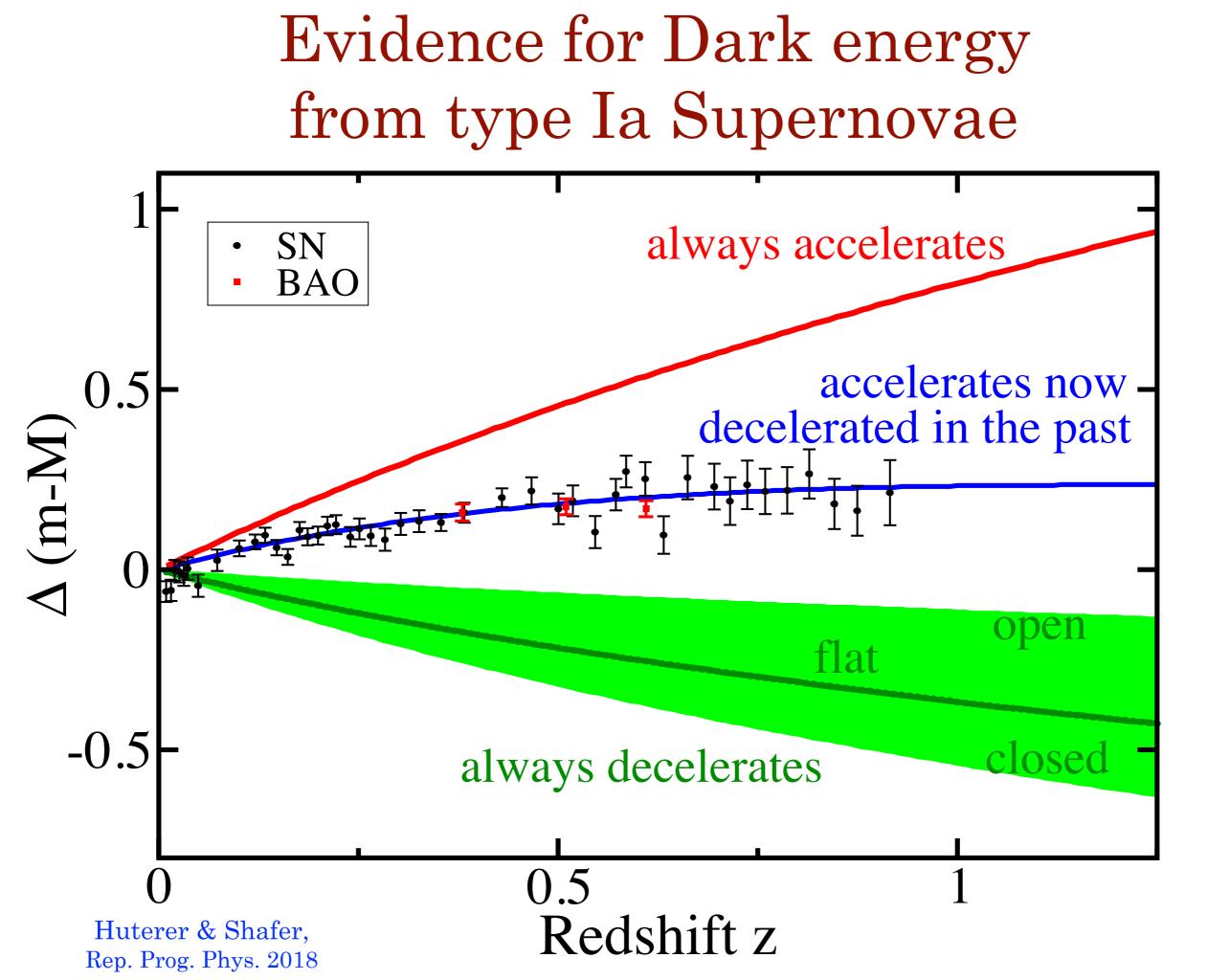
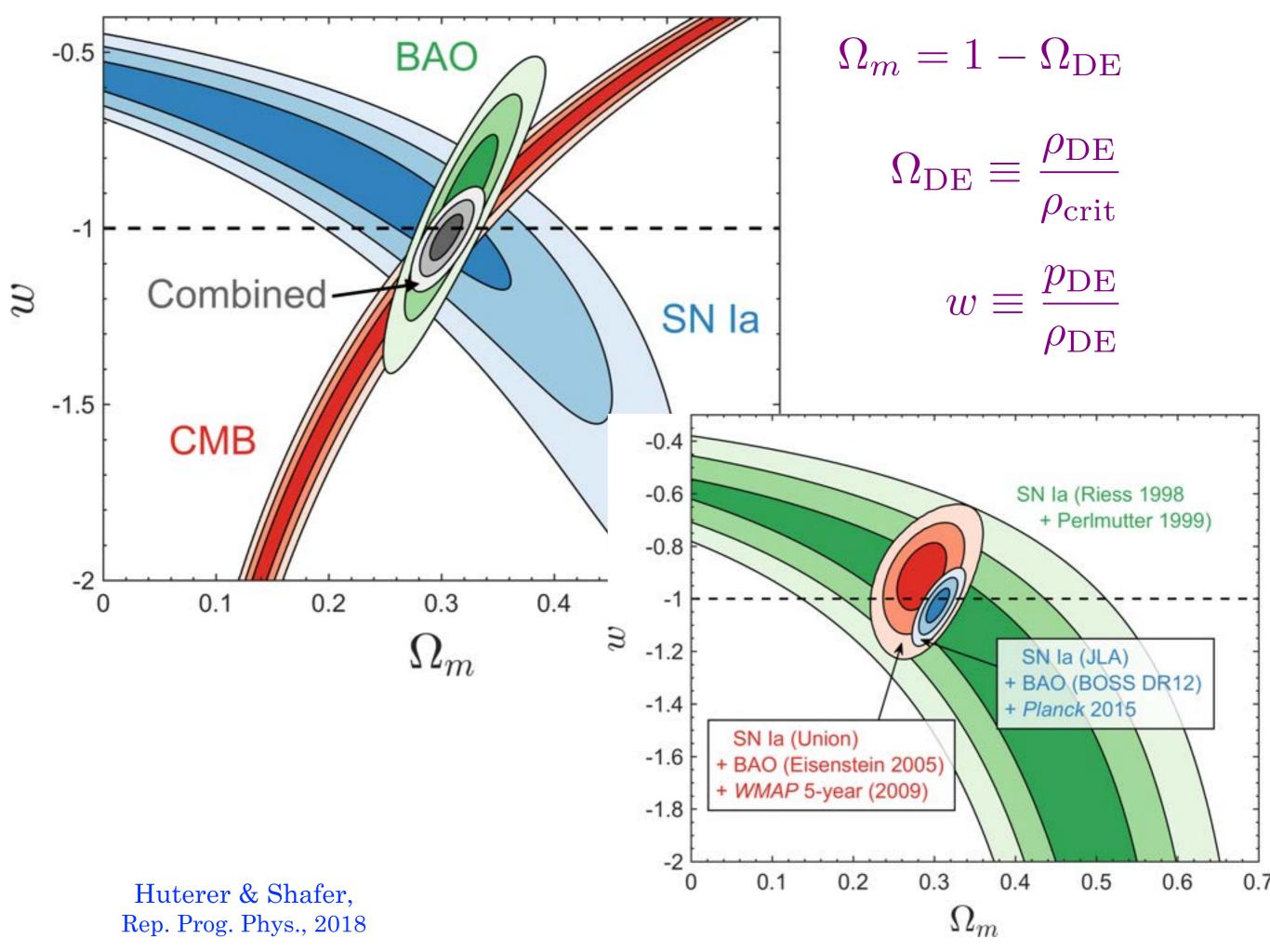
Probing the Universe with Dark Energy Survey

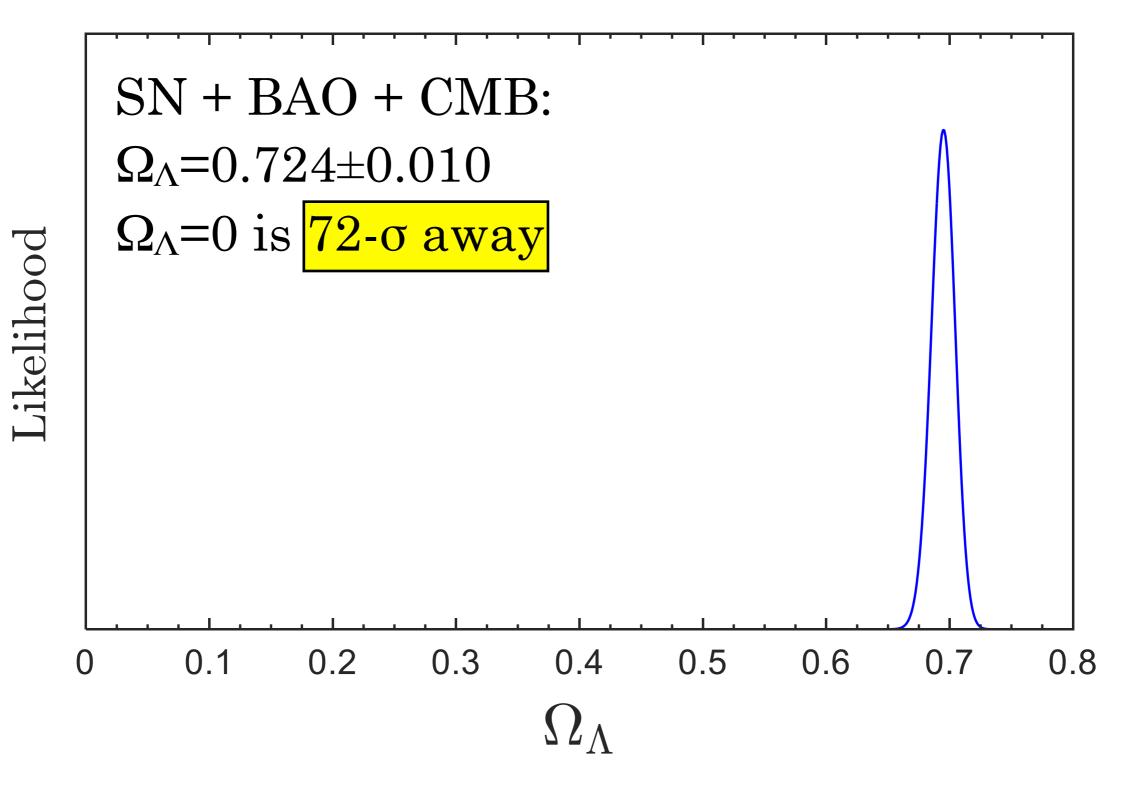
Dragan Huterer Physics Department University of Michigan

Blanco telescope at Cerro Tololo, Chile





Current evidence for dark energy is impressively strong



Daniel Shafer, 2017

A difficulty:

DE theory target accuracy, in e.g. $w=p/\rho$, not known *a priori*

Contrast this situation with:

1. Neutrino masses:

$$(\Delta m^2)_{sol} \approx 8 \times 10^{-5} \text{ eV}^2$$

 $(\Delta m^2)_{atm} \approx 3 \times 10^{-3} \text{ eV}^2$

$$\sum_{i=0.11 \text{ eV}^* \text{ (inverted)}} \sum_{i=0.11 \text{ eV}^* \text{ (inverted)}} \sum_{i=0.11 \text{ eV}^* \text{ (inverted)}}$$

2. Higgs Boson mass (before LHC 2012): m_H ≤ O(200) GeV (assuming Standard Model Higgs)

Combined-

CMB

SN la

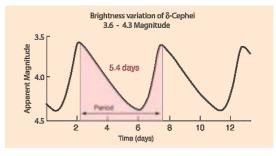
0.5

 Ω_m

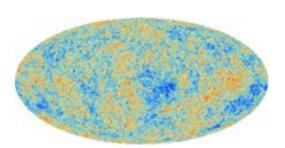
Hubble tension

Type Ia supernovae + Cepheid distances give

 $H_0 = 74.0 \pm 1.4 \text{ (km/s/Mpc)}$



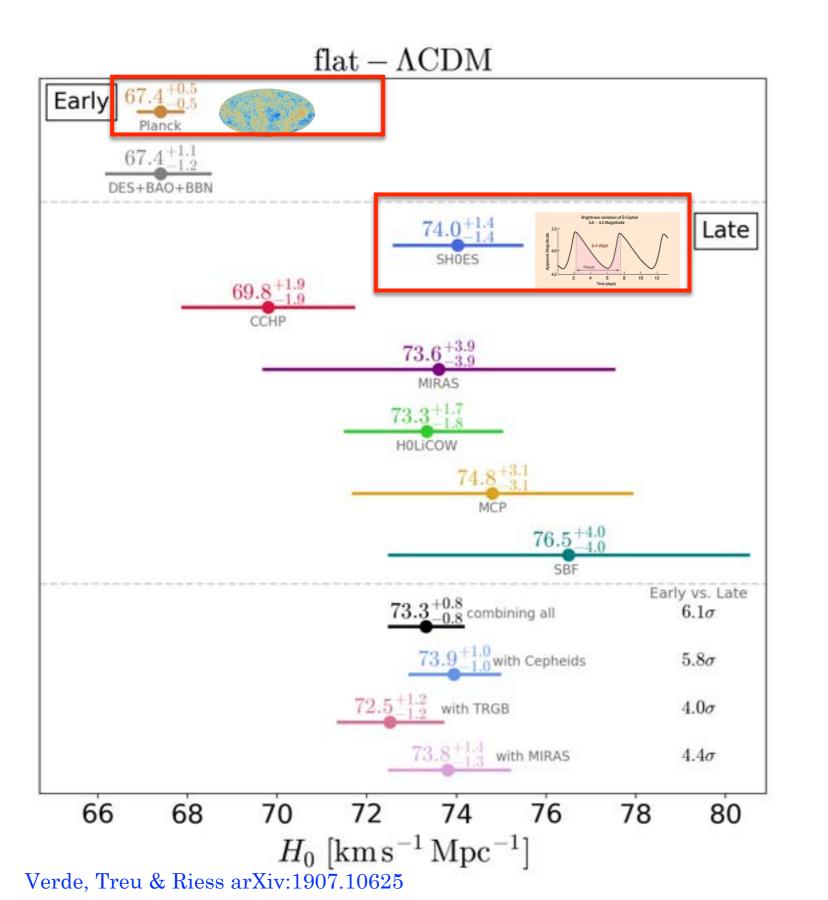
Cosmic Microwave Anisotropies give $H_0 = 67.4 \pm 0.4$ (km/s/Mpc)



These two measurements are discrepant at about five sigma!*

* once strong-lensing constraints are added, which come out high (H_0 ~ 73)

Hubble tension - a gift to cosmology!



- exciting, real tension in cosmology
- •all major analysis very thorough
- •no obvious systematics (as yet)
- theory models
 surprisingly hard to
 concoct (e.g. very
 finely tuned scalar
 field models that also
 don't really work)

Major ongoing or upcoming DE expt's:

Ground photometric:

Kilo-Degree Survey (KiDS)

Dark Energy Survey (DES)

Hyper Supreme Cam (HSC)

Large Synoptic Survey Telescope (LSST)

• Ground spectroscopic:

- Hobby Eberly Telescope DE Experiment (HETDEX)
- Prime Focus Spectrograph (PFS)
- Dark Energy Spectroscopic Instrument (DESI)
- Space:
 - Euclid
 - Wide Field InfraRed Space Telescope (WFIRST)

The Dark Energy Survey (DES)

- 570 Megapixel camera for the Blanco 4m telescope in Chile.
- Full survey
 2013-2019
 (Y3 2013-16).
- Wide field:
 5000 sq. deg.
 in 5 bands.
 ~23
 magnitude.
- DES Y3: Positions and shapes of > 100M galaxies.

