DARK ENERGY SURVEY

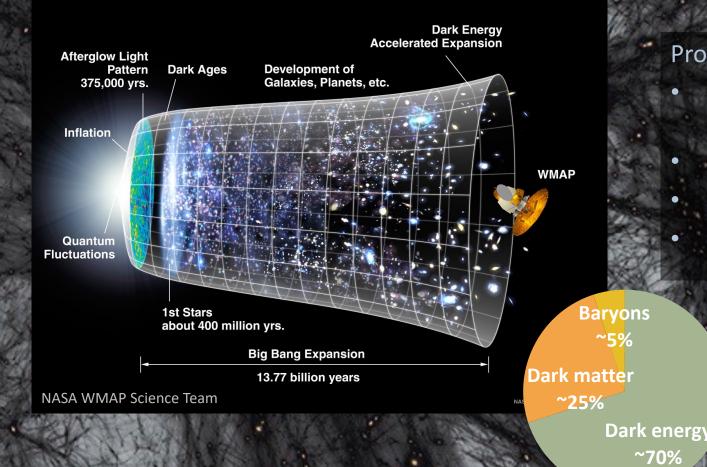


## Probing cosmological structure growth with the Dark Energy Survey

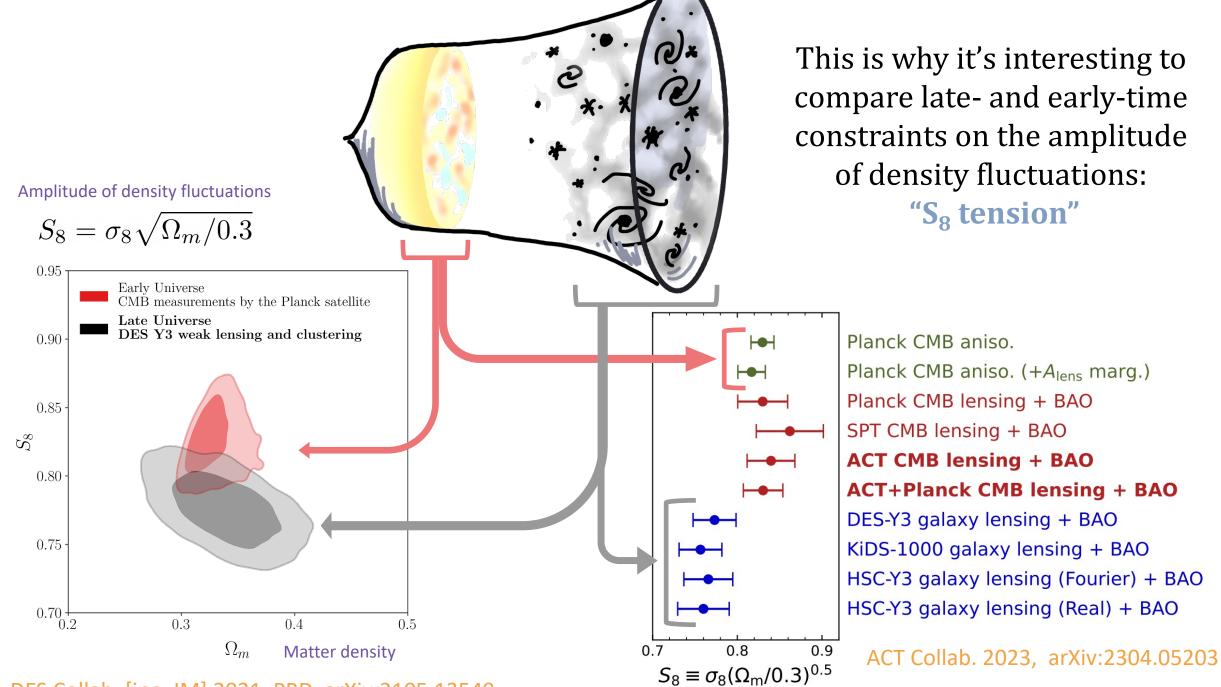
Jessie Muir - Postdoctoral Fellow @ Perimeter Institute for Theoretical Physics BCCP/Cosmology Seminar --- September 19, 2023

## We can use the large-scale structure of the Universe to learn about fundamental physics.

~70%



- Properties of structure depend on
  - Properties of matter (dark matter, baryons, neutrinos)
  - Expansion history (dark energy)
  - Gravity (general relativity)
  - Initial fluctuation properties (inflation)



DES Collab. [inc. JM] 2021, PRD, arXiv:2105.13549

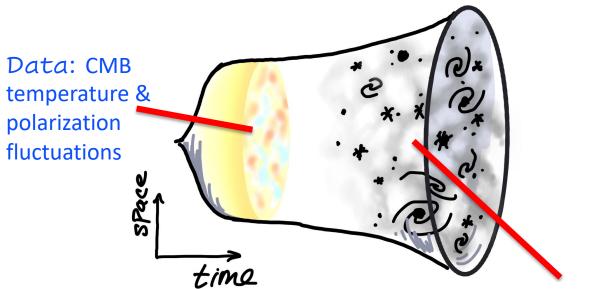
## Testing models beyond $\Lambda\text{CDM}$

- Explore what kinds of physics could explain tensions
- Seek hints of new physics that don't yet show up as tensions



#### MODEL: ACDM

- Λ: cosmological constant dark energy
- CDM: cold dark matter
- General relativity
- Flat geometry
- Gaussian initial fluctuations



Data: The distribution of matter in the late Universe probed by galaxy surveys

Baryons

~5%

Dark

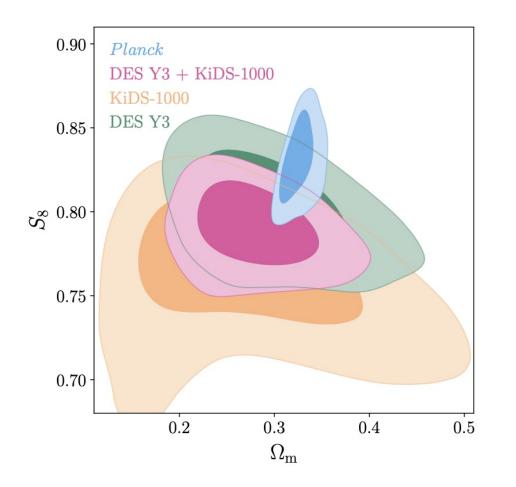
energy

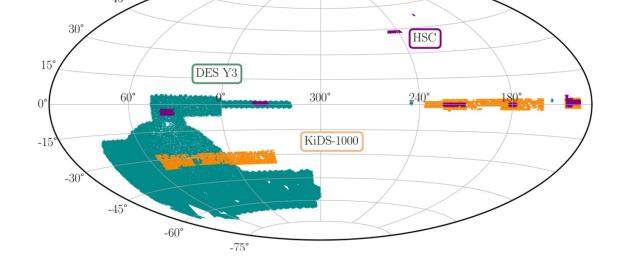
~70%

**Dark matter** 

~25%

Testing models beyond-ΛCDM is \*not\* a replacement for understanding data, improving precision & accuracy.





Increasing data precision  $\rightarrow$  more stringent accuracy requirements

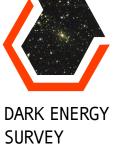
#### **DES+KIDS cosmic shear combined analysis**

- Methodology validated for each survey separately, but faced with combined-data constraining power, both KiDS and DES pipelines failed accuracy requirements.
- Team of members of both collab's developed "hybrid" model which was more robust in simulated analyses.
- Most impactful modeling choices:
  - Modeling of intrinsic alignments (astrophysical systematic)
  - Method for computing nonlinear matter power spectrum
- Final S<sub>8</sub> result 1.7σ from Planck

#### DES & KiDS Collabs. [inc. JM] 2023, arXiv:2305.17173



4m Blanco Telescope Cerro Tololo Inter-American Observatory, Chile Photo from Aug. 2017 observing shift



## The Dark Energy Survey (DES)

SURVEY

#### Imaging survey 2013-2019

- 758 nights observing, 4M Blanco telescope @ CTIO
- 5000 deg<sup>2</sup>, ~10% of sky
- 400+ participants
- Probes include: Weak lensing, galaxy clustering, SNe, galaxy clusters, Milky Way satellites, ...
- Y3 galaxy clustering and weak lensing ٠
  - Full 5000 deg2 at ~50% depth
  - ACDM, wCDM cosmology: DES Collab. 2022, PRD, arXiv:2105.13549
- Legacy Y6 analysis (full dataset) underway



