



THE DARK ENERGY SURVEY

# Spectroscopic SNeIa 3-Year Cosmology Results

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On behalf of the DES Supernova Working Group

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South American Workshop on Cosmology in the LSST Era - December 17th 2018





# **Motivation**

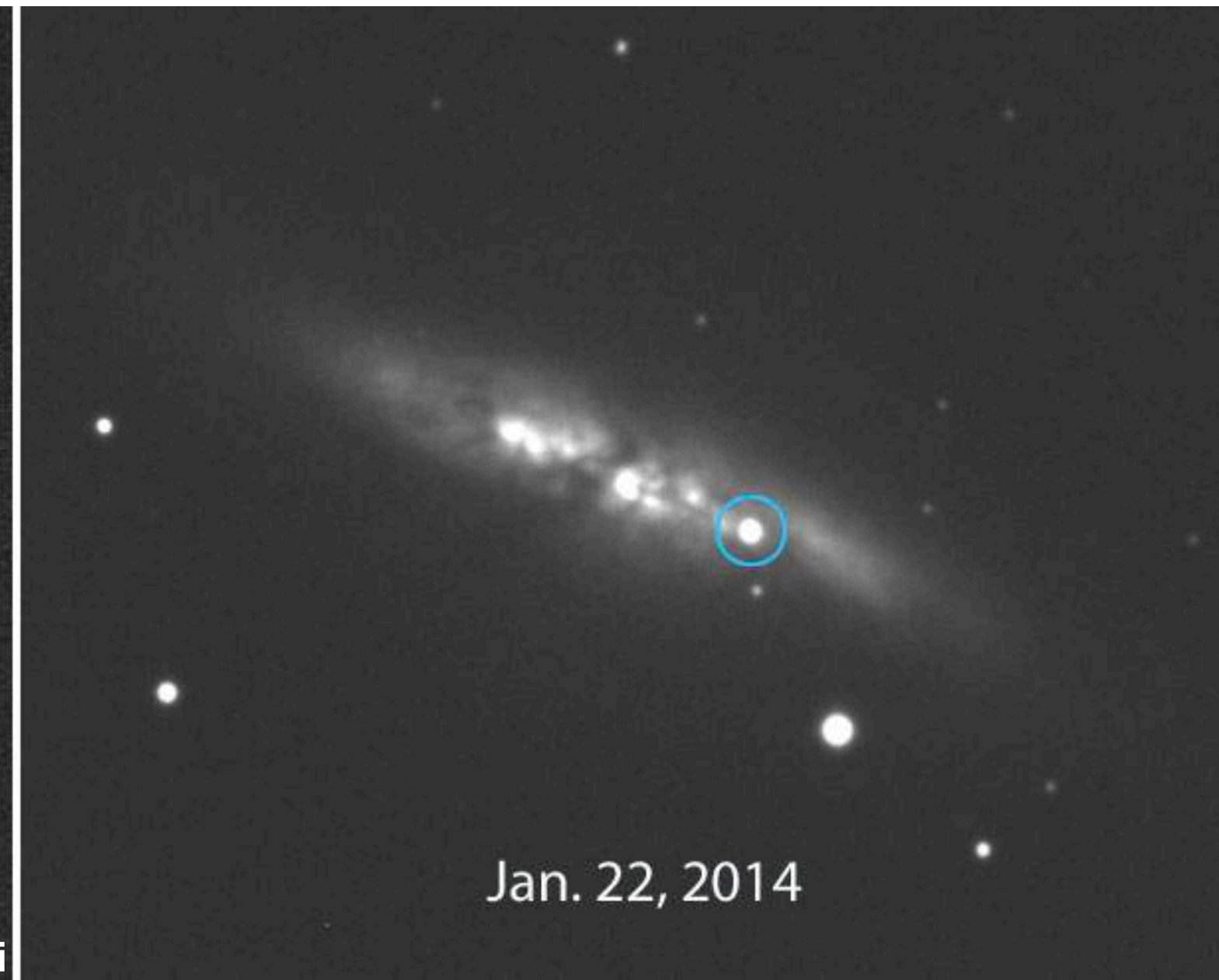
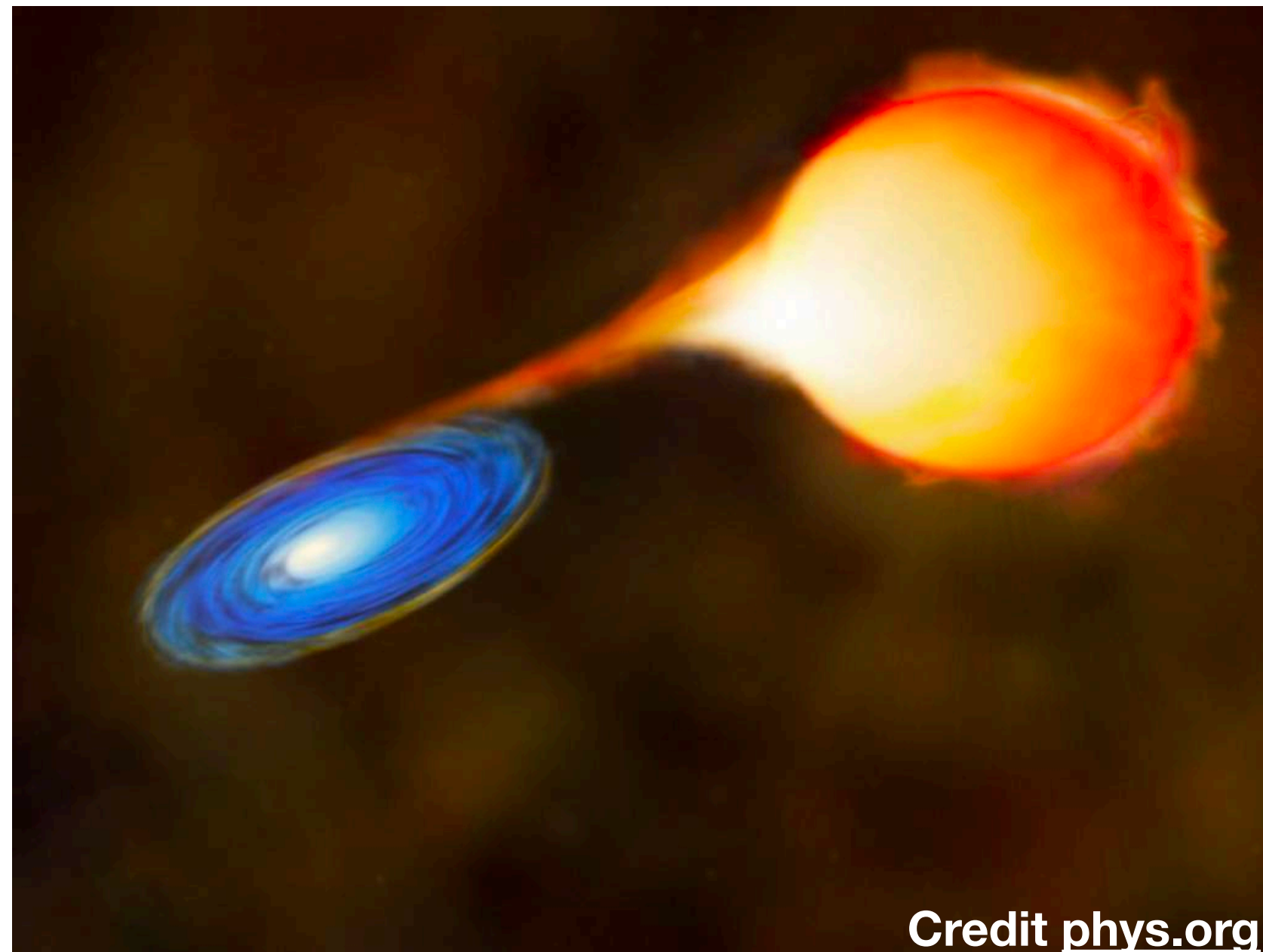
**Ingredients for SN Ia Cosmology**

**Results from the First 3 Years**

**The Future of DES-SN**



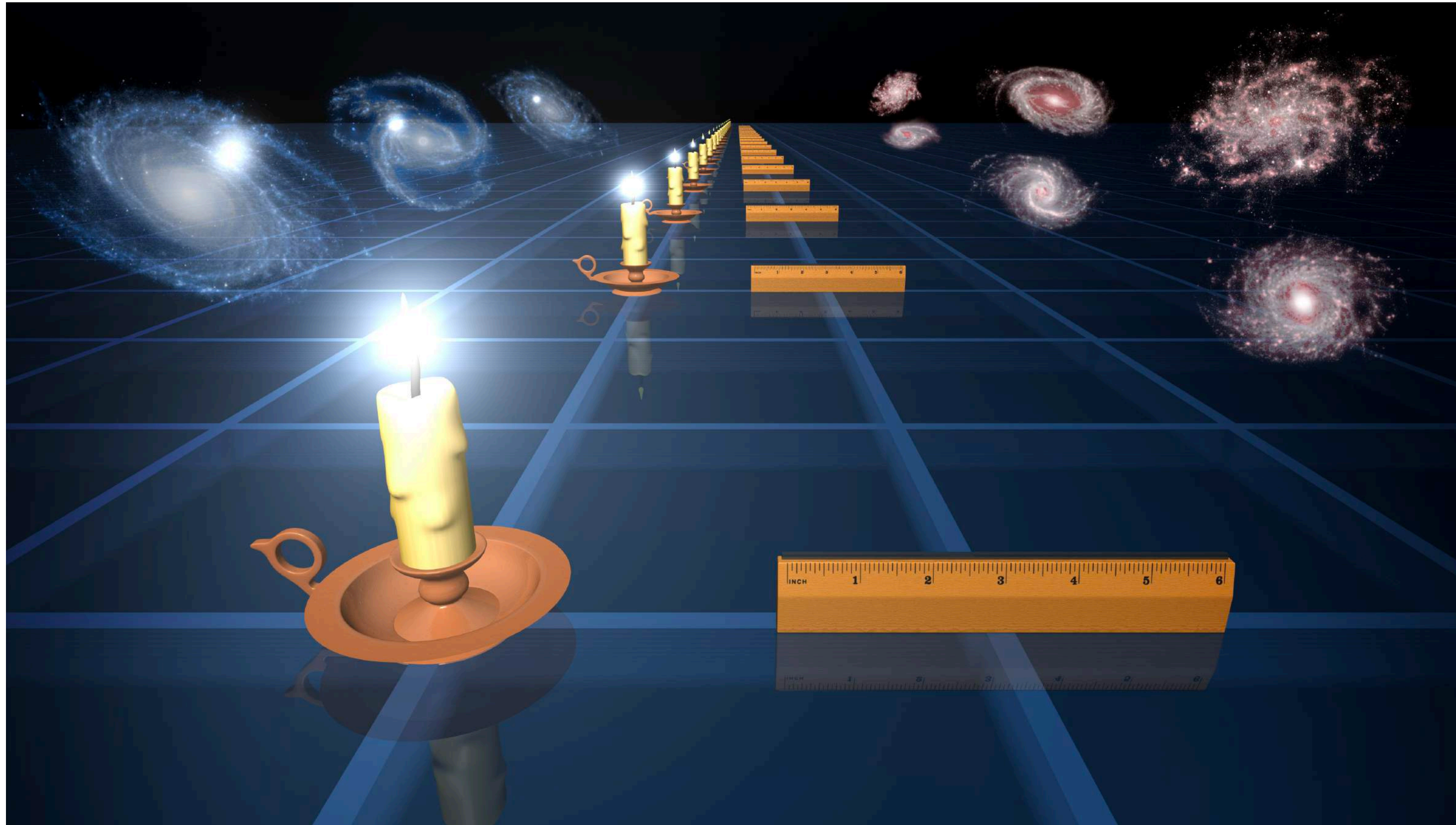
# What are Type Ia Supernovae?



1 SN per galaxy per century



# Why Type Ia Supernovae?



## Luminosity Distance

$$F = \frac{L}{4\pi D_L^2}$$

## Distance Modulus

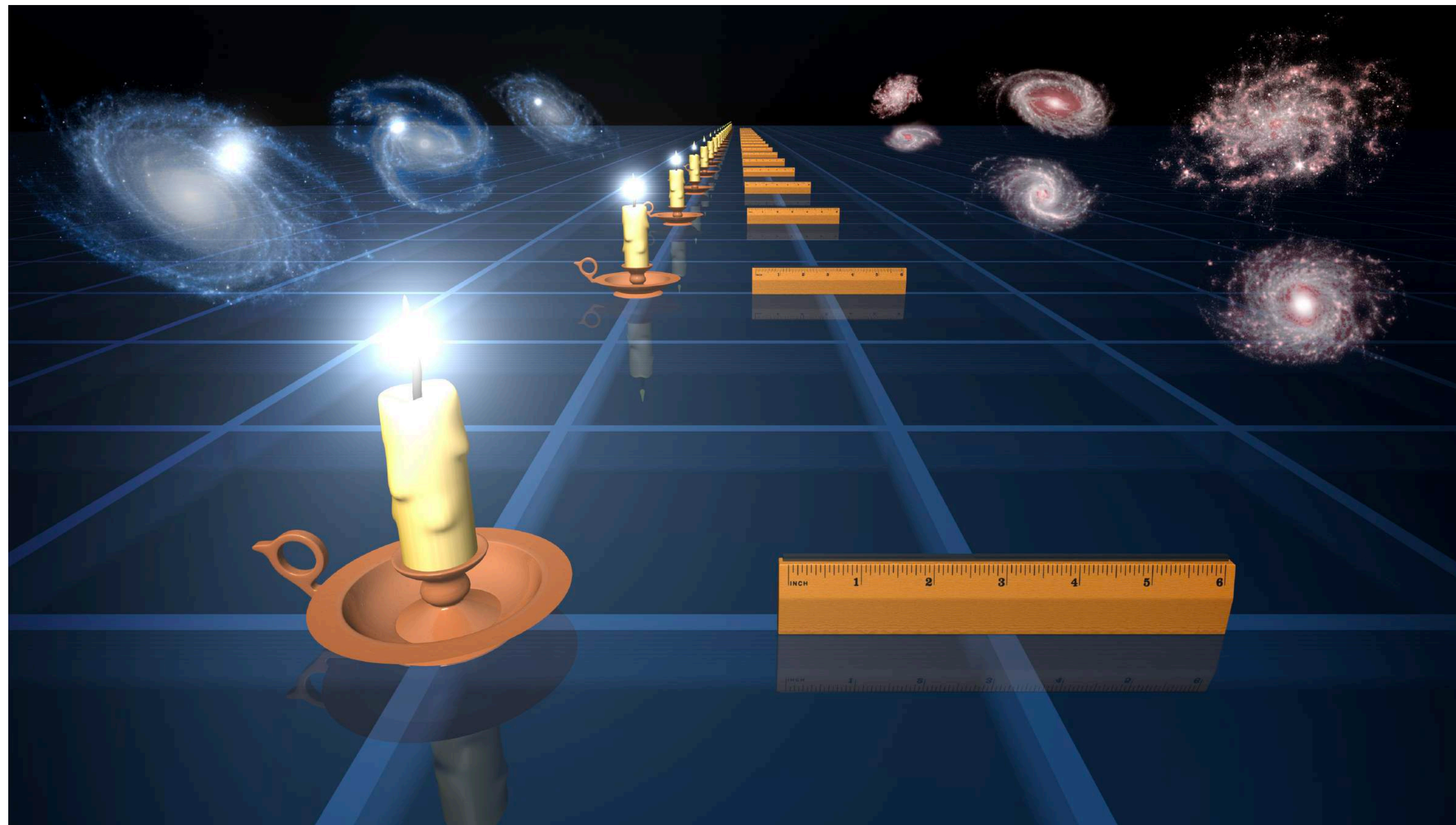
$$\mu(D_L) = m - M$$

Apparent

Intrinsic



# Why Type Ia Supernovae?



Luminosity Distance

$$F = \frac{L}{4\pi D_L^2}$$

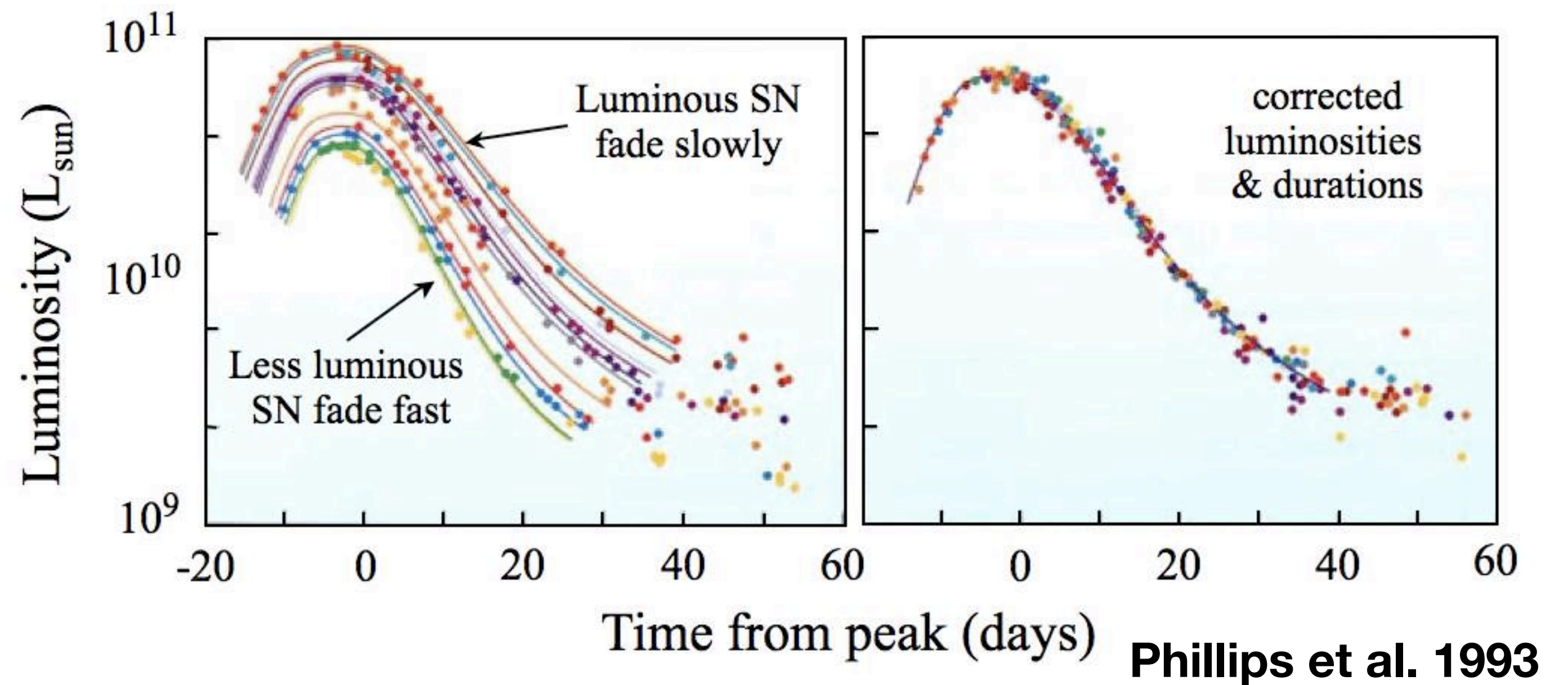
Distance Modulus

$$\mu(D_L) = m - M$$

Intuition  $\longrightarrow \Delta\mu \sim \%$



# Why Type Ia Supernovae?



$$\mu = m_B - M + \alpha x_1 - \beta c$$

- *Standardizable* Candles
- Intrinsic luminosity is known to  $\sim 10\%$
- We measure the redshift of the SN or the Host galaxy

# 20 year anniversary

March 1998 - acceleration of the  
Universe - nonzero cosmological  
constant discovery by the SCP and  
HST.

