

Mapping cosmic structure in the next decade: Where **imaging** and **spectroscopic** surveys intersect

Jamie McCullough, Princeton University

Presenting major contributions from **Alex Amon, Jared Siegel, Elisa Legnani, Daniel Gruen**, and others in DES, DESI, and DESC

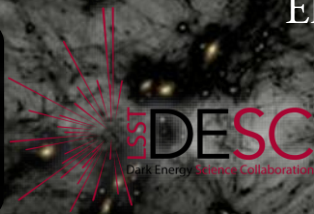
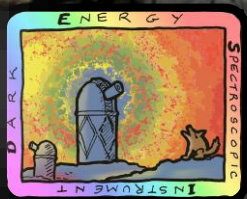
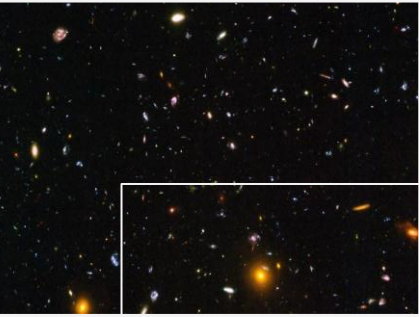


Image credit: Ralf Kaehler, Carter Emmart, Tom Abel, Oliver Hahn



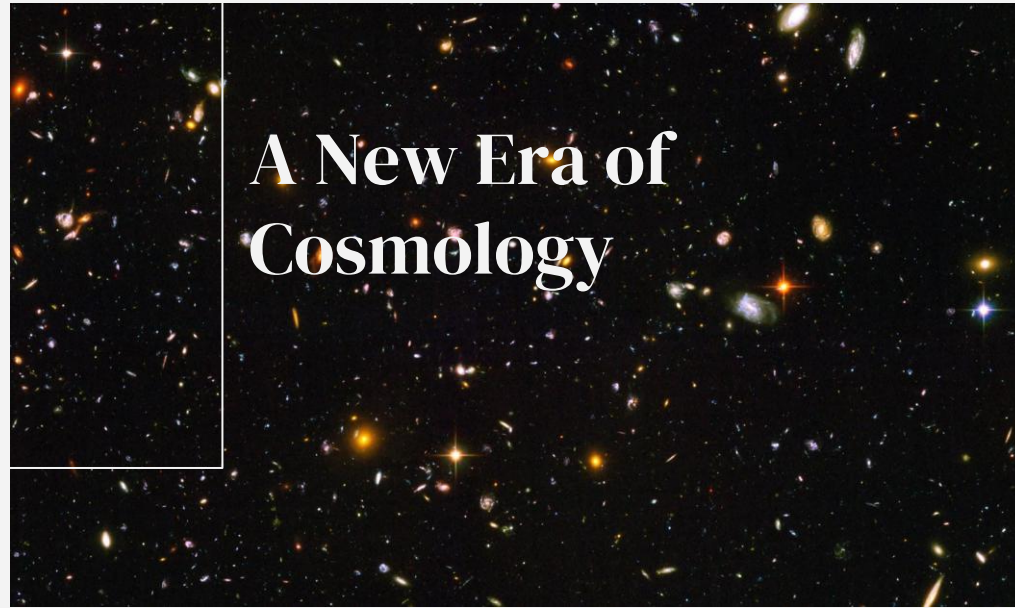
20,000,000,000

the number of galaxies that the Vera Rubin Observatory will observe in its ten year survey, **perhaps ~10-20% with well measured shapes**



our ability to model our observations and astrophysical processes

We are entering a domain
where **systematics**, not
statistics, limit our knowledge
of the universe.



A New Era of
Cosmology

A visualization of the cosmic web, showing a complex network of dark matter filaments and galaxy clusters. The filaments are depicted as thin, interconnected lines of purple and blue, with bright yellow and orange spots representing galaxy clusters. The background is a deep purple color.

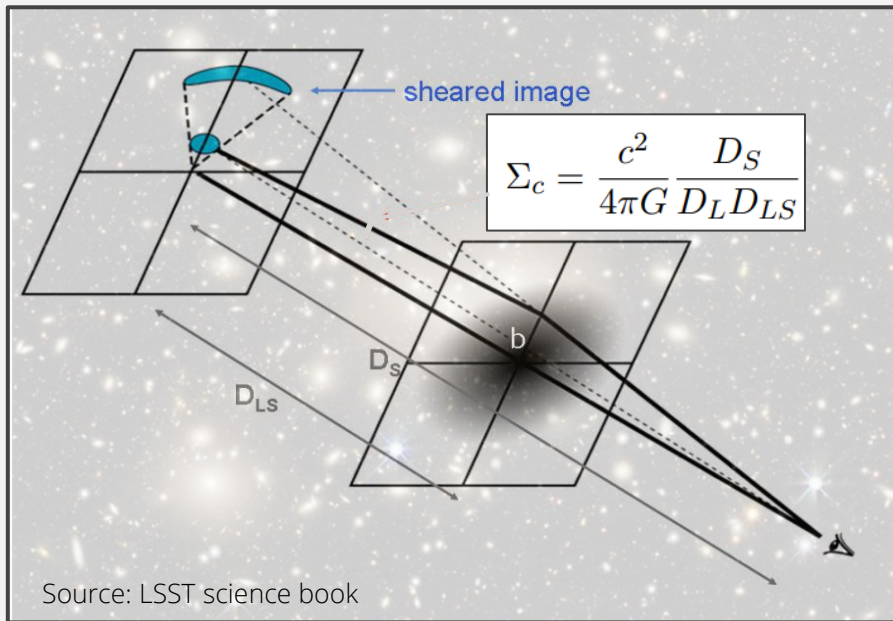
01

**Weak
Gravitational
Lensing**

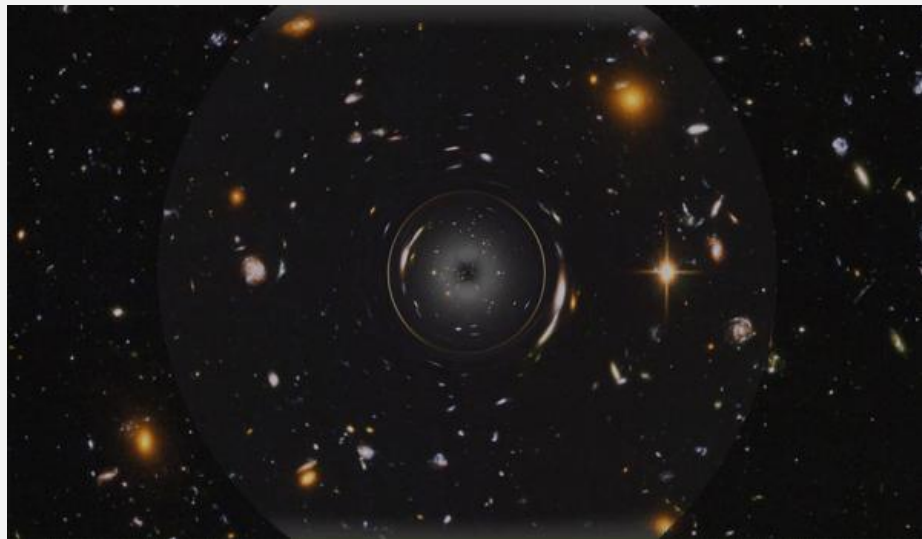
Gravitational lensing

probes **foreground structure** in the universe by measuring the shear of galaxy shapes around foreground matter, or *lenses*.

The shear we see depends on the **geometry** of the lens and the source galaxies.



The path light takes is **warped around massive structures**, even if that matter is invisible to us — like refraction through a piece of glass.

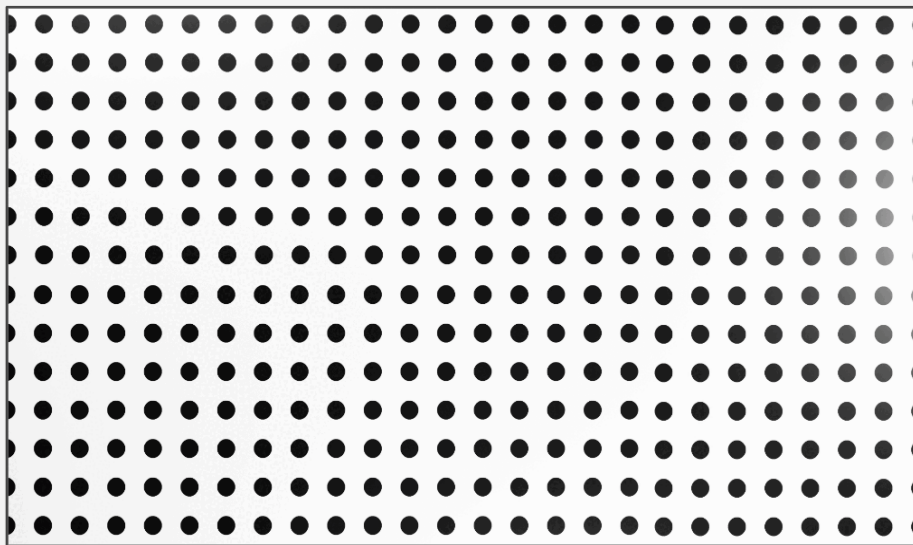


Strong gravitational lensing in action, as simulated with glass.

Weak gravitational lensing

is in the regime where the lensing effect on shape is *small* ($\sim 1\%$) — with enough source galaxies it can statistically measure **large-scale structure** in the universe

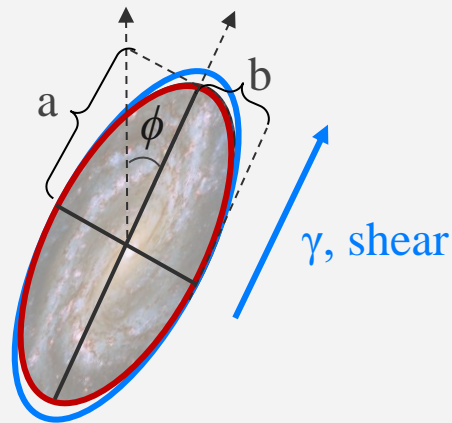
We need the **ensemble of distances** for the lens and the source galaxies with high accuracy.



We can examine an applied shear as a linear addition to the shape moment of *ellipticity*

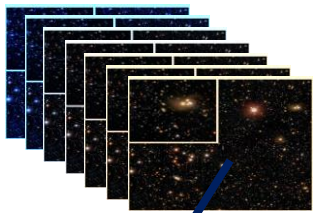
$$e = \frac{a^2 - b^2}{a^2 + b^2}$$

$$e_i^{obs} \approx e_i^{true} + \gamma_i \quad i \in (1,2)$$

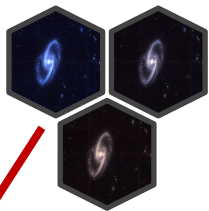


The Ingredients for Lensing (ex. The Dark Energy Survey)

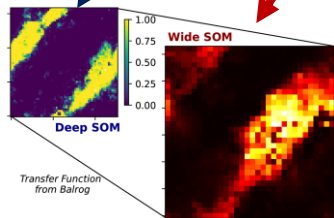
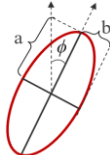
Deep Field **images**
(*ugriz/HKs* fluxes)



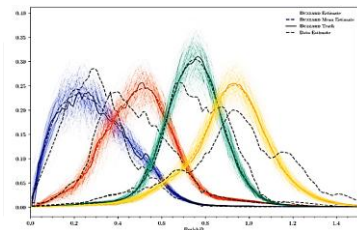
Wide Field **images**
(*riz* fluxes)



shape
measurement



Transfer Function
from Balrog

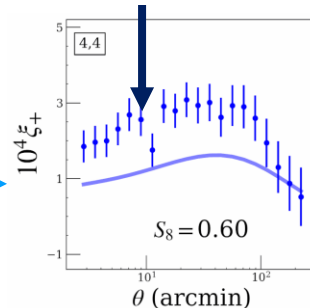
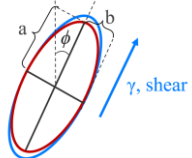


ensemble **distance** inference,
(*photometric redshifts*)