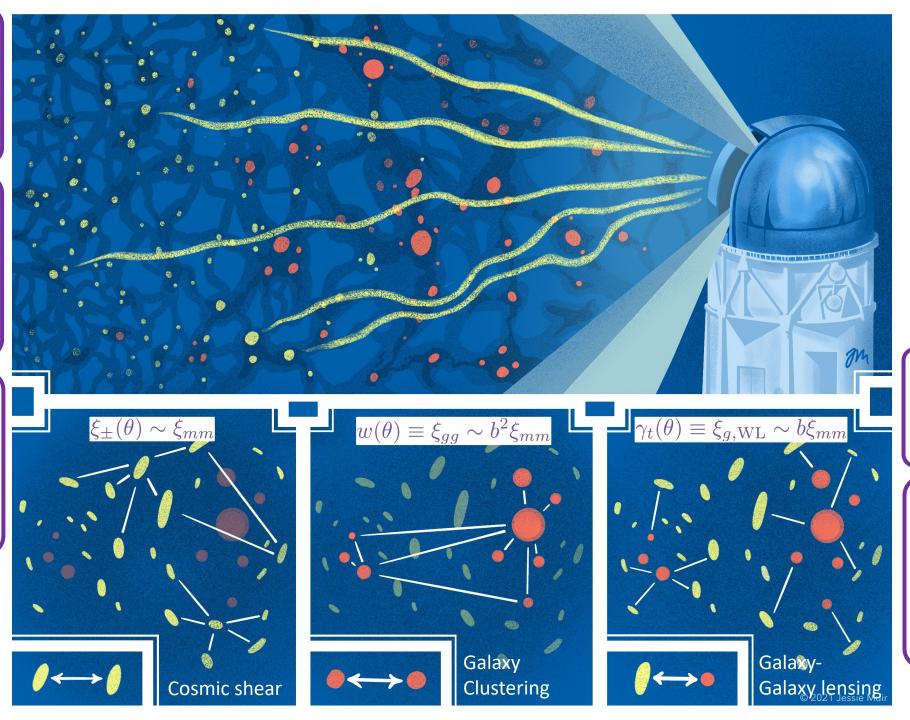
Weak lensing: 0.1% distortions of apparent galaxy shapes due to lineof-sight structure

Galaxy clustering: Galaxy density traces matter density

$$\delta_{\rm gal} = b \delta$$

b = galaxy bias

Galaxy – galaxy lensing: Cross correlate foreground lens galaxies with shear of background source galaxies

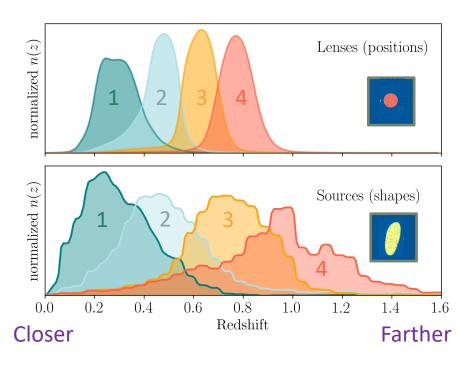


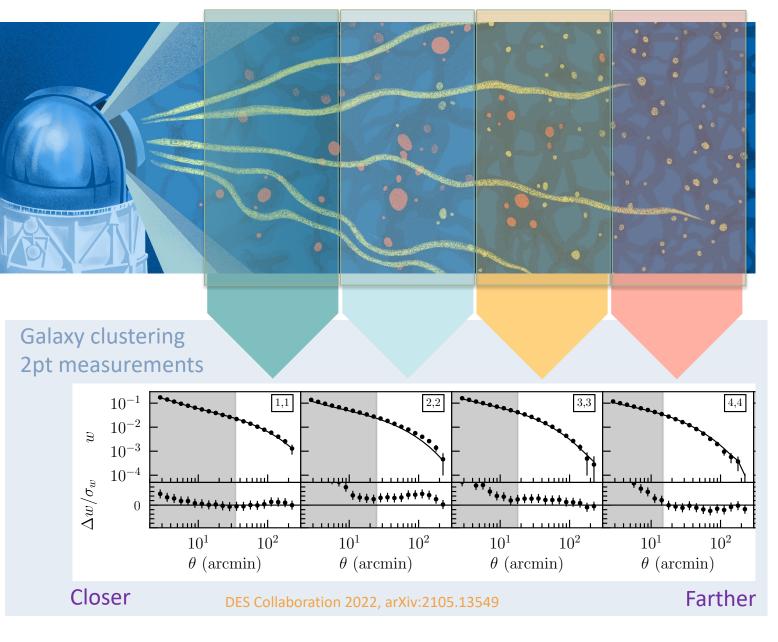
**3x2pt analysis:** combined study of these three kinds of 2pt functions

**2pt functions:** correlation of signal (galaxy shapes, positions) vs separation on sky  $\xi_{xy}(\theta) \propto \langle x(\hat{n})y(\hat{n}+\theta) \rangle$ 

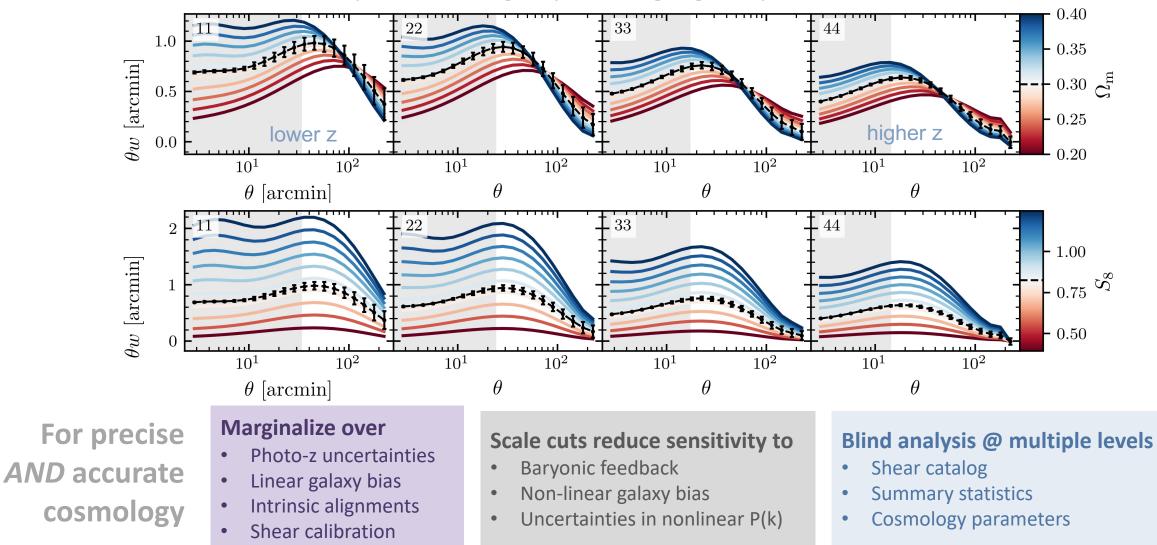
## DES Y3 Measurements

- Lens sample
  - 7.6M galaxy positions
  - 4 redshift (line-of-sight) bins
- Weak lensing sources
  - 100M galaxy shapes
  - 4 redshift (line-of-sight) bins





#### We constrain parameters by comparing predictions to 2pt measurements.



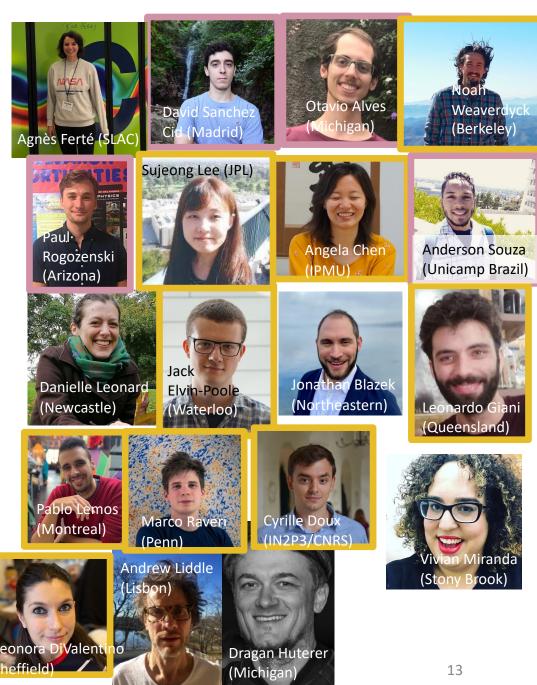
Model predictions for galaxy clustering angular 2pt correlations

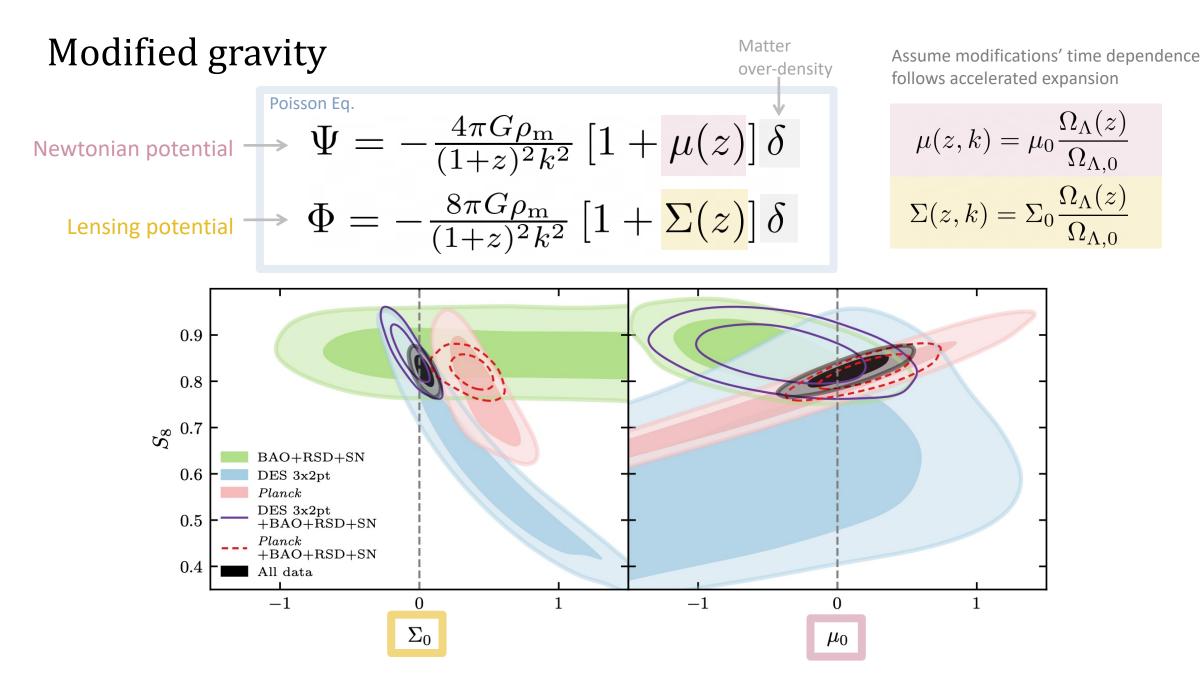
Bayesian analysis of 462 measurements, sampling 31 parameters (6 cosmology, 25 nuisance)