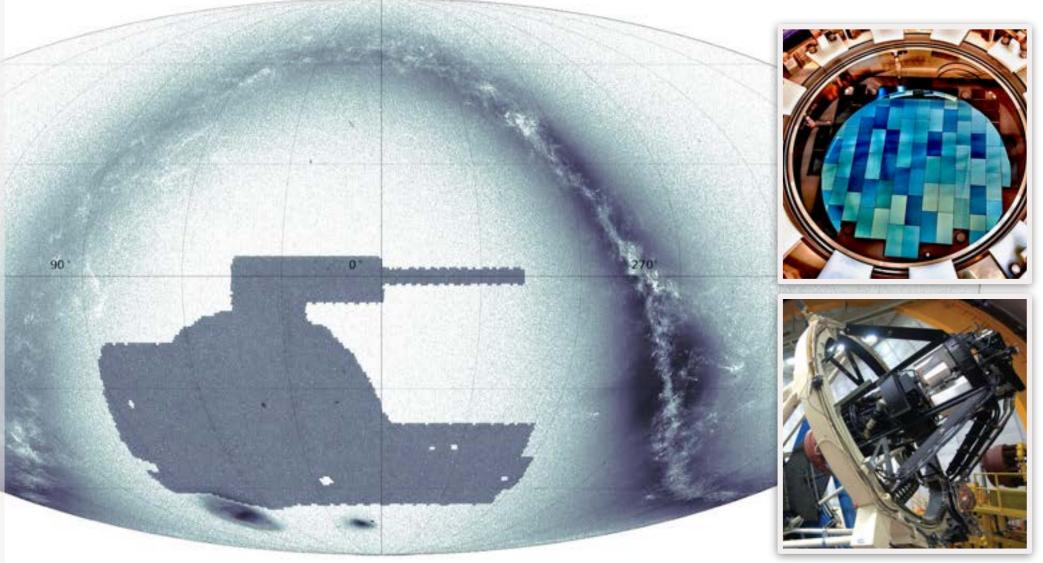


Image Credit: CosmoHub, Port d'Informació Científica (PIC)

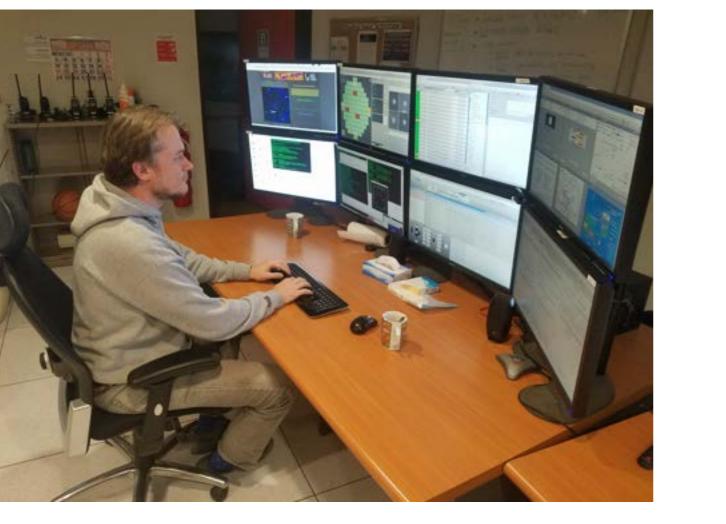


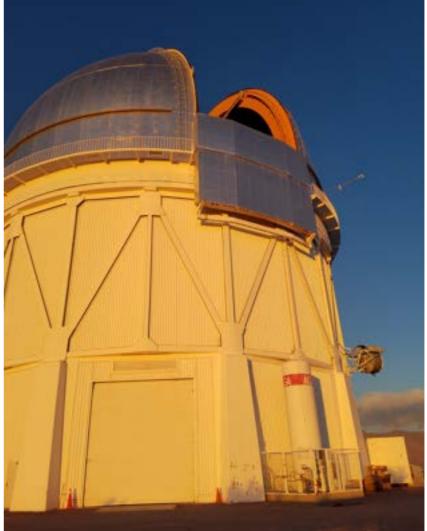
Cerro Tololo, Chile

Dark Energy Survey (DES)









Blanco Telescope

List of participants (Early Career Scientists in bold)

			Alyssa dalola	r enpe Analude Onvend		5
(Early Career Scientists in bold)			Dhayaa Anbajagane	Jack Elvin-Poole	Danielle Leonard	Simon Birrer
			Andresa Campos	Juan P. Cordero	Gaston Gutierrez	Brian Yanny
			Cyrille Doux	Mike Jarvis	Federica Tarsitano	Sahar Allam
Beatrice Moser	Adam Amara	Ramon Miquel	Jessie Muir	Eric Huff	Juan Mena Fernández	Scott Dodelson
Dan Scolnic	Santiago Avila	Jenna Freudenbe	r G eorgios Zacharegka	is Chris Conselice	David Sánchez Cid	Jim Annis
Robert Morgan	Sunayana Bharga		William Hartley	Eric Neilsen	Seshadri Nadathur	Andras Kovacs
Nacho Sevilla	Antonella Palmese	eTomasz Kacprzak		Javier Sanchez	Gary Bernstein	Hugo Camacho
Paul Rogozenski Elisabeth Krause	Zhiyuan Zhou	Giulia Giannini	Michael Troxel	Andres Navarro	Sujeong Lee	Kai Hoffmann
Joe DeRose	Aaron Roodman	Chihway Chang	Judit Prat	Tae-hyeon Shin	Prudhvi Varma	Mandeep Gill
Richard Kron	Matthew Becker	Anderson Souza	Pablo Fosalba	Chun-Hao To	Oliver Friedrich	Jonathan Blazek
H. Thomas Diehl	Risa Wechsler	Jacobo Asorey	Douglas Tucker	Tesla Jeltema	Simon Samuroff	Lucas James Faga
Ofer Lahav	Andrés Plazas	David Burke	Eli Rykoff	Kevin Wang	Richard Kessler	Joe Zuntz
Reese Wilkinson	Rafael Gomes	Isaac Tutusaus	Michael Johnson	Niall MacCrann	Huan Lin	Steve Kent
Peter Melchior	Ian Harrison	Jamie McCulloug	h <mark>Masaya Yamamoto</mark>	Erin Sheldon	Rutuparna Das	Martin Crocce
David Weinberg	Romain Buchs	Paul Ricker	Dillon Brout	Agnes Ferte	Lorne Whiteway	Spencer Everett
Anqi Chen	Ami Choi	Eduardo Rozo	Matias Carrasco	Ross Cawthon	Anushka Shrivastava	Juan Estrada
Dominik Zuercher	Maria Pereira	Noah Weaverdyck		Manda Banerji	Tamara Davis	Donald Petravick
Niall Jeffrey	Alex Alarcon	Pauline Vielzeuf	Nico Hamaus	Yuuki Omori	Jimena Gonzalez	Hung-Jin Huang
Mitch McNanna	Bhuvnesh Jain	Eusebio Sanchez	Ismael Ferrero	Brenna Flaugher	Tim Eifler	Yuanyuan Zhang
Alexandre Refregier	Raphael Sgier	Boyan Yin	Mike Wang	Alfredo Zenteno	Giorgia Pollina	Georgios Zacharegka
Dylan Britt Pablo Lemos	Albert Stebbins	Robert Gruendl	Andrew Liddle	Mathew Smith	Ashley Ross	Shivam Pandey
Alexandra Amon	Dragan Huterer	Vivian Miranda	Daniel Gruen	Otavio Alves	Eleonora di Valentino	Helen Qu
Shantanu Desai	Justin Myles	Xiao Fang	Keith Bechtol	Eve Kovacs	Lucas Secco	Eric Baxter
	Youngsoo Park	Marco Gatti	Juan De Vicente	Martin Rodriguez Monroy		Jack Odonnell
	Marco Raveri	Heidi Wu	Anna Porredon	Megan Tabbutt	Andrew Pace	Sebastian Bocquet 5
				mogan habbatt		- 5