(image **simulations**)



shape to **shear**
(*shear bias*)



two-point correlation

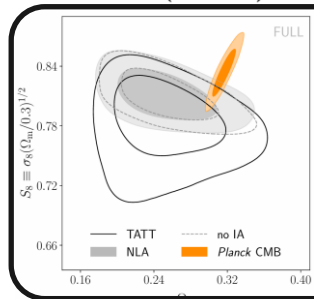
Source: CAASTRO

Modeling our
measurements

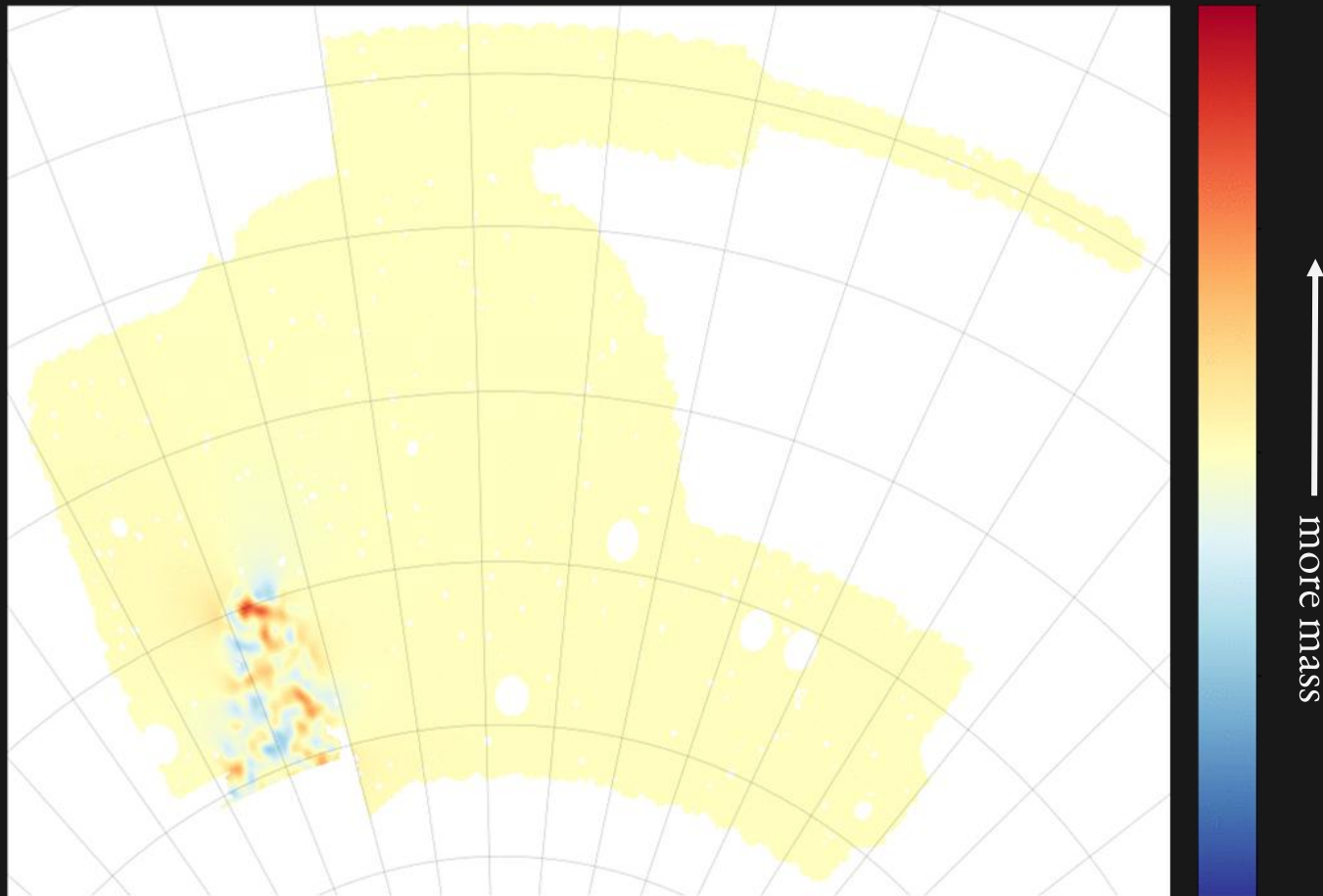
- baryon feedback
- intrinsic alignments

**Constraints on our
cosmological model**

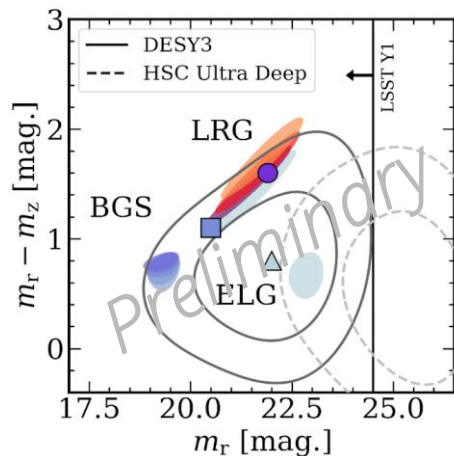
- Matter fluctuation amplitude, S_8
- Matter density, Ω_m



If you do it
right...

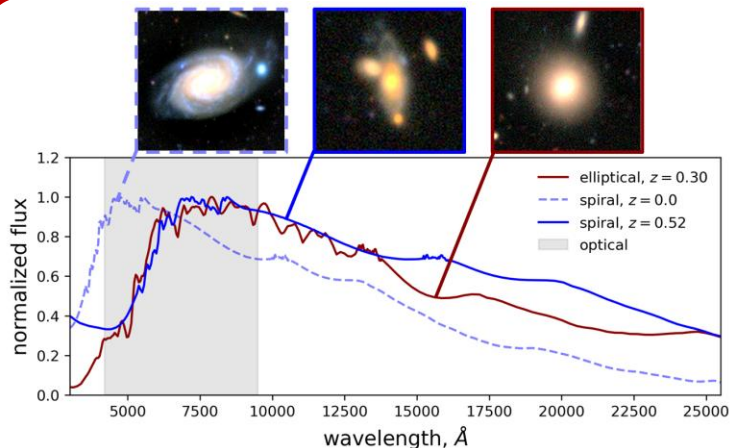


Upcoming Challenges ...



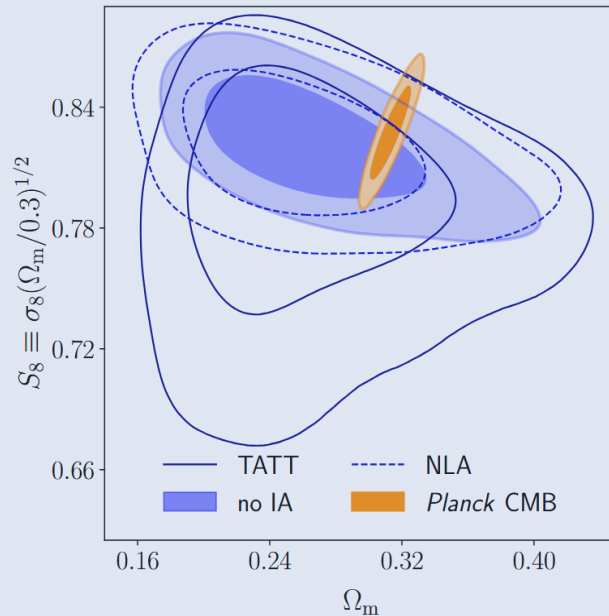
Measurements of intrinsic alignments of faint, blue galaxies like those dominating lensing surveys are **uncertain**

Siegel, McCullough, Amon+ (in prep)



Unknown color-redshift relation for faint galaxies with high precision

McCullough+2024



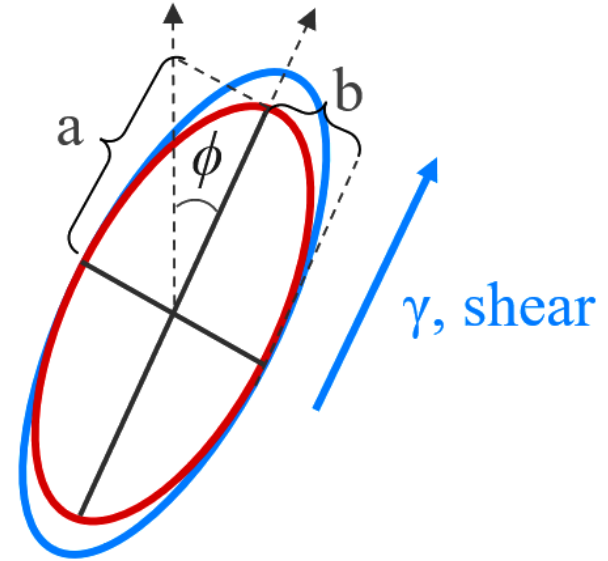
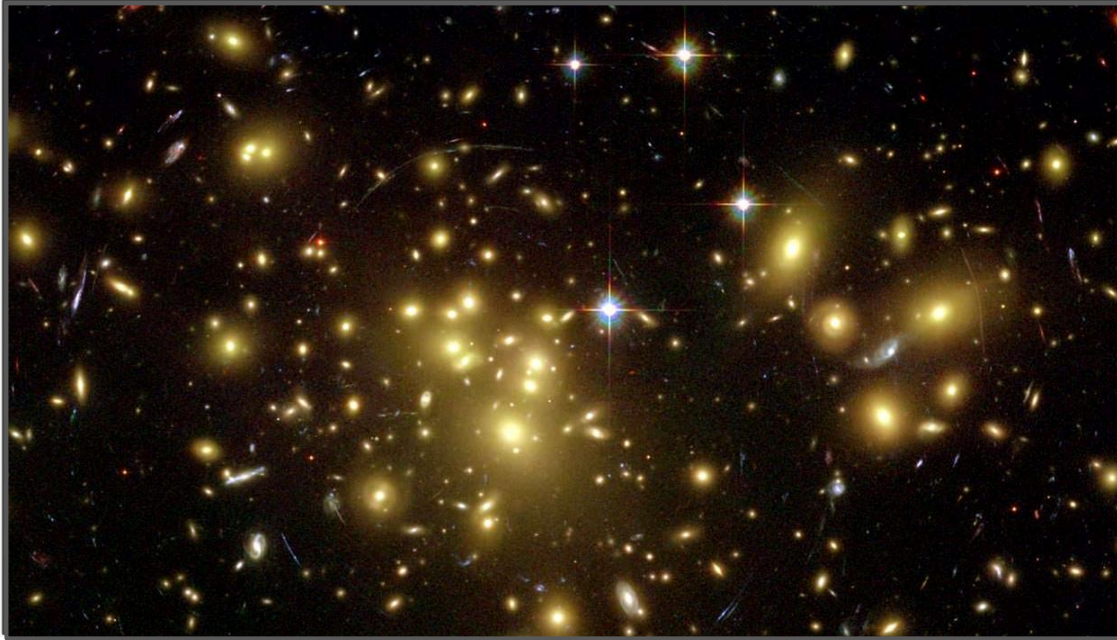
More accurate intrinsic alignment models dramatically **limit our cosmological constraints**

McCullough, Amon, Legnani, Gruen+ 2024

Blue cosmic shear

02

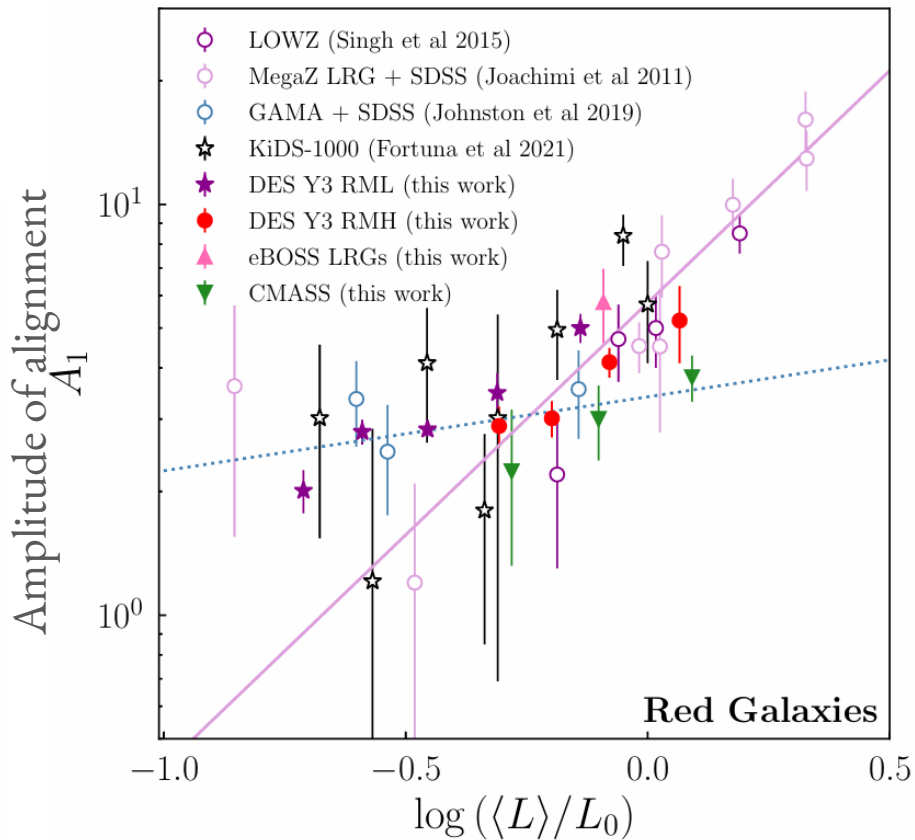
Intrinsic alignment can masquerade as cosmic shear



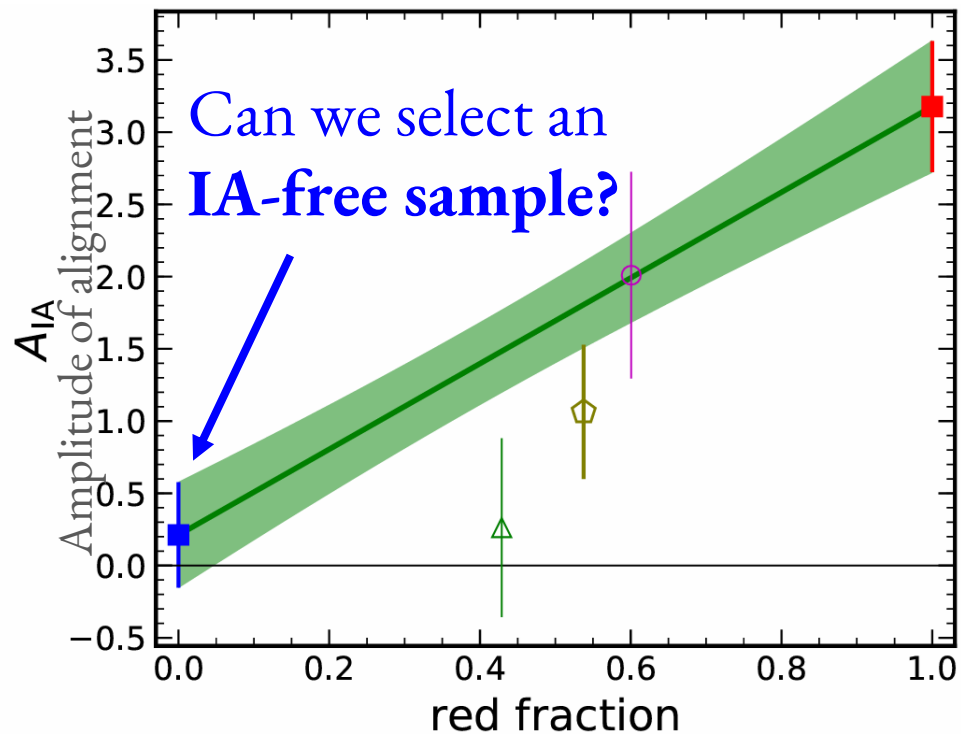
$$\langle e_i^{true} \rangle \approx \mathbf{0},$$

$$\langle e_i^{obs} \rangle \approx \langle \gamma + e_i^{int} \rangle$$

Do we understand intrinsic alignment in lensing survey populations?