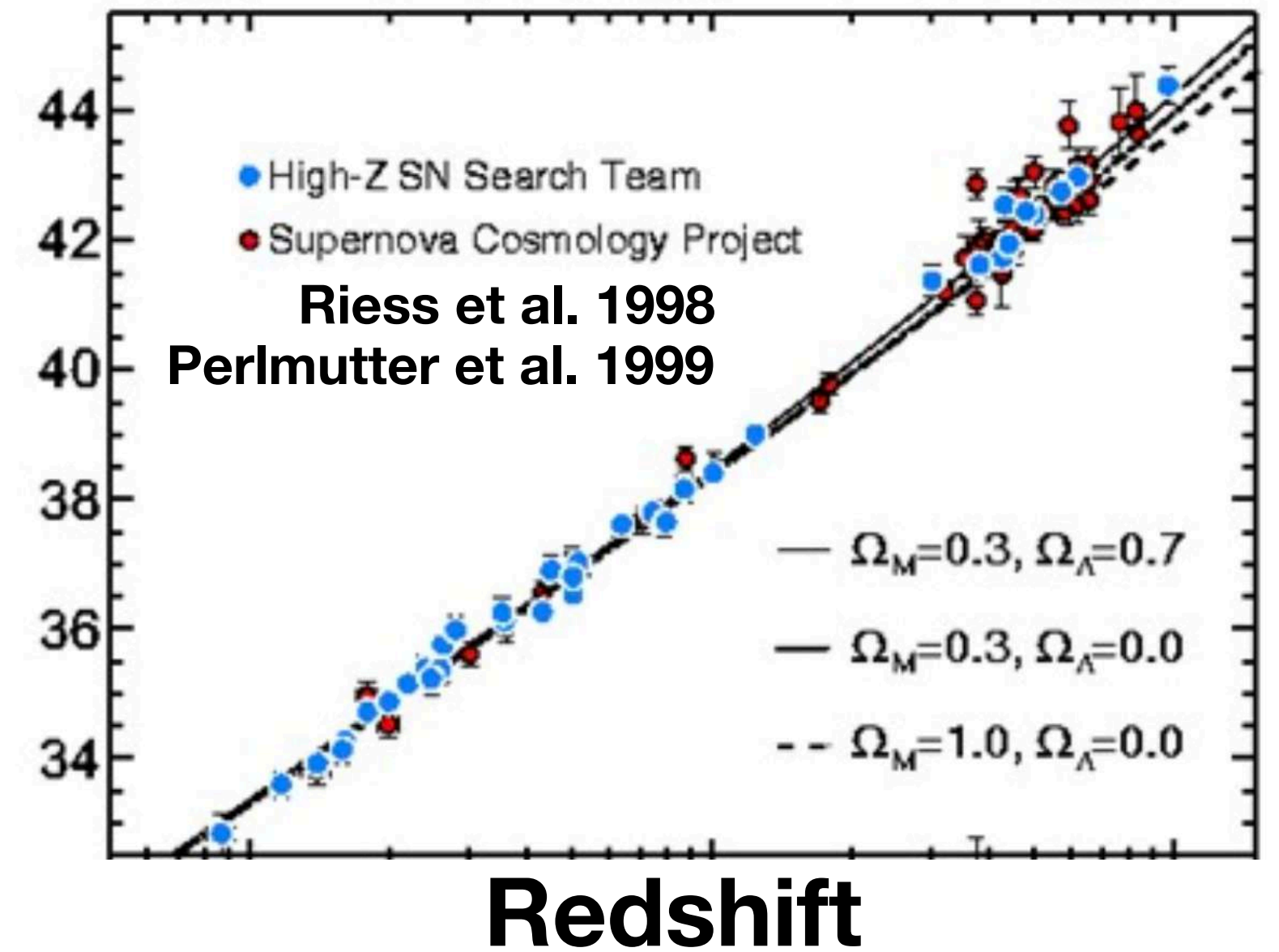
# 20 year anniversary

March 1998 - acceleration of the Universe - nonzero cosmological constant discovery by the SCP and HZT.

Distance

m-M (mag)

## Nobel Prize Datasets

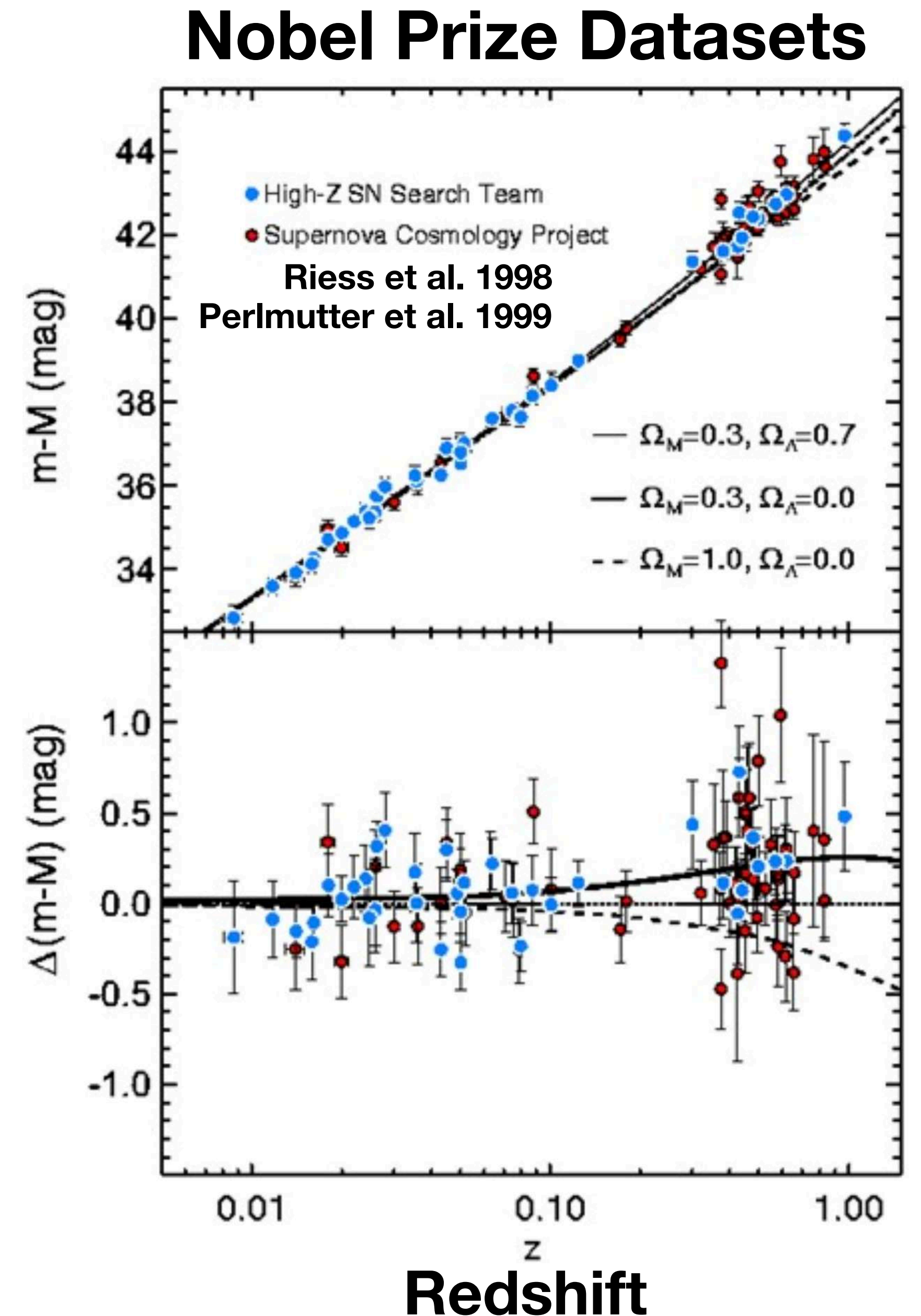




# 20 year anniversary

March 1998 - acceleration of the Universe - nonzero cosmological constant discovery by the SCP and HZT.

Distance  
Residuals

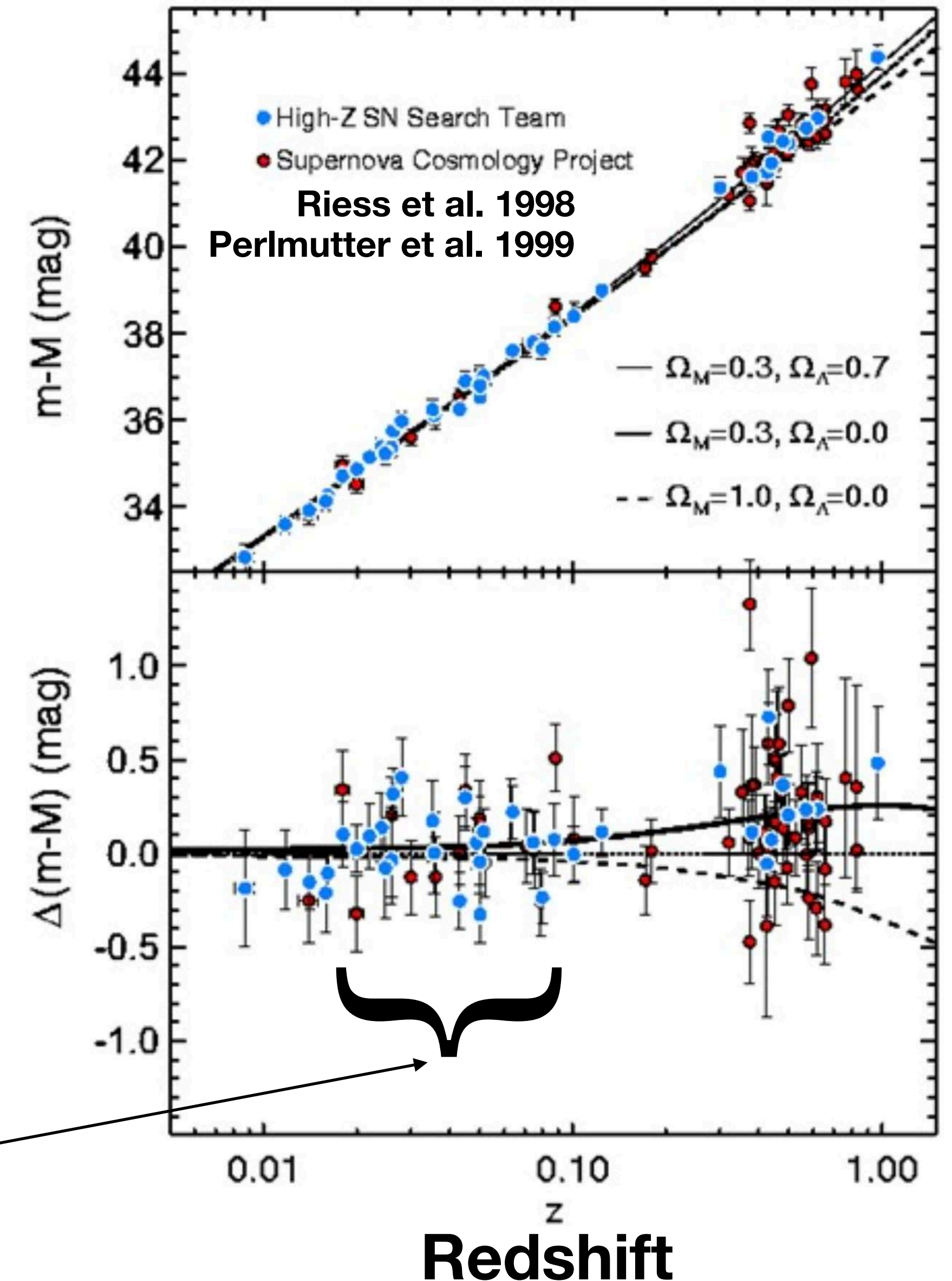


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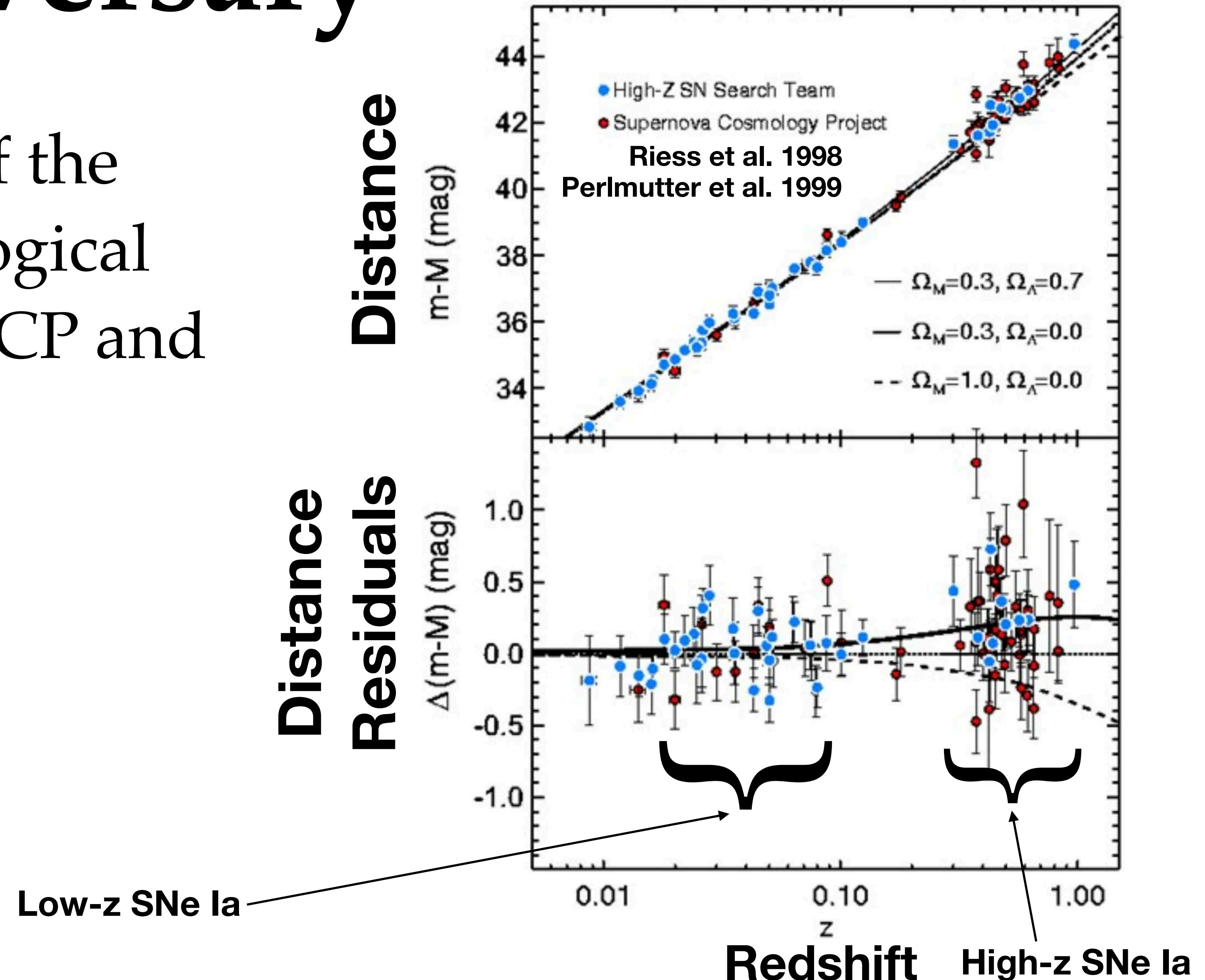


# 20 year anniversary

March 1998 - acceleration of the Universe - nonzero cosmological constant discovery by the SCP and HZT.