Alyssa Garcia

Felipe Andrade-Oliveira Ken Herner

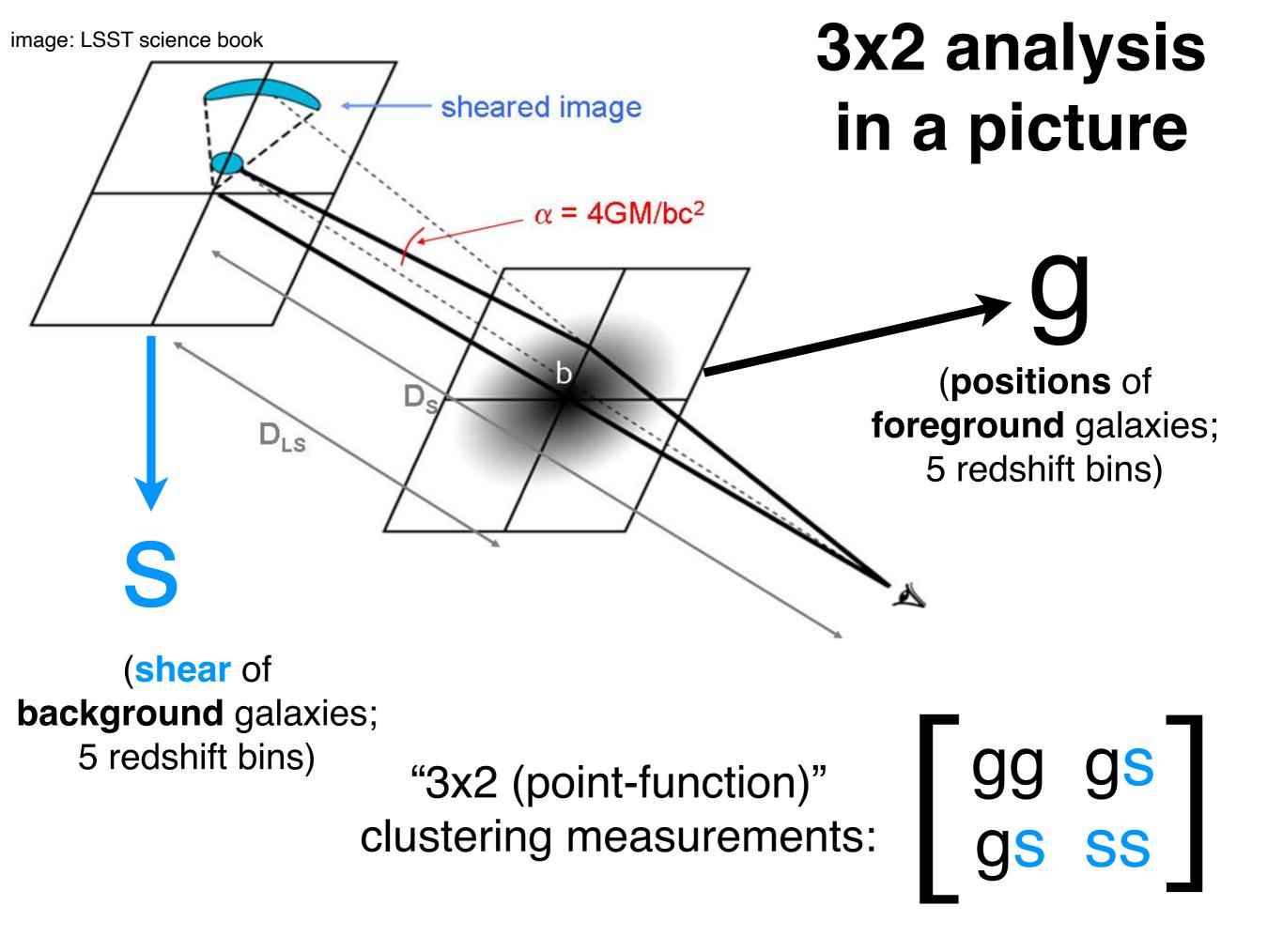
Alex Drlica-Wagner

Dark Energy Survey Year 3 results. List of key and supporting papers

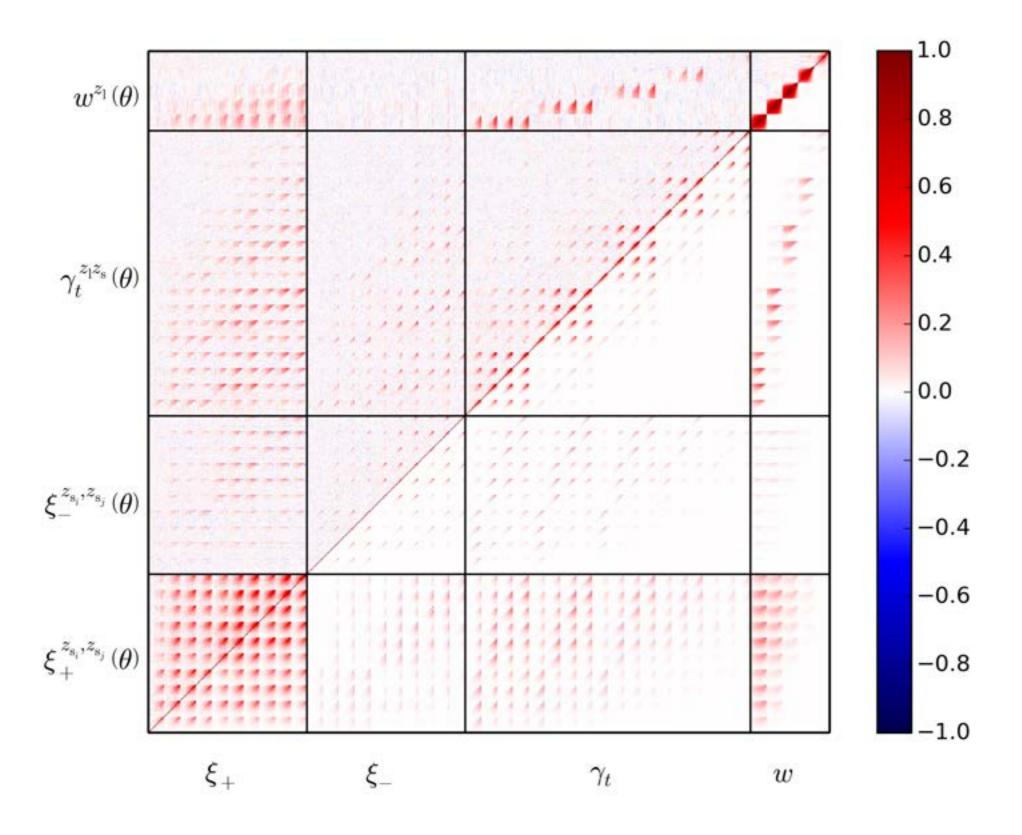
- 1. "Blinding Multi-probe Cosmological Experiments" J. Muir, G. M. Bernstein, D. Huterer et al., arXiv: 1911.05929, MNRAS 494 (2020) 4454
- "Photometric Data Set for Cosmology", I. Sevilla-Noarbe, K. Bechtol, M. Carrasco Kind et al., arXiv:2011.03407, ApJS 254 (2021) 24 2.
- "Weak Lensing Shape Catalogue", M. Gatti, E. Sheldon, A. Amon et al., arXiv:2011.03408, MNRAS 504 (2021) 4312 3.
- "Point Spread Function Modelling", M. Jarvis, G. M. Bernstein, A. Amon et al., arXiv:2011.03409, MNRAS 501 (2021) 1282 4.
- 5. "Measuring the Survey Transfer Function with Balrog", S. Everett, B. Yanny, N. Kuropatkin et al., arXiv:2012.12825
- "Deep Field Optical + Near-Infrared Images and Catalogue", W. Hartley, A. Choi, A. Amon et al., arXiv:2012.12824 6.
- "Blending Shear and Redshift Biases in Image Simulations", N. MacCrann, M. R. Becker, J. McCullough et al., arXiv:2012.08567 7.
- "Redshift Calibration of the Weak Lensing Source Galaxies", J. Myles, A. Alarcon, A. Amon et al., arXiv:2012.08566 8.
- "Redshift Calibration of the MagLim Lens Sample using Self-Organizing Maps and Clustering Redshifts", G. Giannini et al., in prep. 9.
- "Clustering Redshifts Calibration of the Weak Lensing Source Redshift Distributions with redMaGiC and BOSS/eBOSS", M. Gatti, G. Giannini, et al., 10. arXiv:2012.08569
- "Calibration of Lens Sample Redshift Distributions using Clustering Redshifts with BOSS/eBOSS", R. Cawthon et al. arXiv:2012.12826 11.
- "Phenotypic Redshifts with SOMs: a Novel Method to Characterize Redshift Distributions of Source Galaxies for Weak Lensing Analysis" R. Buchs, C.Davis, D. 12. Gruen et al. arXiv:1901.05005, MNRAS 489 (2019) 820
- "Marginalising over Redshift Distribution Uncertainty in Weak Lensing Experiments", J. Cordero, I. Harrison et al., in prep. 13.
- "Exploiting Small-Scale Information using Lensing Ratios", C. Sánchez, J. Prat et al., in prep. 14.
- "Cosmology from Combined Galaxy Clustering and Lensing Validation on Cosmological Simulations", J. de Rose et al., in prep. 15.
- "Unbiased fast sampling of cosmological posterior distributions", P. Lemos et al., in prep. 16.
- "Assessing Tension Metrics with DES and Planck Data", P. Lemos, M. Raveri, A. Campos et al., arXiv:2012.09554 17.
- "Dark Energy Survey Internal Consistency Tests of the Joint Cosmological Probe Analysis with Posterior Predictive Distributions", C. Doux, E. Baxter, P. Lemos 18. et al. arXiv:2011.03410, MNRAS 503 (2021) 2688
- "Covariance Modelling and its Impact on Parameter Estimation and Quality of Fit", O. Friedrich, F. Andrade-Oliveira, H. Camacho et al., arXiv:2012.08568 19.
- "Multi-Probe Modeling Strategy and Validation", E. Krause et al., in prep. 20.
- "Curved-Sky Weak Lensing Map Reconstruction", N. Jeffrey, M. Gatti, C. Chang et al., in prep. 21.
- "Galaxy Clustering and Systematics Treatment for Lens Galaxy Samples", M.Rodríguez-Monroy, N. Weaverdyck, J. Elvin-Poole, M. Crocce et al., in prep. 22.
- "Optimizing the Lens Sample in Combined Galaxy Clustering and Galaxy-Galaxy Lensing Analysis", A. Porredon, M. Crocce et al., arXiv:2011.03411 PhRvD 23. **103** (2021) 043503
- "High-Precision Measurement and Modeling of Galaxy-Galaxy Lensing", J. Prat, J. Blazek, C. Sánchez et al., in prep. 24.
- "Constraints on Cosmological Parameters and Galaxy Bias Models from Galaxy Clustering and Galaxy-Galaxy Lensing using the redMaGiC Sample", S. 25. Pandey et al., in prep.
- "Cosmological Constraints from Galaxy Clustering and Galaxy-Galaxy Lensing using the Maglim Lens Sample" A. Porredon, M. Crocce et al., in prep. 26.
- "Cosmology from Cosmic Shear and Robustness to Data Calibration", A. Amon, D. Gruen, M. A. Troxel et al., in prep. 27.
- "Cosmology from Cosmic Shear and Robustness to Modeling Assumptions", L. Secco, S. Samuroff et al., in prep. "Magnification modeling and impact on cosmological constraints from galaxy clustering and galaxy calaxy lenging". L Elvin Poolo, N. MacCrann et al., in prep. 28.
- 20

"Cosmological Constraints from Galaxy Clustering and Weak Lensing" The DES Collaboration ${
m arXiv:}2105.13549$ 30.

(plus **hundreds** of other DES papers up to this point...)



Covariance of 3x2 datavector



Krause, Eifler et al (2017)

tests in: Friedrich et al, arXiv:2012.08568

DES Y3 3x2 analysis highlights

A total of 32 parameters (in LCDM): (7 cosmological, 25 astrophysical/systematic)

and a fanatical devotion to controlling the systematic errors:

Everything is validated

- 1. Two lens samples (redMaGiC and MagLim)
- 2. Two data-vector (theory) codes (cosmosis and cosmolike)
- 3. Two models for Intrinsic Alignments (in shear)
- 4. Many checks on shear measurements, data covariance, samplers, stat methods, bias modeling.....

and

All cosmology results are **blinded**

Blinding the DES analysis

Our requirements:

- Preserve inter-consistency of cosmological probes
- Preserve ability to test for systematic errors



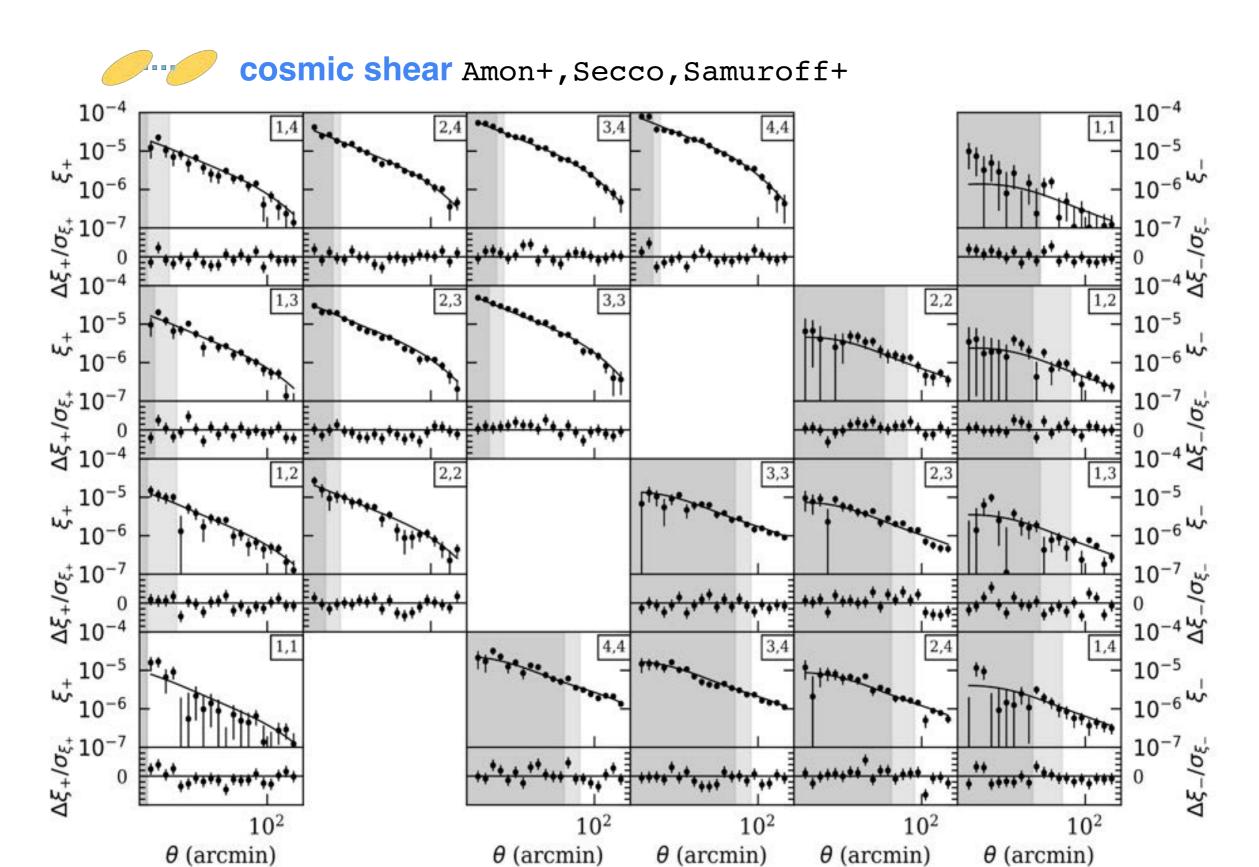
Jessie Muir (Stanford -> Perimeter))

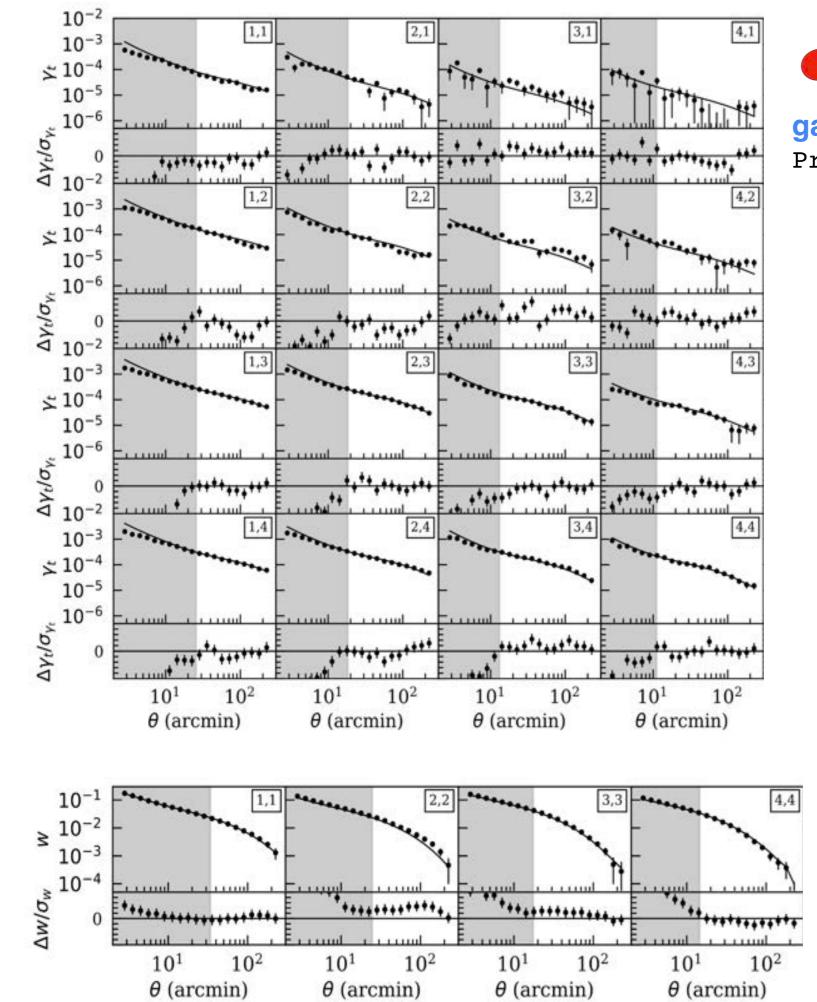
Our choice is specifically:

 $\xi_{ij}^{\text{blinded}} = \xi_{ij}^{\text{measured}} + [\xi_{ij}^{\text{th model 1}} - \xi_{ij}^{\text{th model 2}}]$

Muir, Bernstein, Huterer, et al., arXiv:1911.05929

DES Y1 Measurements: shear clustering, galaxy-galaxy lensing, gal clustering









galaxy clustering Rodriguez-Monroy+

Internal consistency

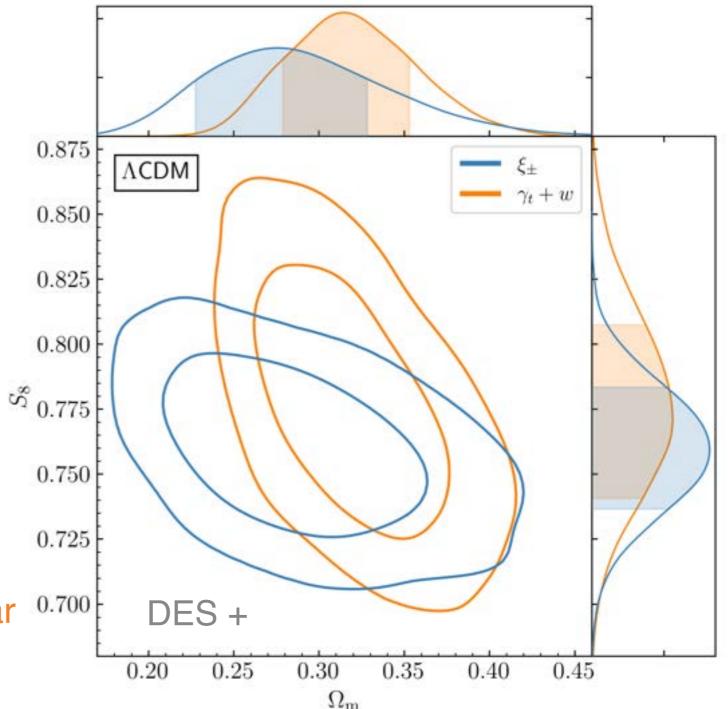
Two correlated cosmological probes:

- 1. Cosmic shear (blue)
- Galaxy clustering and tangential shear (orange)

We find consistency between them.

Cosmic shear most sensitive to clustering amplitude.

Galaxy clustering and tangential shear ¹⁰ more sensitive to total matter density.



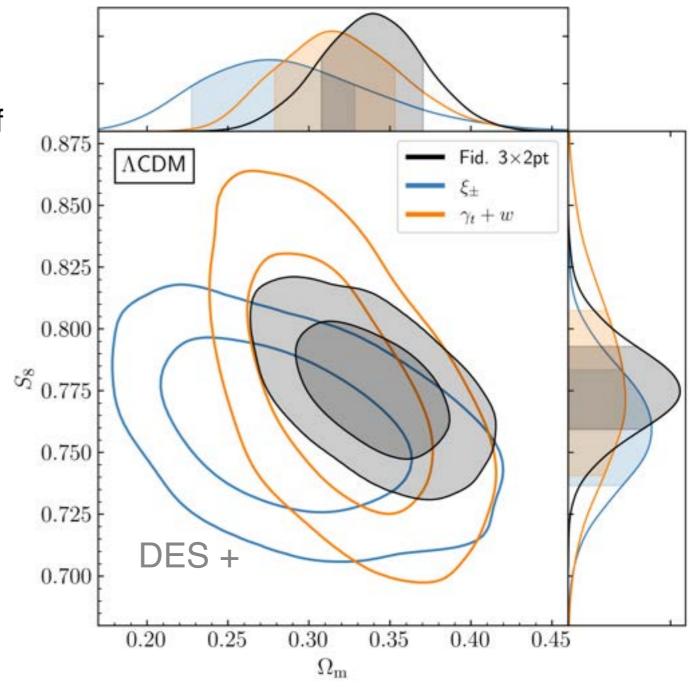
$$S_8 \equiv \sigma_8 \left(\frac{\Omega_m}{0.3}\right)^{0.5}$$

3x2pt results

We combine these into the **3x2pt** probe of large-scale structure.