### DES Y3 beyond-ΛCDM cosmology

- DES Collab. PRD April 2023, arXiv:2207.05766
  - No significant deviations from ACDM
  - Public data: <u>https://dev.des.ncsa.illinois.edu/releases/y3a2/Y3key-</u> <u>extensions</u>
- Analysis co-leads: JM and Agnès Ferté (SLAC)
- Models considered:
  - Time dependent dark energy equation of state
  - Non-zero spatial curvature
  - Modified gravity
  - Phenomenological  $\sigma_8(z)$  test
  - Sterile neutrinos







DES Collaboration [inc. JM] 2023, PRD arXiv:2207.05766

## Challenge: non-linear modeling

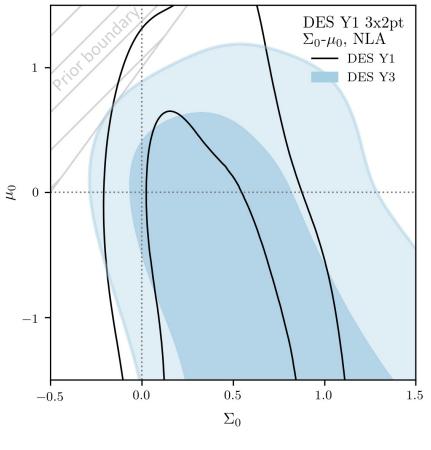
DES Y3 constraints don't improve on Y1 despite 3x more data. *Why? Linear Scale cuts!* 

- DES ACDM analyses use halo-model-based tools that are not validated for many beyond-ACDM models
  - Halofit (Takahashi+Bird) DES Y1, Y3
  - HMCode2020 DES Y6
- So: We remove data sensitive to nonlinear modeling
  - Cuts defined by iteratively removing datapoints from 3x2pt measurements until  $\Delta \chi^2 < 1$ .

$$\Delta \chi^2 \equiv (\mathbf{D}_{\mathrm{NL}} - \mathbf{D}_{\mathrm{lin}})^{\mathrm{T}} \, \mathbf{C}^{-1} \left( \mathbf{D}_{\mathrm{NL}} - \mathbf{D}_{\mathrm{lin}} 
ight)$$

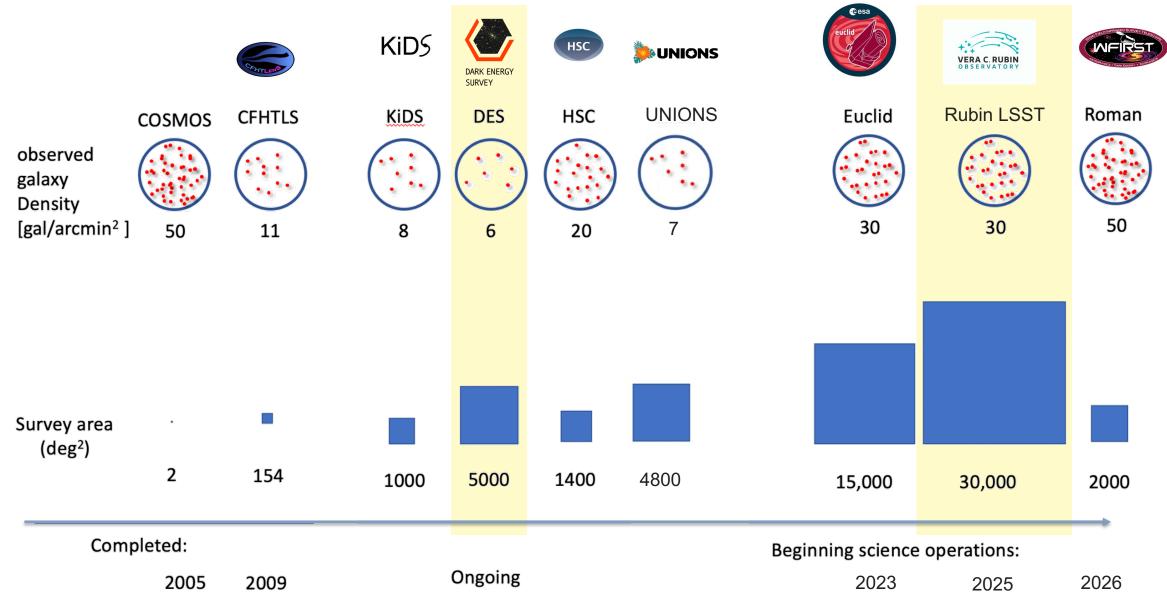
- Y3 uses 256/462 measurements
- Y1 uses 334/457 measurements

DES Y3:  $\Sigma_0 = 0.56^{+0.37}_{-0.48}$ DES Y1:  $\Sigma_0 = 0.43^{+0.28}_{-0.29}$ 

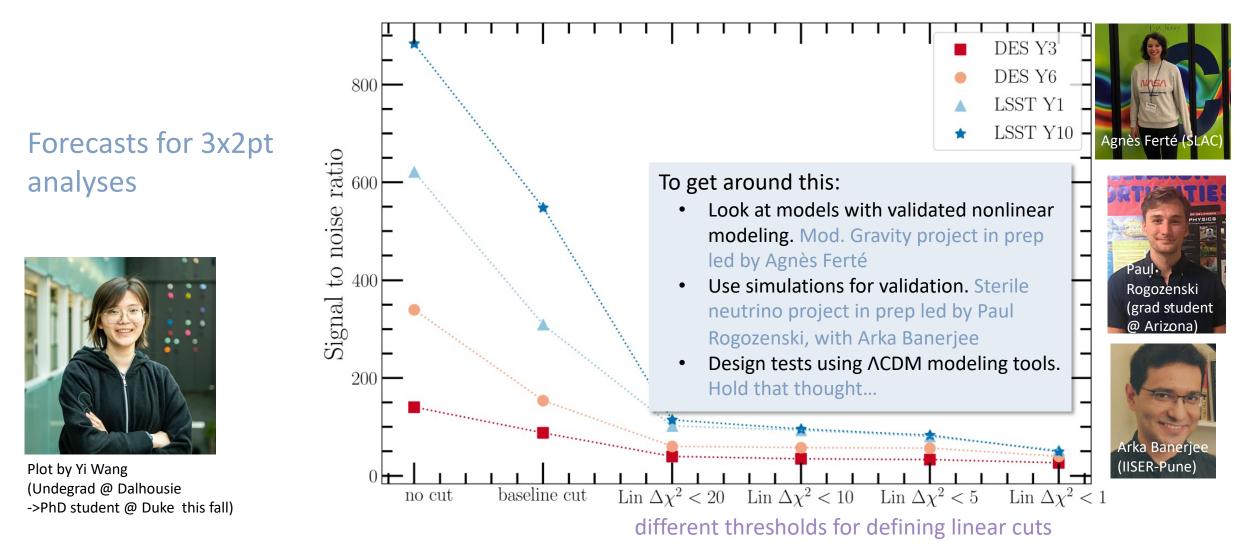


Y3 - DES Collab. arXiv:2207.05766 Y1 - DES Collab. arXiv:1810.02499

#### In context with other imaging surveys



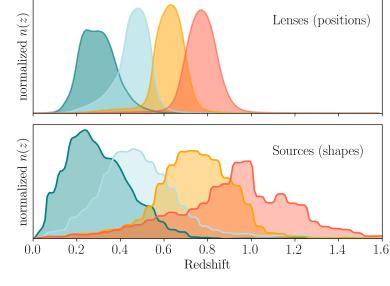
# Removing non-linear scales throws away a lot of information, and this will get worse with more precise data.