Distance  
Residuals

## Nobel Prize Datasets



# Name of the game...

*Luminosity distance*



*Redshift*

*Measure the  
effective scale of the  
universe over time*

Search for departures from the  
standard cosmological model  
 $\Lambda$ CDM



# Landscape of High Redshift Rolling SN Surveys

$$q_0 \leq 0$$

## Nobel Prize

1997

□ □ □

2003

# 2004

# 2005

2006

2007

2008

2009

2010

2011

2012

2013

2014

2015

2016

2017

# 2018

2019

2020

2021

2022

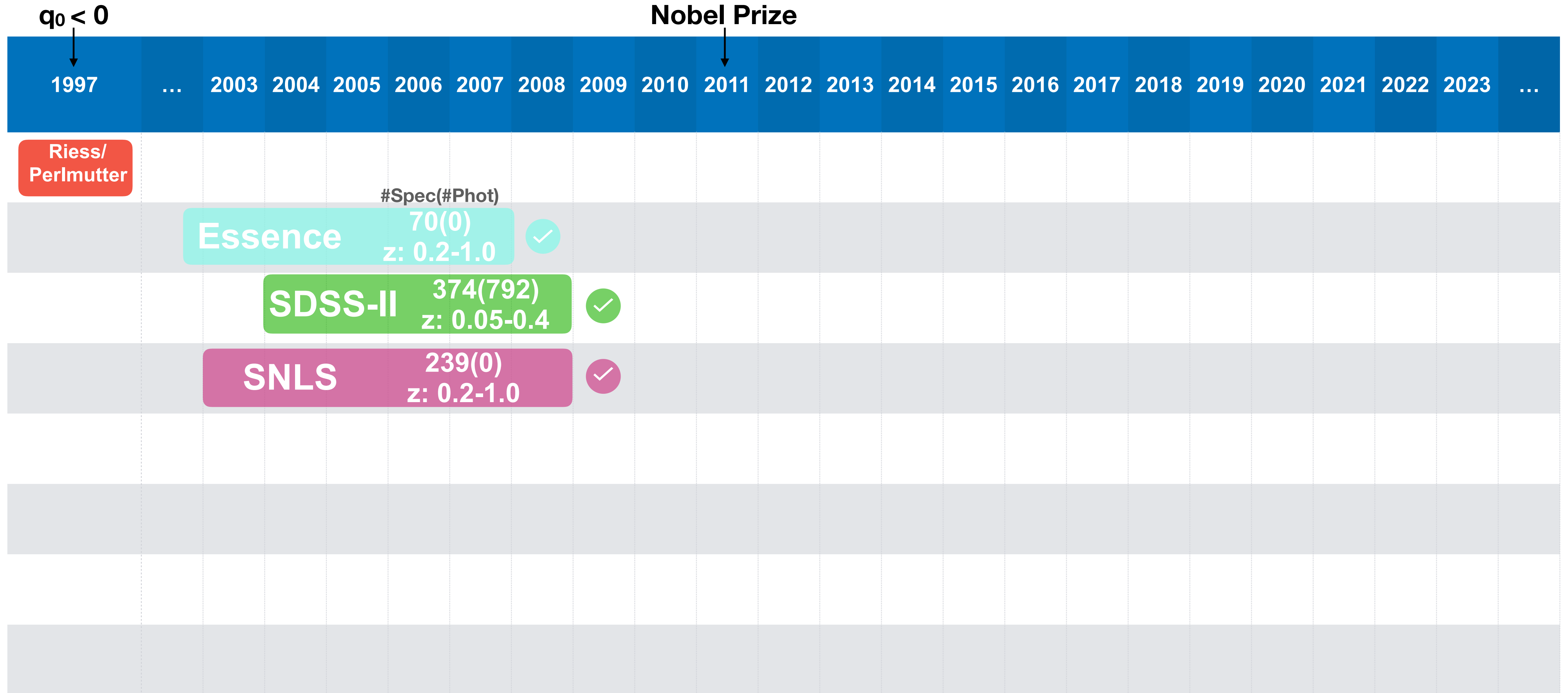
2023

□ □ □

100

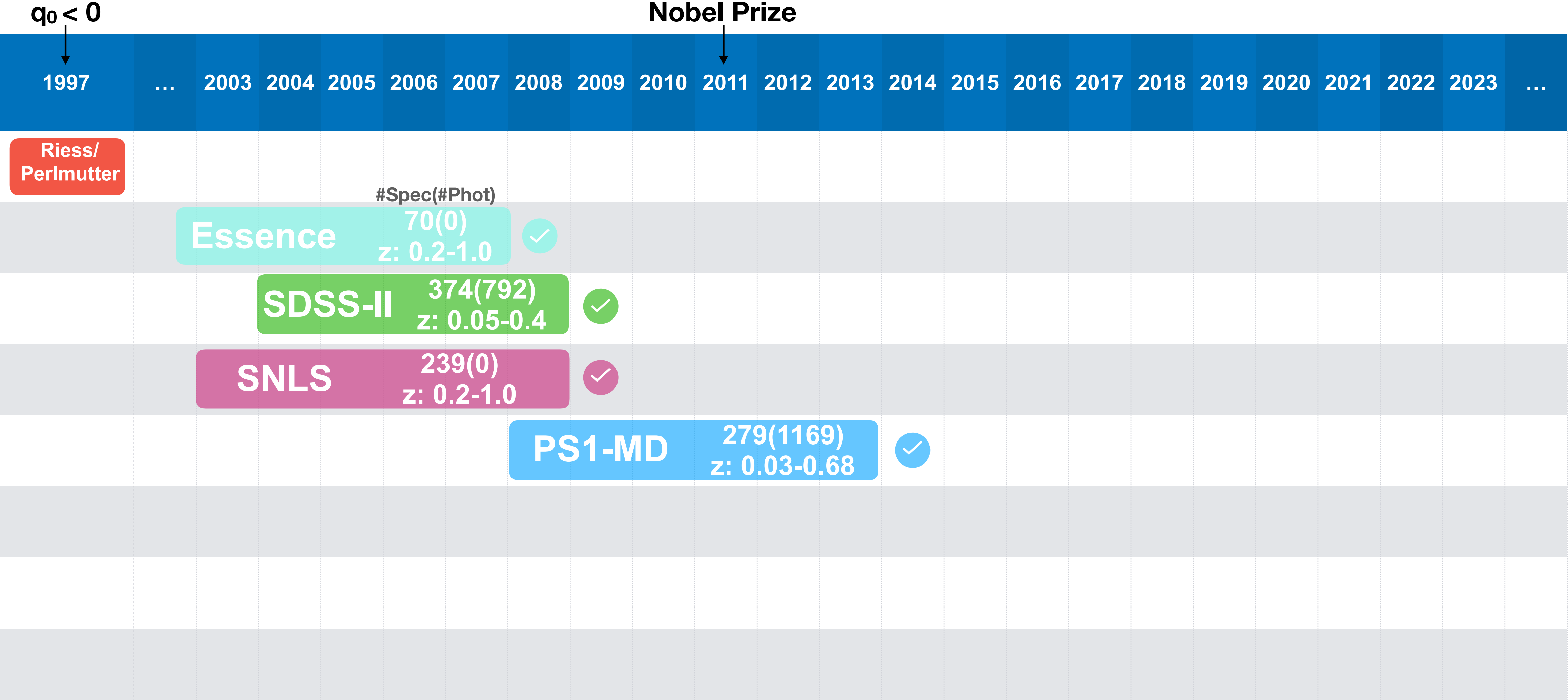
**Riess/  
Perlmutter**

# Landscape of High Redshift Rolling SN Surveys

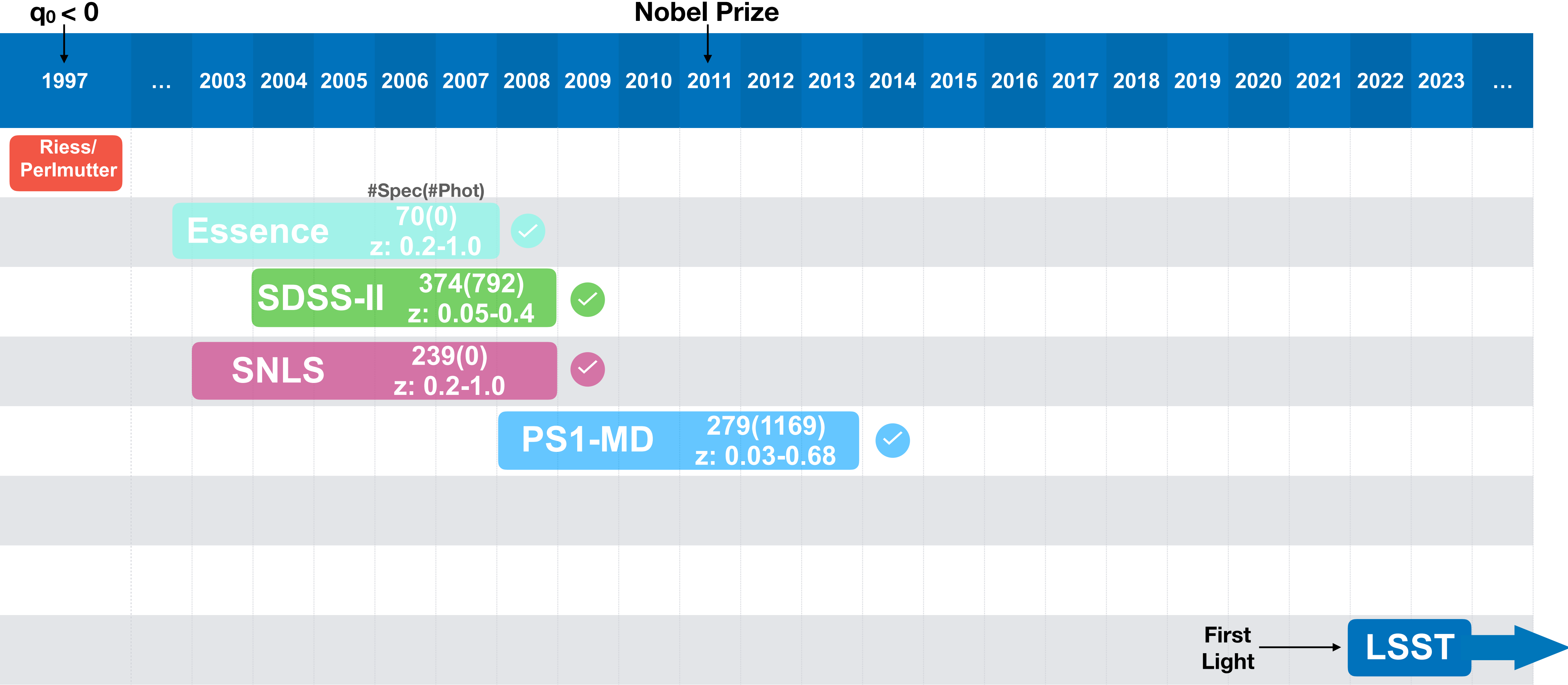




# Landscape of High Redshift Rolling SN Surveys

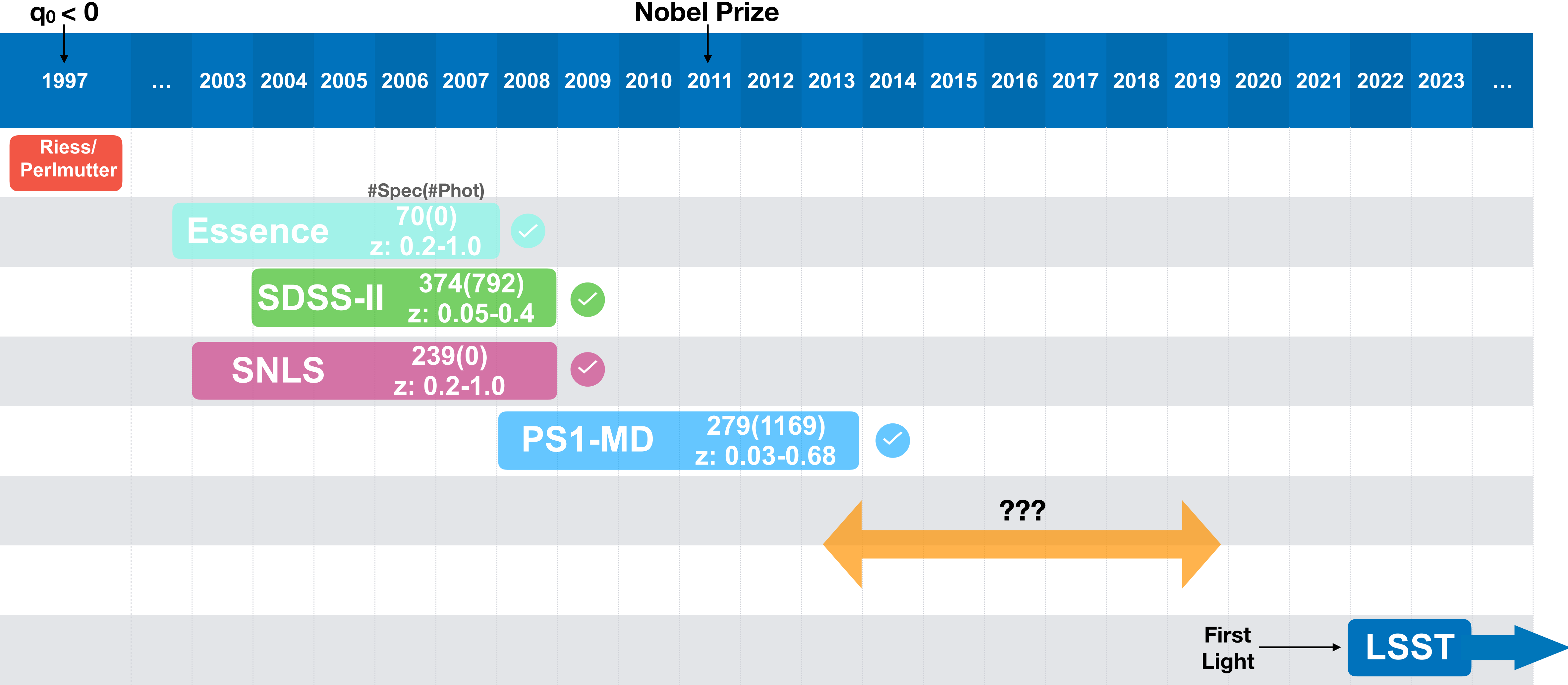


# Landscape of High Redshift Rolling SN Surveys

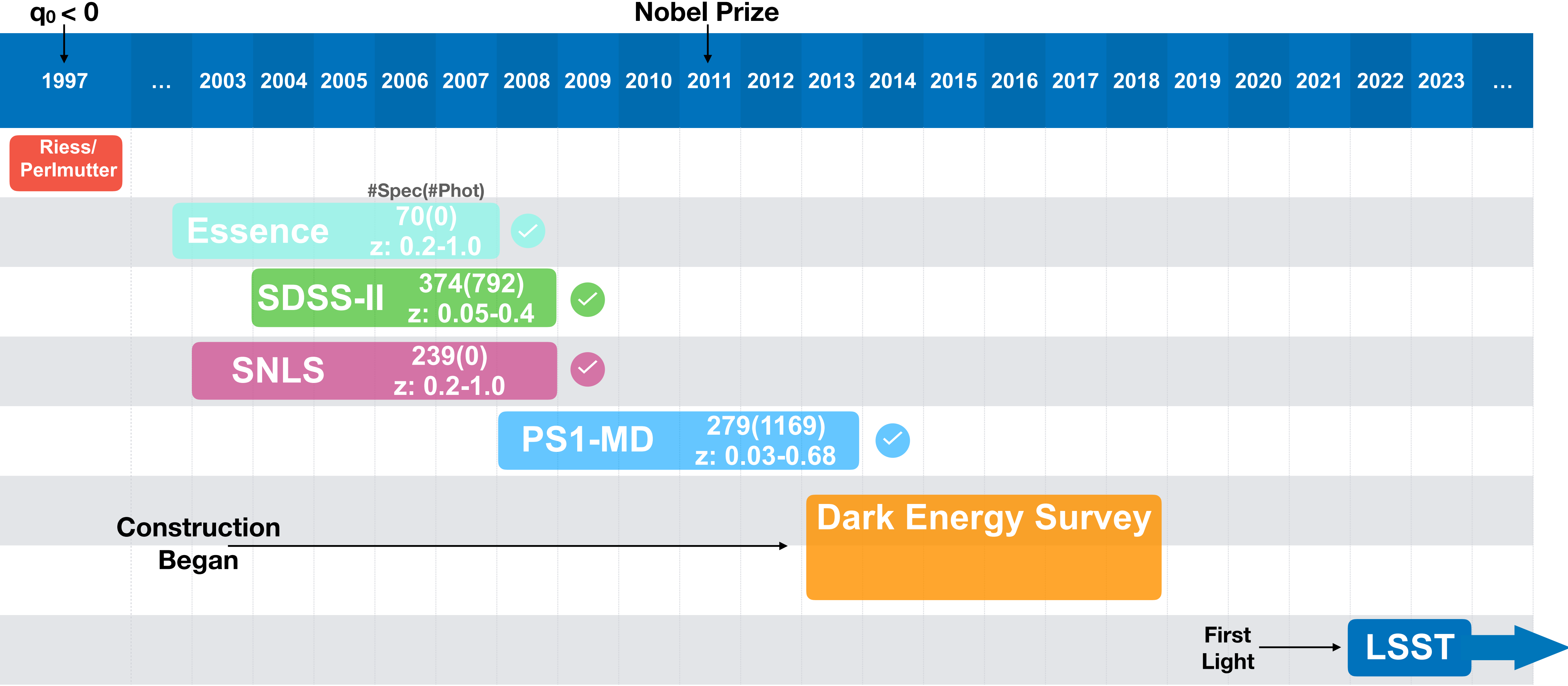




# Landscape of High Redshift Rolling SN Surveys



# Landscape of High Redshift Rolling SN Surveys





## 4 Main Probes

- Supernovae
- Weak Lensing
- Baryon Acoustic Oscillations
- Cluster counting







# THE DARK ENERGY SURVEY

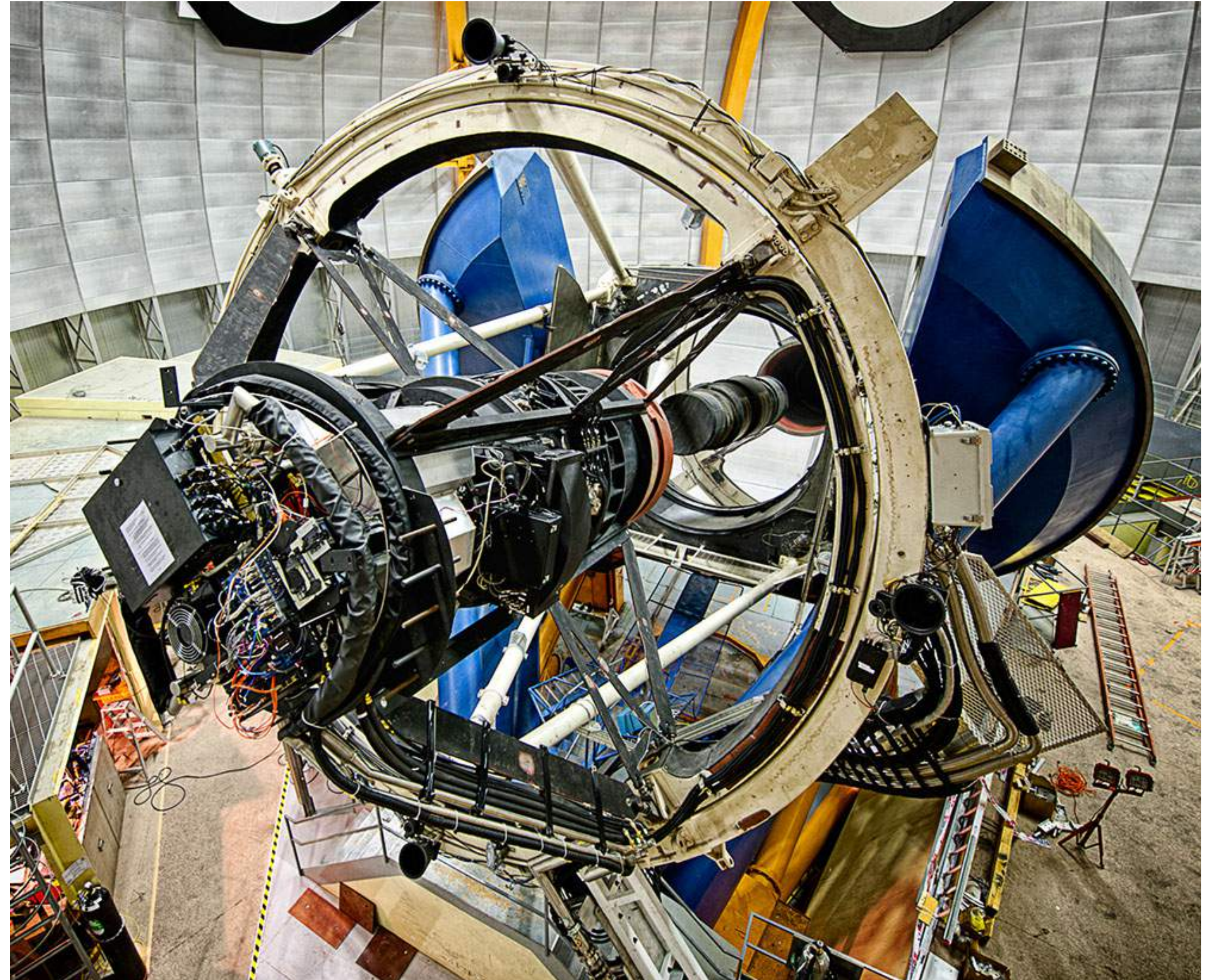
570 Megapixels

2.2 degree diameter FOV camera on  
the Blanco 4m telescope

Facility instrument for astronomy  
community (DES 30% time)