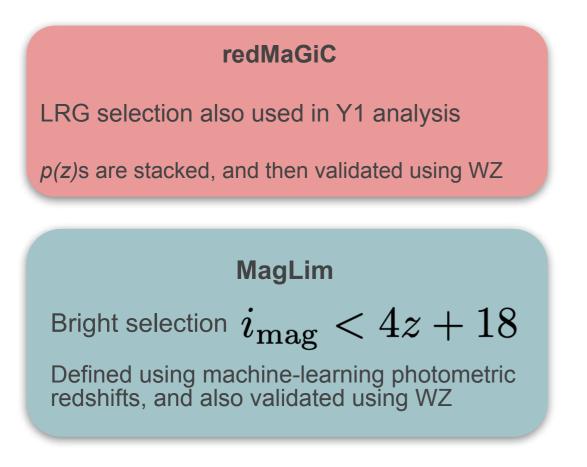
A factor of 2.1 improvement in signal-tonoise from DES Year 1.

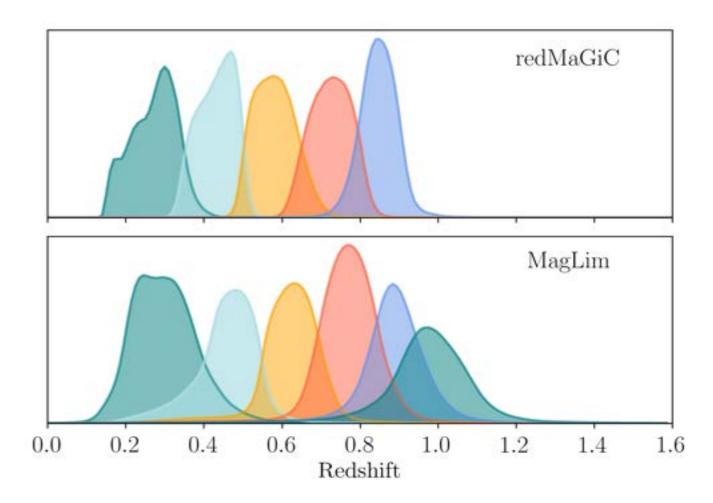
In ΛCDM:	$S_8 = 0.776^{+0.017}_{-0.017} \ (0.776)$
	$\Omega_{\rm m} = 0.339^{+0.032}_{-0.031} \ (0.372)$
	$\sigma_8 = 0.733^{+0.039}_{-0.049} \ (0.696)$
In <i>w</i> CDM:	$\Omega_{\rm m} = 0.352^{+0.035}_{-0.041} \ (0.339)$
	$w = -0.98^{+0.32}_{-0.20} \ (-1.03)$



$$S_8 \equiv \sigma_8 \left(\frac{\Omega_m}{0.3}\right)^{0.5}$$

Galaxy clustering and Lens samples Galaxy clustering measured in two foreground samples



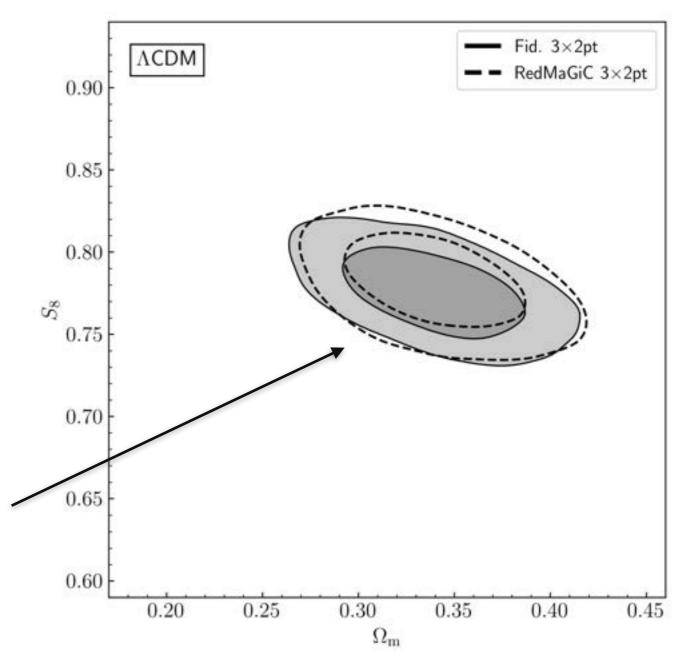


Lens WZ: Cawthon et al. (2021) MagLim: Porredon, et al. (2020) Clustering: Rodriguez-Monroy et al. (2021) Lens SOMPZ (alt. method): Giannini et al. (in prep) DNF: de Vicente et al (2015)

We find consistent cosmological results between the fiducial MagLim lens sample and the redMaGiC lens samples

Almost perfect agreement for 3x2pt in ΛCDM .

```
3x2 results are extremely robust
```

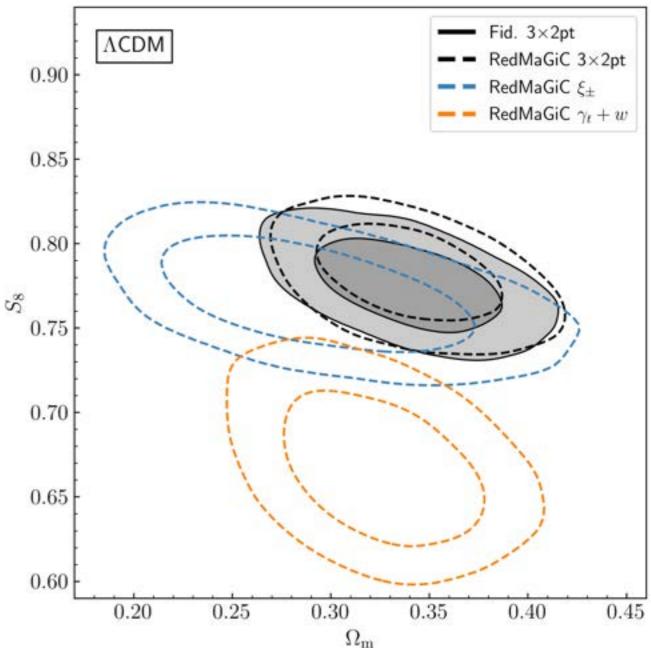


Cosmic shear and galaxy clustering+tangential shear (2x2pt) for redMaGiC are also formally consistent and combine to give the **3x2pt** result.

2x2pt prefers lower S8 and higher galaxy bias. Combination with cosmic shear brings S8 up and bias down to agree with DES Y1.

Evidence for potential systematics in the redMaGiC clustering data vector at all redshifts and above the fiducial lens redshift range for MagLim.

Two highest-redshift bins removed in MagLim.



In RedMaGiC, γ_t +w (i.e. "2x2") appears inconsistent with 3x2

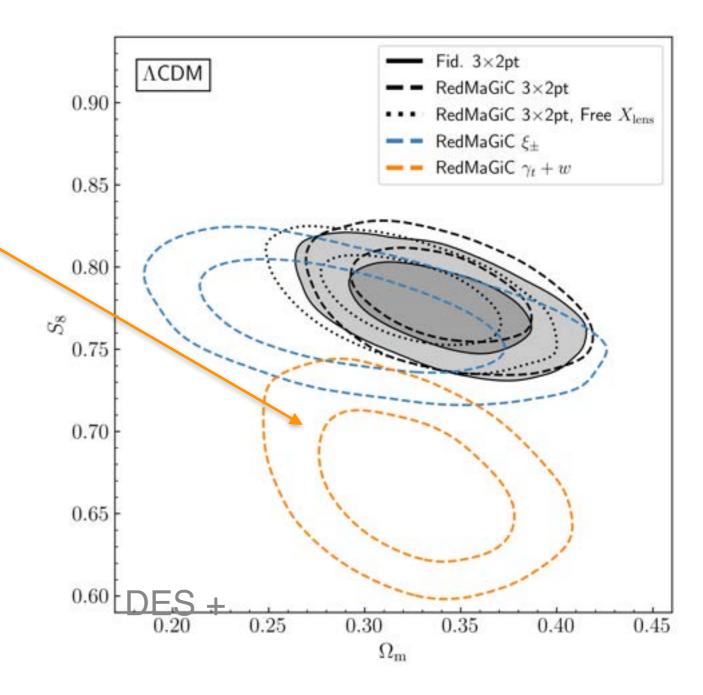
We introduce a parameter X_{lens} to model this, it decorrelates the clustering and lensing amplitude:

$$w^{ii}(\theta) = b_i^2 \xi_{mm}^{ii}(\theta)$$

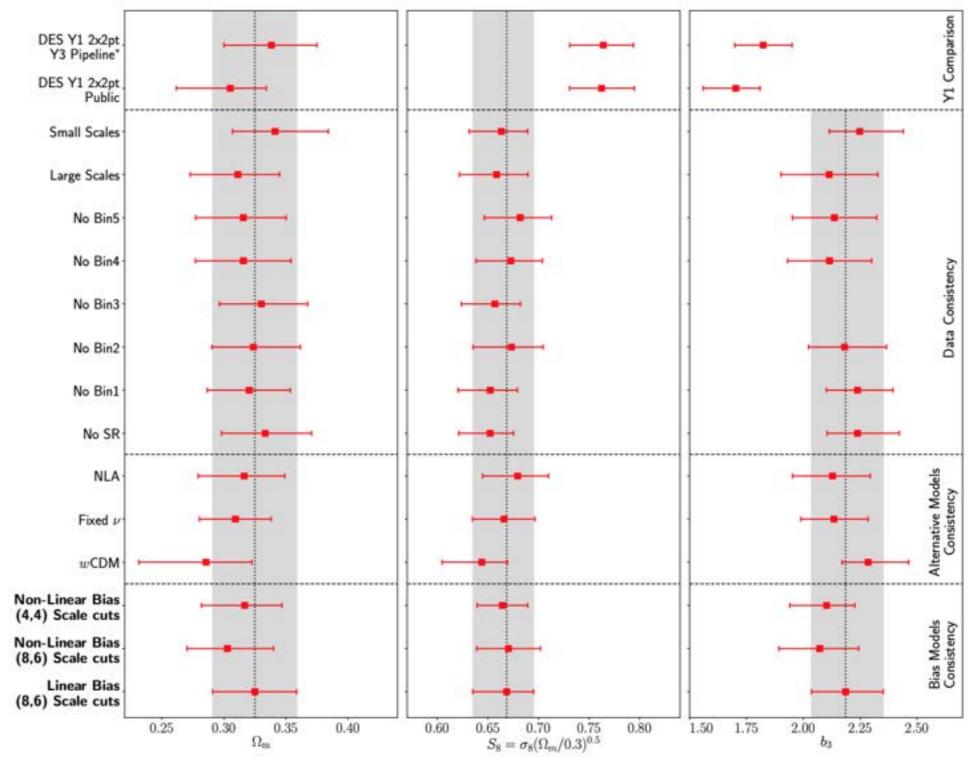
$$\gamma_t^{ij}(\theta) = X_{lens} b_i \xi_{mm}^{ij}(\theta)$$

(expect X_{lens}=1)

$$X_{lens} = 0.877^{+0.026}_{-0.019}$$



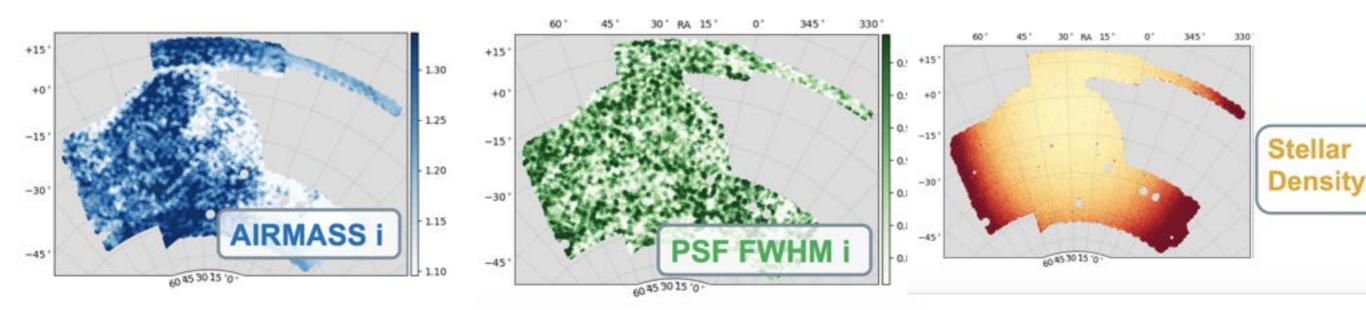
After extensive testing, we believe this to be largely a result of unaccounted for systematics in the *redMaGiC* sample



Pandey et al, arXiv:2105.13545

Important systematic: Foregrounds (survey properties etc)

- Map contamination: a key systematic in LSS
- due to variety of observ/astro/instrumental reasons
- •visible "by eye" at large scales
- important for all galaxy-clustering, shear etc
- esp important for large-spatial-scale science (f_{NL})
- multiplicative, so small scales affected too

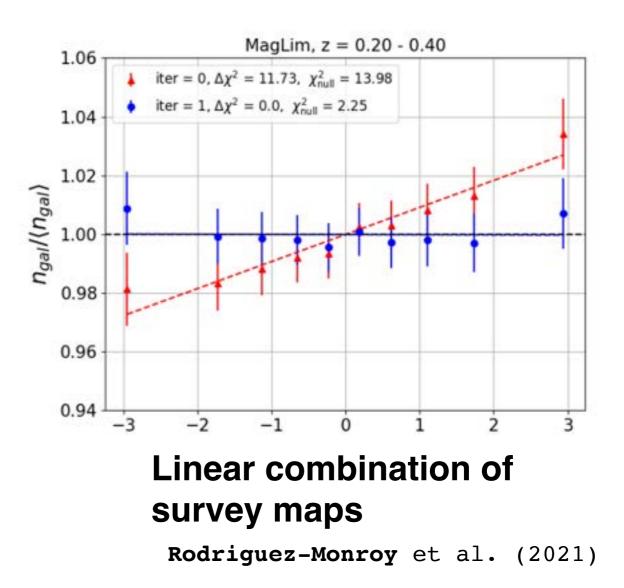


LSS systematics

Correlation with survey properties and astrophysical maps are removed by re-weighting galaxy sample by fitted relation

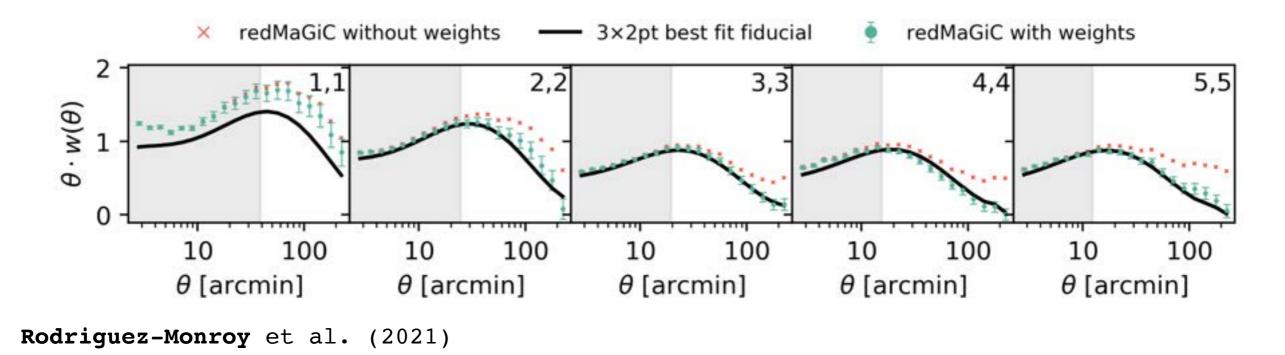
Accounts for correlation with: airmass, seeing, exposure time, depth, stellar density, dust, sky brightness, calibration residuals