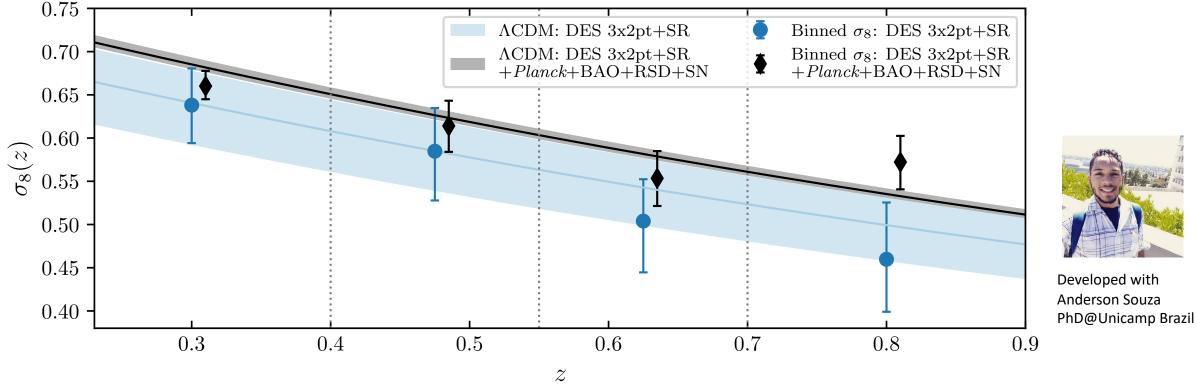


Binned  $\sigma_8(z)$ : Is large-scale structure growth over time consistent with  $\Lambda$ CDM?

$$P_{\rm lin}(k,z) \rightarrow A_i P_{\rm lin}(k,z) \qquad \sigma_8^{[\rm bin\,i]} \equiv \sigma_8 \sqrt{A_i^{P_{\rm lin}}}$$

One A<sub>i</sub> parameter per lens bin Another (A<sub>CMB</sub>) added for CMB when Planck included

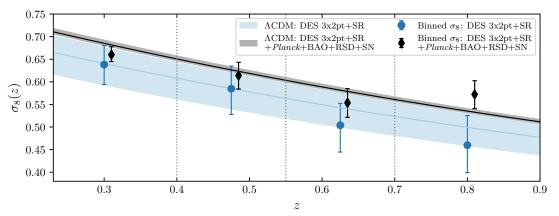




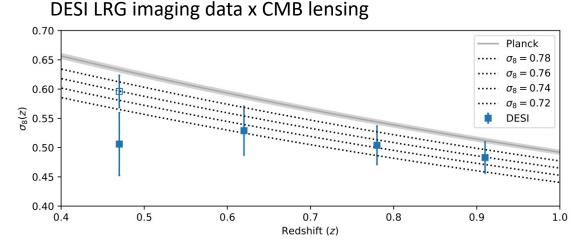
DES Collaboration [inc. JM] 2023, PRD arXiv:2207.05766

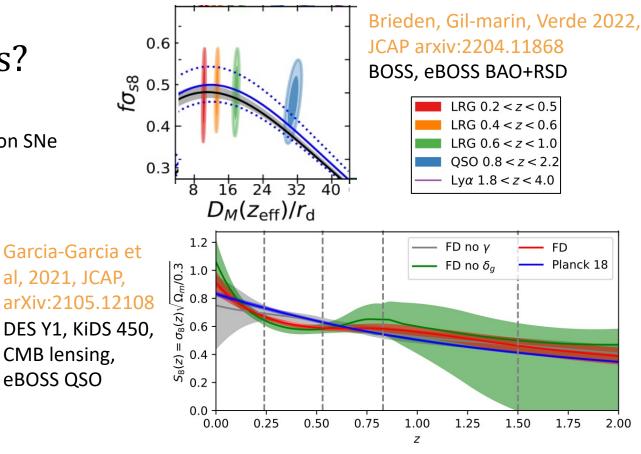
### Hints at slow growth at late times?

DES Collaboration [inc. JM] 2023, PRD arXiv:2207.05766 DES Y3, Planck 2018 primary CMB, BOSS/eBOSS BAO+RSD, Pantheon SNe



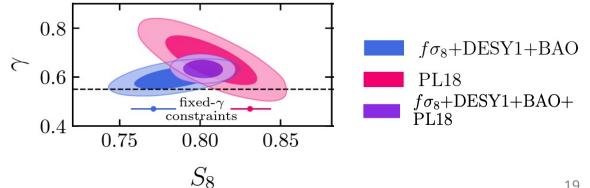
#### White et al, 2022, JCAP 2022 arXiv:2111.09898





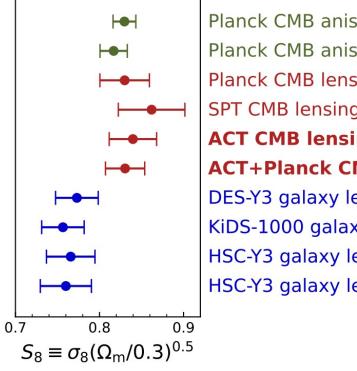
#### Nguyen, Huterer, & Wen, 2023 PRD, arXiv:2302.01331.

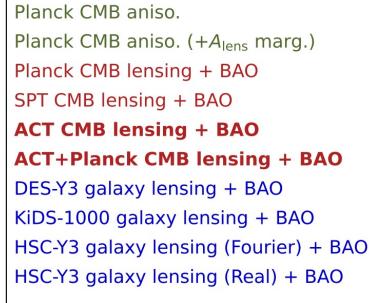
Planck 2018 primary CMB, DES Y1 3x2pt, 6DFGS+SDSS BAO, RSD & Pec. Vel.



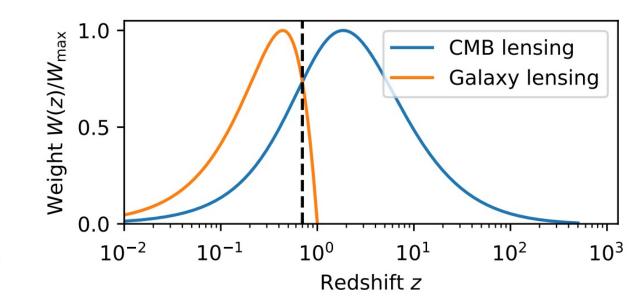
# Designing a targeted phenomenological test, with CMB Lensing

#### ACT Collab. 2023, arXiv:2304.05203





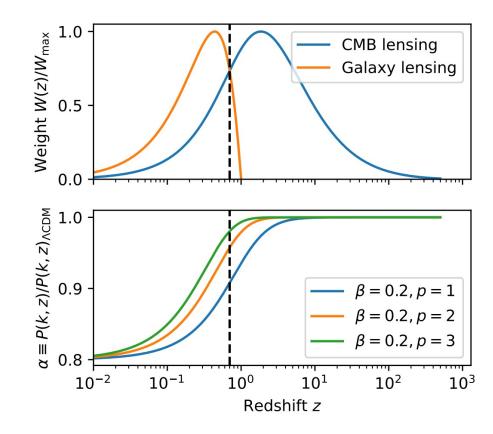
Lensing kernels: Which redshifts contribute to lensing signals



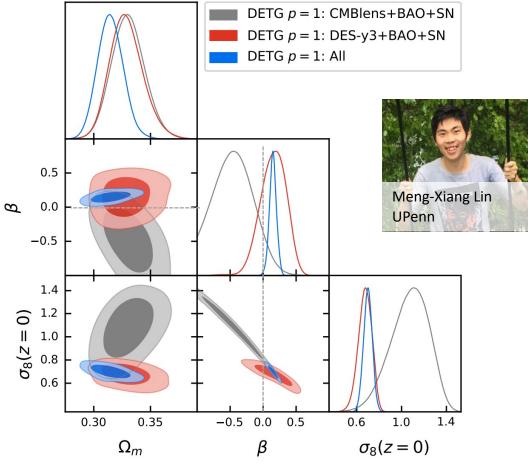
Lin et al [inc. JM] 2023, arXiv:2308.16183

# Is growth suppressed in the dark energy dominated era relative to $\Lambda$ CDM expectations?

$$lpha(z) \equiv rac{P(k,z)}{P(k,z)_{\Lambda ext{CDM}}} = 1 - eta \left(rac{\Omega_{ ext{DE}}(z)}{\Omega_{ ext{DE}}^0}
ight)^p$$



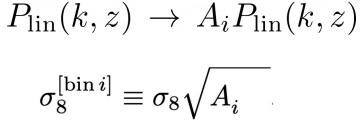
Lin et al [inc. JM] 2023, arXiv:2308.16183



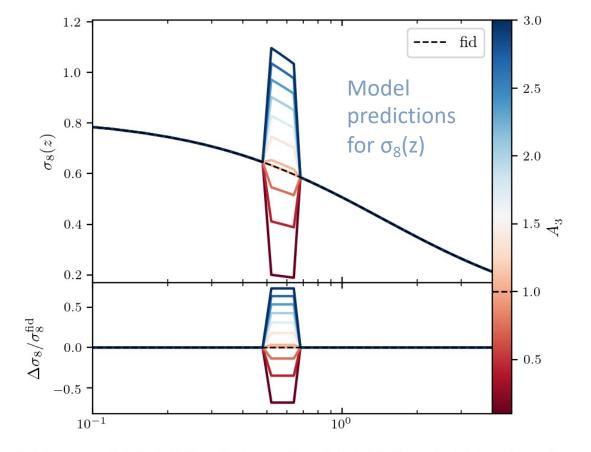
#### Maybe!