DES 2013-2018 (525 nights)

Mean cadence of 7 nights. Cadence  
monitor

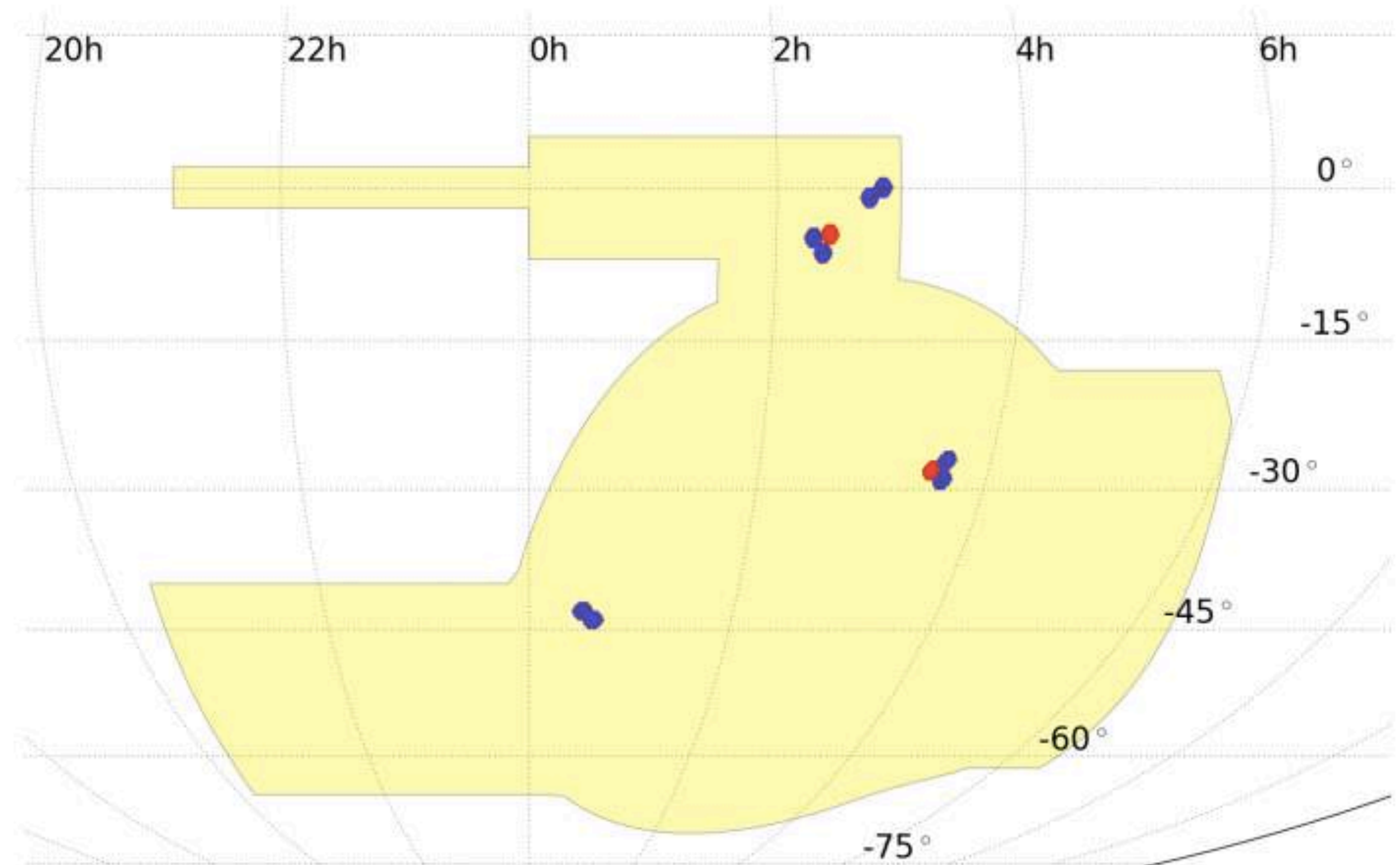






# THE DARK ENERGY SURVEY

Two multi-band  
imaging surveys

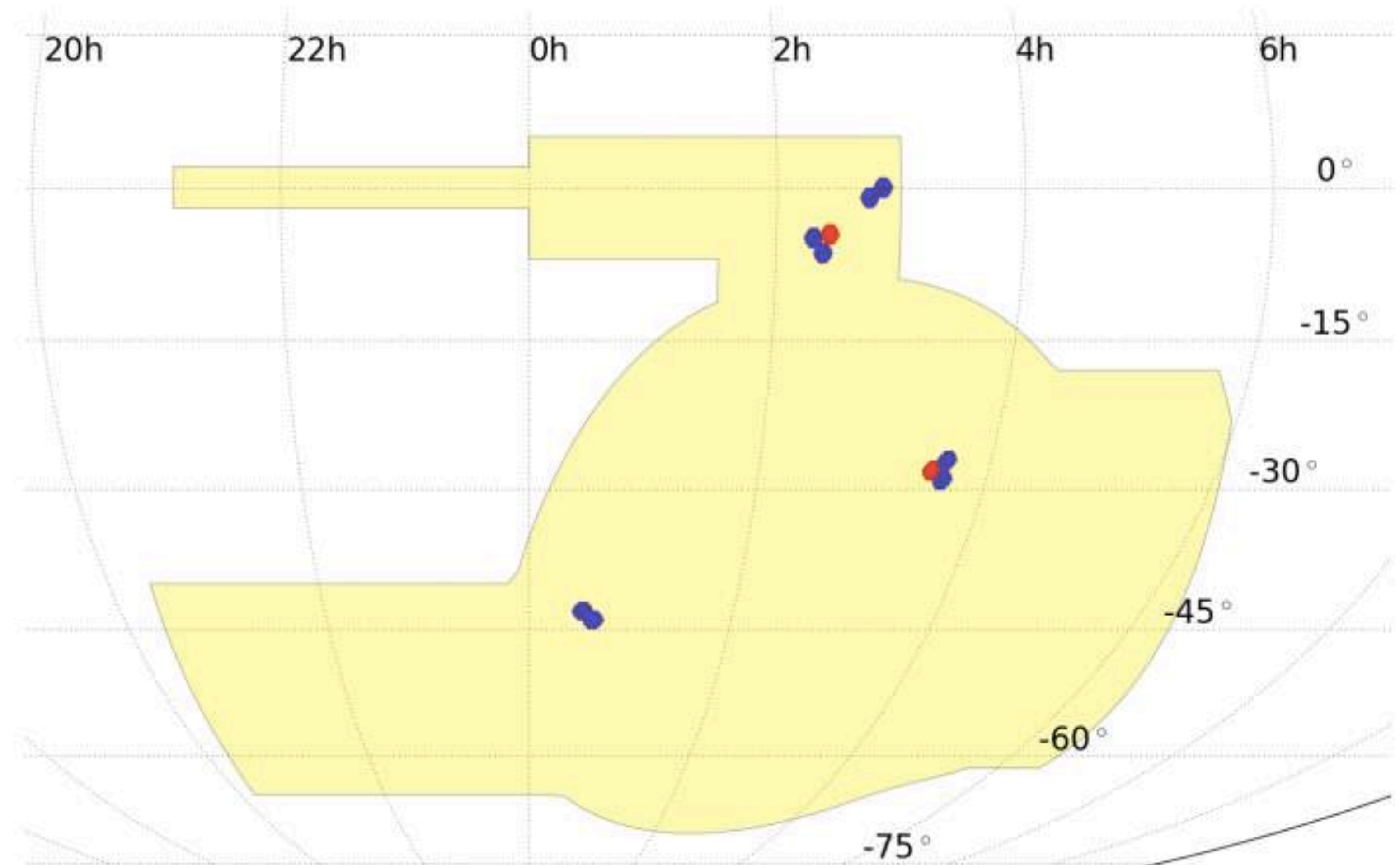




# THE DARK ENERGY SURVEY

Two multi-band  
imaging surveys

5000 deg<sup>2</sup> *grizY*





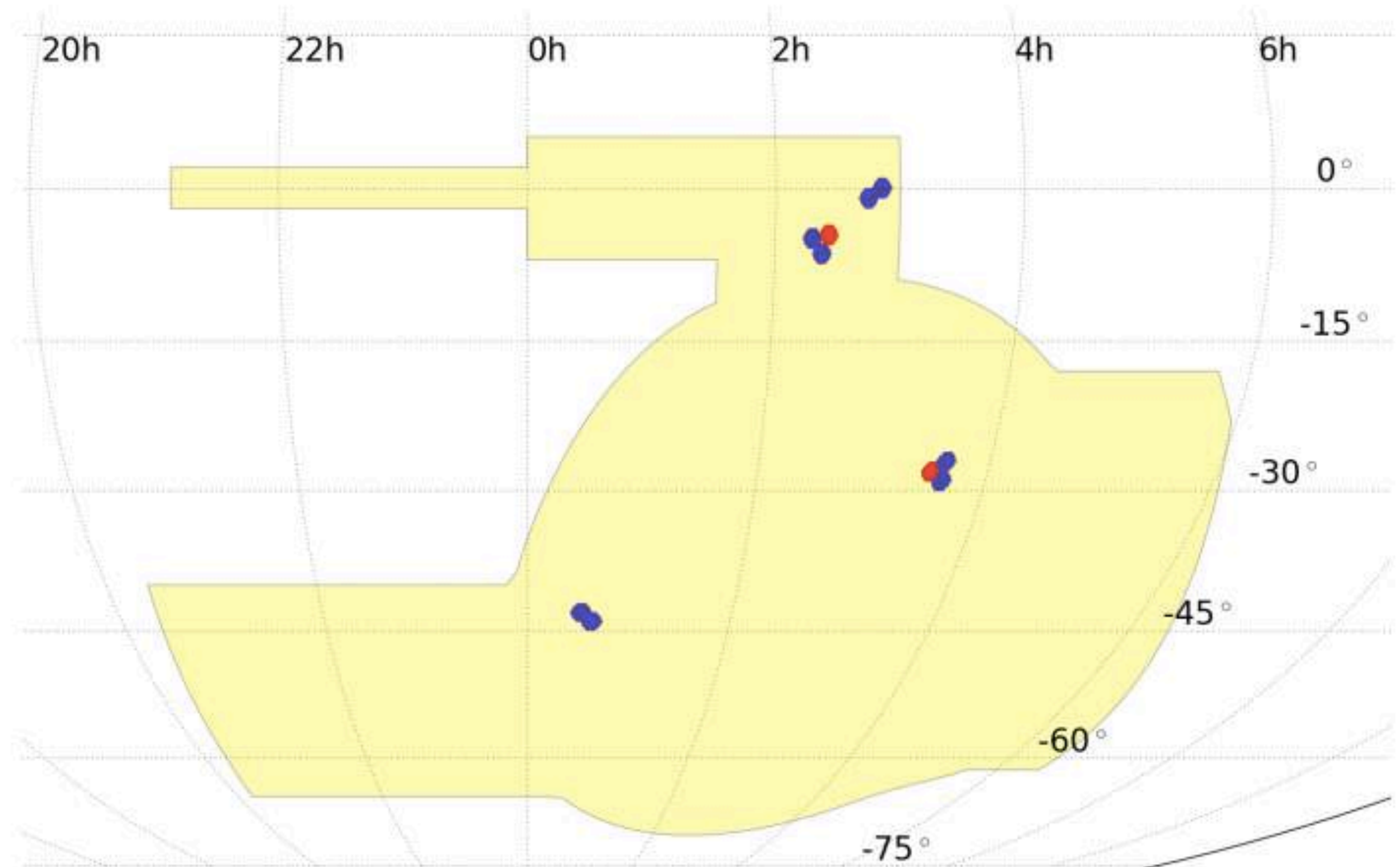


# THE DARK ENERGY SURVEY

Two multi-band  
imaging surveys

5000 deg<sup>2</sup> *grizY*

30 deg<sup>2</sup> repeat *griz*  
10 *pointings* (SNe)

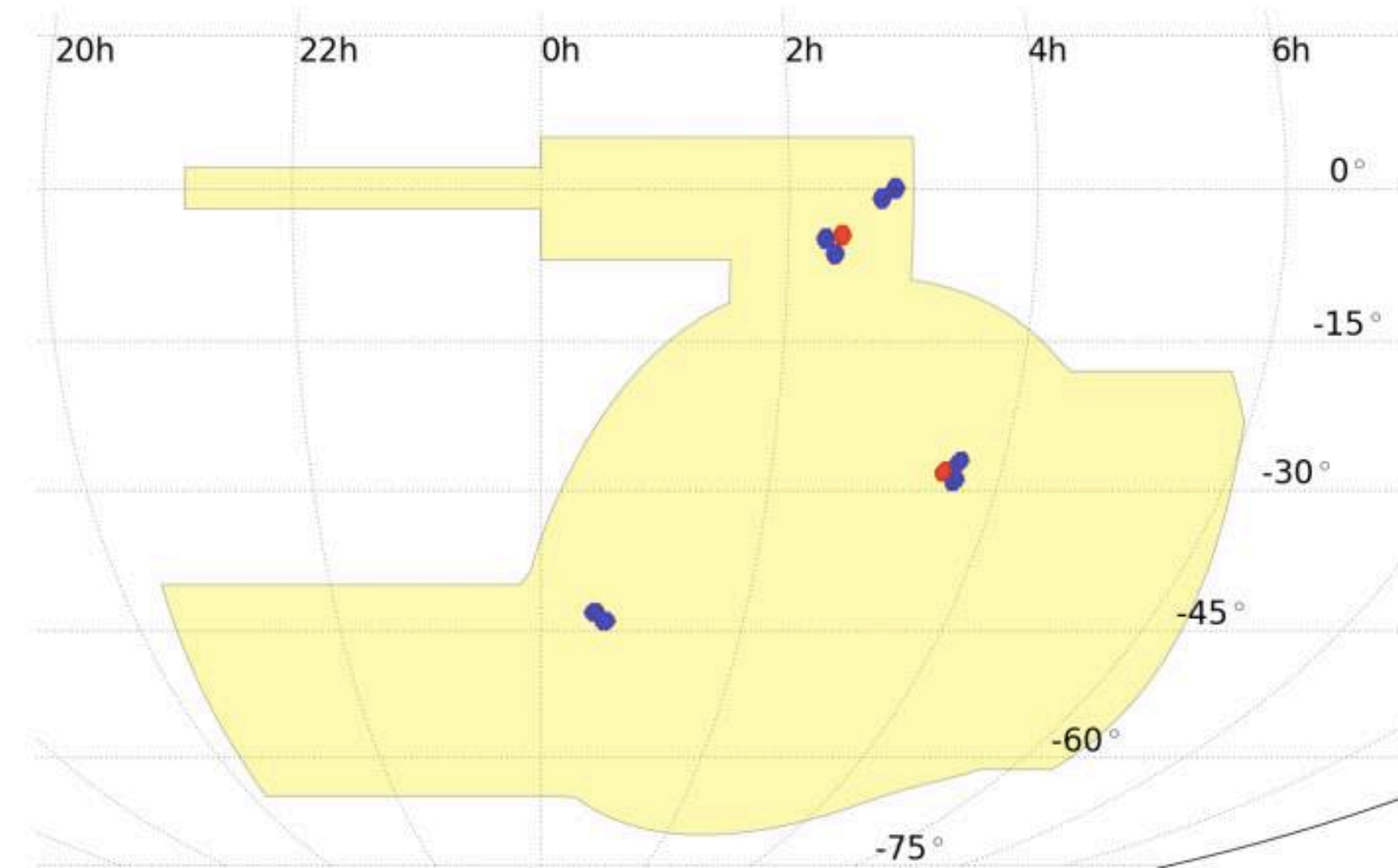




Two multi-band  
imaging surveys

5000 deg<sup>2</sup> *grizY*

30 deg<sup>2</sup> repeat *griz*  
10 *pointings* (SNe)



	area (deg <sup>2</sup> )	visits (per filter)	filters	exposure time in sec (per visit)	Depth
SN shallow	22	125	<i>griz</i>	175/150/200/400	23.5
SN deep	5	125	<i>griz</i>	600/1200/1800/3630	24.5