Samuroff+2023



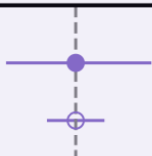
Johnston+2019 (KiDS + GAMA)

Weak lensing challenge: modelling the **intrinsic alignment** of galaxies

[adapted from DES Y3, *Amon+ 21*]

DES data: Fiducial analysis

DES data: No astrophysical uncertainties

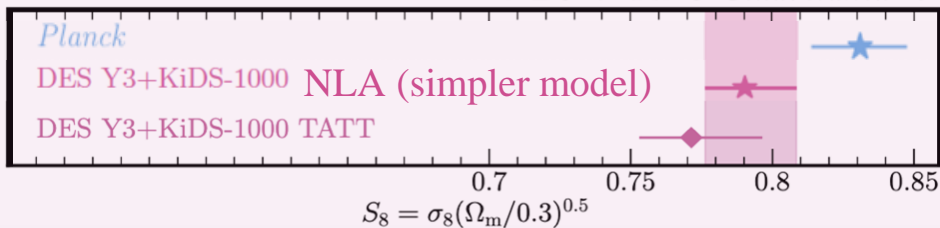


Clustering Amplitude, $S_8 = \sigma_8(\Omega_m/0.3)^{0.5}$

- **Severe limitation** from **astrophysical uncertainties** (feedback intrinsic alignment)

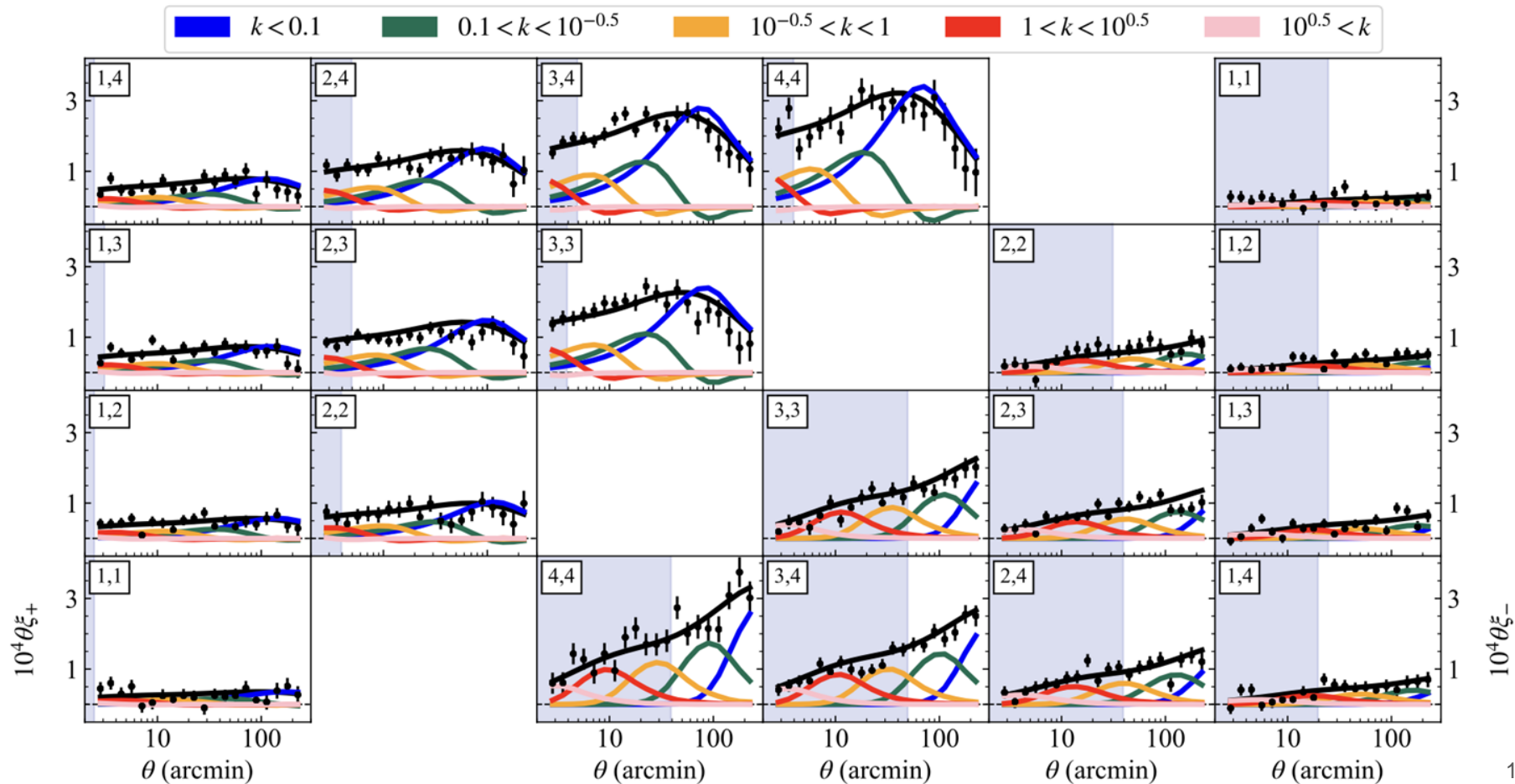
Bigwood+2024

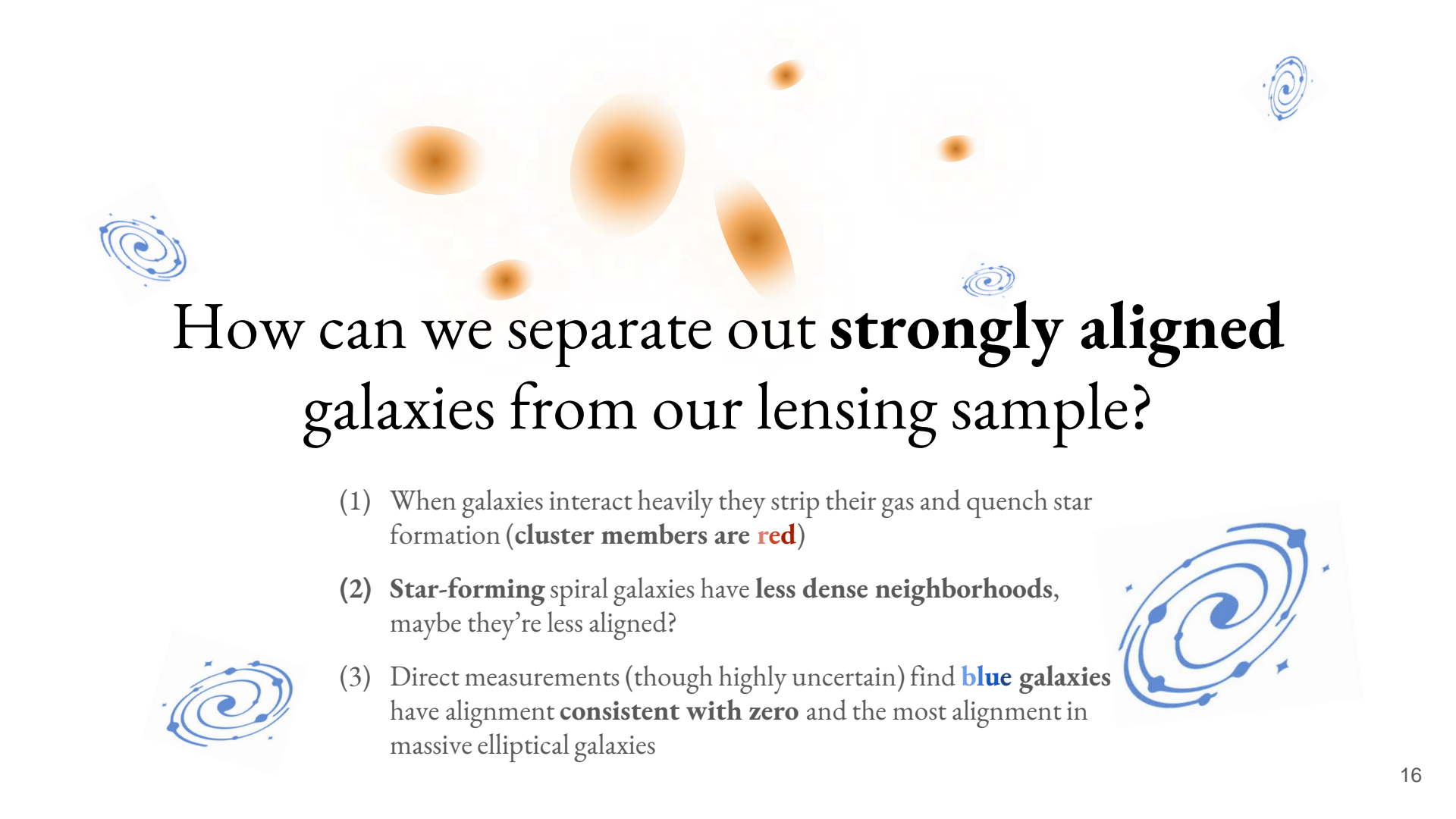
DES & KiDS Collaboration 23



- **Shift in cosmology** with **choice of intrinsic alignment model** (0.5-1 σ)

Cosmic shear is dominated by small k , but **mixes many scales** across redshift bins. (*Preston et al 2023, DES Y3*)



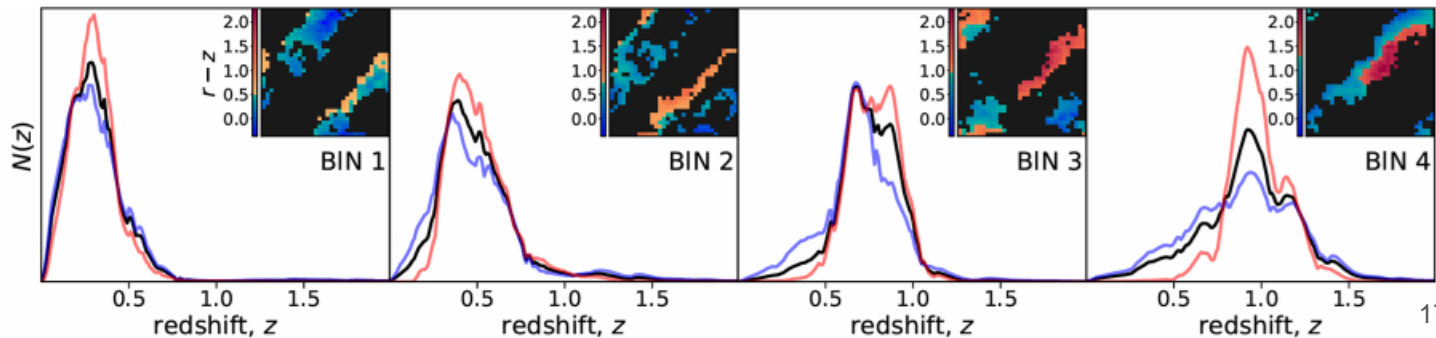
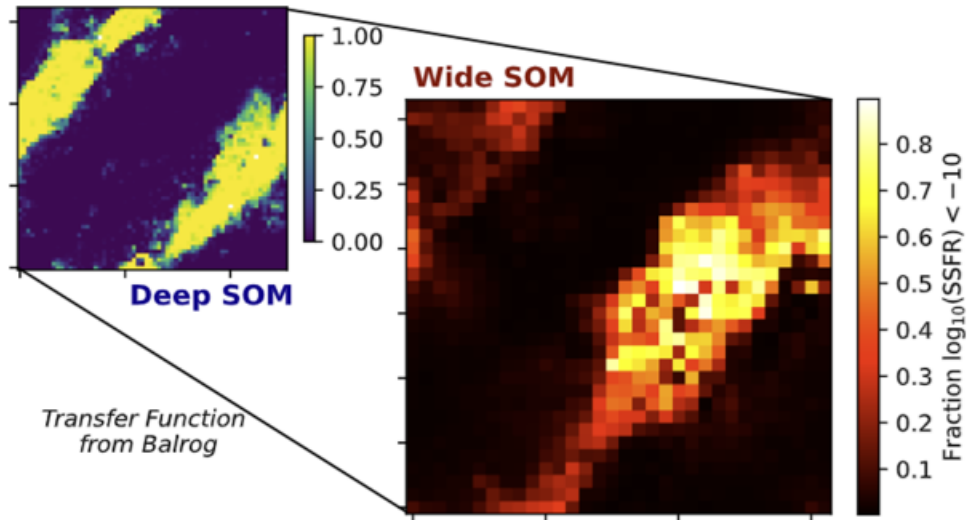


How can we separate out **strongly aligned** galaxies from our lensing sample?

- (1) When galaxies interact heavily they strip their gas and quench star formation (**cluster members are red**)
- (2) **Star-forming** spiral galaxies have **less dense neighborhoods**, maybe they're less aligned?
- (3) Direct measurements (though highly uncertain) find **blue galaxies** have alignment **consistent with zero** and the most alignment in massive elliptical galaxies

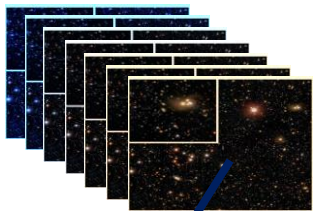
Let's pick a **pure sample** of star-forming spirals:

- We can select on **color** and **distance** to identify star-forming galaxies (e.g., with SOMPZ cells informed by deep field SED fitting)
- We repeat the Y3 cosmic shear analysis with our new sample (~65 million galaxies), redoing redshift and shear calibration.