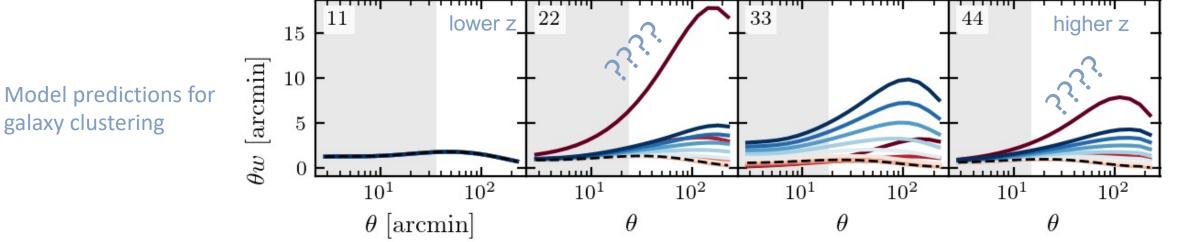
- For "all" data: Improvement of  $\Delta \chi^2 \sim 7$ , varying  $\beta$ , fixed p=1
- 2-3 $\sigma$  preference for  $\beta$ >0 based on 1D marginalized posteriors
- Worth further investigation: projection effects, S<sub>8</sub> behavior

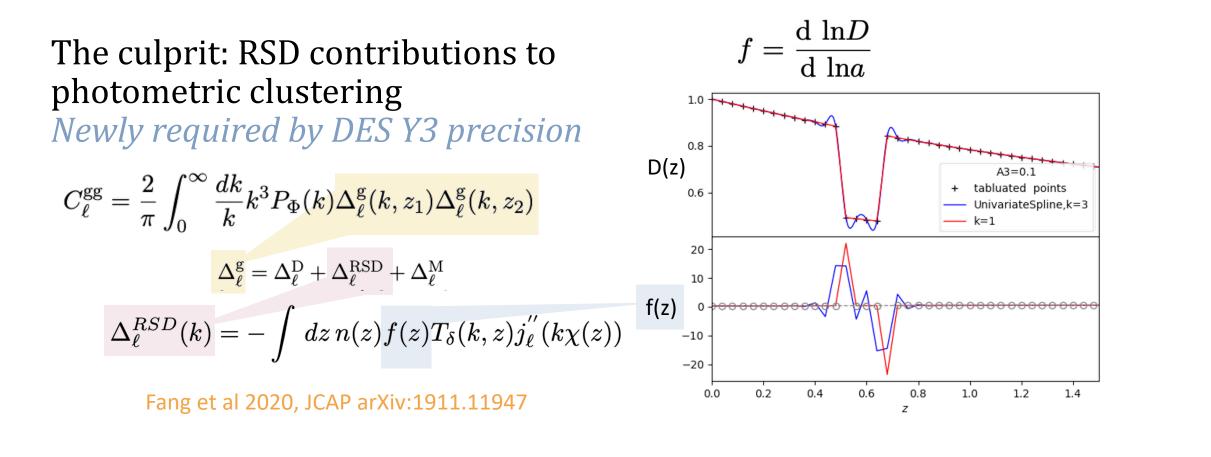
### Ongoing project highlight: Motivation from odd results during $\sigma_8(z)$ validation

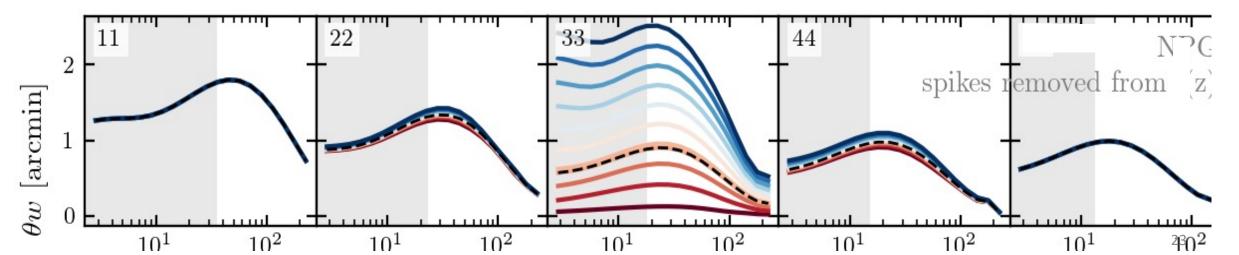


For each redshift bin i

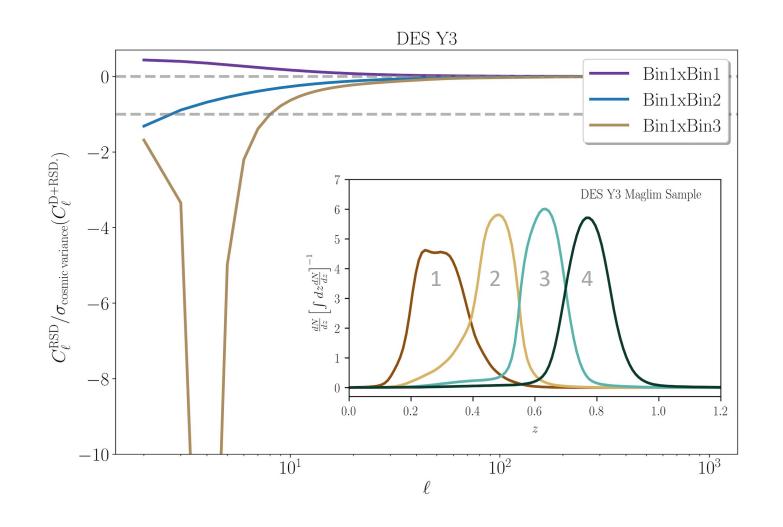




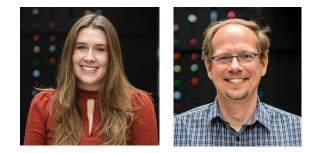




# Accounting for RSD in photometric galaxy clustering: Can we extract additional growth information by adding cross-bin correlations?

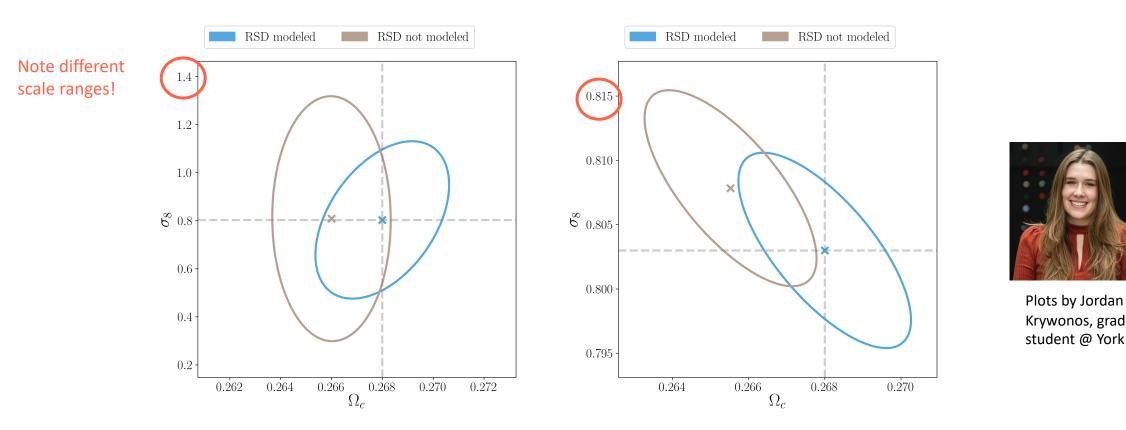


- DES analyses have only used auto-correlation measurements of galaxy (position) clustering.
- Most forecasts assessing value of cross-bin correlations haven't accounted for RSD contributions.



With Jordan Krywonos & Matt Johnson York University / Perimeter

## Preliminary results: Fisher forecasts for LSST Y1 galaxy clustering



#### Auto-correlations only

All cross-bin correlations

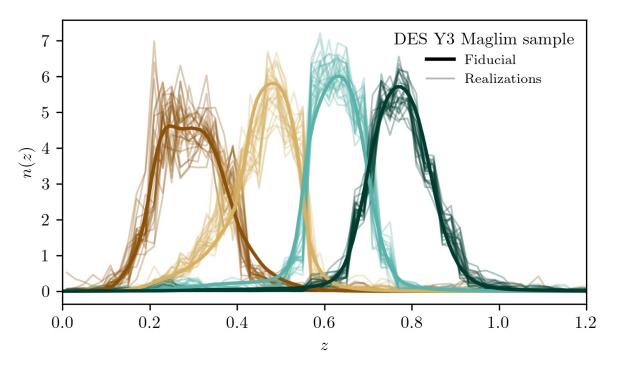
- If analyzing photometric galaxy clustering alone, cross-bin correlations add a ton of information!
  - (will be less impactful when combined with lensing)
- Including RSD doesn't significantly impact gains from "auto only" -> "all cross"
- Either way, neglecting RSD in our model will bias cosmology results.

## Next steps: impact of photo-z uncertainties

Very schematically,

$$C_\ell^{g_A g_B} \sim \int dz \, n_A(z) \, n_B(z) F(k,z)$$

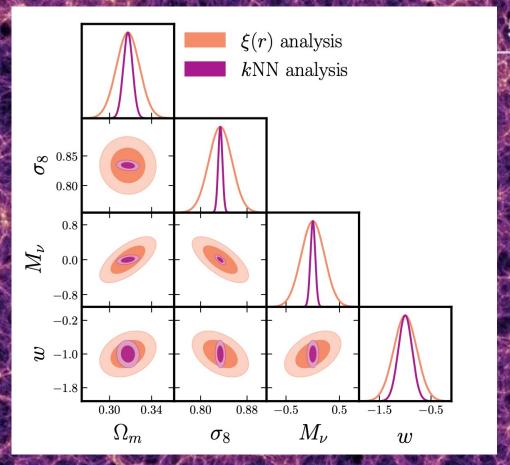
- Fiducial (auto-only) DES Y3 analysis captures photo-z uncertainties via mean shift nuisance parameters:
  - $\Delta z^{A} : n^{A}(z) \rightarrow n^{A}(z \Delta z^{A})$
  - Tests show this is sufficient for robust cosmology with only auto correlations.
- Cross-bin correlations will have greater sensitivity to shape of n(z), especially distribution tails.
- Ongoing work
  - forecast, study biases due to variations in n(z) shape.
  - Extend forecasts beyond ACDM