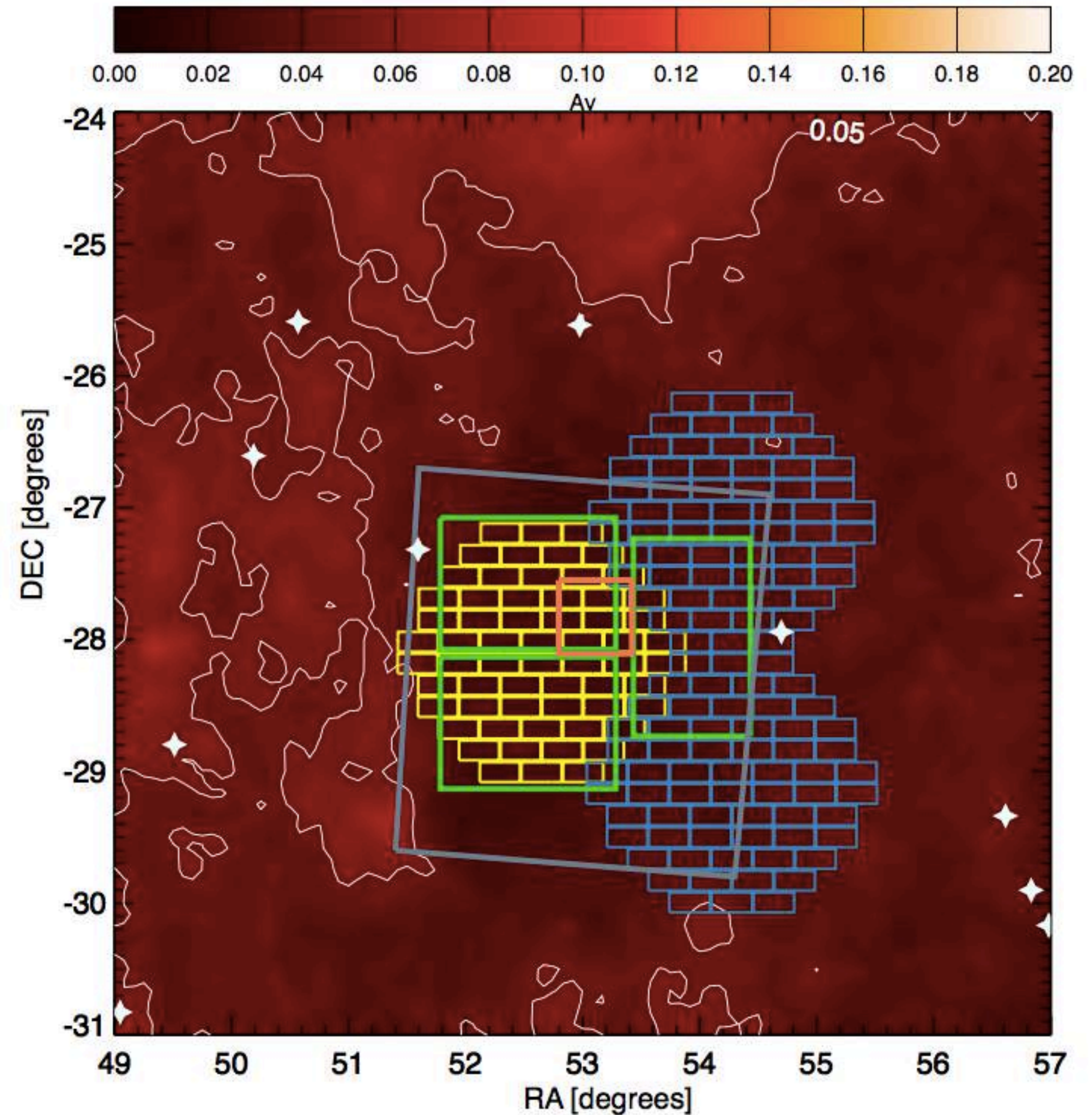
# THE DARK ENERGY SURVEY

Two multi-band  
imaging surveys

5000 deg<sup>2</sup> *grizY*

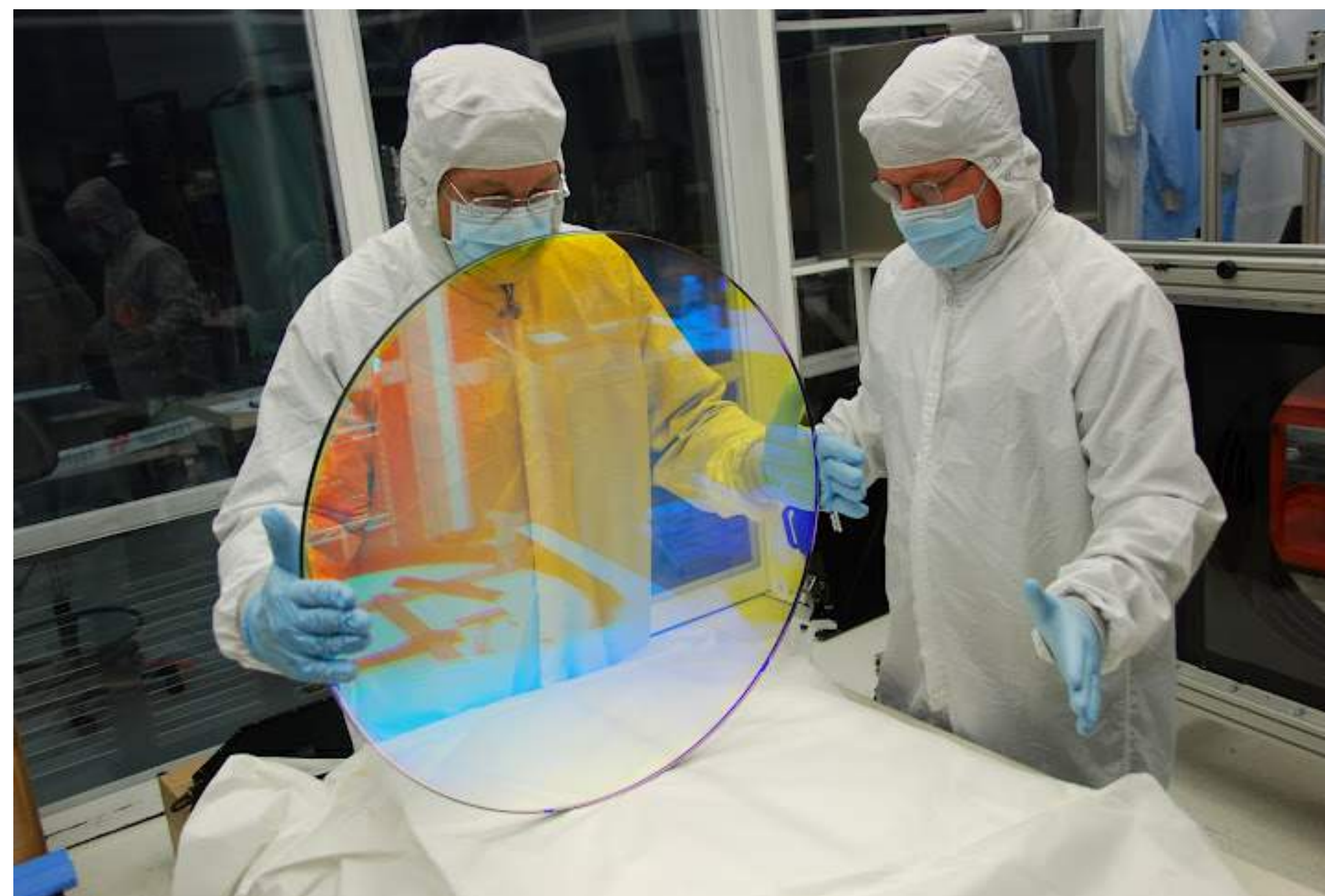
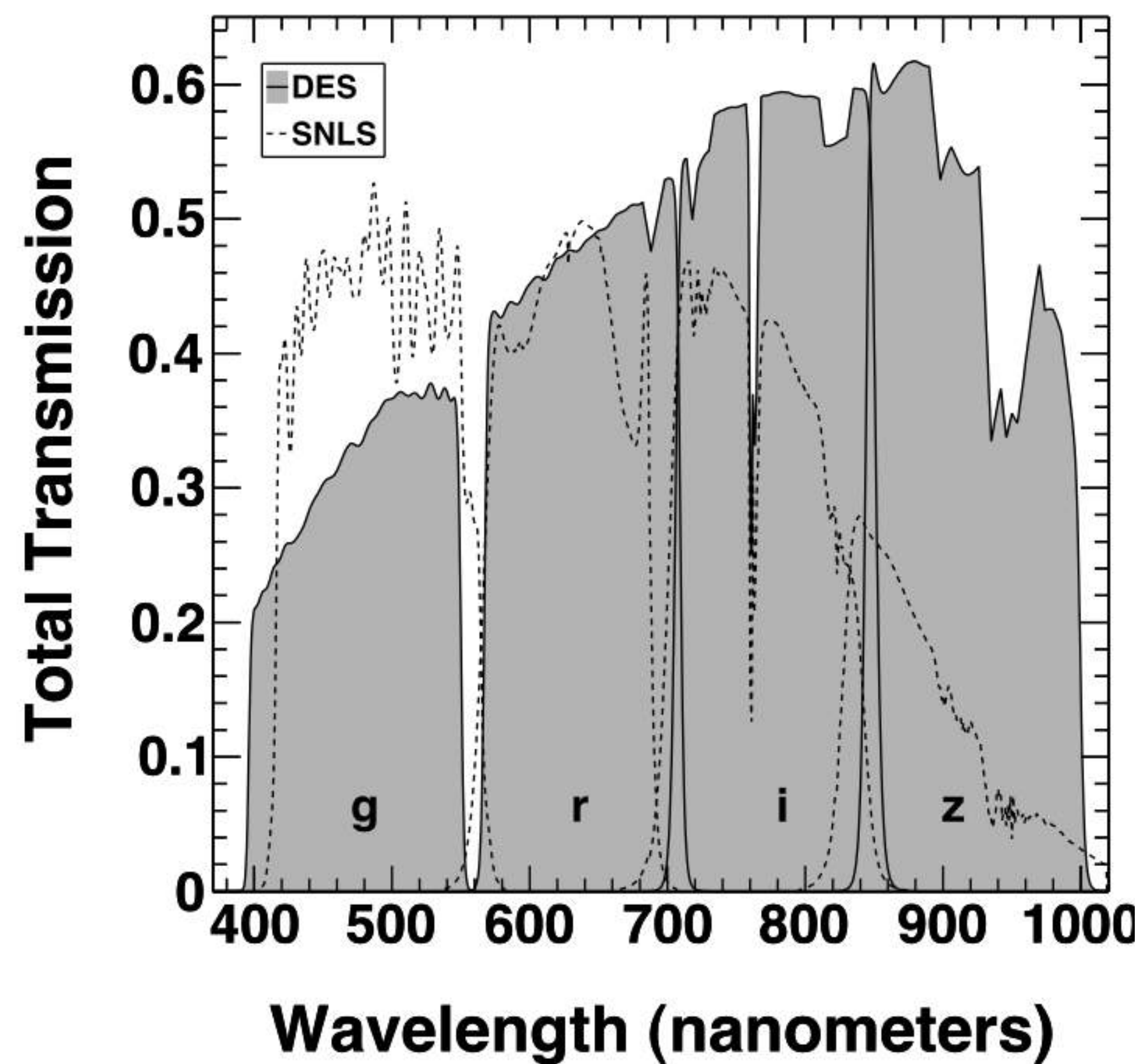
30 deg<sup>2</sup> repeat *griz*

10 *pointings* (SNe)





New **red-sensitive** camera  
(DECAM) on CTIO 4m





# Classification of the Supernova to be used for cosmology

- DES “discovered” ~15,000 Likely Supernovae
- ~2500 Type Ia for all 5 years

With 4 filters

Or

Spectrum of SN

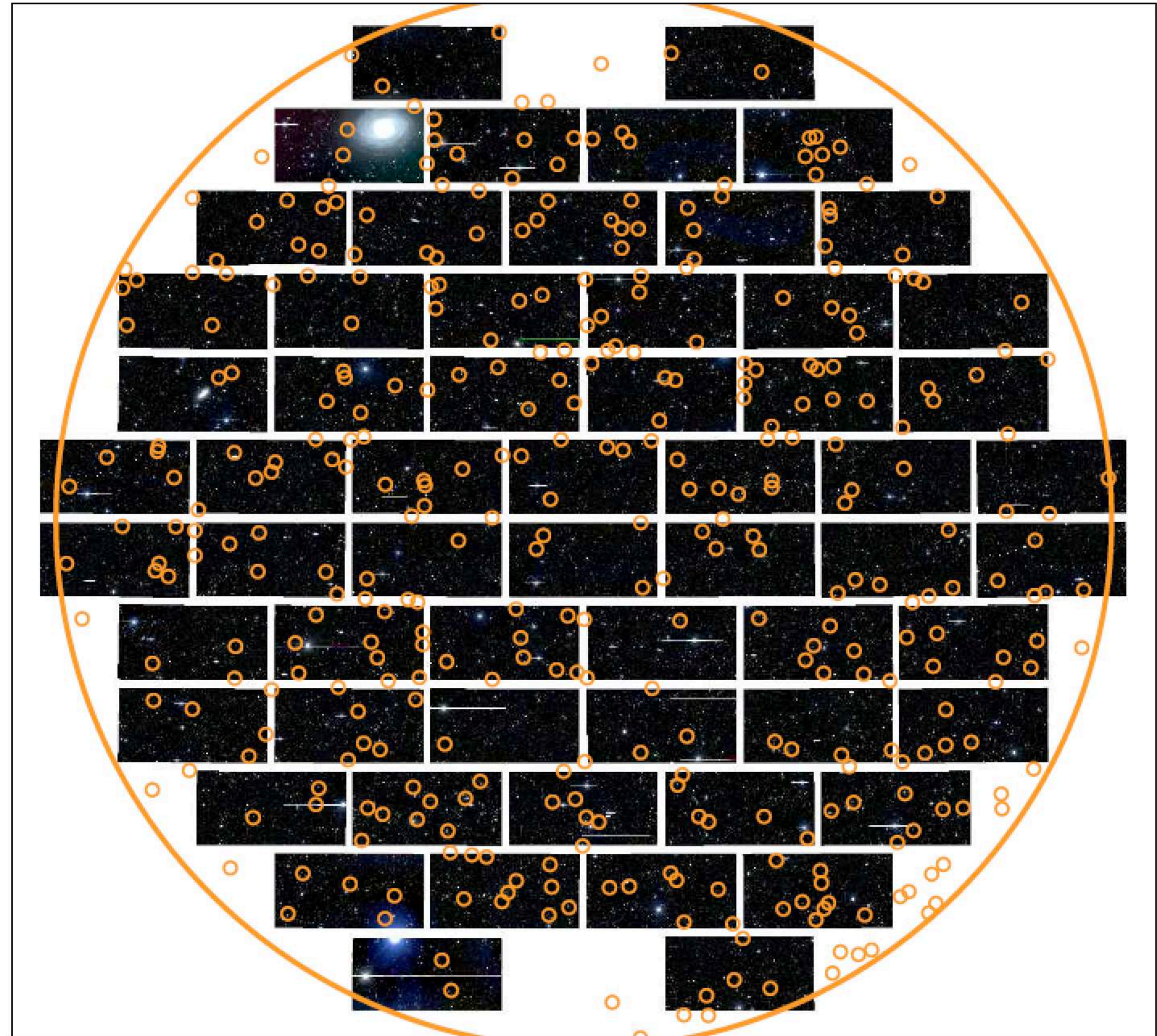
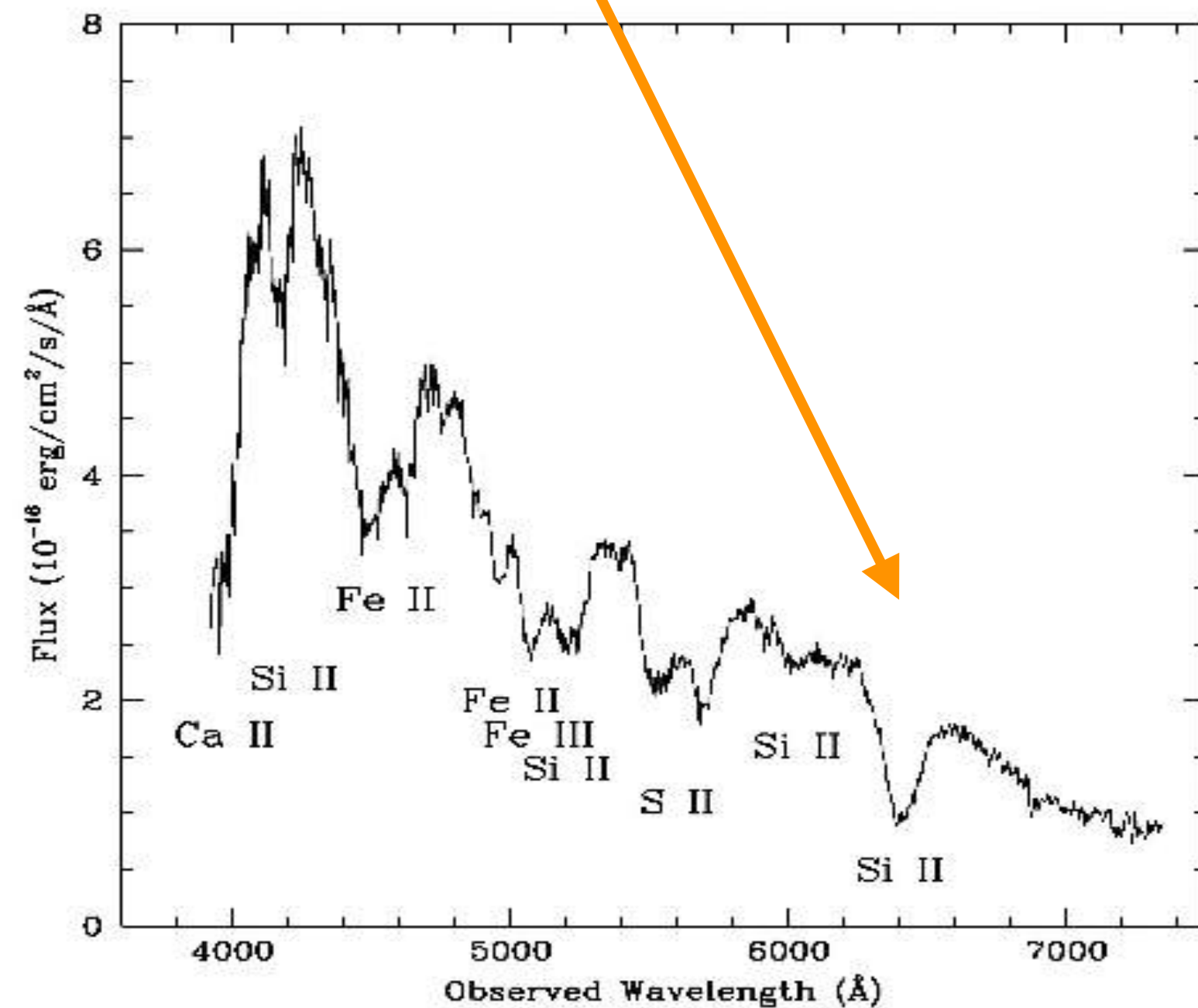


# Spectra of SNe

Spectroscopically confirmed 251 SNe from the first three years of data.