The Ingredients for Lensing (ex. The Dark Energy Survey)

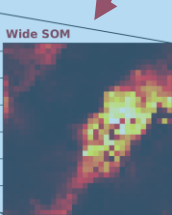
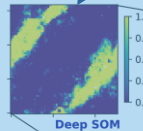
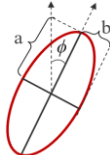
Deep Field **images**
(*ugriz/HKs* fluxes)



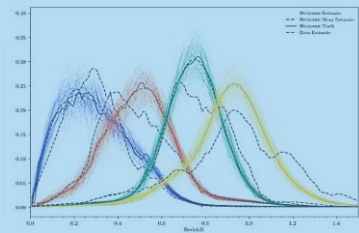
Wide Field **images**
(*riz* fluxes)



shape
measurement



Transfer Function
from Balrog

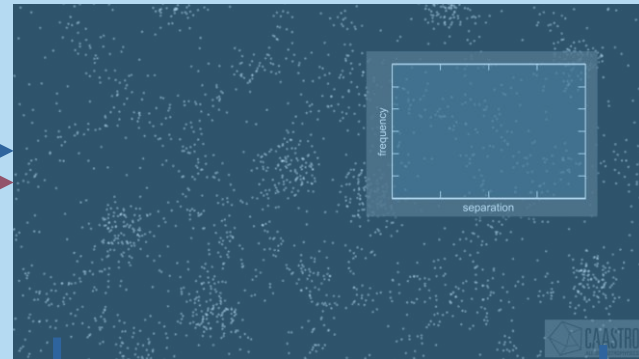
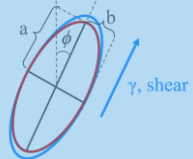


ensemble **distance** inference,
(*photometric redshifts*)

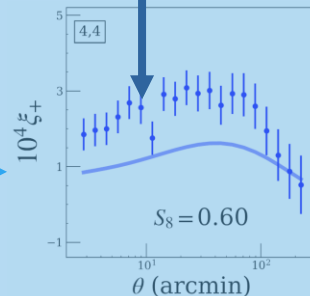
(image **simulations**)



shape to **shear**
(*shear bias*)



two-point correlation
Source: CAASTRO

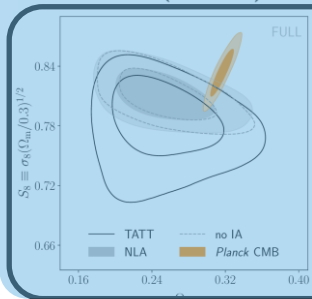


Modeling our
measurements

- baryon feedback
- intrinsic alignments

**Constraints on our
cosmological model**

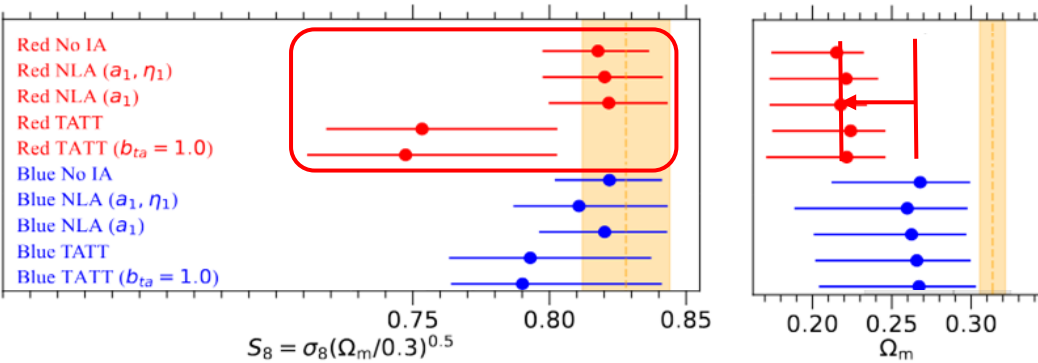
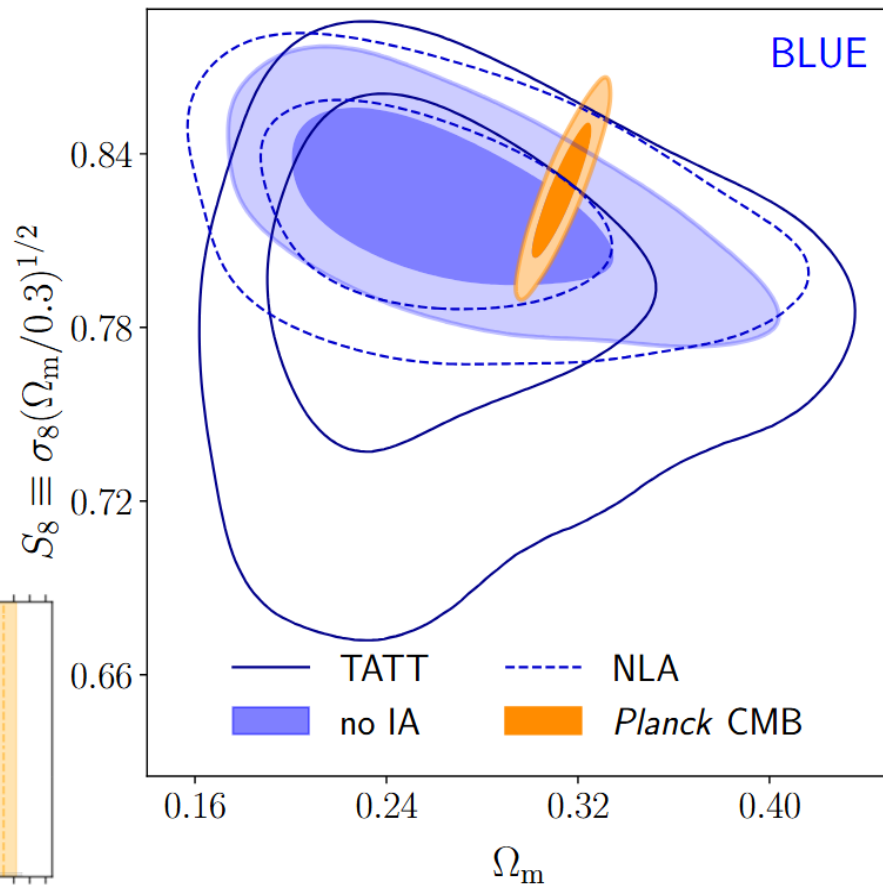
- Matter fluctuation amplitude, S_8
- Matter density, Ω_m



With a **blue**, star-forming selection of **galaxies** we find:

- **Consistent cosmology & improved goodness-of-fit regardless of IA model.**
- **Data prefer the *no IA* model & more complex IA model parameters consistent with zero**

Compared to the **red sample** complement, our results have a **higher Ω_m** and **minimize shifts in S_8** due to IA model choice

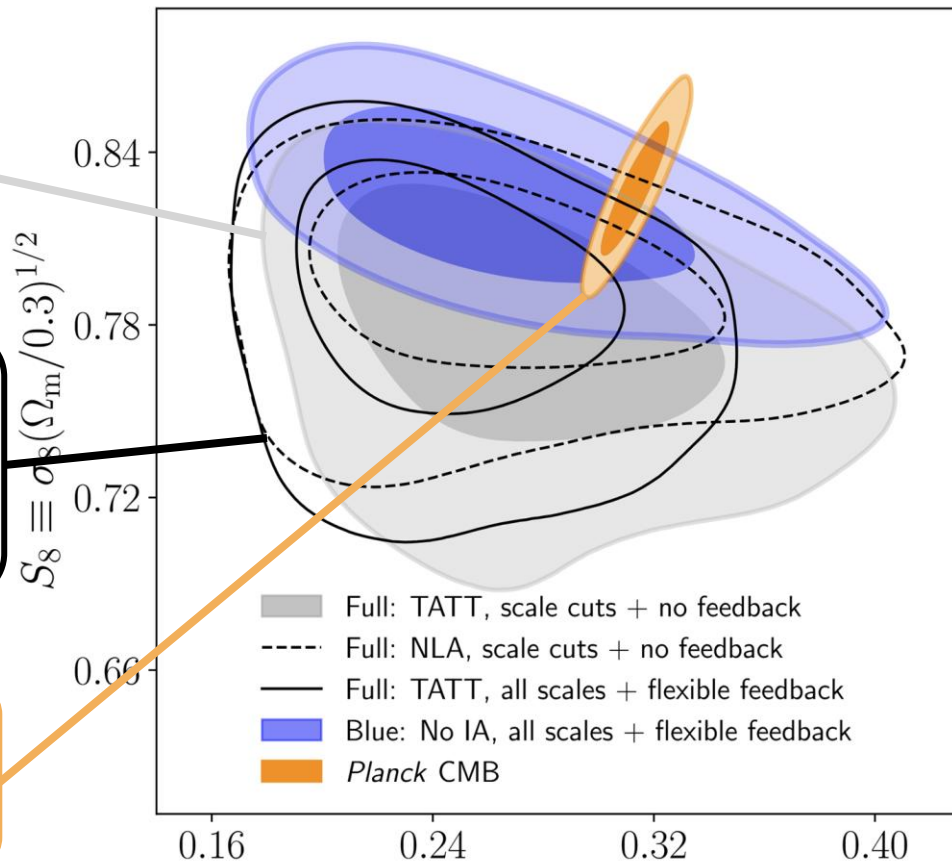


With a **blue**, star-forming selection of **galaxies** we find:

Compared to **fiducial DES Y3** approach, the **blue** constraints have **$\sim 1.5\times$ smaller uncertainties**

Improvement due to IA choices: even with consistent feedback modelling, **blue** constraints **$\sim 1.5\times$ smaller** than Full + complex TATT model

The blue result is in better agreement with **Planck CMB constraints** ($\sim 0.2\sigma$ in S_8)

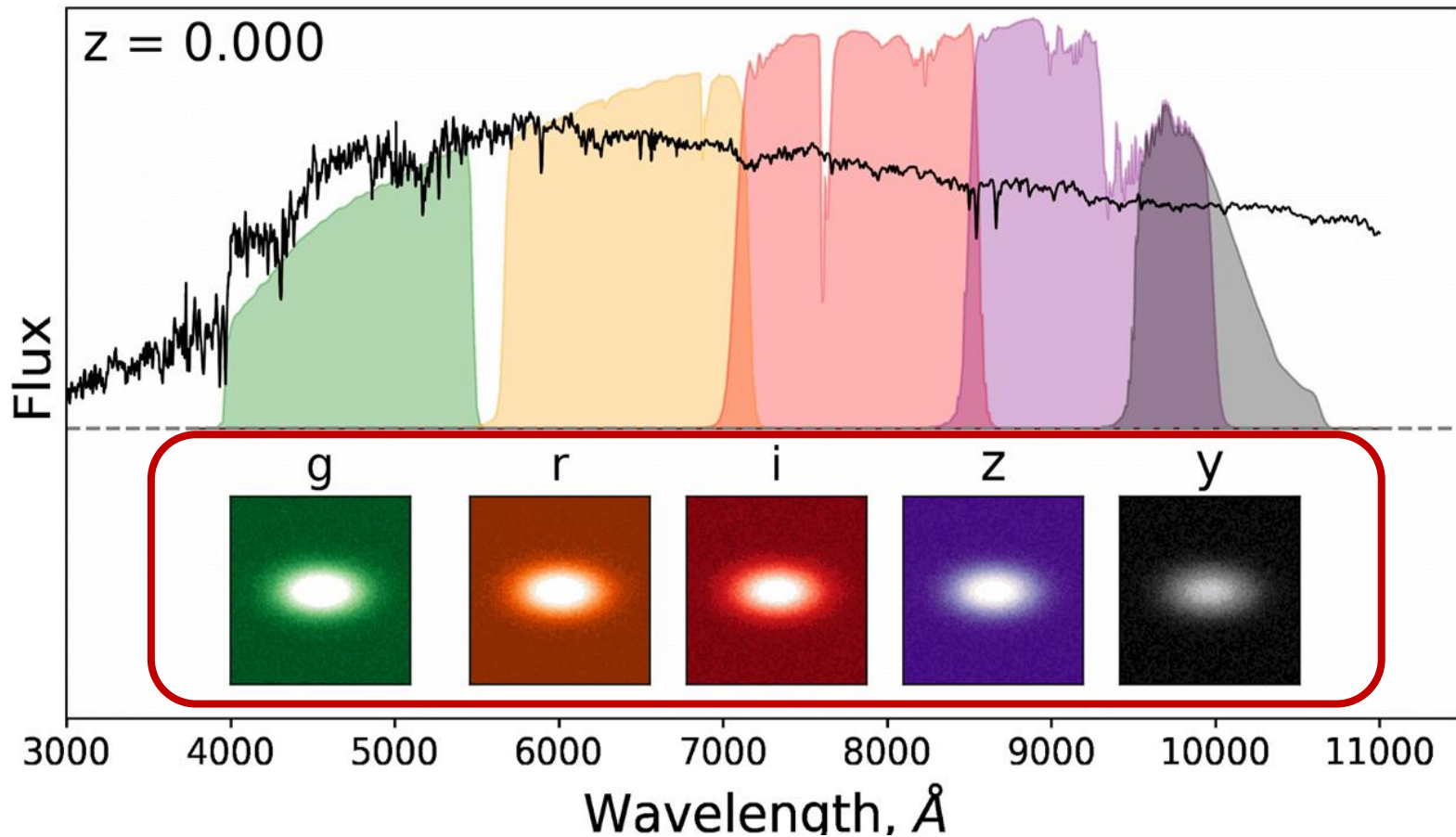


03

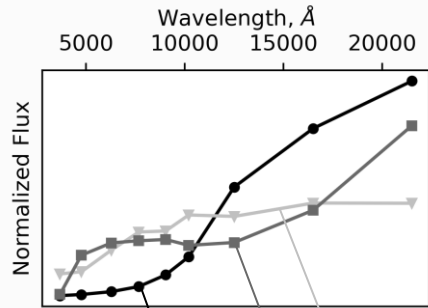
**Massively
multiplexed
spectroscopy**



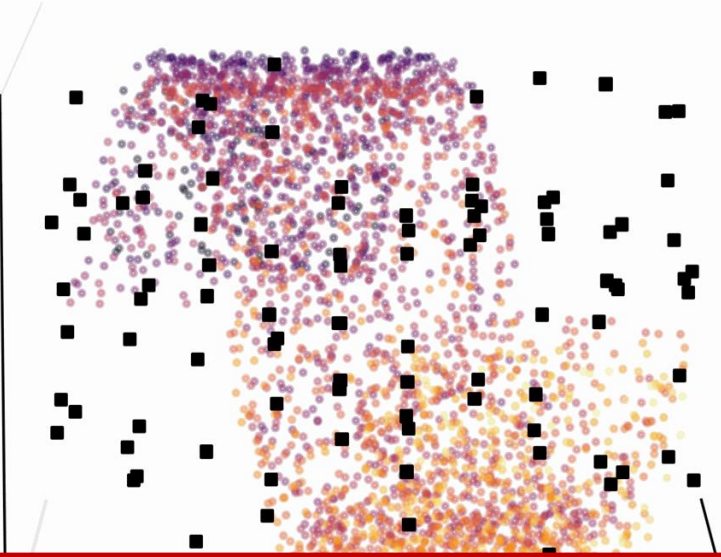
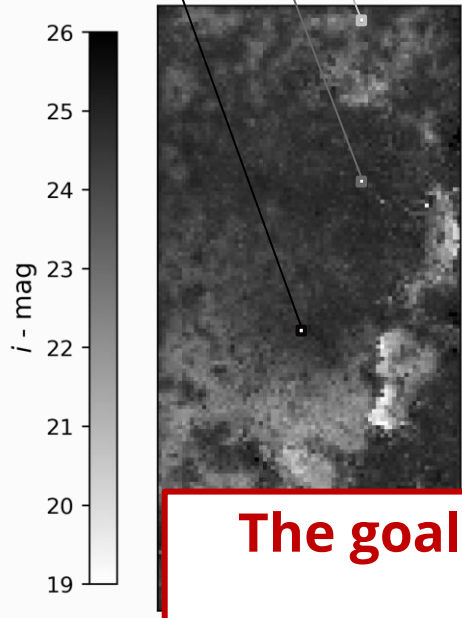
For most lensing we only have **images...**