Example (right): correlation with a PCA of the above survey property maps



LSS systematics

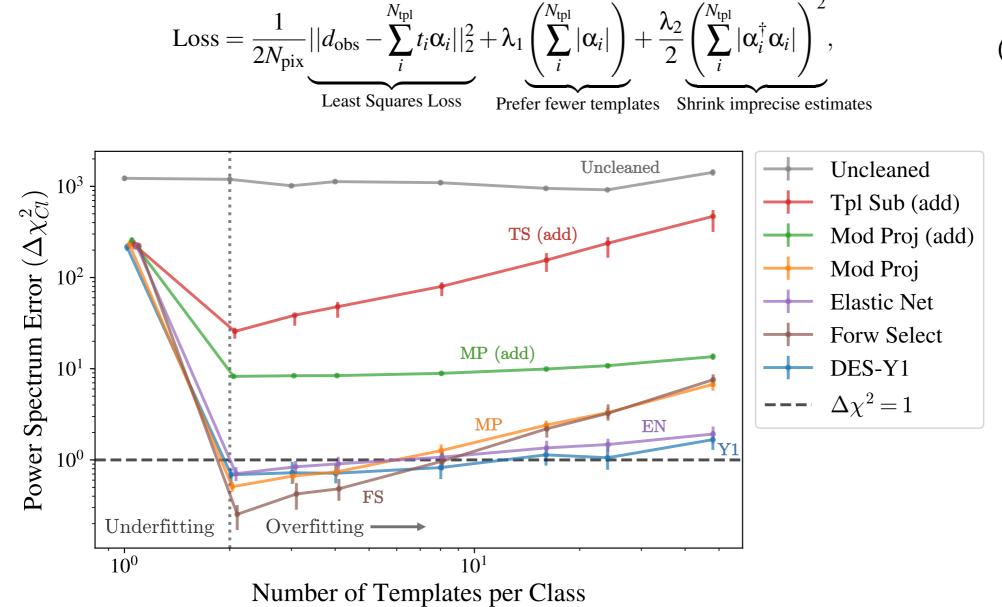
Correlation with survey properties and astrophysical maps are removed by re-weighting galaxy sample by fitted relation



Detailed analysis of LSS map cleaning methods



Noah Weaverdyck (U. Michigan -> Berkeley)



Weaverdyck & Huterer, 2021

DES Y3 (Xlens) results unchanged even after adopting these methods

DES Y3 analysis takeaways

- **Photometric LSS is... hard**. Lots of information, but (for a careful analysis), big pipeline needed, lots of validation
- Biggest systematics (my opinion): map-level systematics and photometric redshifts.
- Nonlinear scales: difficult to model, simulations exist but show a range of results. May be hard to exploit reliably even with fancy statistical algorithms.

On the <u>other</u> hand:

- A lot of **information** available in the density field: 3D galaxy positions plus their shapes (plus galaxy properties...) for hundreds of millions of objects
- Information about both geometry (distances, volumes) and growth of structure (e.g. scaling of power spectrum in redshift) comes out automatically

What if gravity deviates from GR?

For example:

$$H^{2} - F(H) = \frac{8\pi G}{3}\rho, \quad \text{or} \quad H^{2} = \frac{8\pi G}{3}\left(\rho + \frac{3F(H)}{8\pi G}\right)$$

Modified gravity Dark energy

Notice: there is no way to distinguish these two possibilities just by measuring expansion rate H(z)!

Growth of structure comes to the rescue: in standard GR, H(z) determines distances **and** growth of structure

$$\ddot{\delta} + 2H\dot{\delta} - 4\pi\rho_M\delta = 0$$

 \Rightarrow measure geometry [D(z), Vol(z)] and growth [Pk(z)]

Specifically: compare geometry and growth in order to stress-test the LCDM model and see if it "breaks"

Our approach: Double the standard DE parameter space $(\Omega_M=1-\Omega_{DE} \text{ and } w)$:

 $\Rightarrow \Omega_{M^{geom}, W^{geom}} \Omega_{M^{grow}, W^{grow}}$

[In addition to other, usual parameters]

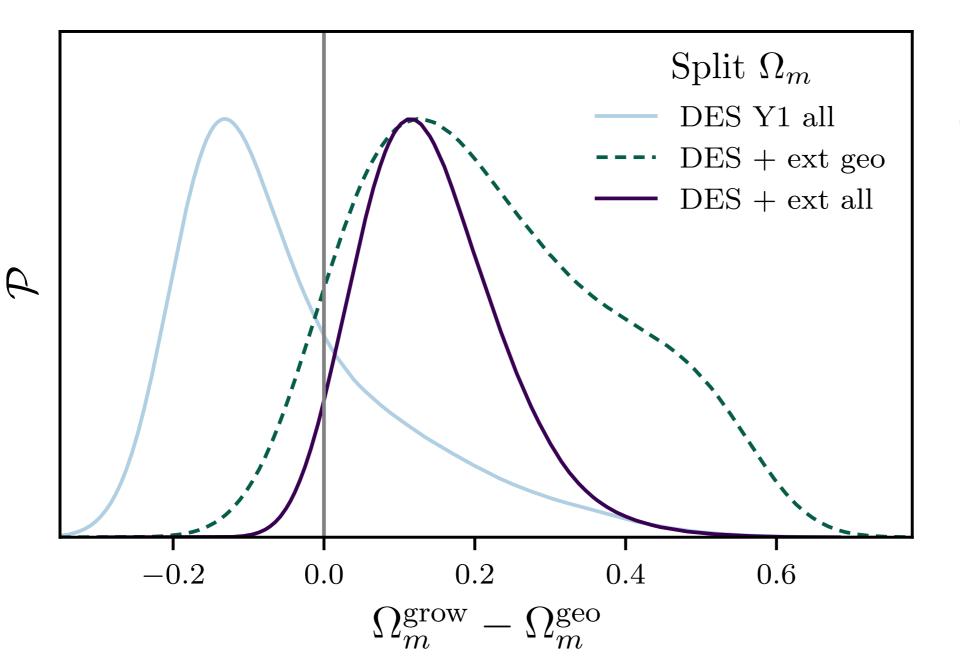
Zhang et al (2005); Wang et al (2007); Ruiz & Huterer (2015); Bernal et al (2016)

Sensitivity to geometry and growth

Cosmological Probe	Geometry	Growth	
SN Ia	$H_0 D_L(z)$		
BAO	$\left(\frac{D_A^2(z)}{H(z)}\right)^{1/3}/r_s(z_d)$		
CMB peak loc.	$R \propto \sqrt{\Omega_m H_0^2} D_A(z_*)$		
Cluster counts	$rac{dV}{dz}$	$rac{dn}{dM}$	
Weak lens 2pt	$\frac{r^2(z)}{H(z)}W_i(z)W_j(z)$	$P\left(k = \frac{\ell}{r(z)}\right)$	
RSD	$F(z) \propto D_A(z) H(z)$	$f(z)\sigma_8(z)$	

Ruiz & Huterer, 2015

Geometry-growth tests with DES Y1

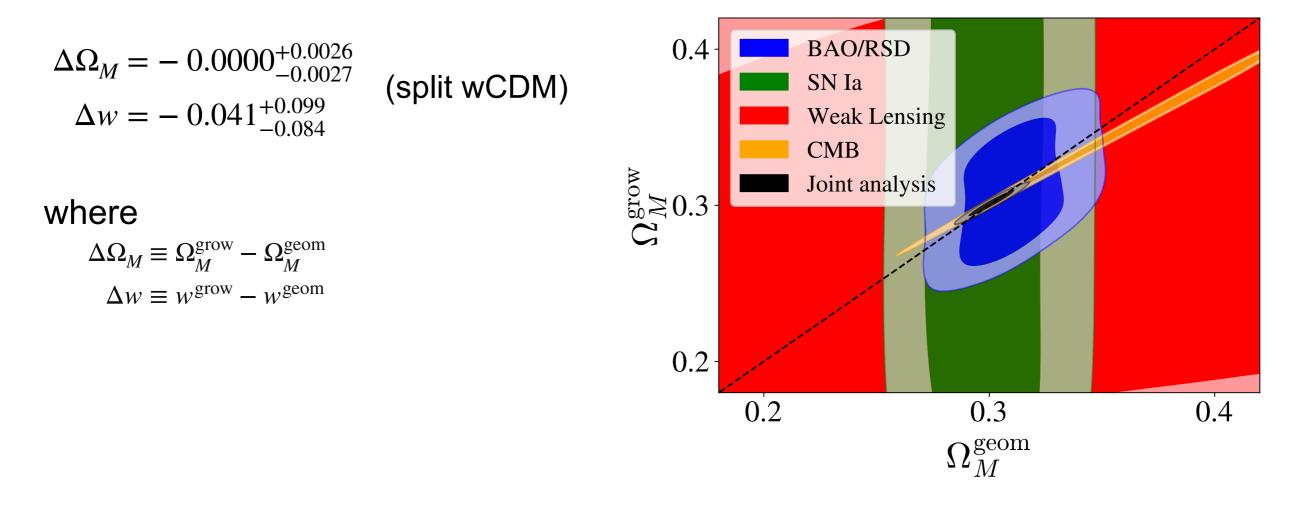




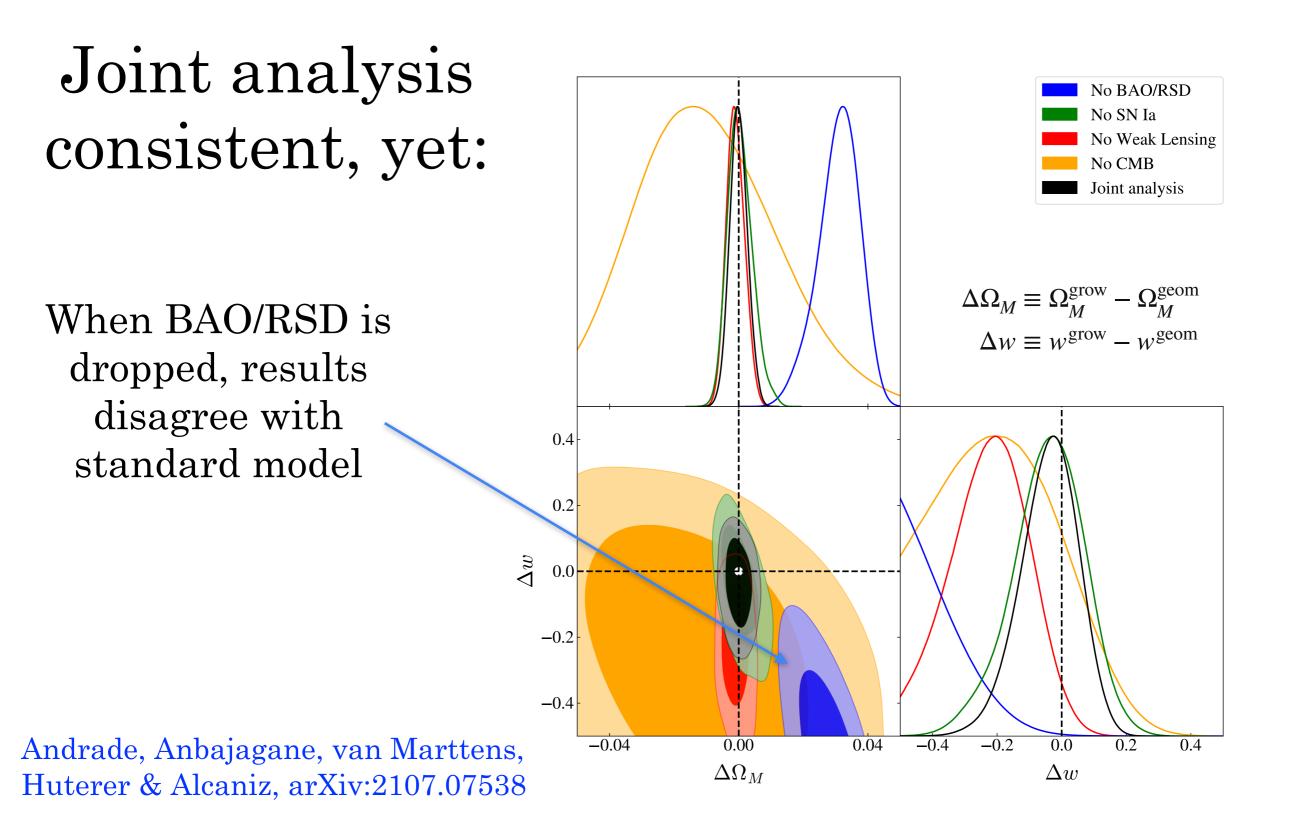
Jessie Muir (Stanford -> Perimeter)

Muir et al (DES collab.), arXiv:2010.05935

Geometry - growth split



Andrade, Anbajagane, van Marttens, Huterer & Alcaniz, arXiv:2107.07538



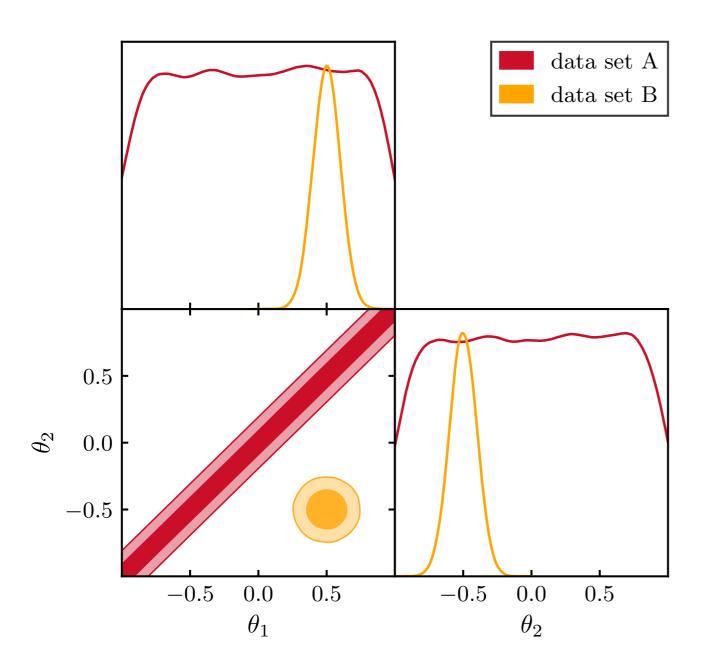
Conclusions

- Dark Energy is a premier mystery in physics/cosmology; physical reason for accelerating universe still an open question
- Impressive variety of new data; forthcoming: DES Y6, HSC, Hetdex; DESI, LSST, Euclid, WFIRST. And new analyses! (geometry-growth split)
- Like particle physicists, we would really like to see some "bumps" in the data (e.g. Hubble tension!).
- DES Y3 results have established a new frontier in terms of quality of data, detail of analysis
- DES Y3 results largely consistent with LCDM model; confirm S8 tension; opened new mysteries as to (probably systematic?) feature in RedMaGiC lens galaxies

Extra slides

How do you measure (N-dim) tensions?