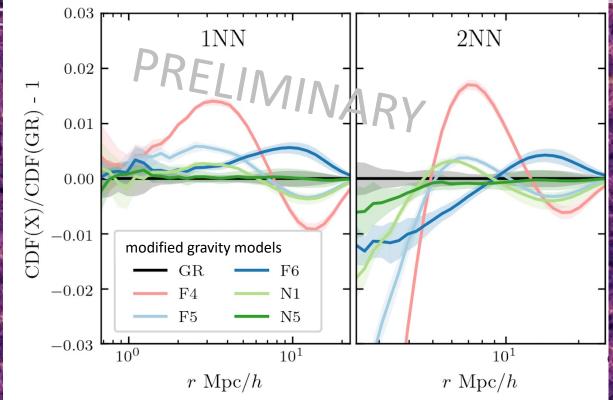
n(z) realizations used for redshift calibration study Giannini et al 2022 [DES Collab], arXiv:2209.05853

#### Ongoing project highlight: "k-Nearest Neighbor" summary statistics as a probe of modified gravity

with Arka Banerjee (IISER-Pune)



Forecast from Banerjee & Abel 2021, arXiv:2102.01184



Exploratory study of sensitivity to modified gravity effects in N-body simulations

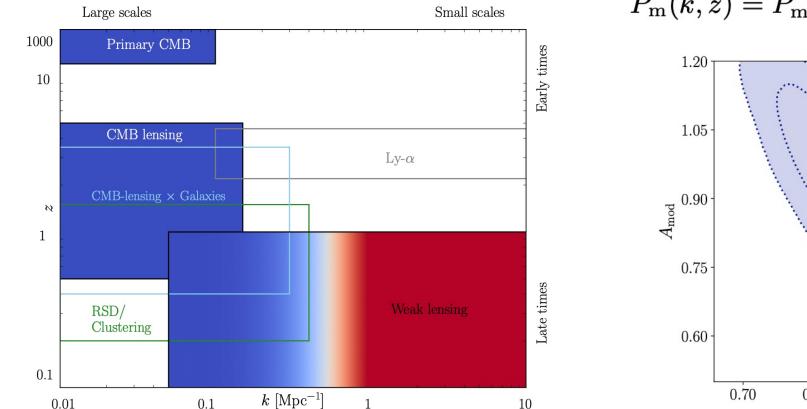
Background image: Millennium simulation project

## Conclusions

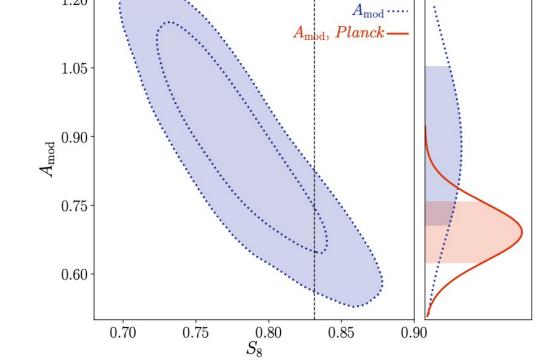
- Large scale structure (LSS) growth history and properties are sensitive to interesting cosmological physics, which is why mismatches between late- and early-Universe measurements of σ<sub>8</sub> have captured the field's attention.
- With DES Y3 galaxy clustering and weak lensing, we've tested several beyond- $\Lambda$ CDM models, including probes of LSS growth via modified gravity and binned  $\sigma_8(z)$  parameterizations.
- There \*may\* be some hints of slower-than-ACDM growth at late times, but nothing conclusive yet.
- Learning more about growth motivates us to make the most of current & soon-to-be available data.
  - Improve non-linear modeling
  - Analyze additional observables: e.g. CMB lensing, cross-redshift-bin galaxy clustering
  - Go beyond 2-point summary statistics
- Beyond-ACDM studies are complementary to work to understand how astrophysical, systematic uncertainties impact analyses --- and beware --- they may be particularly susceptible to modeling/analysis/systematics challenges!

## **BACKUP SLIDES**

# Differences could be driven by linear vs nonlinear scales, rather than (or in addition to!) redshift-dependent effects

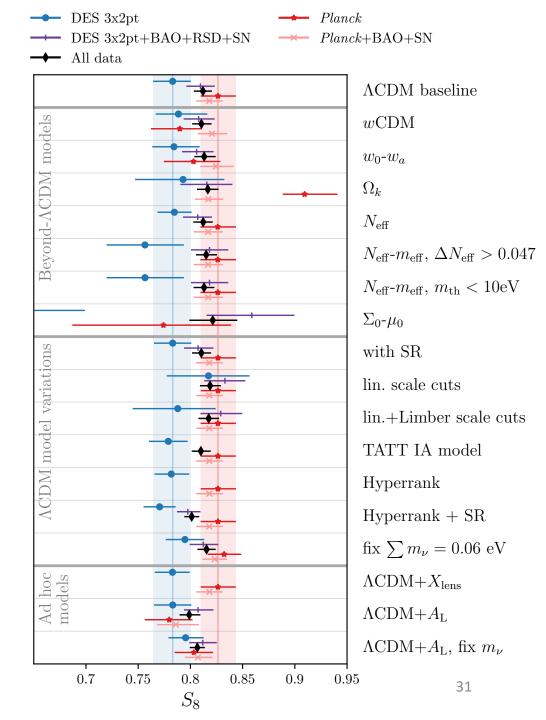


$$P_{\mathrm{m}}(k,z) = P_{\mathrm{m}}^{\mathrm{L}}(k,z) + A_{\mathrm{mod}}[P_{\mathrm{m}}^{\mathrm{NL}}(k,z) - P_{\mathrm{m}}^{\mathrm{L}}(k,z)]$$



Amon and Efstathiou, 2022, JCAP 2022 arXiv:2206.11794 Preston, Amon, and Efstathiou 2023, arXiv:2305.09827

# Impact of model extensions on ${\rm S}_8$



DES Collaboration [inc. JM] 2023, PRD arXiv:2207.05766

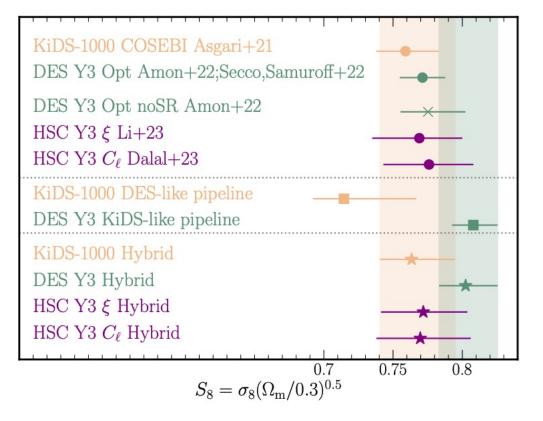
### DES+KiDS details: Pipeline differences

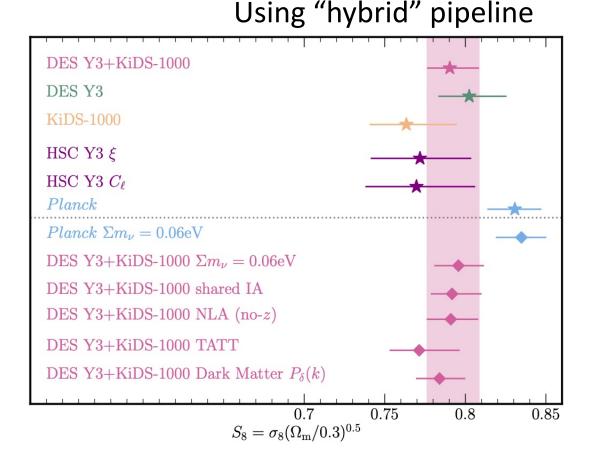
	DES Y3	KiDS-1000	Hybrid
Cosmological parameter priors:			
Amplitude	$A_{\rm s}$ : [0.5, 5.0]	$S_8$ : [0.1, 1.3]	$S_8$ : [0.1, 1.3]
Hubble constant	h:[0.55, 0.91]	h:[0.64, 0.82]	h:[0.64, 0.82]
Matter density	$\Omega_{ m m}$ : [0.1, 0.9]	$\omega_{\rm c}$ : [0.051, 0.255]	$\omega_{\rm c}$ : [0.051, 0.255]
Baryon density	$\Omega_{\rm b}$ : [0.03, 0.07]	$\omega_{\rm b}$ : [0.019, 0.026]	$\omega_{\rm b}$ : [0.019, 0.026]
Spectral index	$n_{\rm s}$ : [0.87, 1.07]	$n_{\rm s}$ : [0.84, 1.1]	$n_{\rm s}$ : [0.84, 1.1]
Neutrinos	$1000 \Omega_{\nu} h^2$ : [0.6, 6.44]	$\Sigma m_{\nu} = 0.06 \text{eV}$	$\Sigma m_{\nu} = [0.055, 0.6] \mathrm{eV}$
Astrophysical systematic models and priors:			
Intrinsic Alignments	TATT: $b_{\text{TA}}$ : [0, 2]; $a_1, a_2, \eta_1, \eta_2$ : [-5, 5]	NLA: $A_{IA}$ : [-6, 6]	NLA-z: $A_{IA}$ , $\eta_{IA}$ : [-5, 5]
Non-linear Model	Halofit	HMCode2016	HMCode2020
Baryon Feedback	Scale cuts	$A_{\text{bary}}$ : [2, 3.13]	Scale cuts & $\log_{10}(T_{AGN}/K)$ : [7.3, 8.0]
Neutrino Model	Bird et al. (2012)	HMČode2016	HMCode2020
Sampling Algorithm:			
	PolyChord	MultiNest	PolyChord