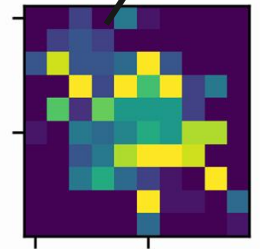
Self-organizing maps discretize optical + infrared color-space



galaxy color weights



(x,y,z) weight



Occupancy

The goal: get reliable redshifts for galaxies where we have comprehensive photometric coverage

The 4MOST Complete Calibration of the Color-Redshift Relation

(4C3R2) Pls: JM & Daniel Gruen

Allocated **980k fiber hours** ~3% of all 4MOST!

4C3R2 aims to cover to $z < 1.55$

- in wide, ~45 per cell ($Z < 21.5$)
- in deep, ~10 per cell ($Z < 22$)

More telescope time than has ever been granted to a photo-z calibration effort!

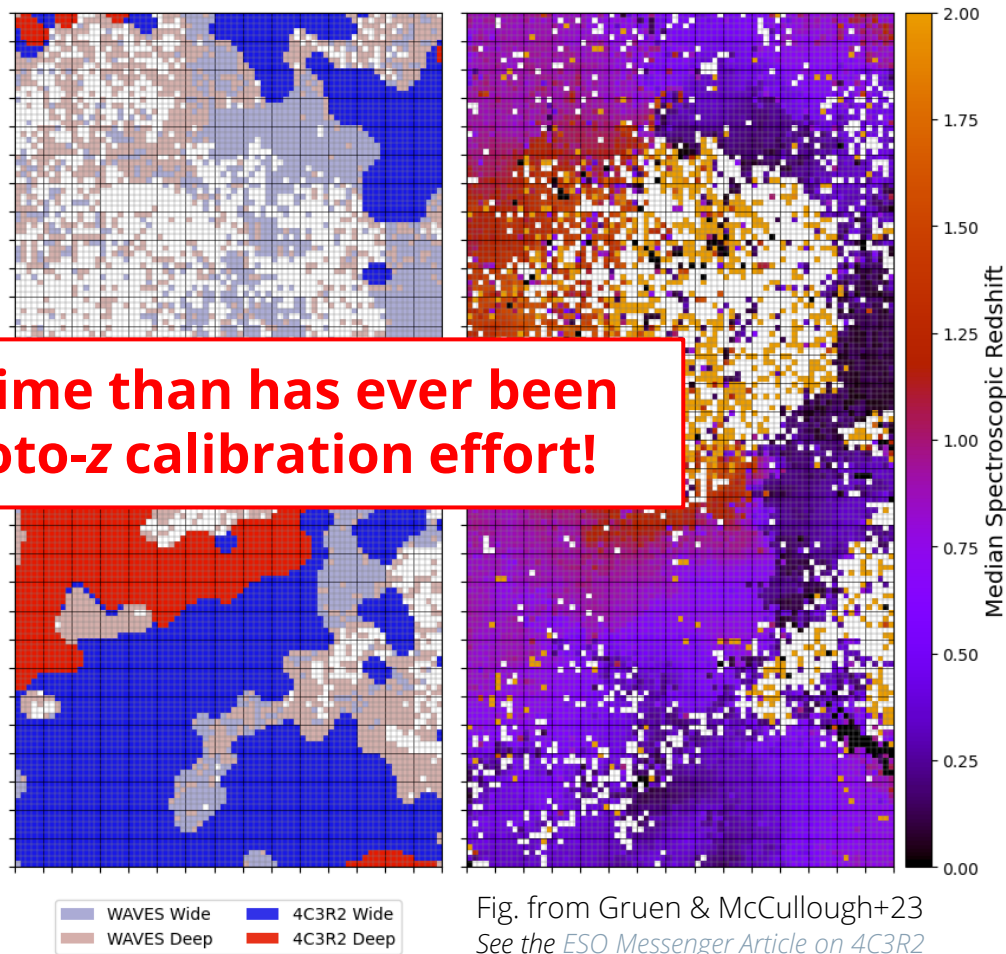
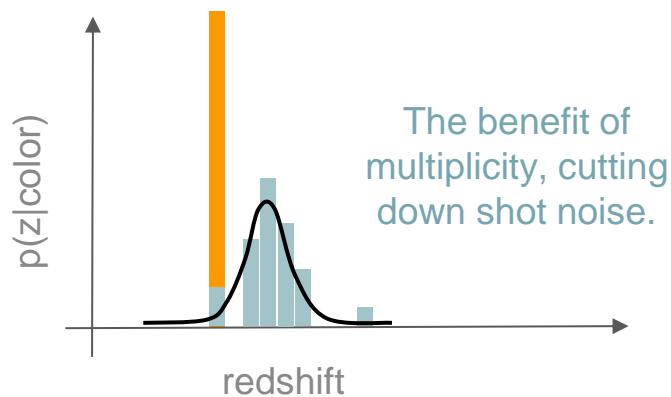


Fig. from Gruen & McCullough+23
See the [ESO Messenger Article on 4C3R2](#)

The Dark Energy Spectroscopic Instrument (DESI)



and the DESI Complete Calibration of the Color-
Redshift Relation (DC3R2) spare fiber program

The magnitude problem

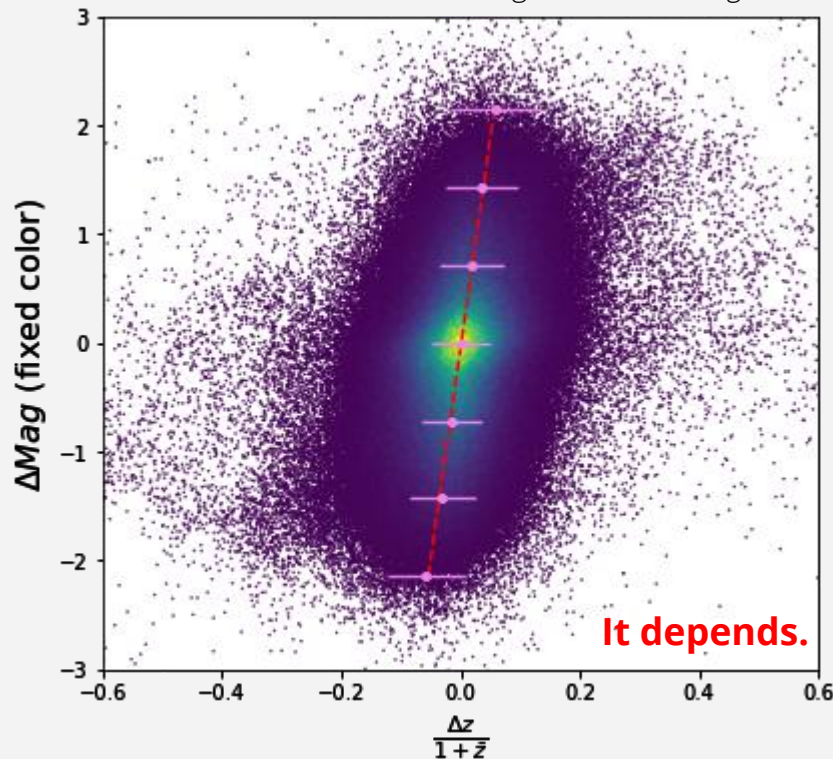
If galaxies have the same color (spectral shape), do bright things look like faint things?

Bright things are easier to observe.

If we have to calibrate color-redshift-magnitude, it will take *months* of dedicated time uninterrupted on multiplexed telescopes.

Shallower observations

Fig. from McCullough+24



$$\frac{\Delta z}{(1+\bar{z})} \approx \Delta(dz/dm) \times (\bar{m}_{\text{wide}} - \bar{m}_{\text{spec}}) \approx 0.001 \text{ (DESC Y10)}$$

With DESI spec-z alone $\Delta(dz/dm) \leq 0.0005$

A proposal: DESI-Deep

Co-leading w/ Biprateep Dey in the C3 photo-z topical group, with others incl. Noah Weaverdyck, Johannes Lange

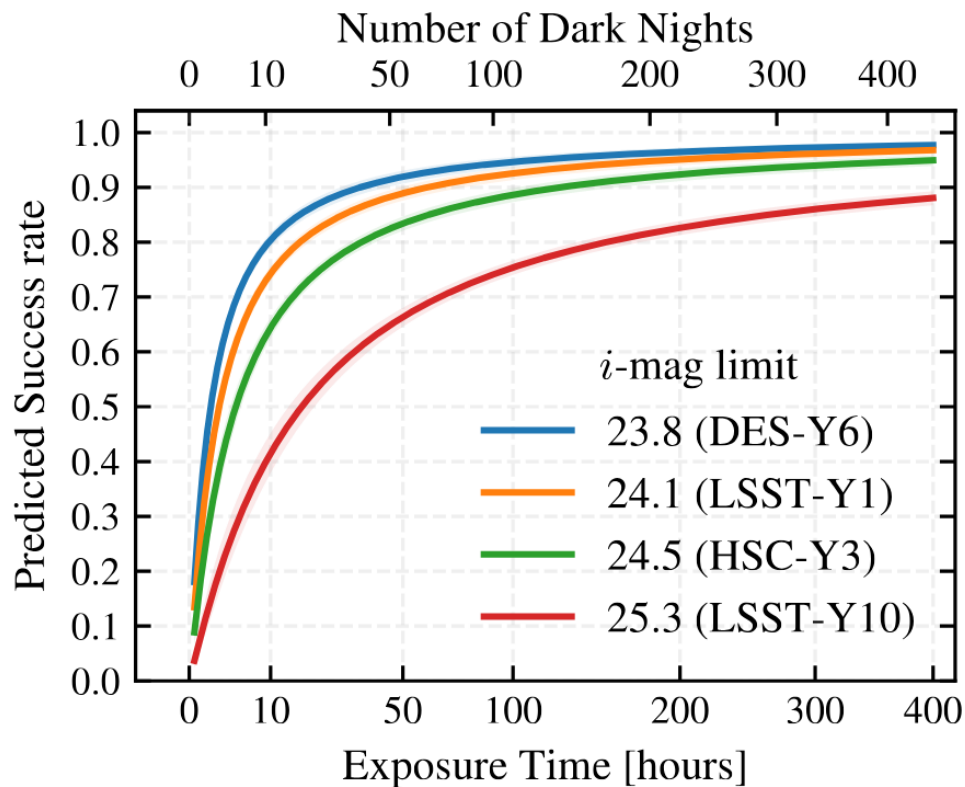


Fig. from *Dey+(in prep)*

Target a **representative magnitude selected sample** for as faint as is feasible in lensing deep drilling fields.

DESI is as efficient as Keck at observing faint objects, and multiplexed.