In 1D it's easy, but in \geq 2D, ambiguous how to estimate

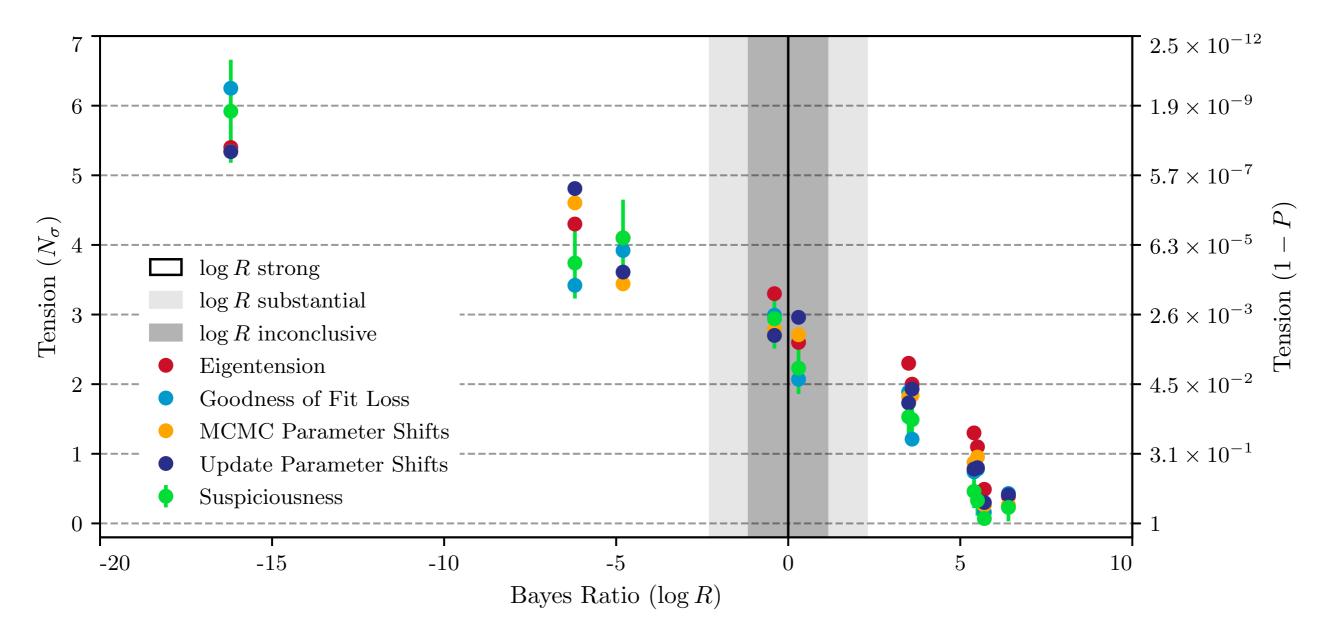


Lemos, Raveri et al (DES collab.), in prep (arXiv in ~2 weeks)



How do you measure (N-dim) tensions?

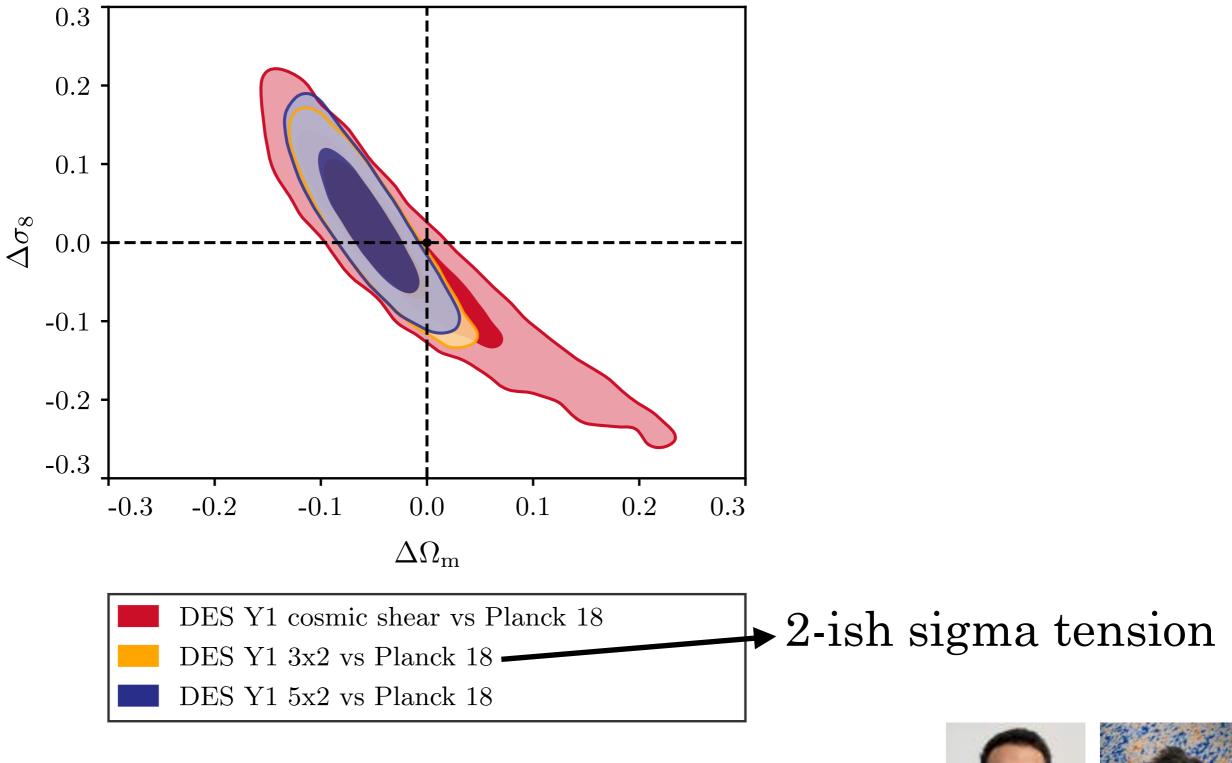
Principal result: tension metrics (roughly) agree



Lemos, Raveri et al (DES collab.), in prep (arXiv in ~2 weeks)



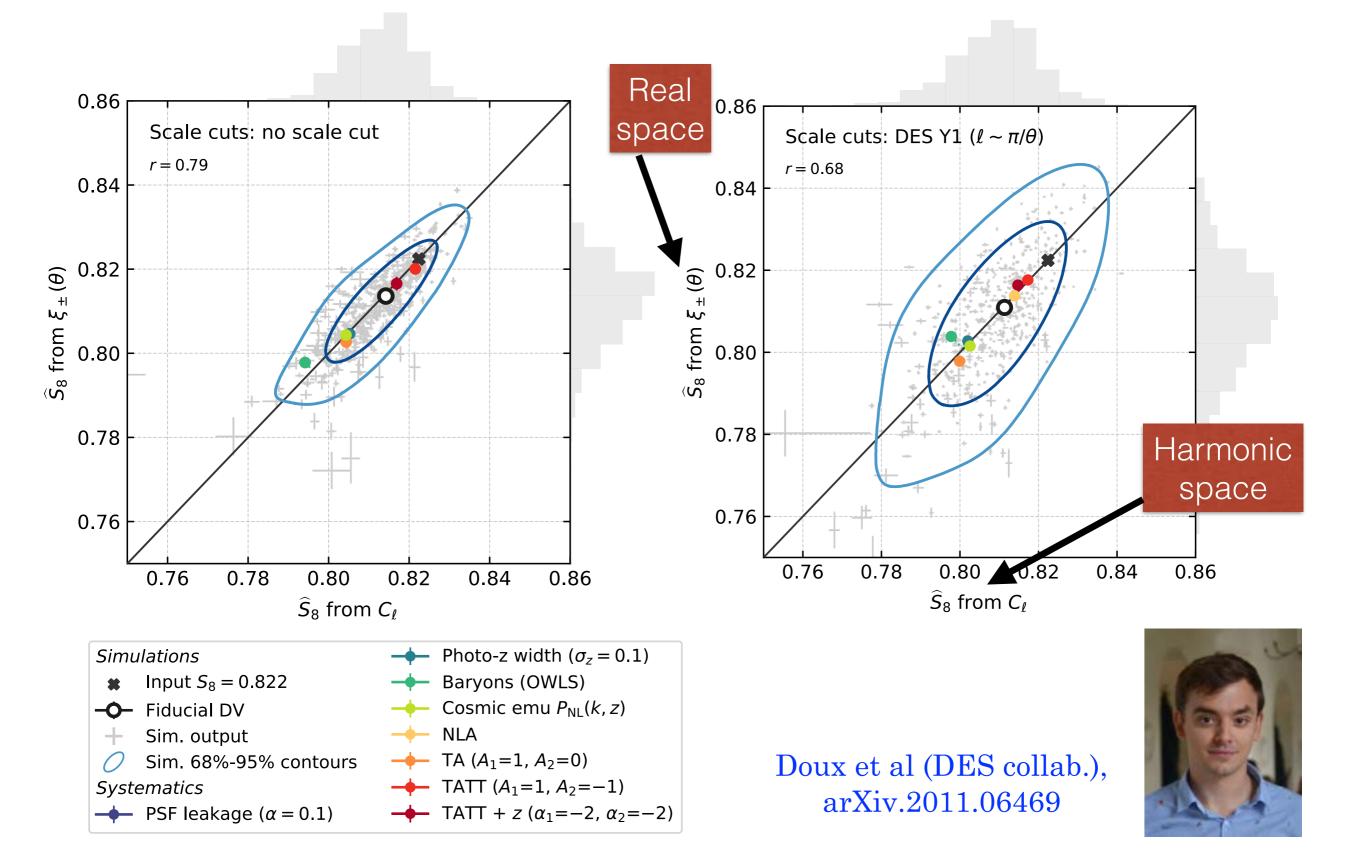
How do you measure (N-dim) tensions?

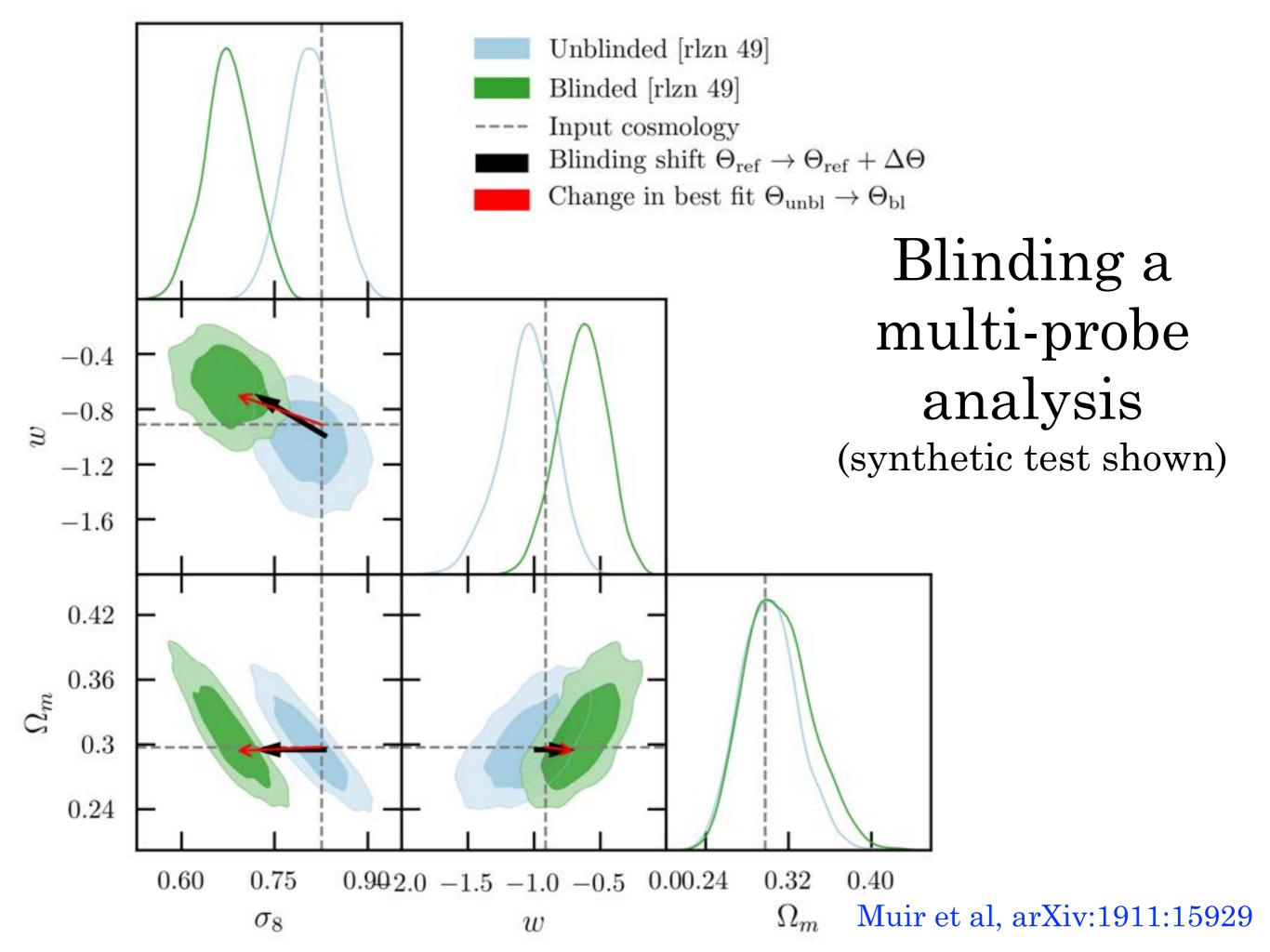


Lemos, Raveri et al (DES collab.), in prep (arXiv in ~2 weeks)



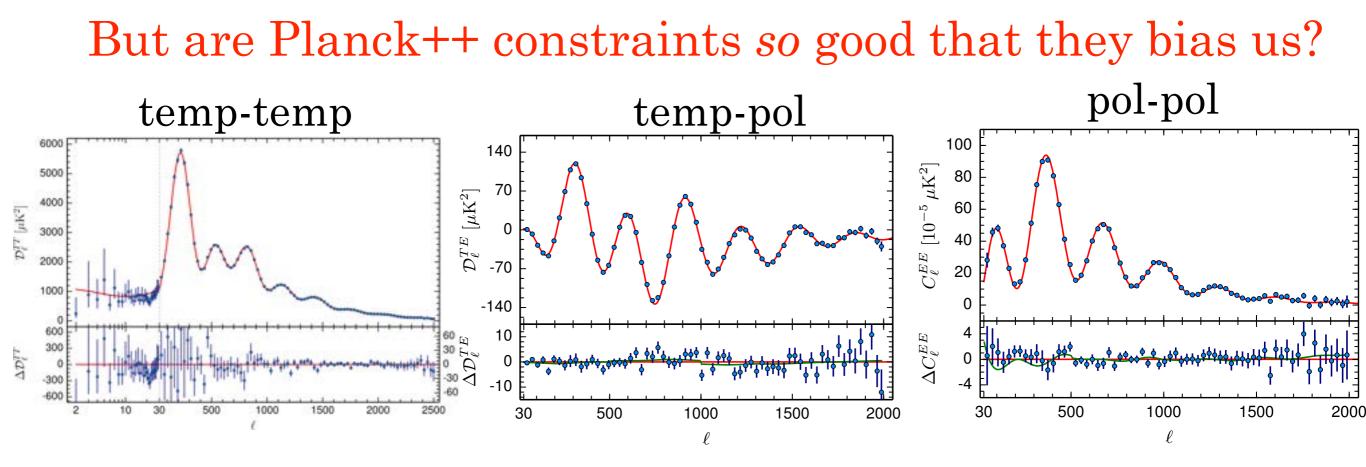
Harmonic vs real space analysis - same information??