DES & KiDS Collabs. [inc. JM] 2023, arXiv:2305.17173

### DES+KiDS details

#### Separate, with pipeline variations





#### DES & KiDS Collabs. [inc. JM] 2023, arXiv:2305.17173

### Systematics a challenge! Example: baryon feedback

1.4

1.2

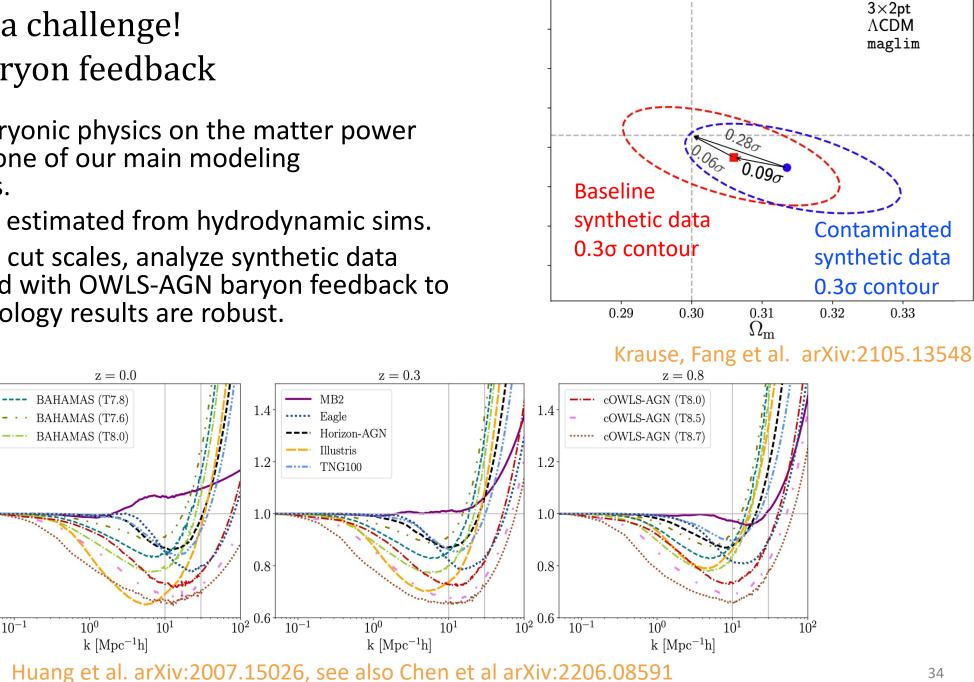
0.8

0.6

 $10^{-1}$ 

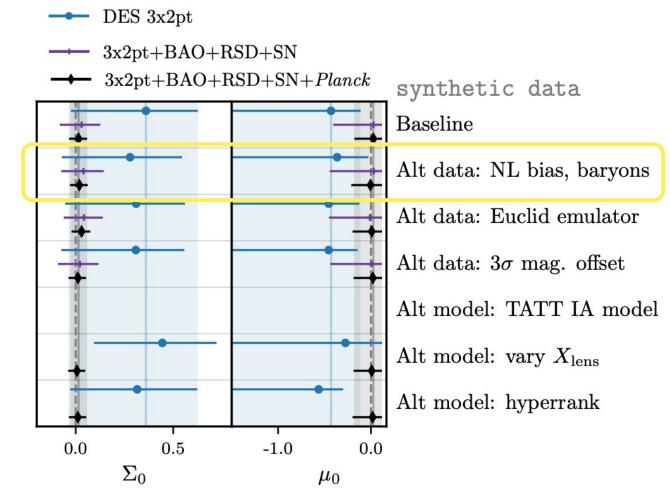
 $P^{\rm hydro}_{\delta}(k)/P^{\rm DMO}_{\delta}(k)$ 

- Impact of baryonic physics on the matter power • spectrum is one of our main modeling uncertainties.
- Size of effect estimated from hydrodynamic sims. ٠
- In DES Y3 we cut scales, analyze synthetic data ulletcontaminated with OWLS-AGN baryon feedback to ensure cosmology results are robust.



Systematics are *even more of* a challenge *beyond-∧CDM*! Example: baryon feedback → DES 3x2pt

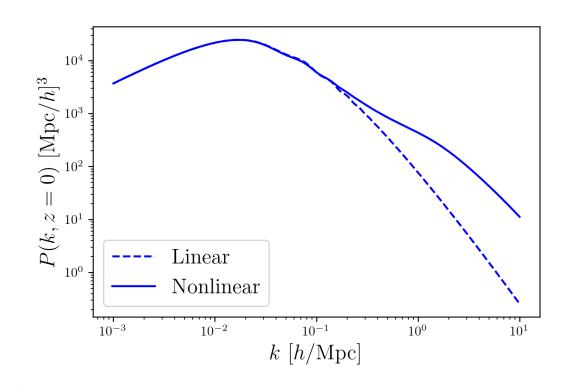
- Modified gravity could plausibly affect how baryonic process occur & impact structure.
- BUT Simulations used to estimate impact of baryons are done in LCDM, assuming GR.
- Ideally would model baryons+MG, test robustness in that space.
- In practice we make sure LCDM+baryons won't give us a false detection of MG.



DES Collaboration [inc. JM] 2023, PRD arXiv:2207.05766

Similar issues for nonlinear matter power spectrum, intrinsic alignments, galaxy bias, higher order shear effects...

## Challenge: Non-linear modeling is beyond ΛCDM



$$\Delta \chi^2 \equiv (\mathbf{D}_{\mathrm{NL}} - \mathbf{D}_{\mathrm{lin}})^{\mathrm{T}} \, \mathbf{C}^{-1} \left( \mathbf{D}_{\mathrm{NL}} - \mathbf{D}_{\mathrm{lin}} 
ight)$$

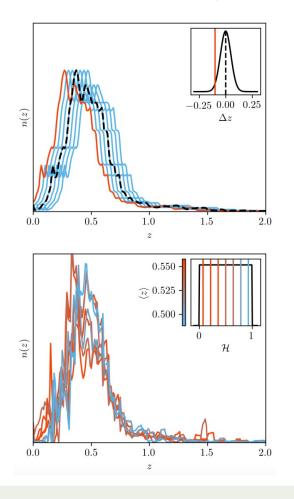
Cuts defined by iteratively removing datapoints from 3x2pt measurements until  $\Delta \chi^2 < 1$ .

- DES ACDM analyses use halo-modelbased tools calibrated on simulations
  - Halofit Used in DES Y1, Y3
  - HMCode2020 DES Y6

Other approaches

- Perturbation theory
- Emulators (usually assume wCDM)
  - EuclidEmulator2, arXiv:2010.11288
  - Aemulus-nu, arXiv:2303.09762
- ReACT method
  - Cataneo 2019, arXiv:1812.05594
  - Available for certain dark energy, modified gravity models

# Challenge: More freedom in the model can leads to greater sensitivity to photo-z uncertainties.



Fiducial: marginalize over mean-shift parameters:

•  $\Delta z_{s}^{i}: n_{s}^{i}(z) \rightarrow n_{s}(z - \Delta z_{s}^{i})$ 

#### Hyperrank:

• Sample over ensemble of possible n<sup>i</sup><sub>s</sub>(z) histograms

Cordero, Harrison et al. [DES] 2022, MNRAS arXiv:2109.09636

Shear ACDM results unchanged between these methods.

 $3x2pt \land CDM S_8$ shifts by ~0.5 $\sigma$ . Binned  $\sigma_8(z)$  3x2pt: some A<sub>i</sub> shifts ~1 $\sigma$ . Add BAO+SN to help restore robustness. In the binned  $\sigma_8(z)$  model, changing to hyperrank produces larger shifts

#### DES 3x2pt alone

- σ<sub>8</sub><sup>[bin 2]</sup> ↑ 0.5σ
- $\sigma_8^{[bin 3]}$   $\uparrow$  0.6 $\sigma$

#### 3x2pt +BAO+RSD+SN

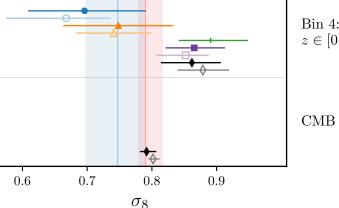
•  $\sigma_8^{[bin 1]} \downarrow 0.7\sigma$ 

#### 3x2pt +BAO+RSD+SN + CMB

- $\sigma_8^{[bin 2]}$   $\uparrow 0.5\sigma$
- σ<sub>8</sub><sup>[CMB]</sup> ↑ 0.6σ

More degrees of freedom in our model, more sensitivity to how certain systematics are handled.

#### $\longrightarrow$ DES 3x2pt+SR - 3x2pt+SR+BAO+RSD+SNHyperrank instead of $\Delta z_s$ marg. → All data 3x2pt+SR+BAO+SN ---- Planck BAO+RSD+SN $\rightarrow$ Planck+BAO+SN $\Lambda \text{CDM}$ Bin 1: $z \in [0.0, 0.4)$ Bin 2: $z \in [0.4, 0.55)$ Bin 3: $z \in [0.55, 0.7)$ Bin 4: $z \in [0.7, 1.5)$



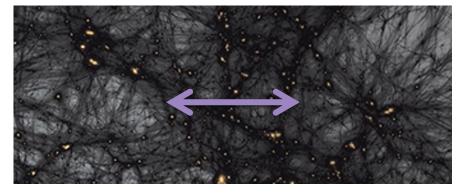
#### DES Collaboration [inc. JM] 2023, PRD arXiv:2207.05766

Challenge: More degrees of freedom in the model can lead to greater sensitivity to systematic uncertainty.