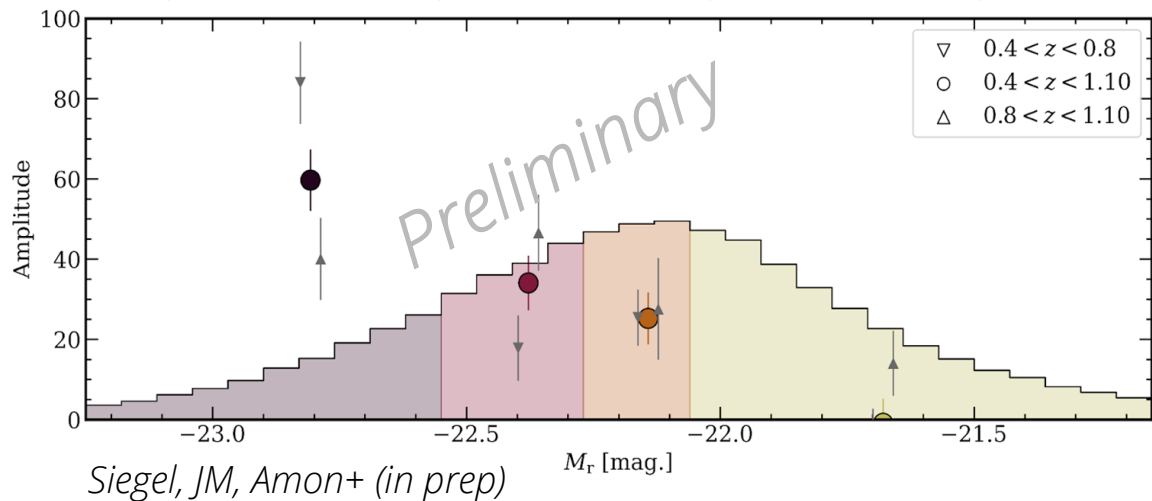
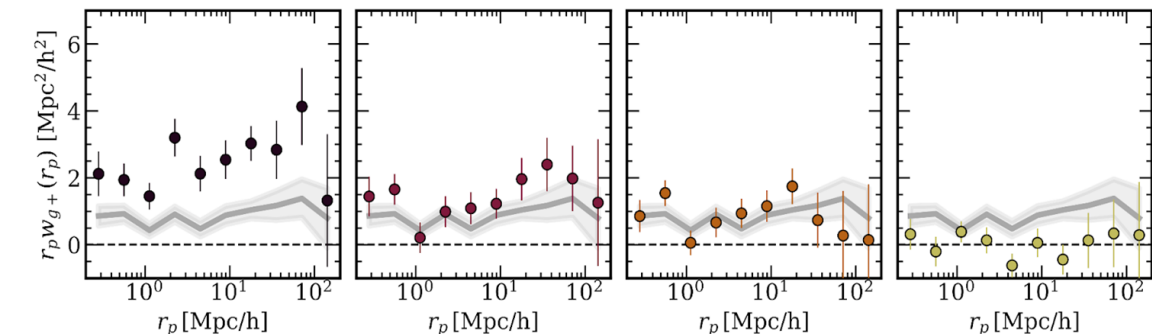
Avoiding complex color-selections as much as possible.



**Data-driven
intrinsic
alignment**

04

How does alignment depend on galaxy luminosity?

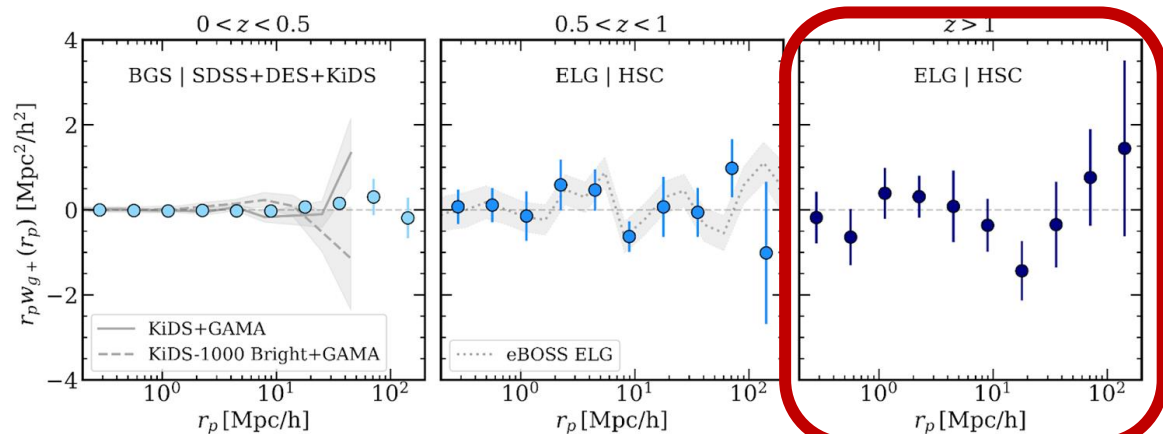


DESI Y1 overlap with SDSS+KiDS+HSC+DES yields >22x more galaxies with precise positions and shapes than have ever been used to measure IA

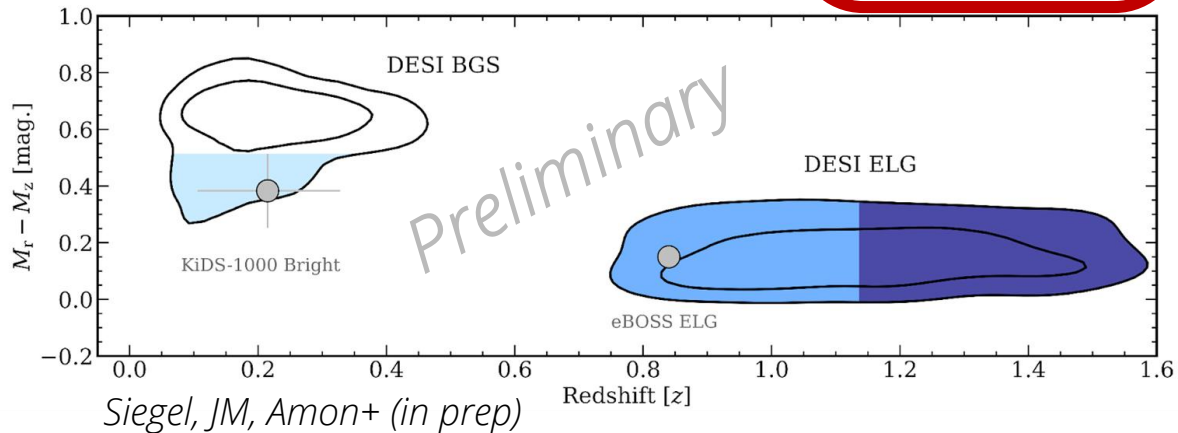
Princeton grad student, **Jared Siegel** leading this in DESI-Y1



How does alignment depend on galaxy color?



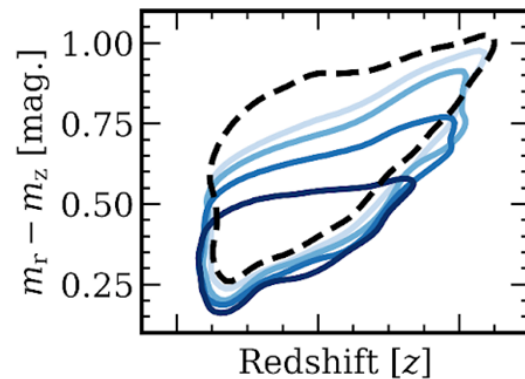
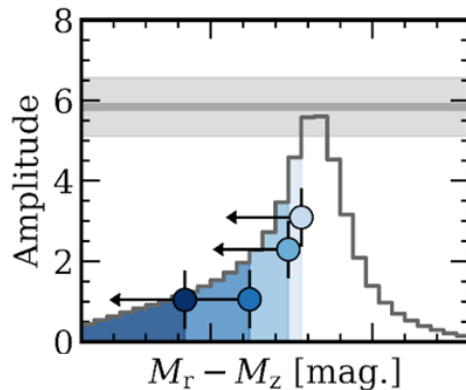
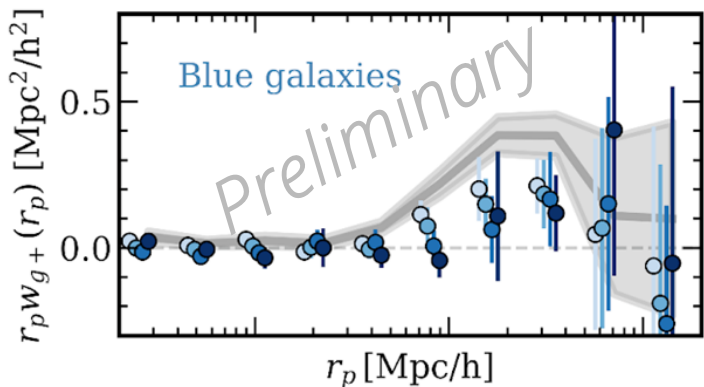
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How does alignment depend on galaxy color?



Siegel, JM, Amon+ (in prep)

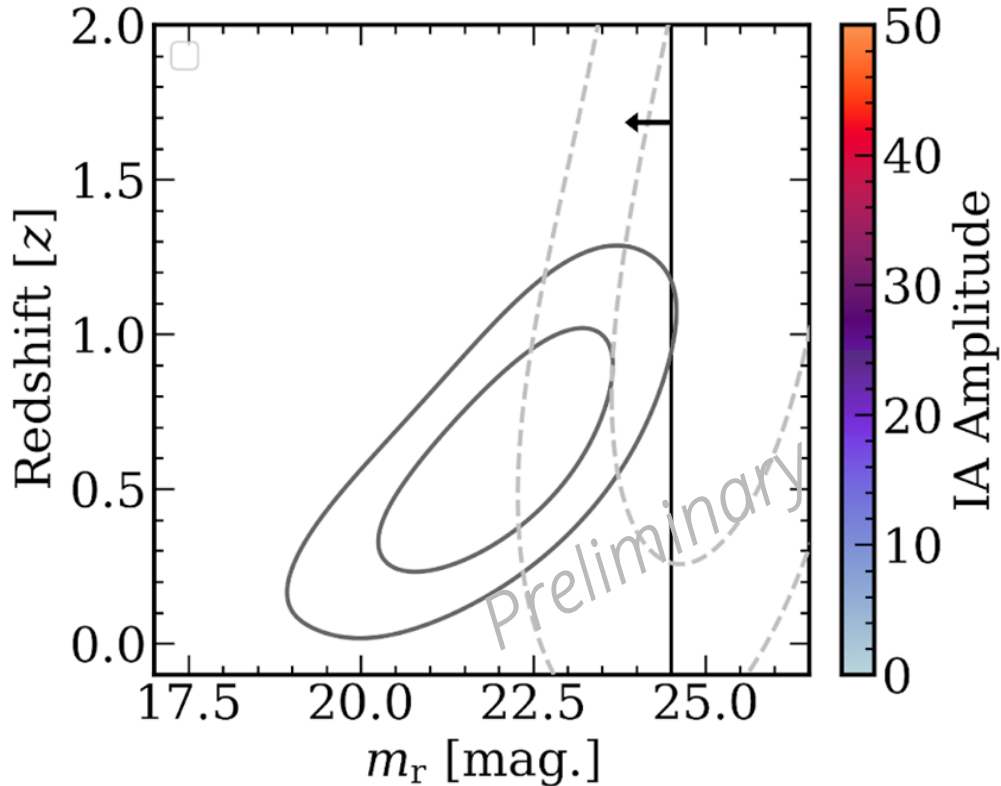
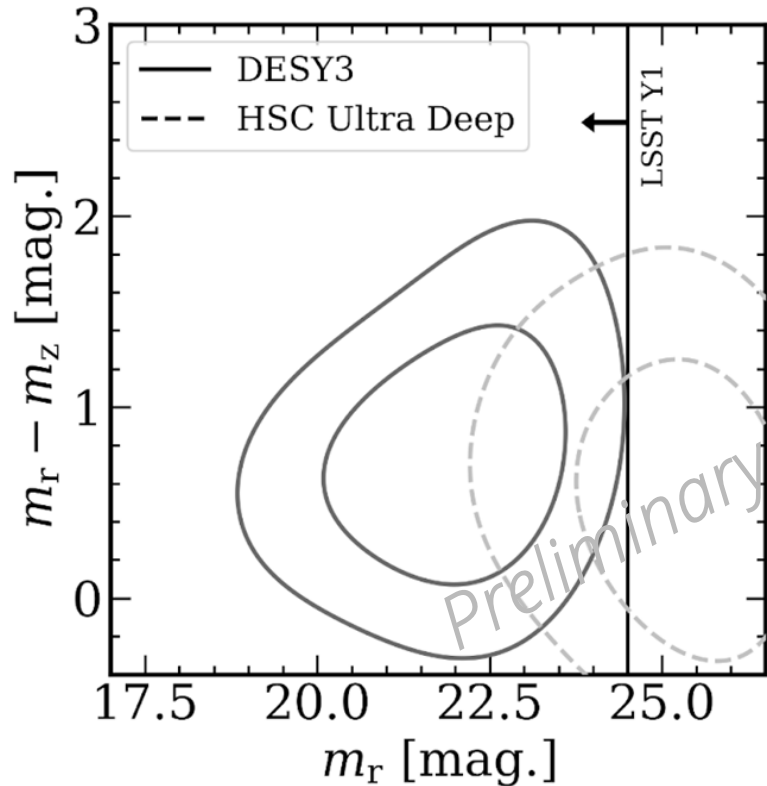
Fine property splits in DESI samples can isolate drivers of alignment and help tune future selections in lensing surveys