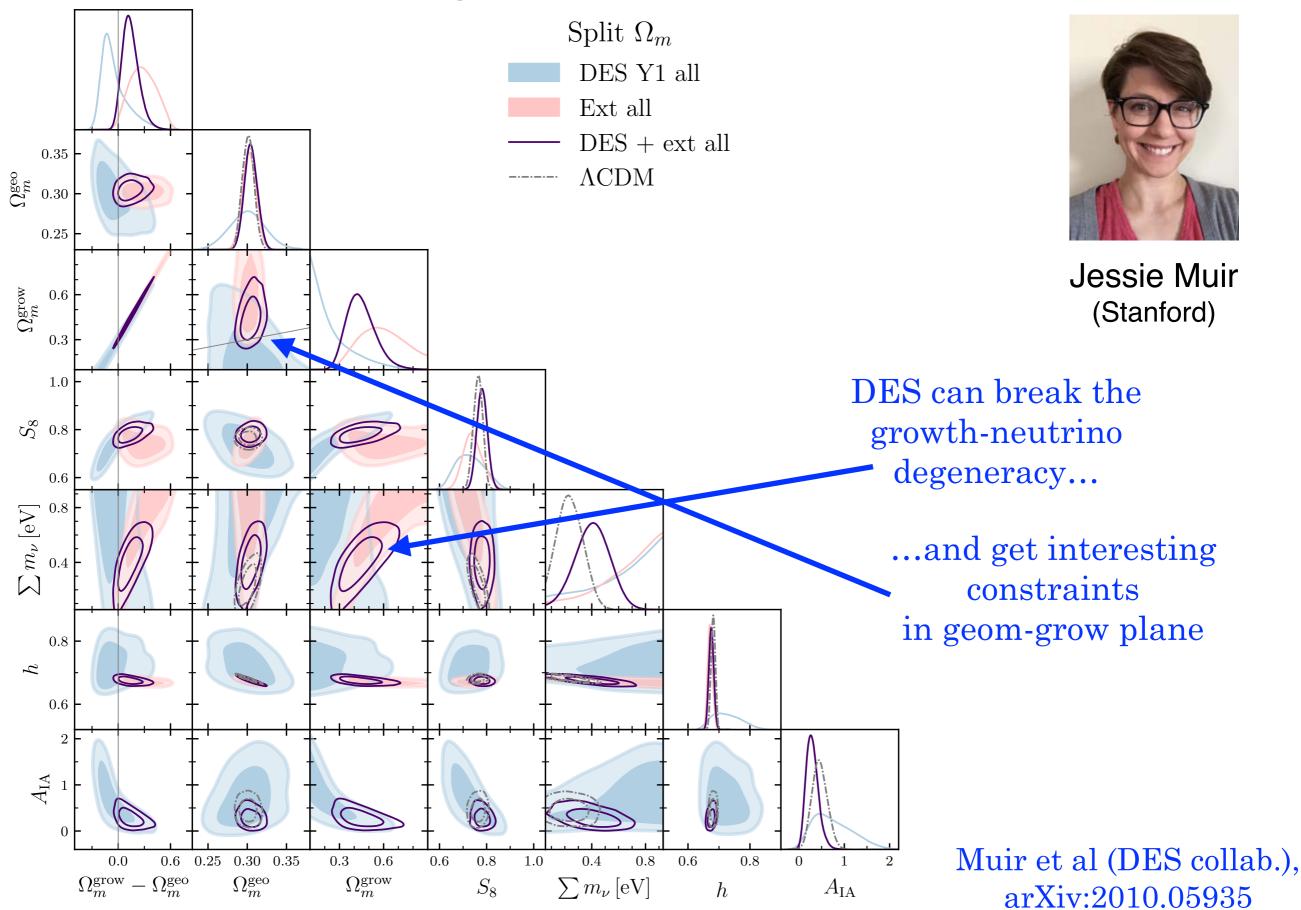
Story so far:

- Cosmology definitely in the precision regime
- Impressive constraints on DM, DE and inflation...
- ...but some big questions unanswered
- Lots of potential from upcoming surveys

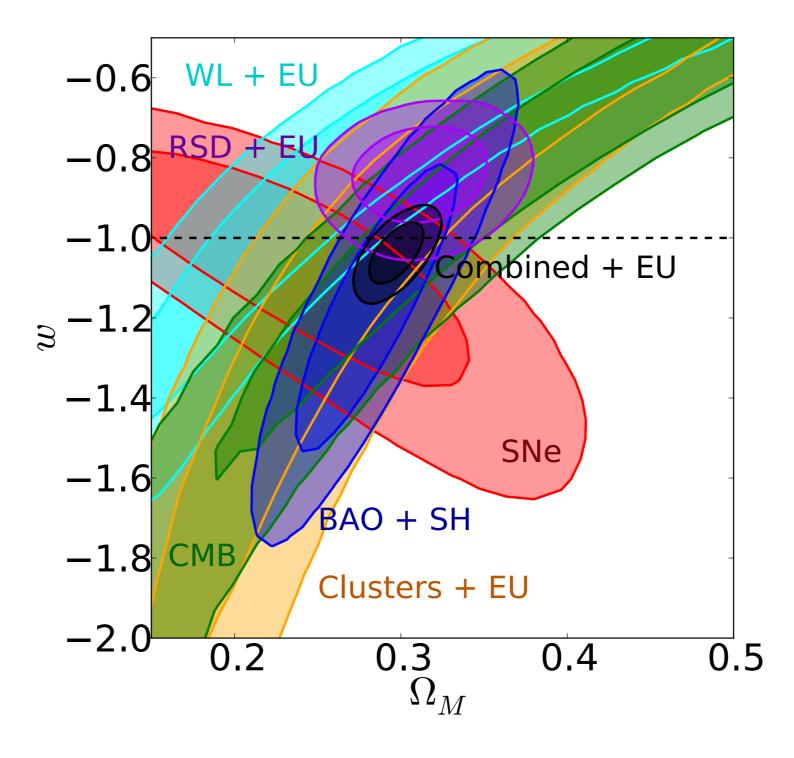


Danger of declaring currently favored model to be the truth \implies blinding new data is key

Geometry-growth tests with DES Y1

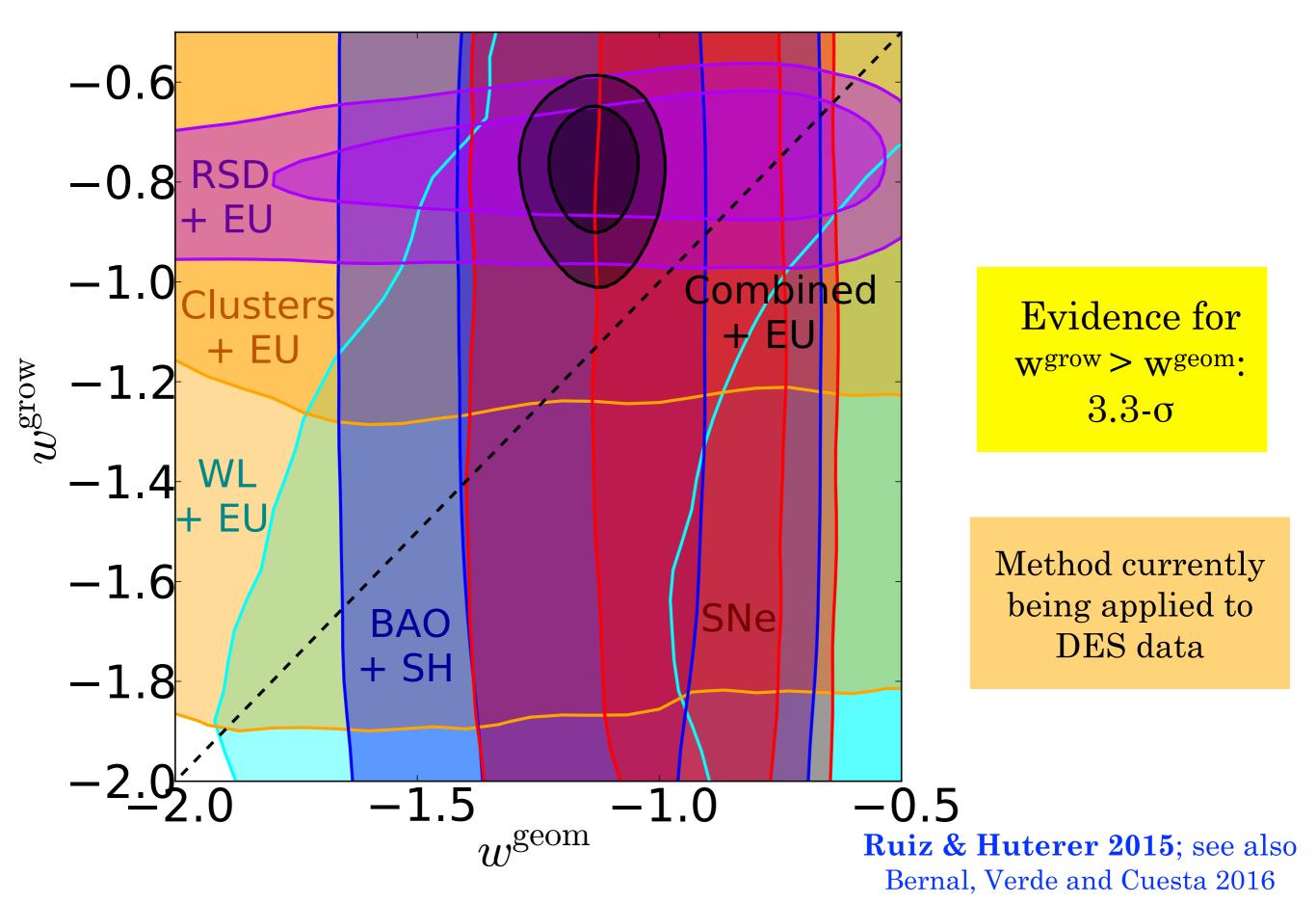


Standard parameter space

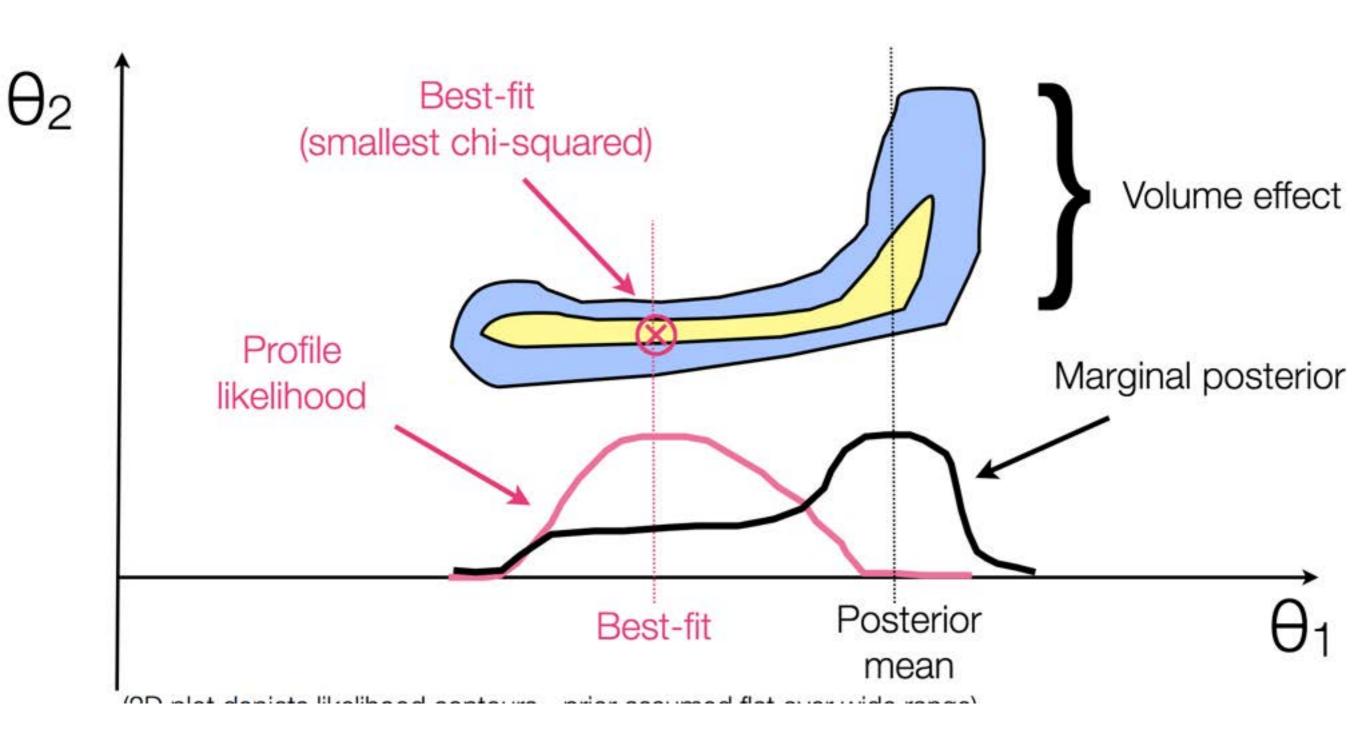


EU = Early Universe prior from Planck ($\Omega_M h^2$, $\Omega_B h^2$, n_s , A) SH = Sound Horizon prior from Planck ($\Omega_M h^2$, $\Omega_B h^2$)