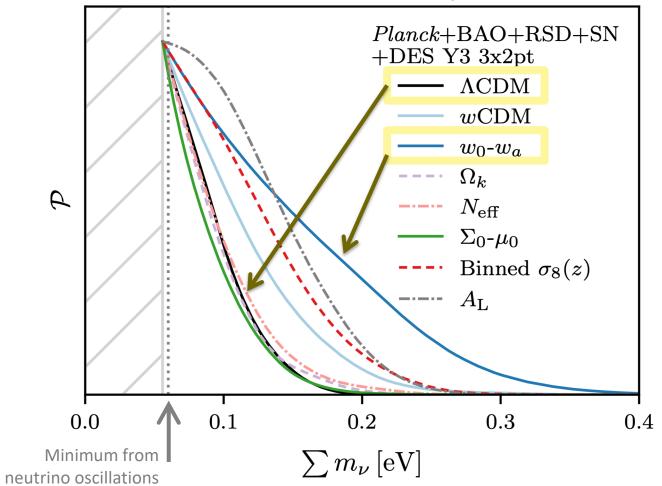
- WL Photo-z uncertainty assessment; robust in LCDM, bigger changes in cosm than would be ideal when switching between these
  - For given redshift bin; things determining amplitude of lensing
    - Redshift distribution of lenses and sources
    - Amplitude of structure in redshift ranges
    - Expansion history, translating redshift distributions to distances in lensing geometry
  - More freedom in one of these can make us more susceptible to uncertainties in others: dropping assumption of smoothness of growth rate vs z means details of n(z) can matter more. Adding in external constraints of expansion from BAO can restore some robustness.

## Neutrinos as (a small fraction of) dark matter

- Cosmological upper bounds on the sum of neutrino masses come from
  - Impact on expansion history
  - Structure growth suppressed on length-scales < free-streaming scale</li>

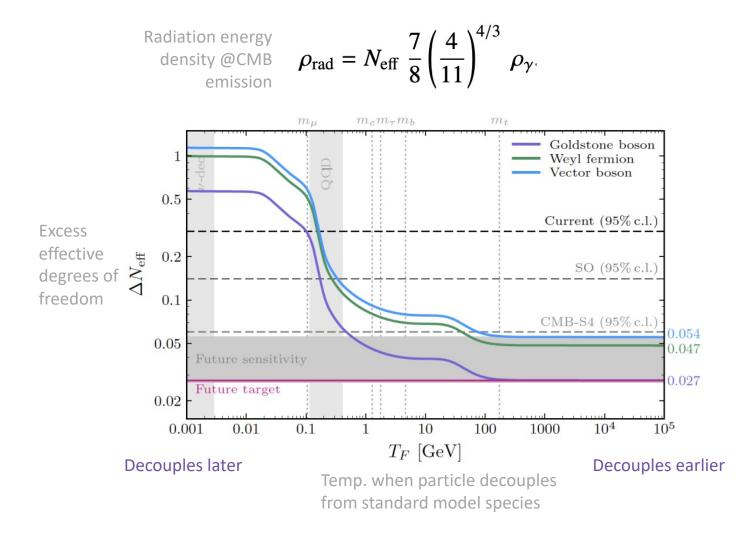


• These constraints depend on the assumed cosmological model.



#### DES Collaboration 2022, arXiv:2207.05766

# Searching for sterile neutrinos and other light relic particles

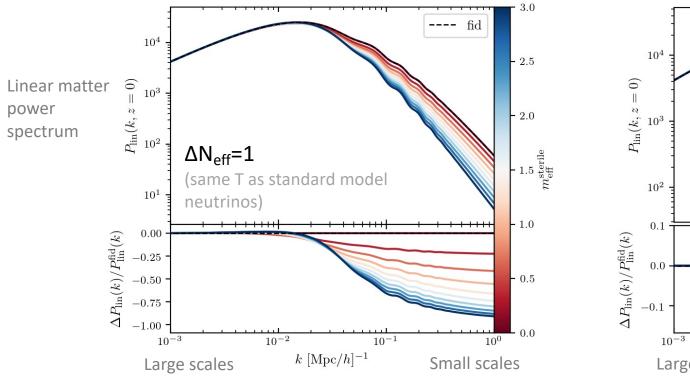


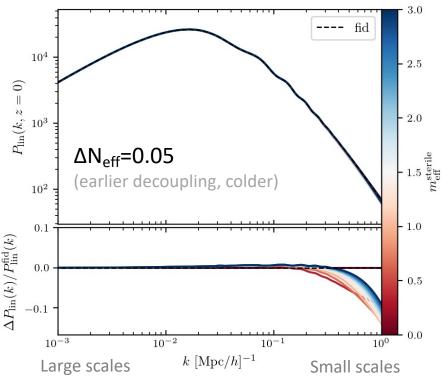
- CMB observables are sensitive to the presence of new relativistic particles
  - Parameterized by  $\rm N_{eff}$
  - $N_{eff} \sim 3$  in standard model (3 neutrinos)
- Stable, massive particles may impact late-time structure growth.
- Relevant recent findings:
  - Constraining one species of light massive relic (e.g. sterile neutrino) provides general sensitivity to presence of others. DePorzio, Xu, Muñoz, and Dvorkin 2021, arXiv:2006.09380
  - Weak lensing data adds significant constraining power! Xu, Muñoz, and Dvorkin 2022, arXiv:2107.09664

## Sterile neutrinos

Generic search for light massive relic beyond-thestandard-model particles.

- m<sub>eff</sub> Mass of stable relic particle
  - controls fraction of dark matter made of relic
  - Higher  $m_{eff} \rightarrow more growth suppression$
- ΔNeff Early Universe energy-density contribution
  - Higher  $N_{eff} \rightarrow$  hotter relic particles





## Sterile neutrino constraints

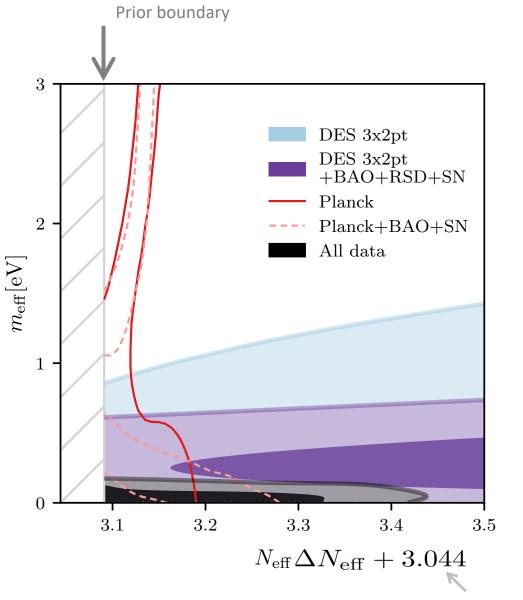
- DES Y3 analysis used linear only scales
  - Only 256 datapointss of 462 used in LCDM
- Even with linear cuts, m<sub>eff</sub> bounds ~3x tighter than Planck 2018 results
- Ongoing project to update analysis:
  - validate nonlinear modeling using N-body simulations
  - Improving galaxy bias modeling



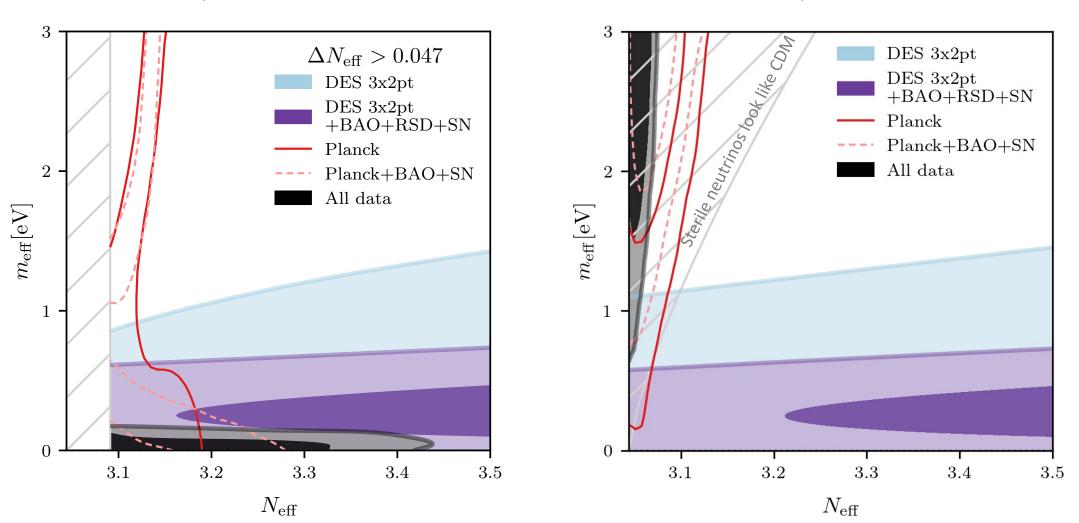


With Paul Rogozenski (grad student @ Arizona)

And Arka Banerjee (IISER-Pune)



#### Challenge: Prior volume effects in unconstrained parameter space regions



Fiducial prior:  $\Delta N_{eff} > 0.047$ 

Results with prior:  $\Delta N_{eff} > 0$ 

Unconstrained small-N<sub>eff</sub> region introduces sensitivity to noise realization, modeling choices, contaminations. Robustness restored with fiducial prior.