Princeton grad student, **Jared Siegel** leading this in DESI-Y1



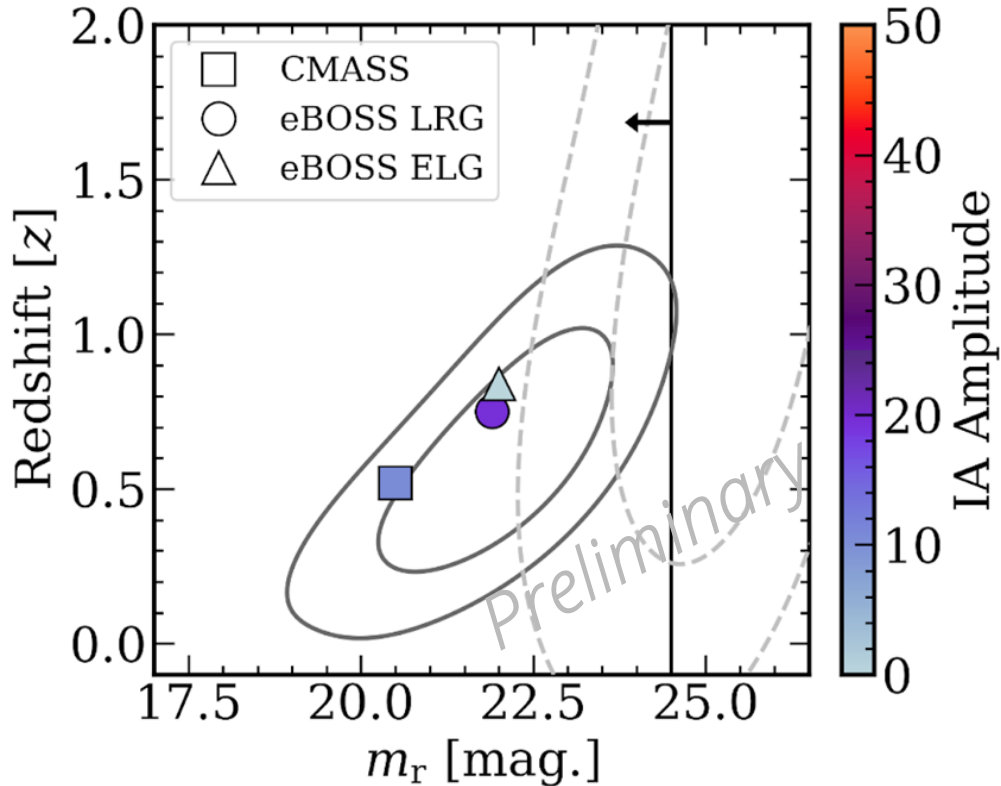
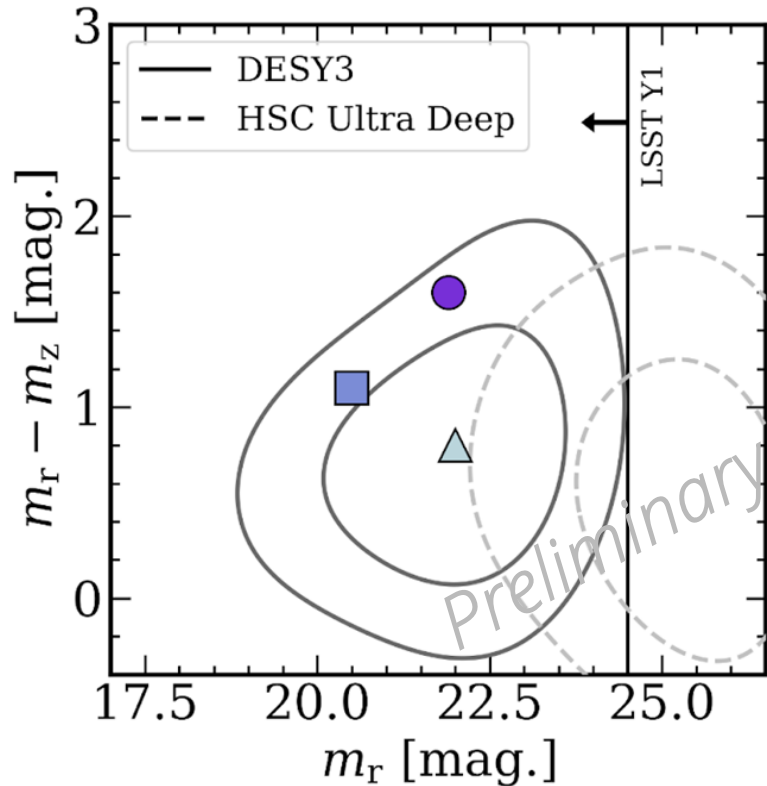
Where do we go from here?

Siegel, JM, Amon+ (in prep)



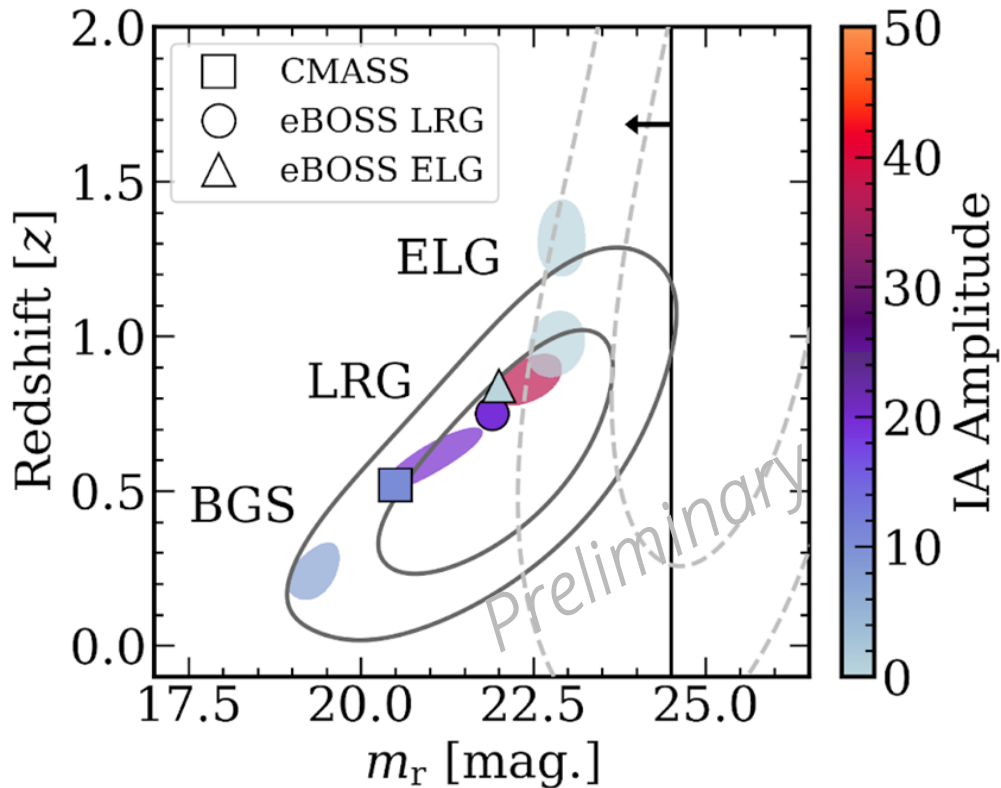
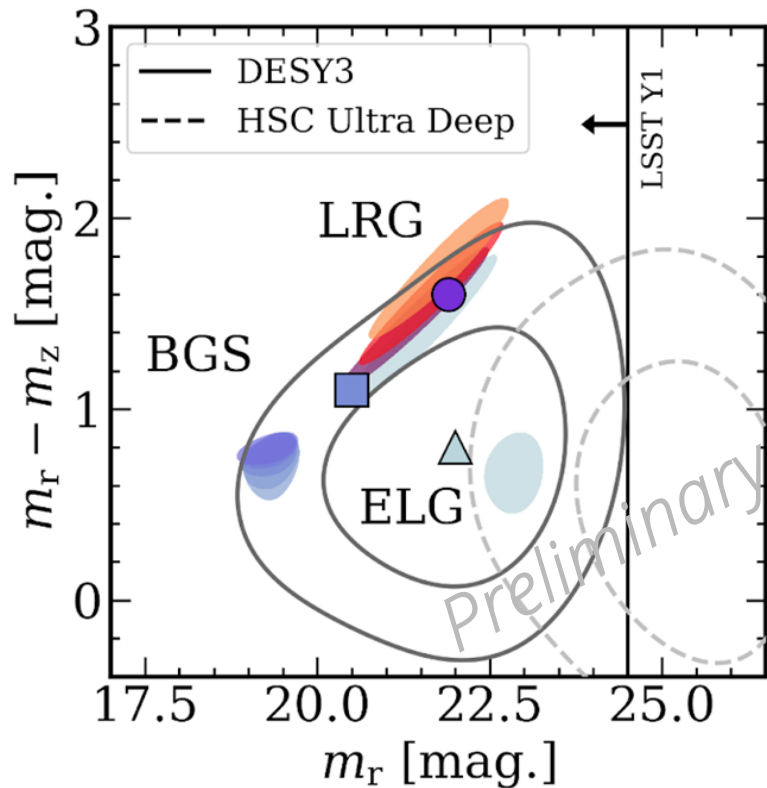
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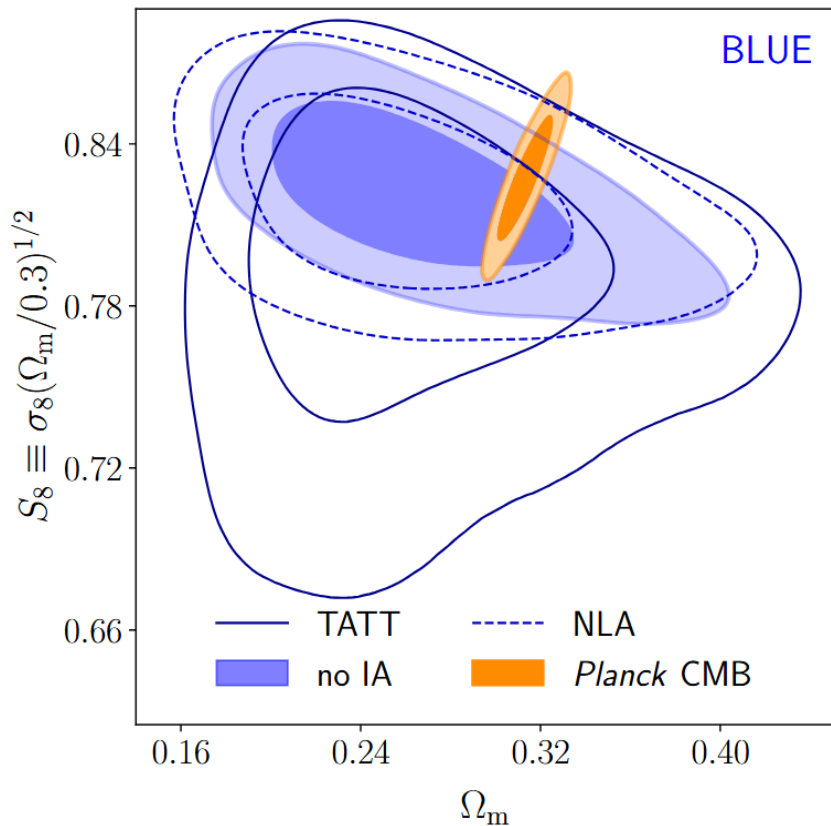


Where do we go from here?

Siegel, JM, Amon+ (in prep)



Previously... pure, blue galaxies in DES have no alignment



McCullough, Amon, Legnani, Gruen+ 2024

Pros:

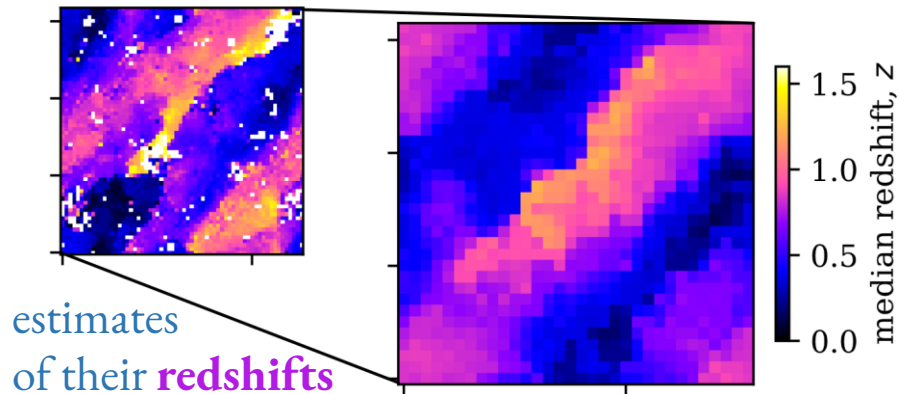
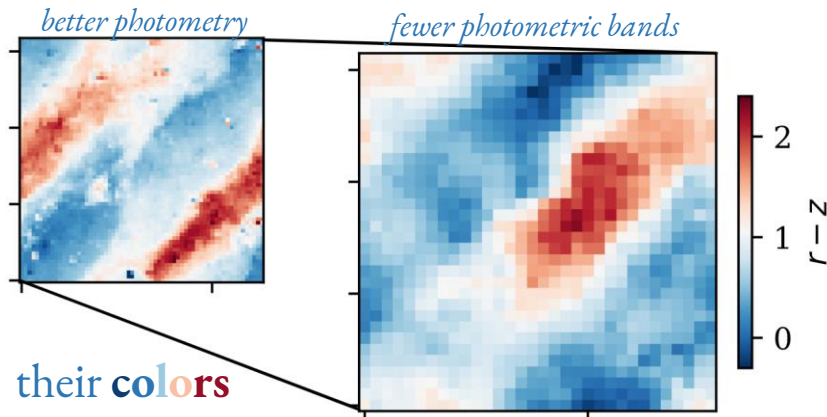
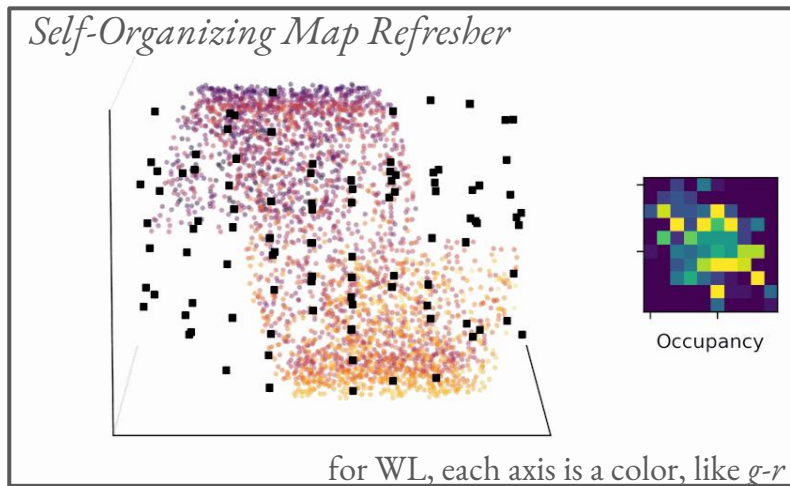
- Can eliminate 5 free parameters in our modeling, **1.5x constraining power**
- Can use all scales (w/ flexible baryon feedback)

Cons:

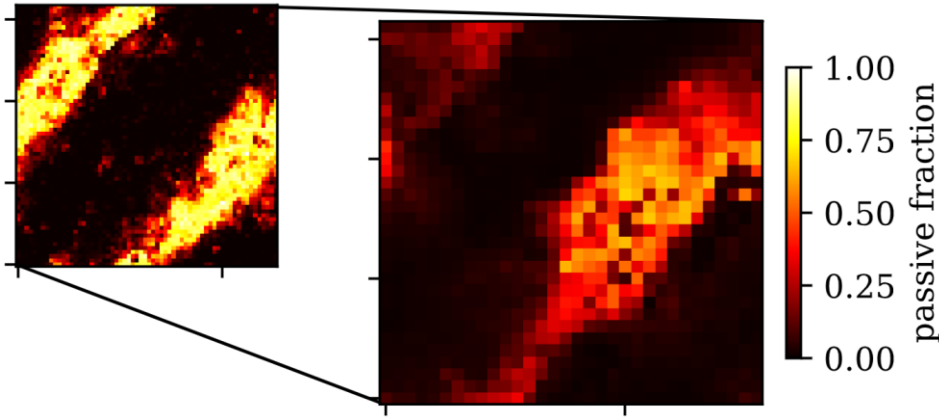
- **Lose statistics** – we toss away up to $\frac{1}{3}$ of the sample
- No direct observation that *all* of the galaxies we select have no alignment

Solution: Use **direct observations** and what we know about **galaxy properties** to set a **prior**.

