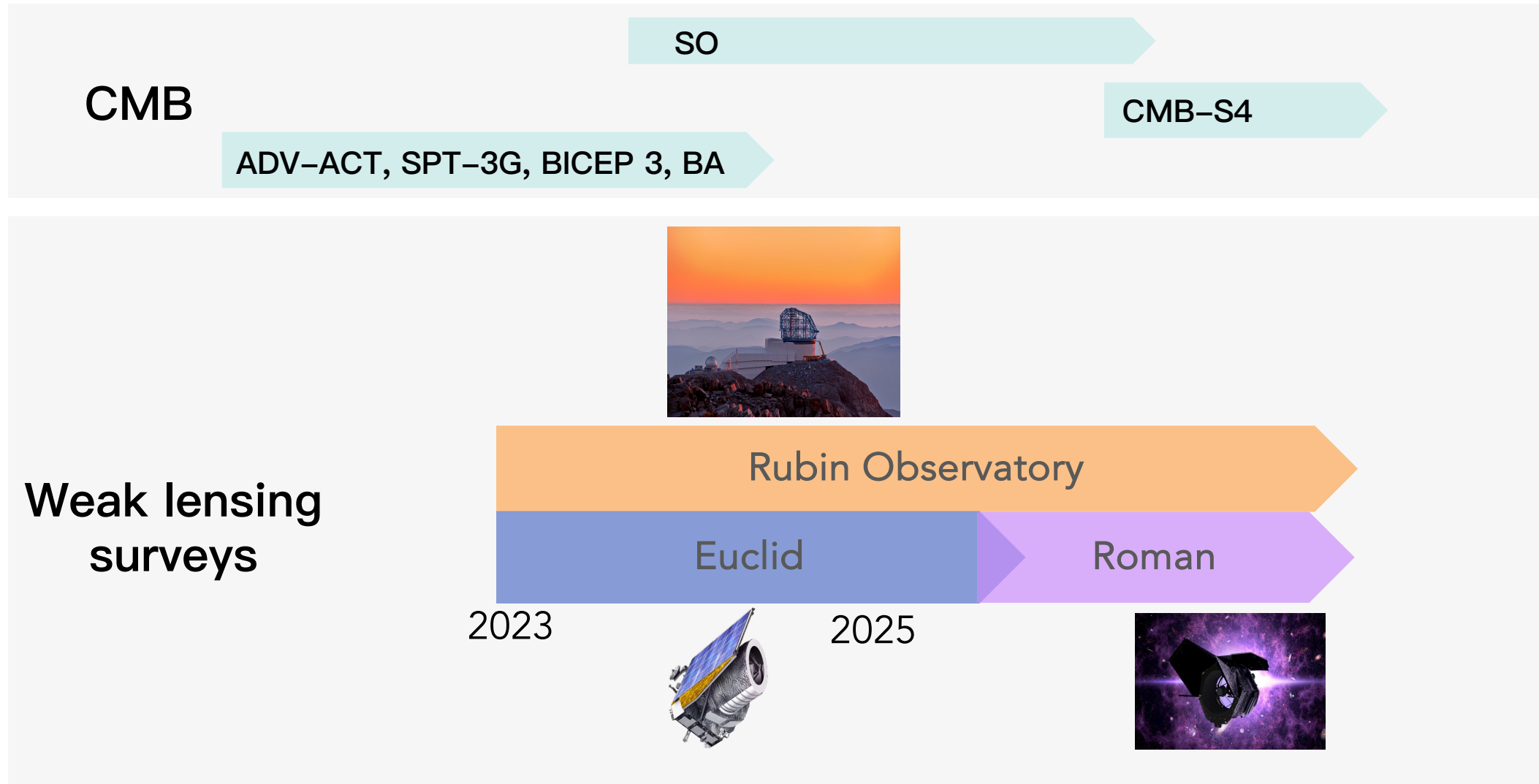
- (Σ, μ) is a great to explore, but we must assume a parametrization.
- Community seems to focus on $f(r)$ and EFT.

In **AF** et al, OJA, 2023 we propose to compare theories at the level of observables.

It will be important to be creative in looking at the data:

- New probes,
- Deep learning, SBI.