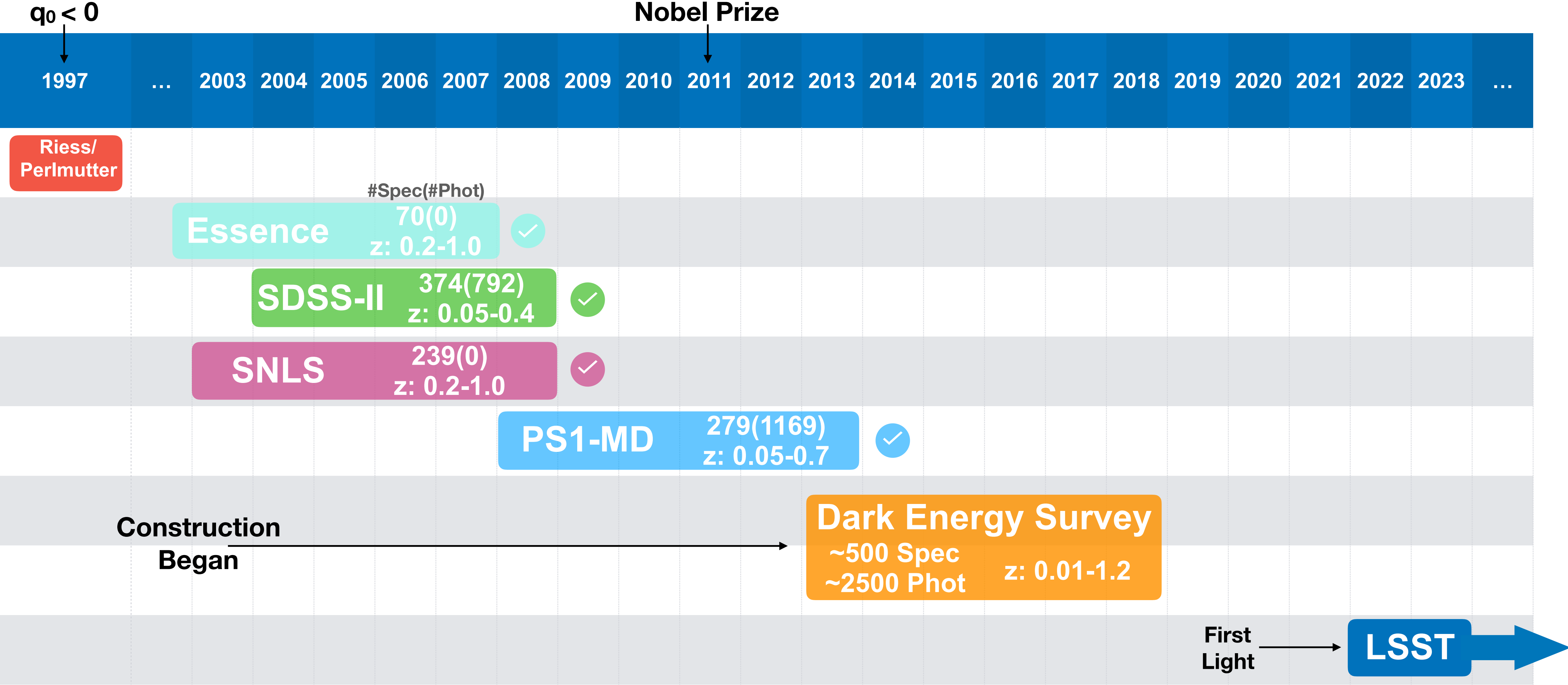
Majority from OzDES Collaboration

Identify via Si II feature in spectrum



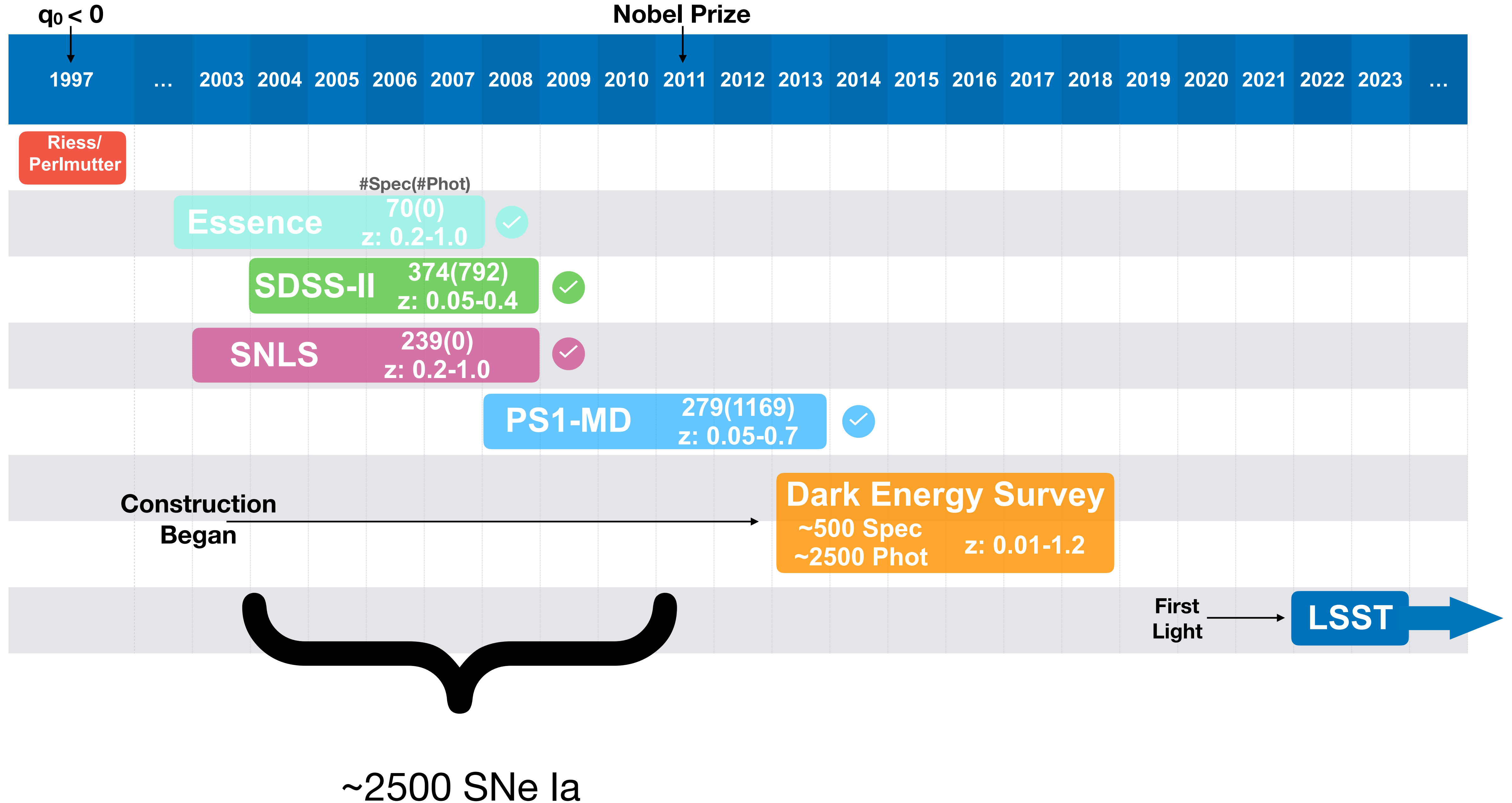


# Landscape of High Redshift Rolling SN Surveys

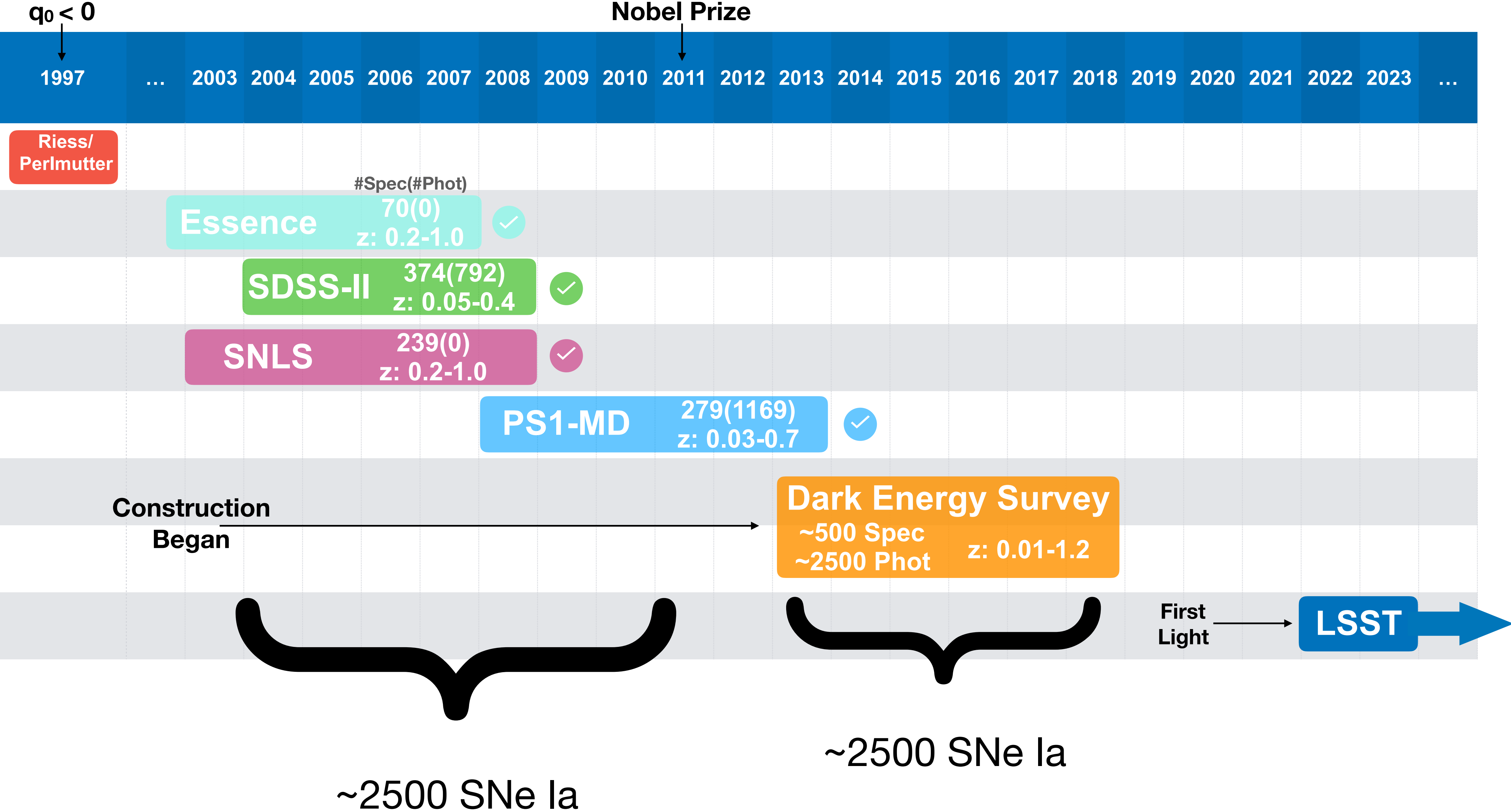




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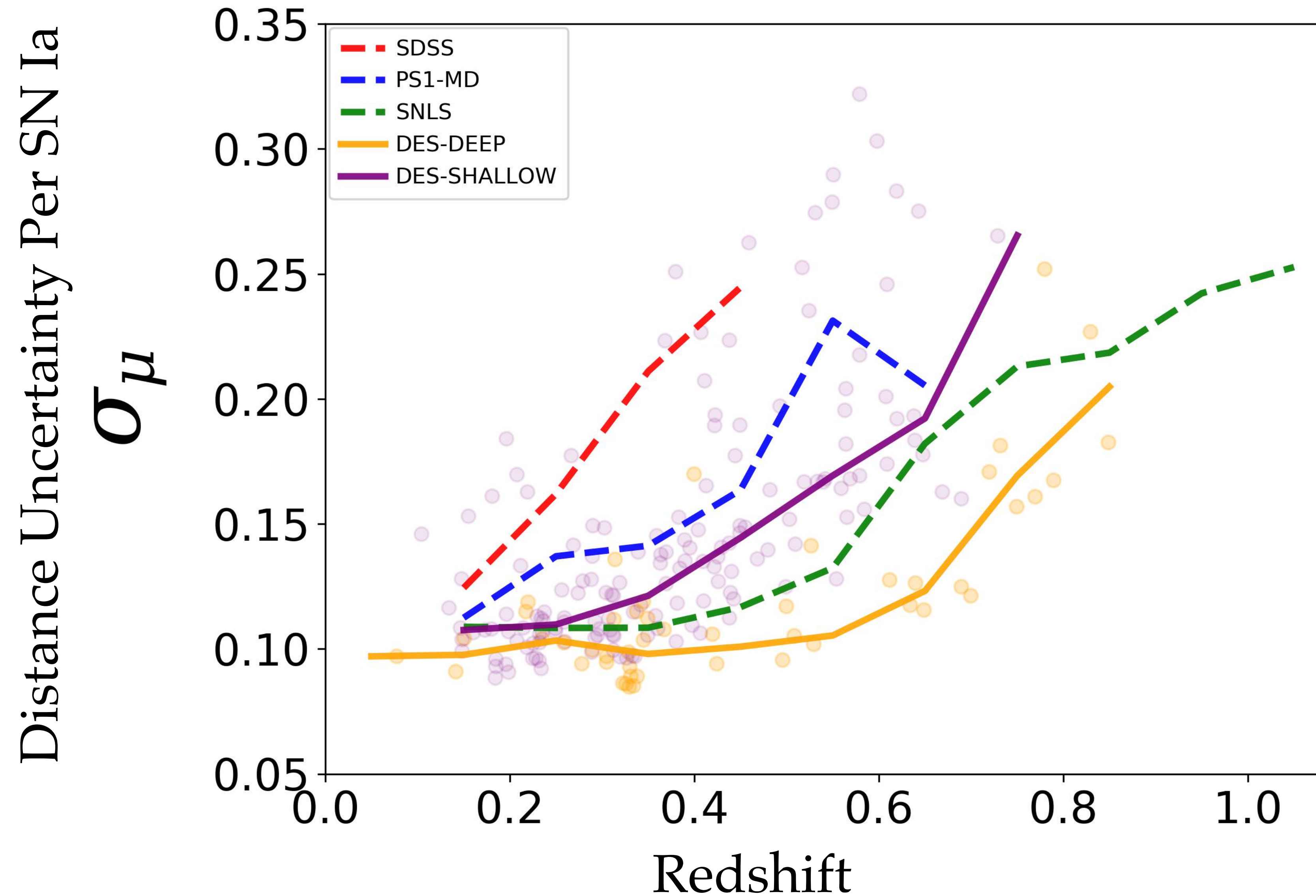


# Landscape of High Redshift Rolling SN Surveys





# How Do DES SNe Stack Up?



# How Does DES-SN3YR Stack Up?

$\sigma_w$ (stat+syst)	#SNe Ia	Spec Analyses
0.054	740	Joint Lightcurve Analysis (2014)
0.040	1050	Pantheon (2018)
0.063	453	Pan-STARRS1 (2018)
???	329	DESSN-3YR (2018)



# How Does DES-SN3YR Stack Up?

$\sigma_w$ (stat+syst)	#SNe Ia	Spec Analyses
0.054	740	Joint Lightcurve Analysis (2014)
0.040	1050	Pantheon (2018)
0.063	453	Pan-STARRS1 (2018)
0.059*	329	DESSN-3YR (2018)

\*Including accounting for previously unforeseen systematic uncertainties



# Motivation

**Ingredients for SN Ia Cosmology**

**Results from the First 3 Years**

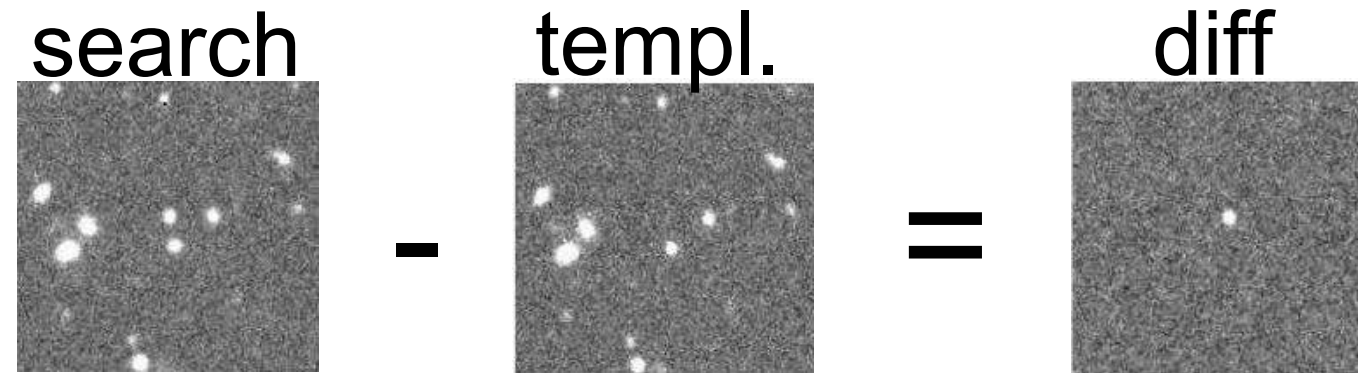
**The Future of DES-SN**



# Ingredients for Supernova Cosmology

Difference Imaging

→ SNe Candidates



# Ingredients for Supernova Cosmology

**Difference Imaging**

→ SNe Candidates

$$\begin{array}{ccccc} \text{search} & & \text{templ.} & & \text{diff} \\ \text{[Image]} & - & \text{[Image]} & = & \text{[Image]} \end{array}$$

**Spectra**

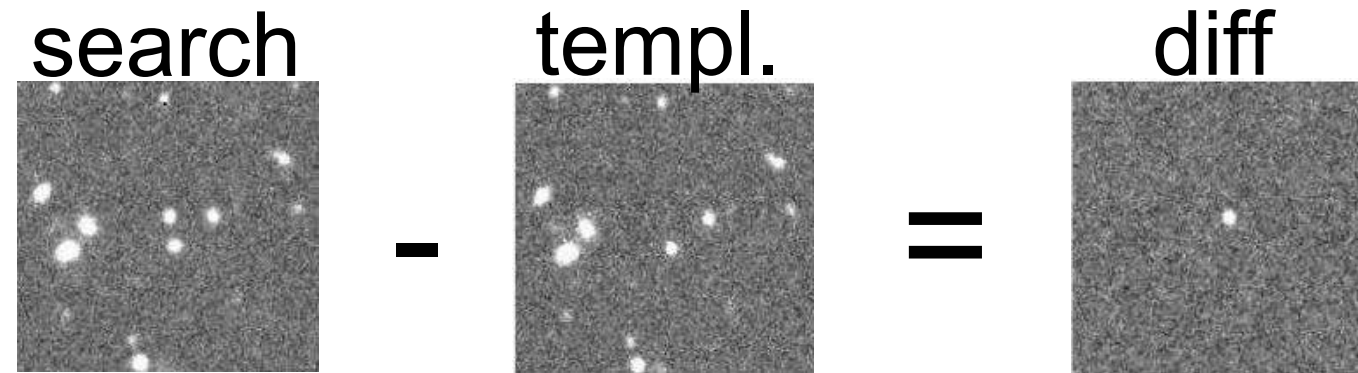
→ Type & redshift



# Ingredients for Supernova Cosmology

**Difference Imaging**

→ SNe Candidates

$$\begin{array}{c} \text{search} \\ \text{templ.} \end{array} \quad \begin{array}{c} \text{search} \\ \text{templ.} \end{array} \quad \begin{array}{c} \text{diff} \\ \text{diff} \end{array}$$