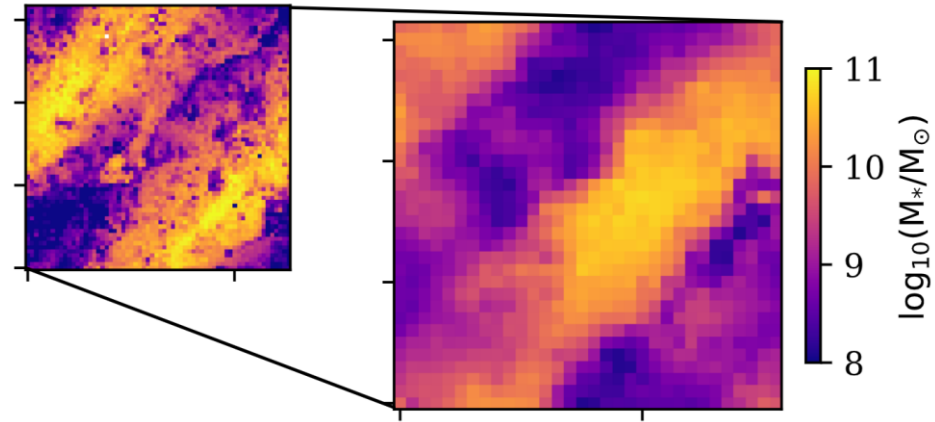
What do we know about galaxies?



What do we know alignment depends on?



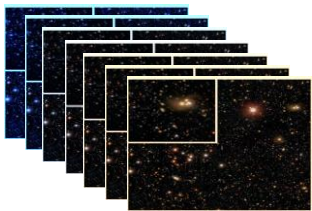
estimates of their **passive fraction**



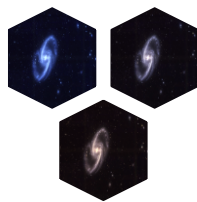
estimates of their **stellar mass and luminosity**

$$A_{IA}(b) = \sum_{c \in b} w_c N_c f_{r,c} A_{IA}(L) \quad A(L) = A_\beta \left(\frac{L}{L_{\text{break}}} \right)^\beta \quad \text{with} \quad \begin{cases} \beta = \beta_1 & \text{for } L < L_{\text{break}} \\ \beta = \beta_2 & \text{for } L > L_{\text{break}} \end{cases}$$

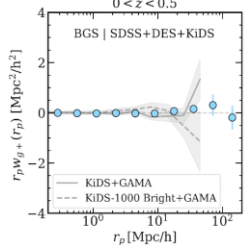
Deep Field **images**
(*ugrizJHKs* fluxes)



Wide Field **images**
(*riz* fluxes)

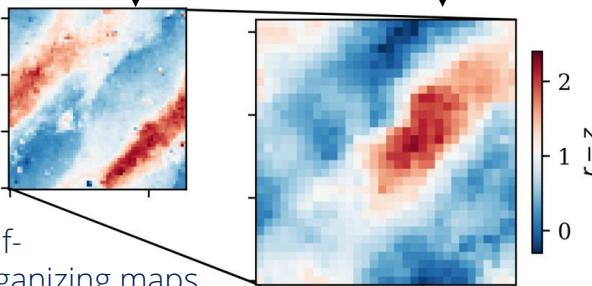
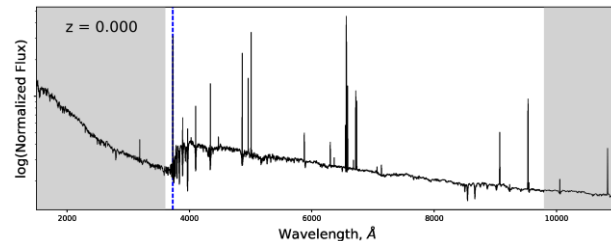


Direct measurements
of intrinsic alignment



Siegel, JM, Amon+2025

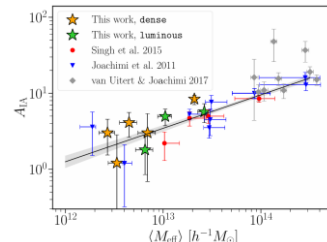
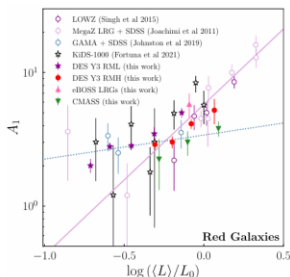
Spectroscopic surveys & many-band SED fits



self-organizing maps

wide-to-deep transfer function

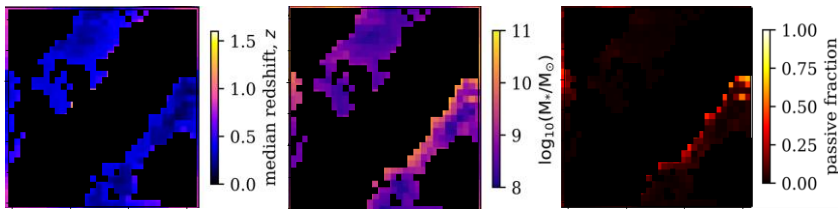
Empirical relations of IA v. properties



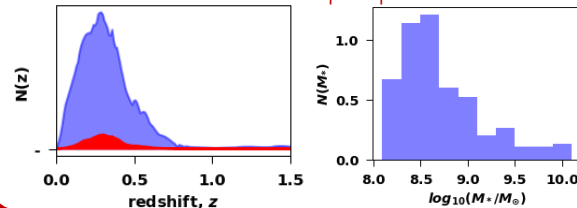
Fortuna+2025, Samuroff+2023

Semi-empirical
data-driven prior

Maps of galaxy properties tied to IA



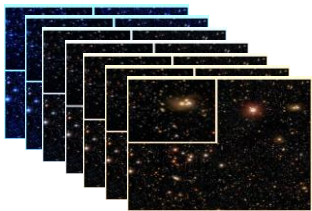
Weighted tomographic distributions
of IA-relevant properties



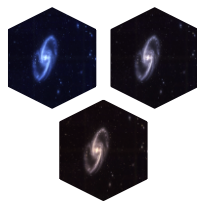
DESC
Project 389

JM, Amon, Siegel+, (in prep)

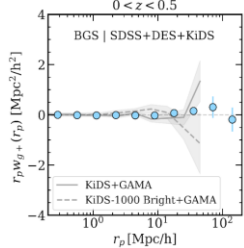
Deep Field **images**
(*ugrizJHKs* fluxes)



Wide Field **images**
(*riz* fluxes)

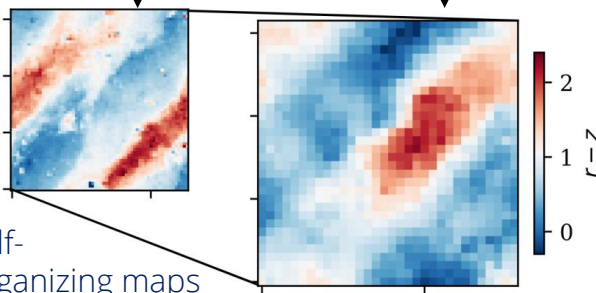
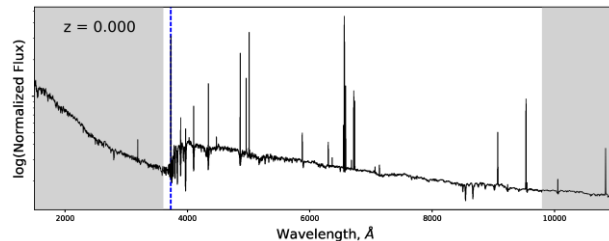


Direct measurements
of intrinsic alignment



Siegel, JM, Amon+2025

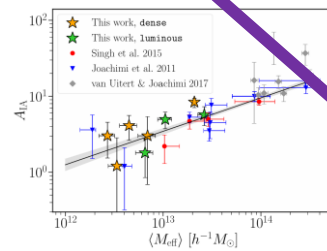
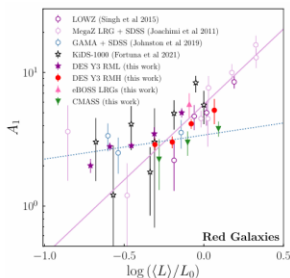
Spectroscopic surveys & many-band SED fits



self-organizing maps

wide-to-deep transfer function

Empirical relations of IA v. properties

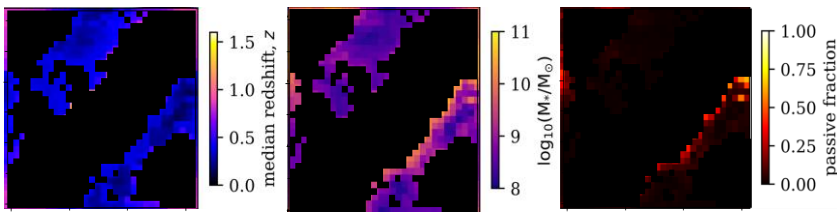


Fortuna+2025, Samuroff+2023

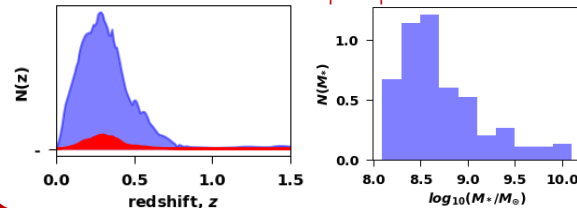
Semi-empirical
data-driven prior

Fully data-driven
prior for IA

Maps of galaxy properties tied to IA



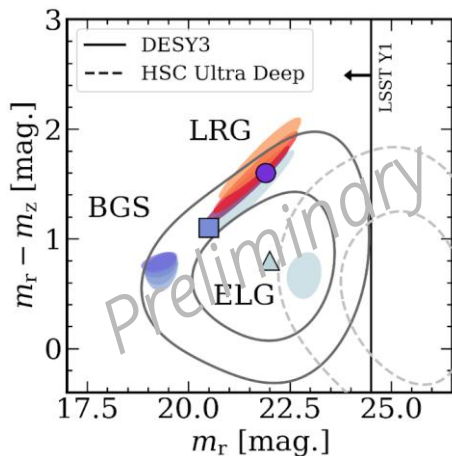
Weighted tomographic distributions
of IA-relevant properties



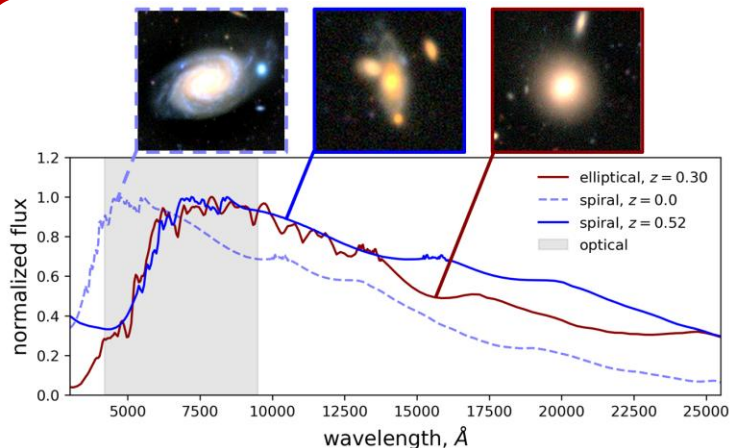
DESC
Project 389

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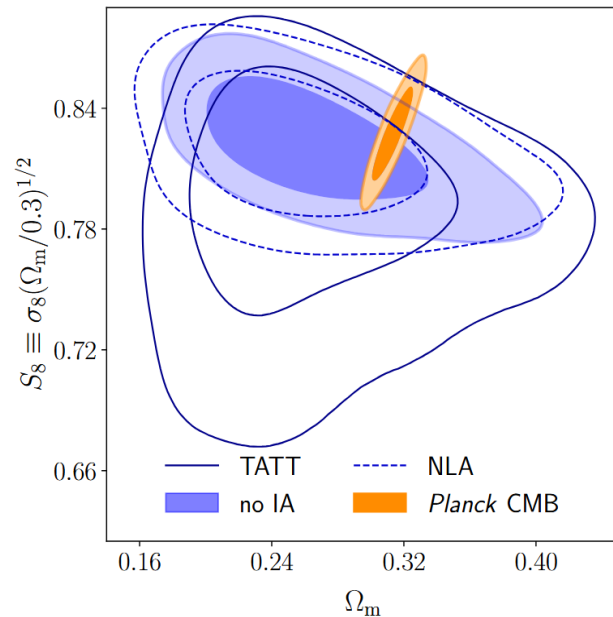
Upcoming Challenges & Conclusions



DESI can *roughly* span the space for LSST Y1, but we require more comprehensive high-z, high density spectroscopic tracers.



Proposed programs to get **representative deep spectra** on multiplexed spectrographs



Blue shear is an approach to reduce systematic bias from IA, and a stepping stone to building data-driven inference to regain lost statistical power