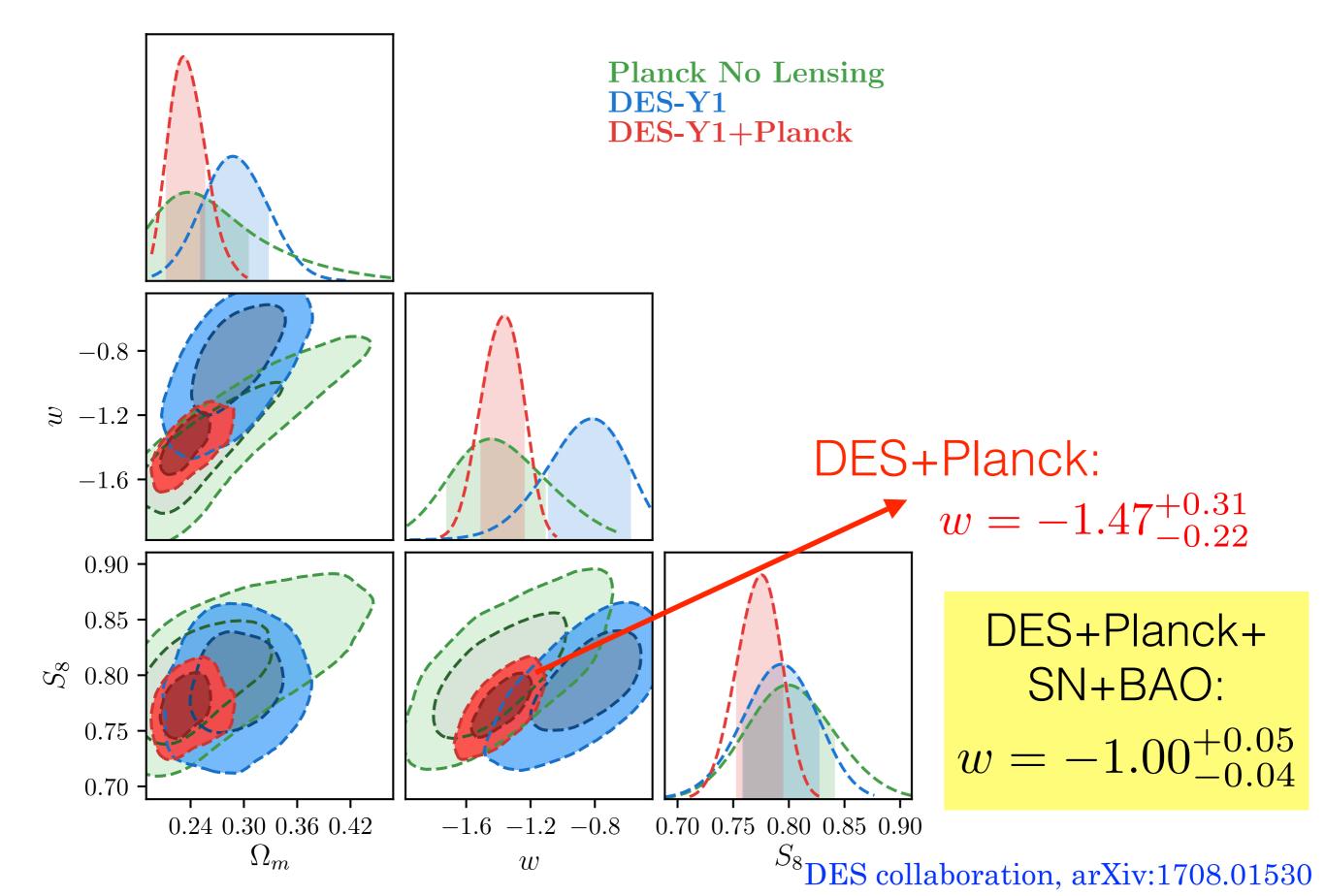
w (eq of state of DE): geometry vs. growth



Prior-volume effect illustrated

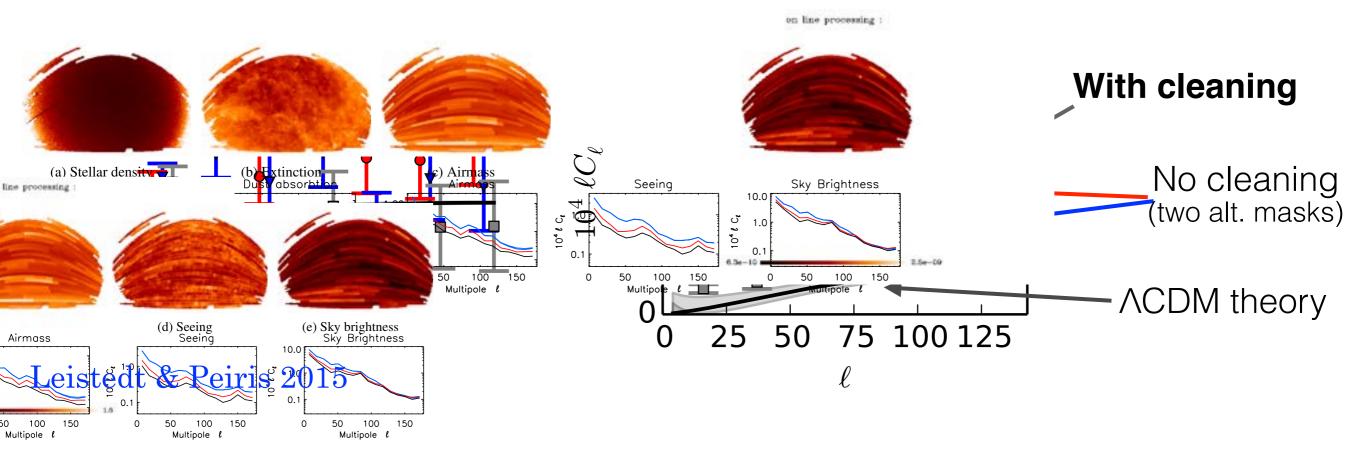


DES Y1 3x2 results: constraints on w

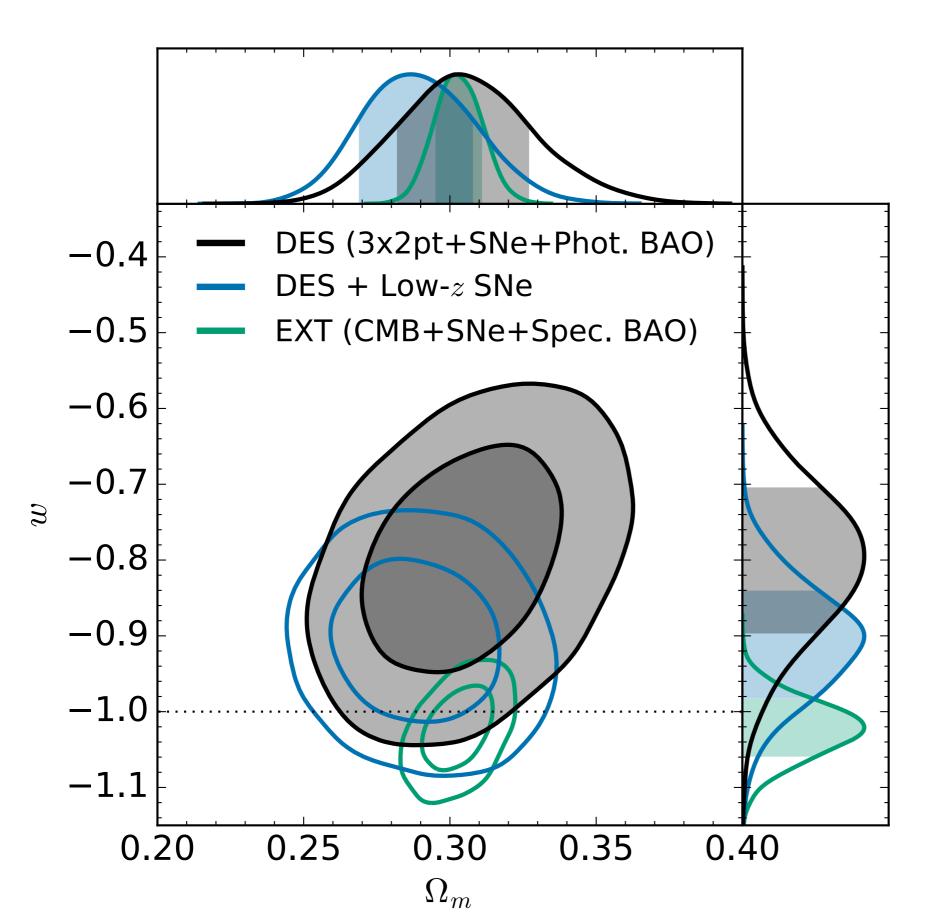


Systematics cleaning (of LSS maps)

- Map contamination: a key systematic in LSS
- due to variety of observ/astro/instrumental reasons
- •visible "by eye" at large scales
- important for all galaxy-clustering, shear etc
- esp important for large-spatial-scale science (f_{NL})
- multiplicative, so small scales affected too



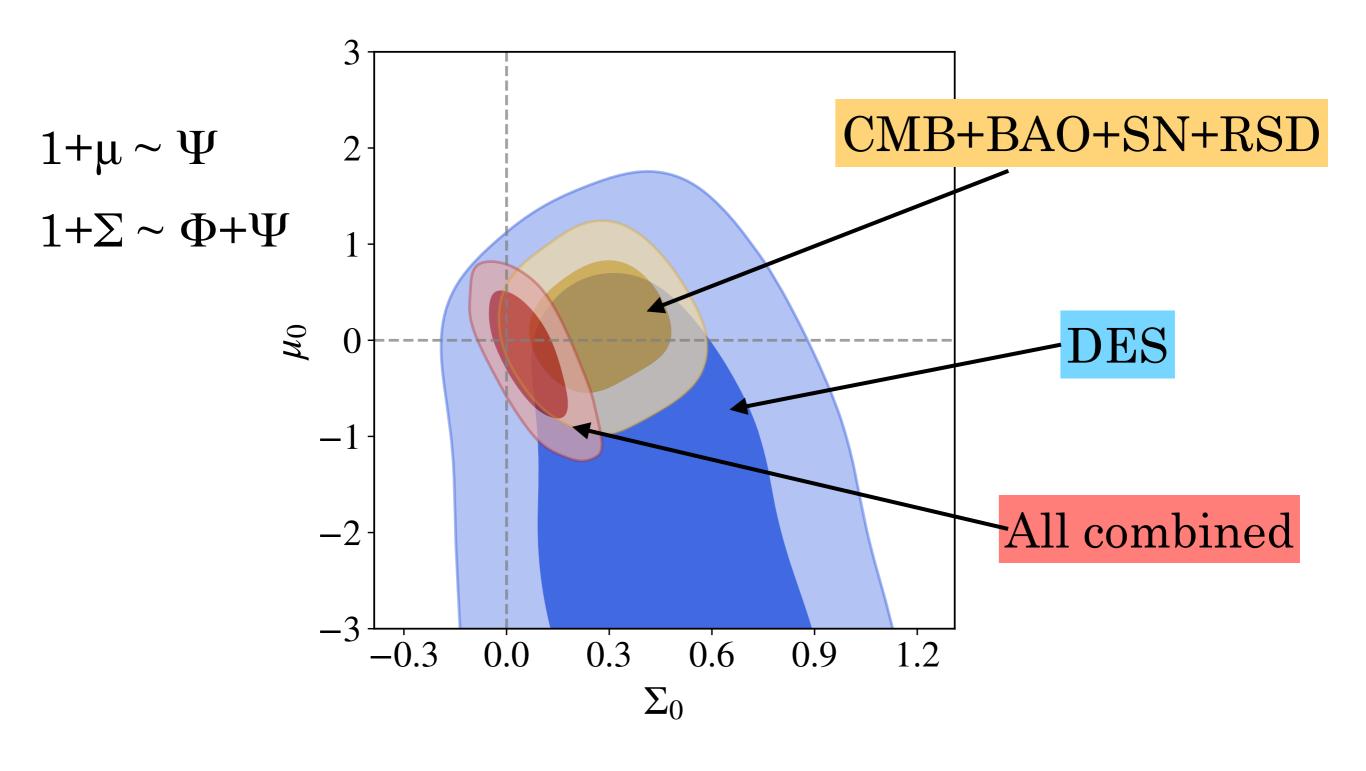
DES-only Y1 constraints on DE



"This is the first time a low-redshift survey has been capable of independently constraining these properties of dark energy to this level of precision"

> DES collaboration, arXiv:1811,02375 PRL 2019

DES Year1 results: extensions to ACDM, incl. modified gravity



DES collaboration, arXiv:1810.02499; PRD Editor's suggestion

Current notable tensions in cosmology

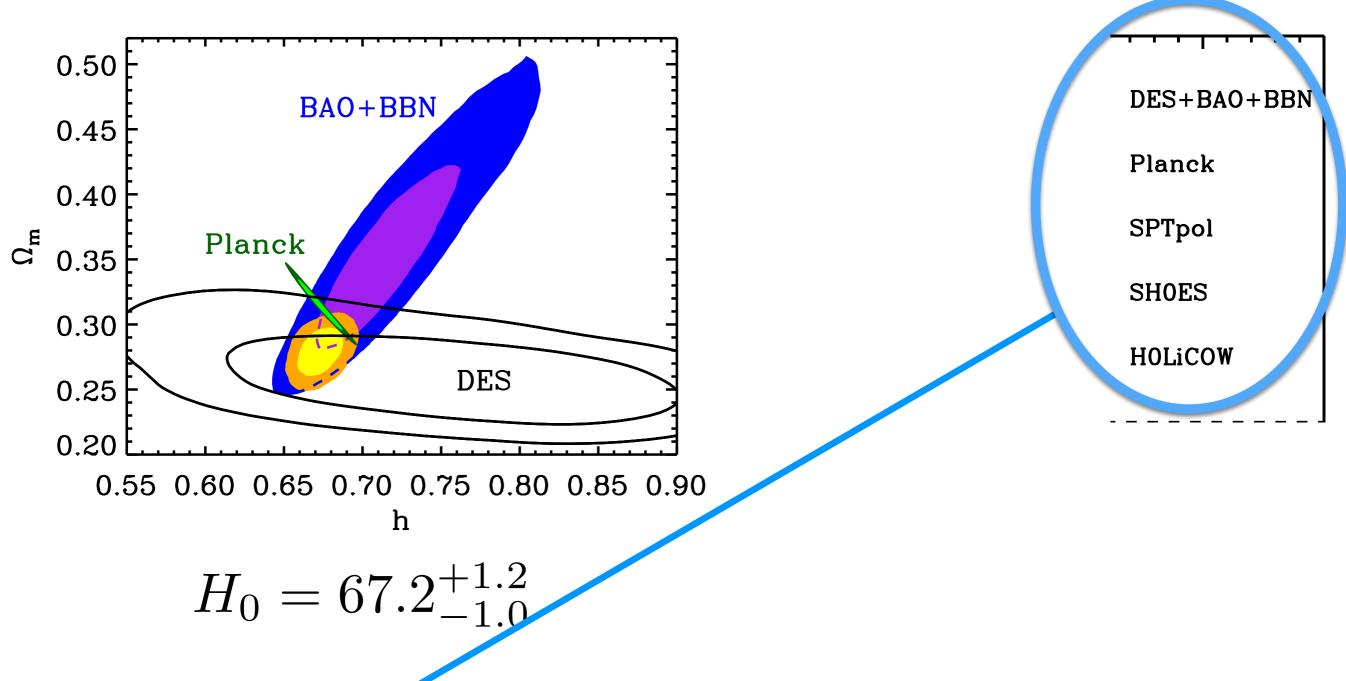
- 1. The amplitude of mass fluctuations (σ_8) is higher in the CMB ($\sigma_8=0.83$) than in cluster abundance / weak lens ($\sigma_8=0.80$)
- 2. Hubble constant measured by the Planck collaboration $(H_0=67.4\pm0.5)$ disagrees with that from the distance ladder measurements $(H_0=74.02\pm1.42)$; the two are 4-5 **sigma** apart

My totally personal view of these:

- 1. is an accidental "scattering around central value" and will go away basically
- is much more serious, because of excellent, rigorous analyses by CMB and distance ladder teams, and may be pointing toward new physics (or non-trivial systematics). Moreover, cosmic variance (fact we live in a "high local H₀" part of universe) contributes negligibly to the (H₀^{local} -H₀^{CMB}) difference (Wu & Huterer 2017)

DES H₀ constraints

DES collaboration, arXiv:1711.00403



Interesting fact:

these 5 measurements of H0 are basically independent

All 5 combined give: $H_0 = 69.1^{+0.4}_{-0.6}$