**Spectra**

→ Type & redshift

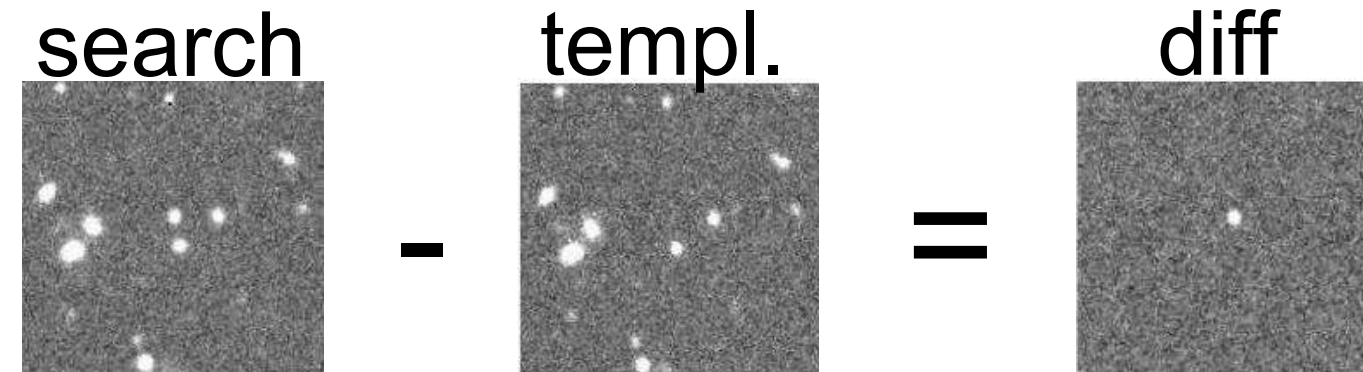
**Photometry**

→ “Standardizable Candles”

# Ingredients for Supernova Cosmology

**Difference Imaging**

→ SNe Candidates

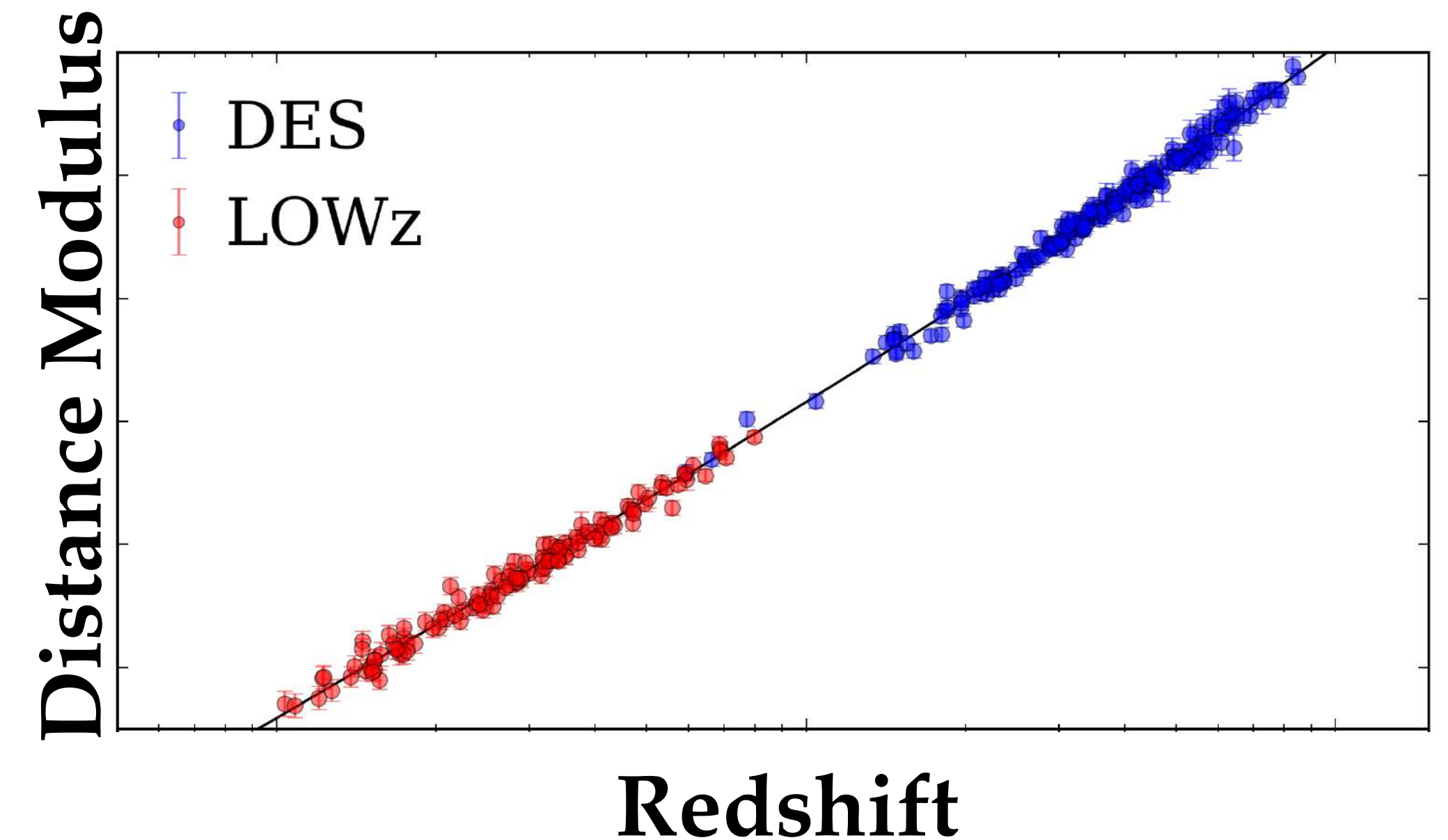
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**Spectra**

→ Type & redshift

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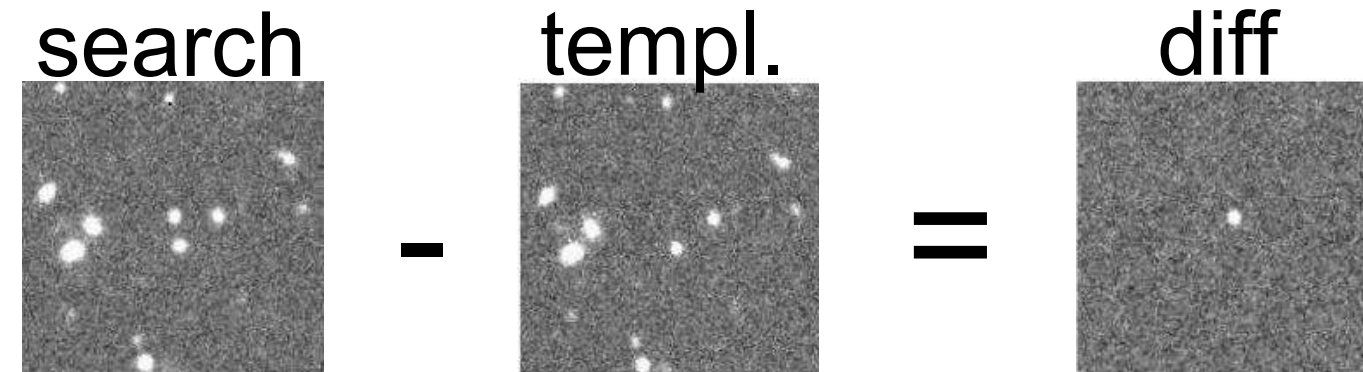




# Ingredients for Supernova Cosmology

**Difference Imaging**

→ SNe Candidates

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**Spectra**

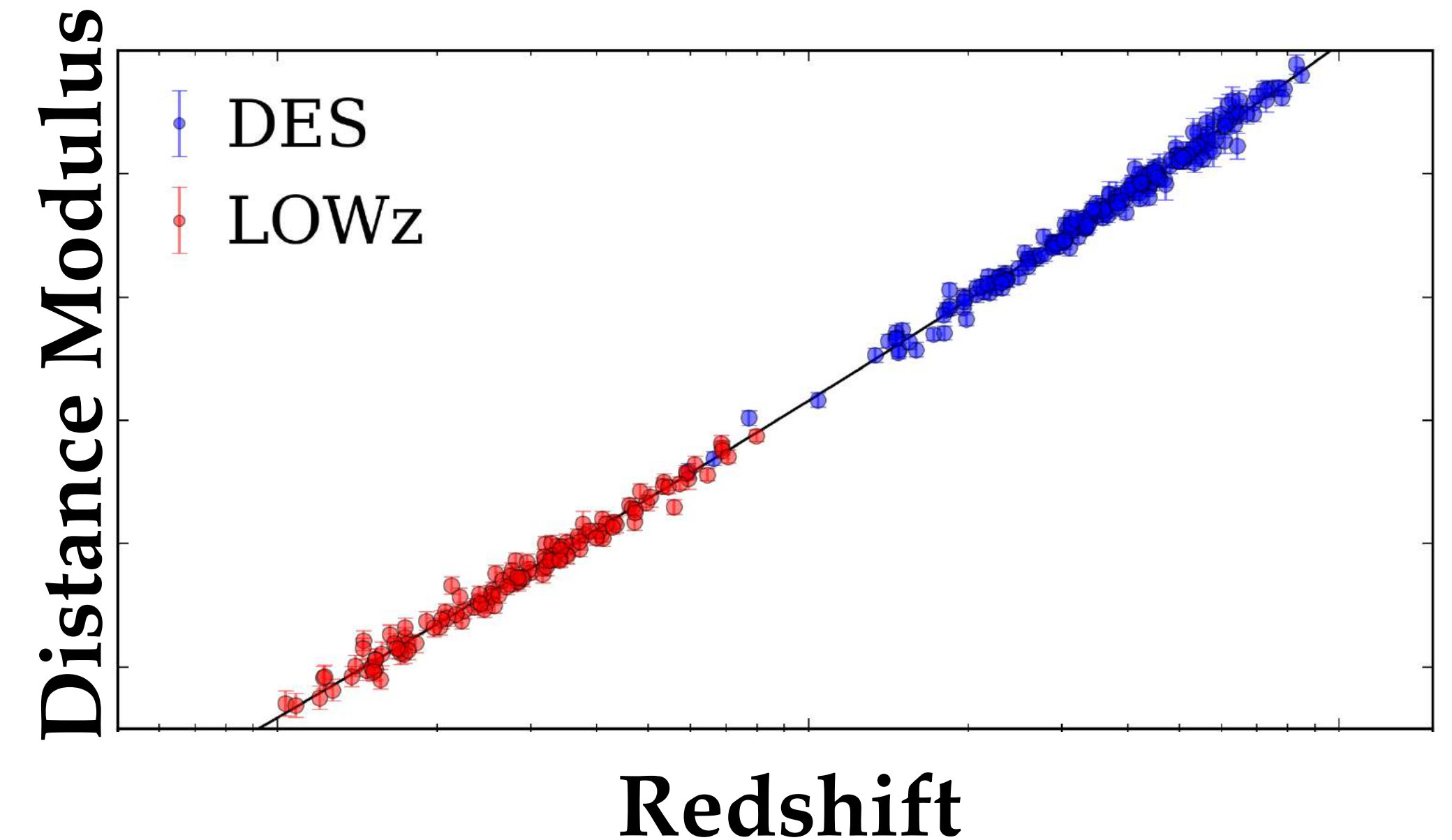
→ Type & redshift

**Photometry**

→ “Standardizable Candles”

**Calibration**

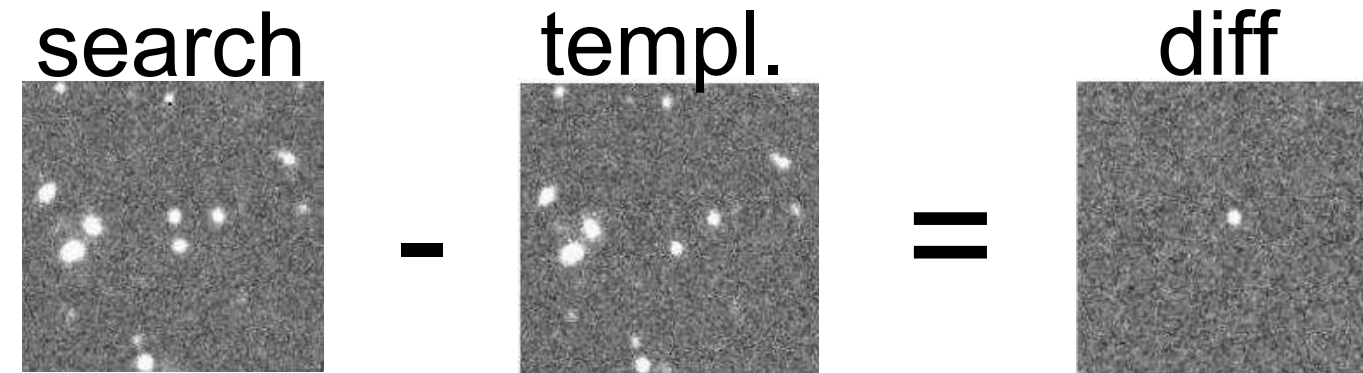
→ Rel. Dist. btwn. All SNe



# Ingredients for Supernova Cosmology

**Difference Imaging**

→ SNe Candidates



**Spectra**

→ Type & redshift

**Photometry**

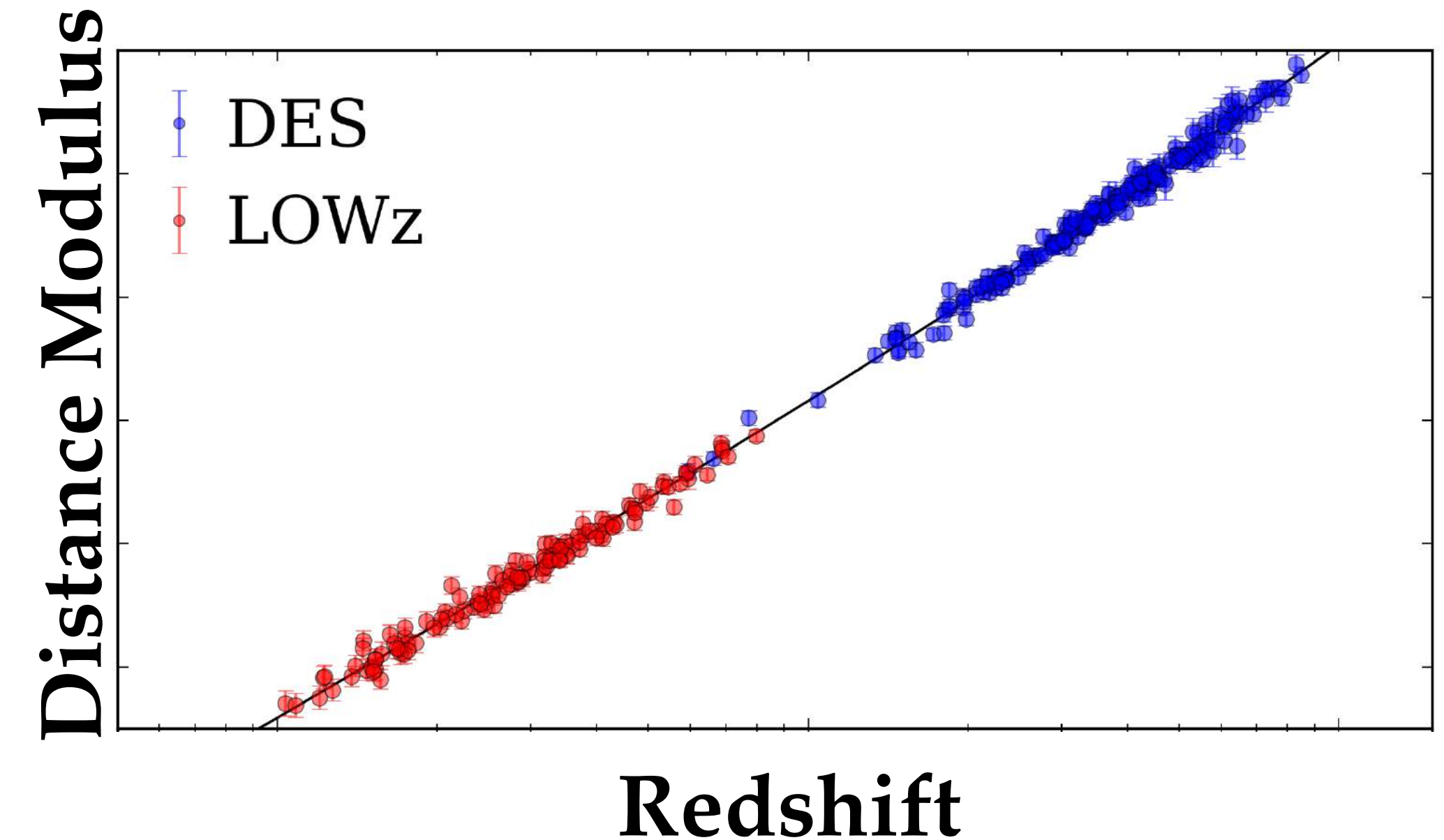
→ “Standardizable Candles”

**Calibration**

→ Rel. Dist. btwn. All SNe

**Simulations**

→ Distance Bias Corrections

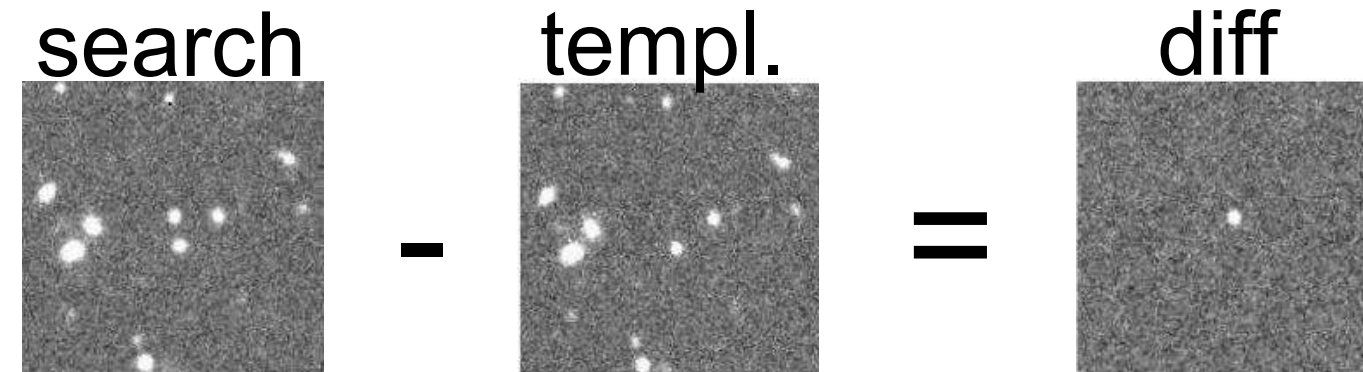




# Ingredients for Supernova Cosmology

**Difference Imaging**

→ SNe Candidates

$$\begin{array}{c} \text{search} \\ \text{templ.} \end{array} - \begin{array}{c} \text{search} \\ \text{templ.} \end{array} = \begin{array}{c} \text{diff} \end{array}$$