Exciting prospects with weak lensing and CMB



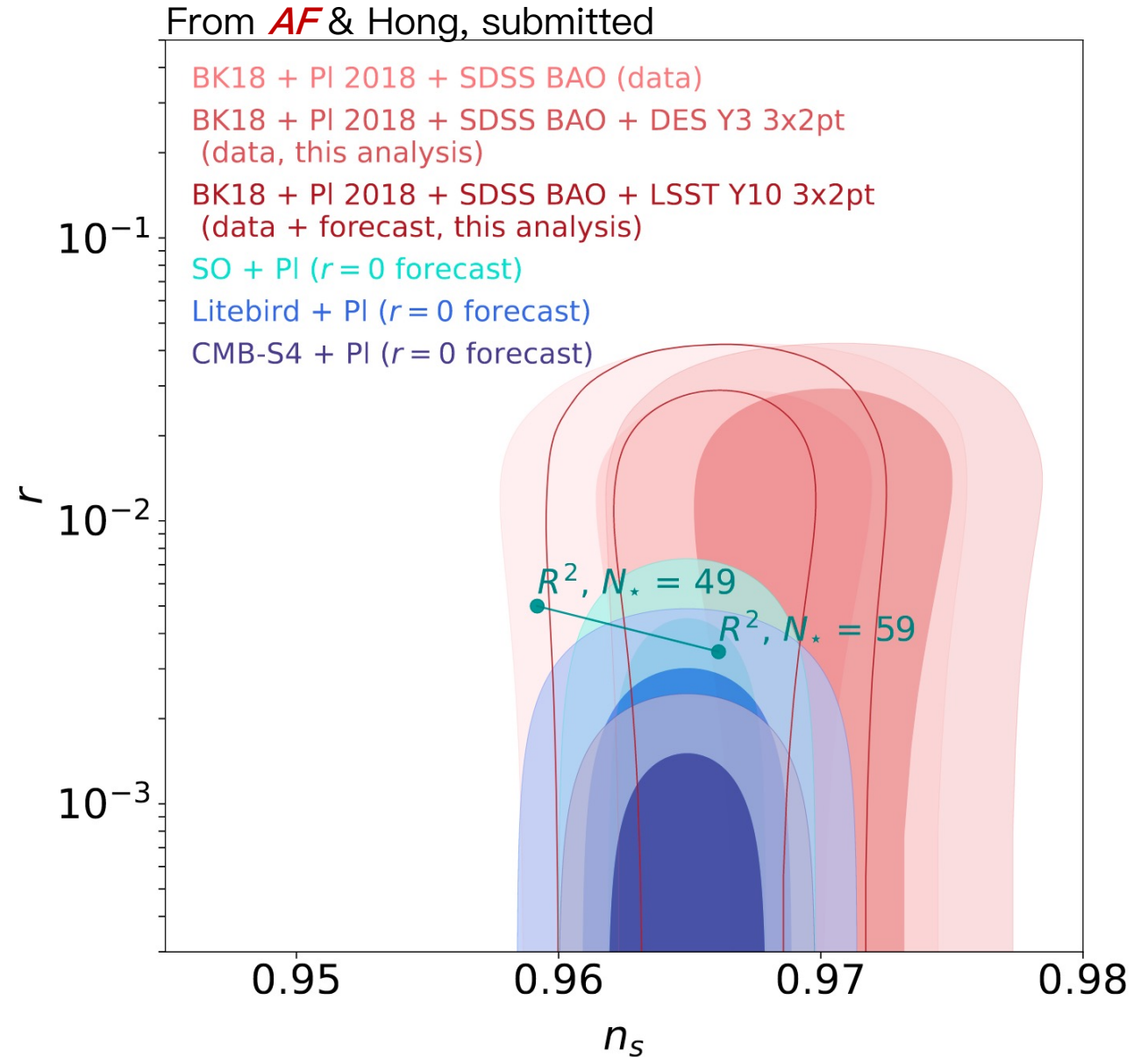
Cosmic inflation

Up to now, **CMB B-modes** experiments mainly use:

- BAO,
- CMB temperature and polarization, to test cosmic inflation.

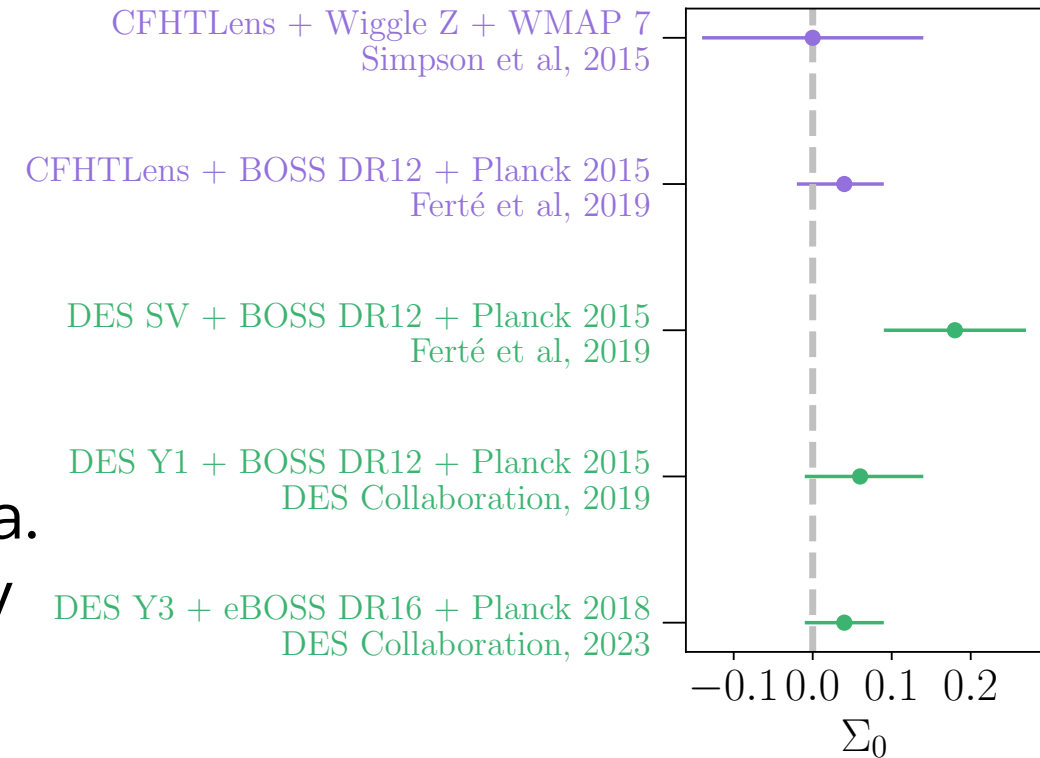
Galaxy surveys should be added as well in the future.

Galaxy surveys also have access to f_{NL} .



Outlooks

- DES is precursor of stage-IV surveys:
ongoing work on DES Y6
- Cosmology from weak lensing:
 - More and more **precise tests of Σ, μ** :
DES Year 3 consistent with GR +
preliminary test with ACT DR6 lensing data.
 - **Modeling observables accurately** is a very
important challenge.



Rich synergies between cosmological surveys in the 2020s.