**Spectra**

→ Type & redshift

**Photometry**

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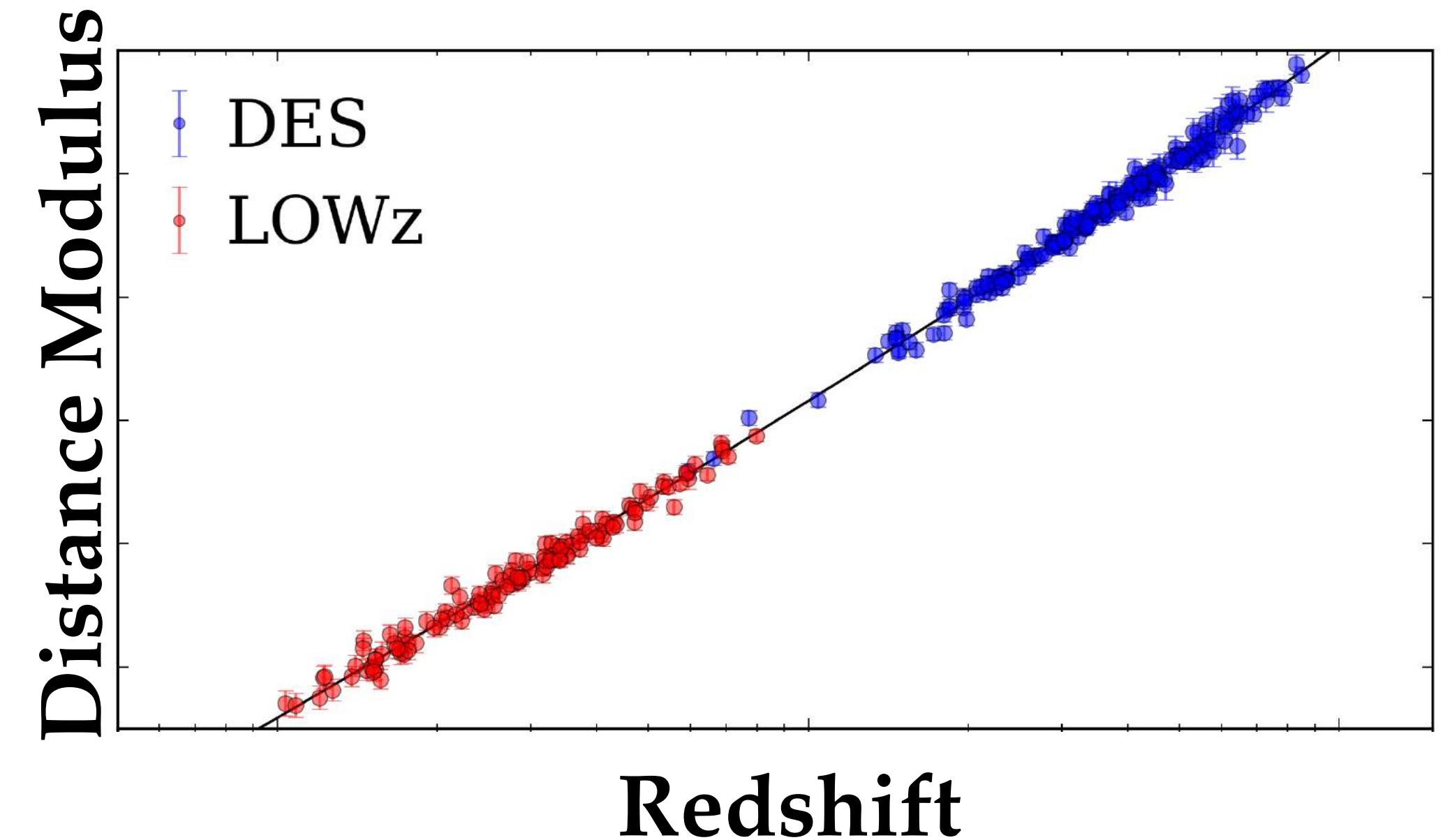
→ Rel. Dist. btwn. All SNe

**Simulations**

→ Distance Bias Corrections

**Systematics**

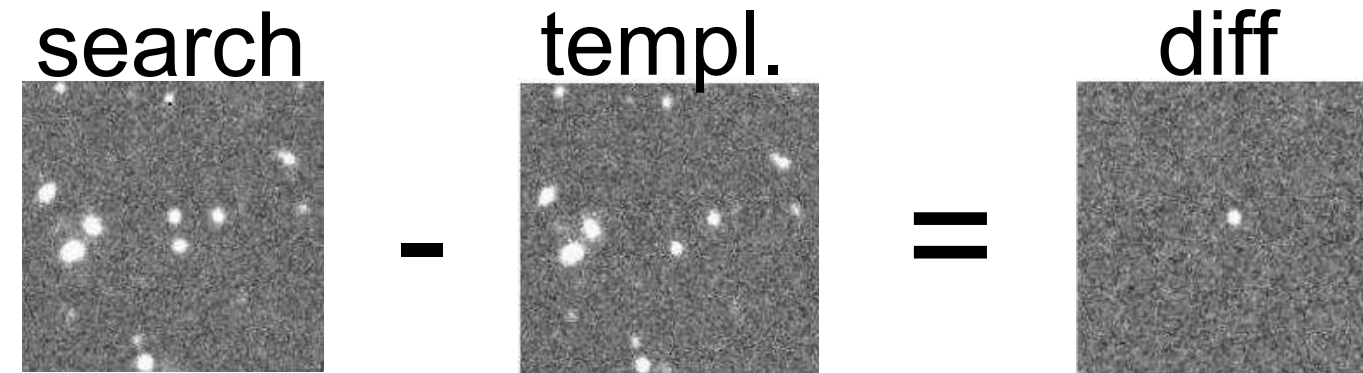
→ Covariance Matrix



# Ingredients for Supernova Cosmology

## Difference Imaging

→ SNe Candidates



## Spectra

→ Type & redshift

## Photometry

→ “Standardizable Candles”

## Calibration

→ Rel. Dist. btwn. All SNe

## Simulations

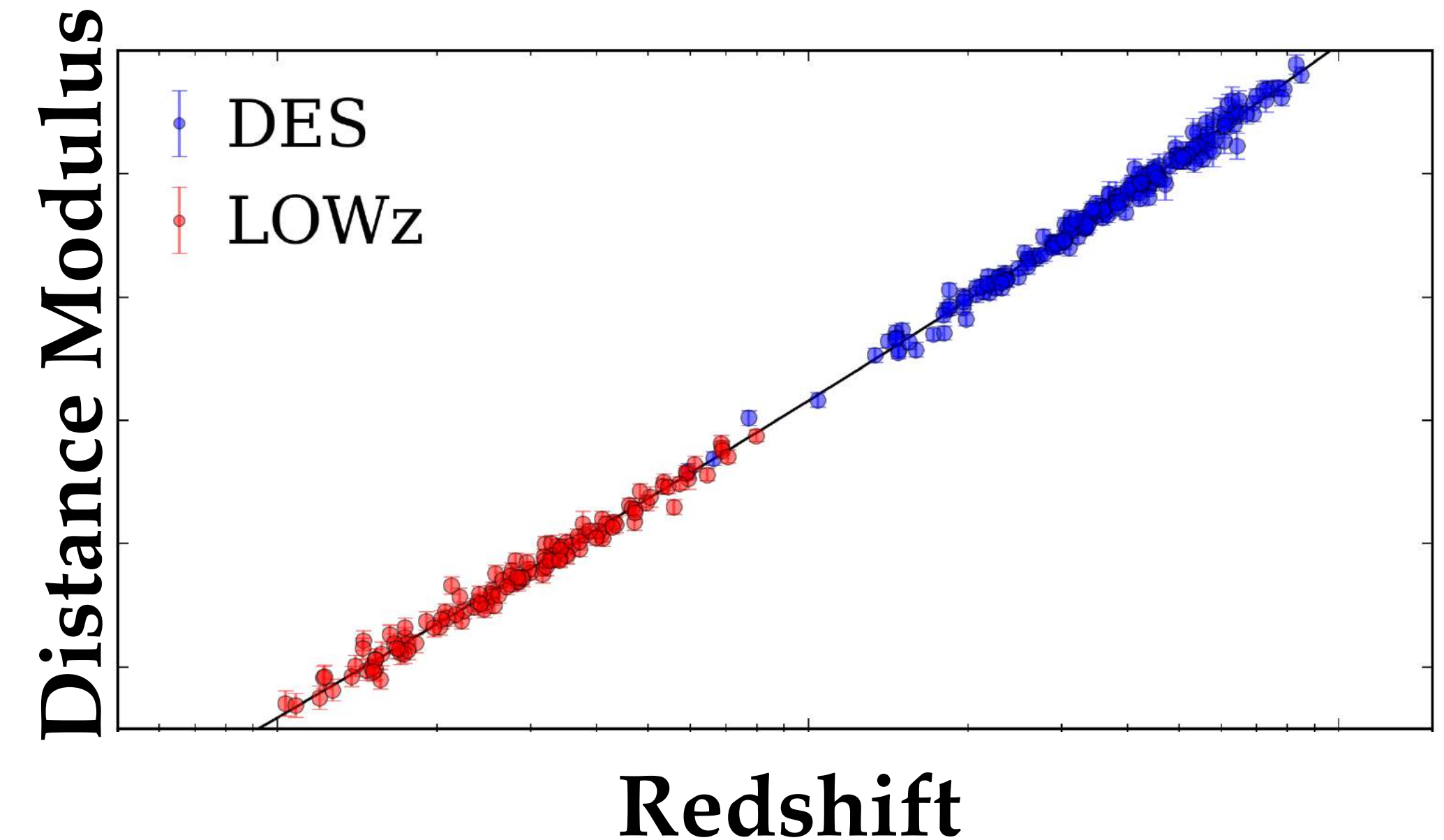
→ Distance Bias Corrections

## Systematics

→ Covariance Matrix

## CosmoMC

→  $\Lambda$ CDM fit with SNe Ia + Planck 2015

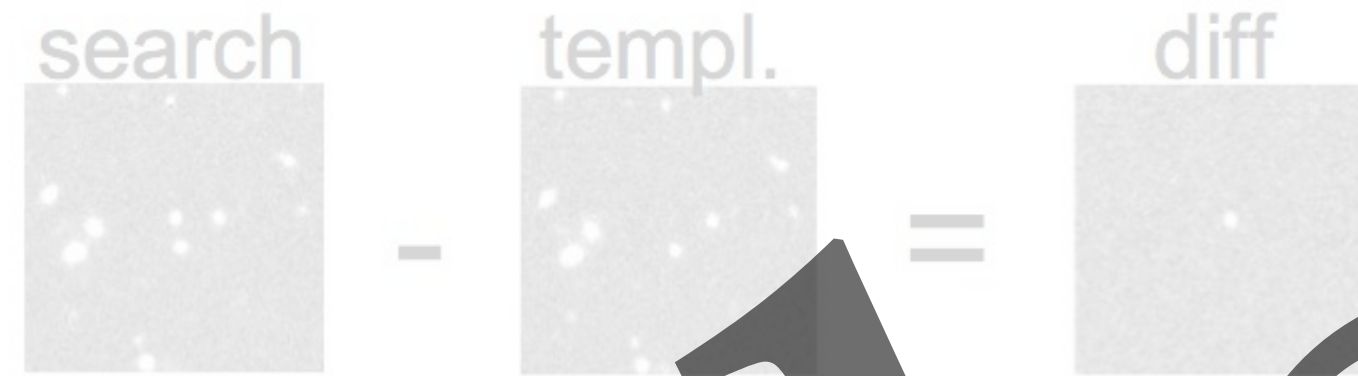




# Ingredients for Supernova Cosmology

Difference Imaging

→ SNe Candidates



Spectra

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Photometry

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Calibration

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Simulations

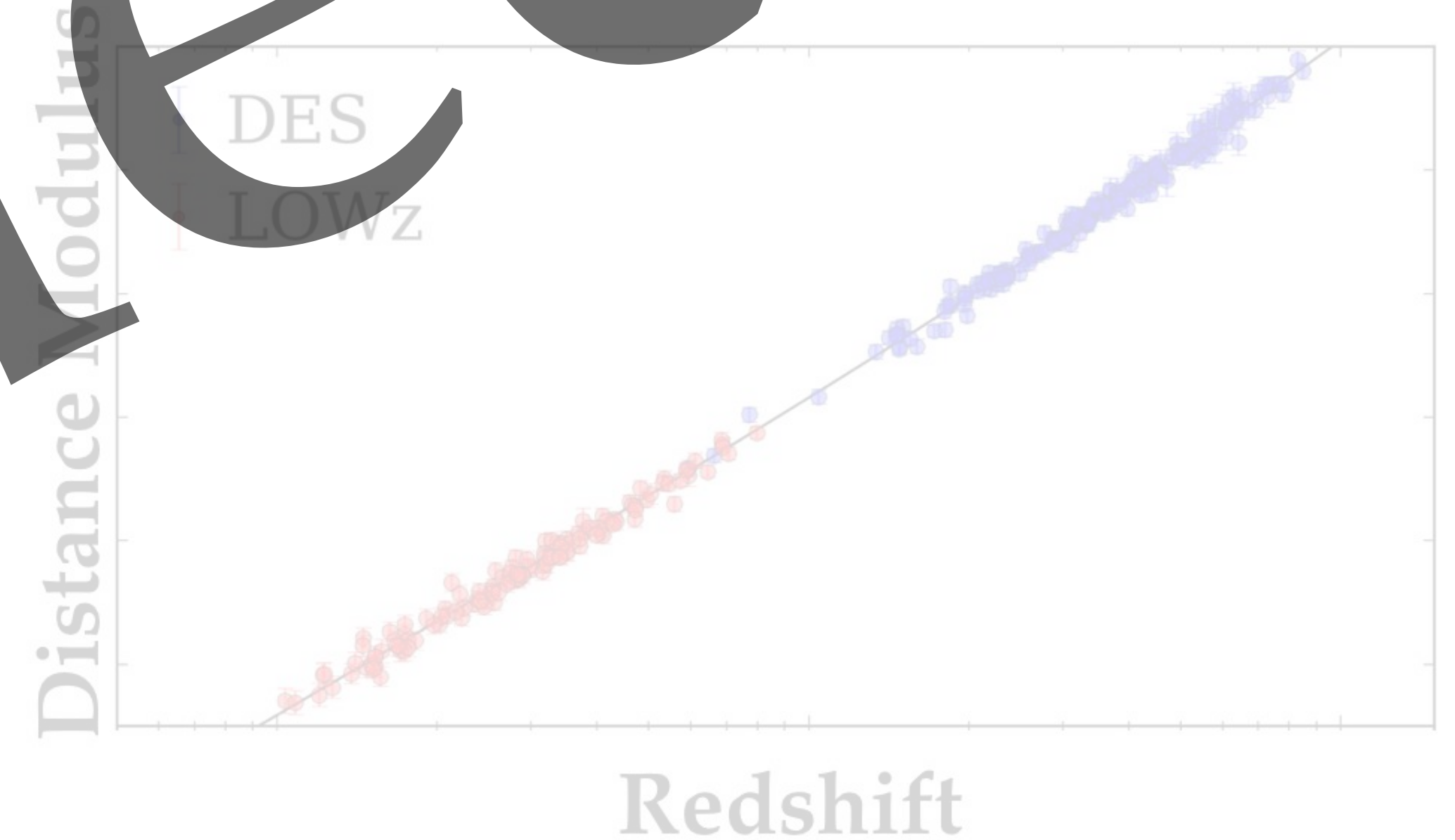
→ Distance Bias Corrections

Systematics

→ Covariance Matrix

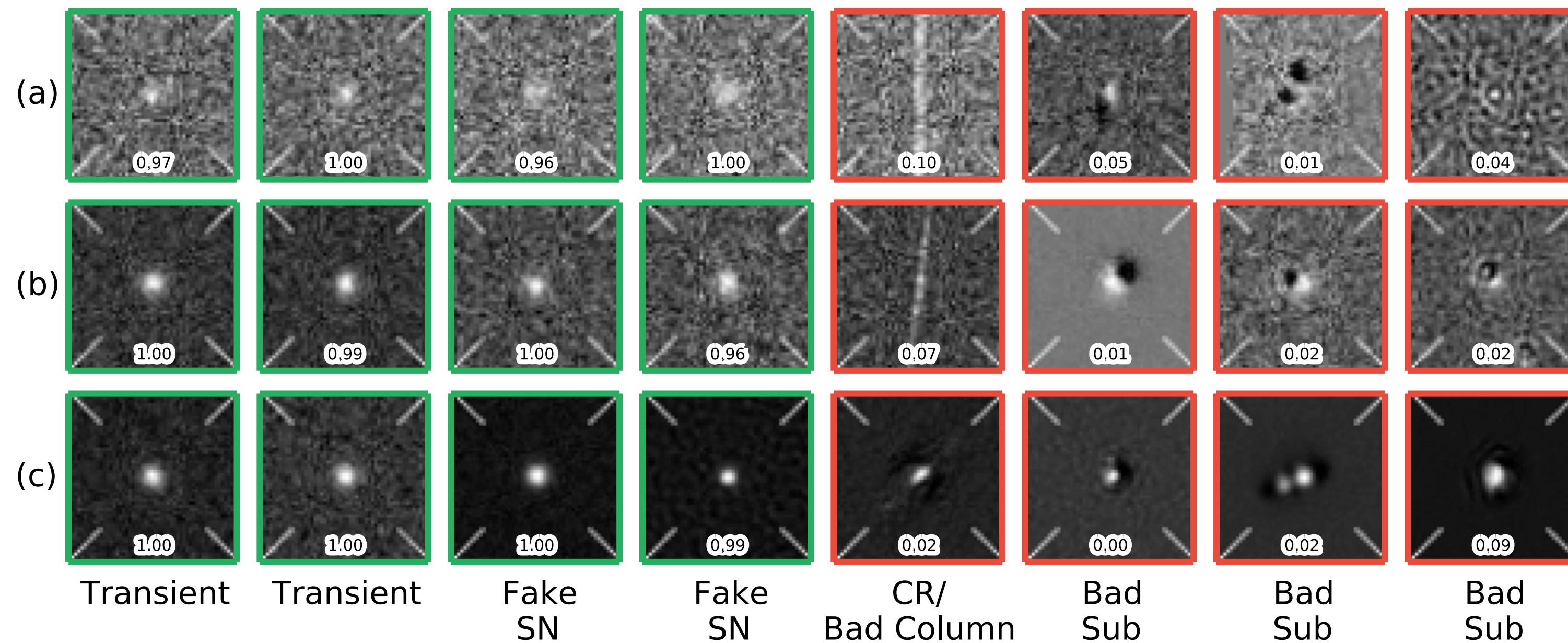
CosmoMC

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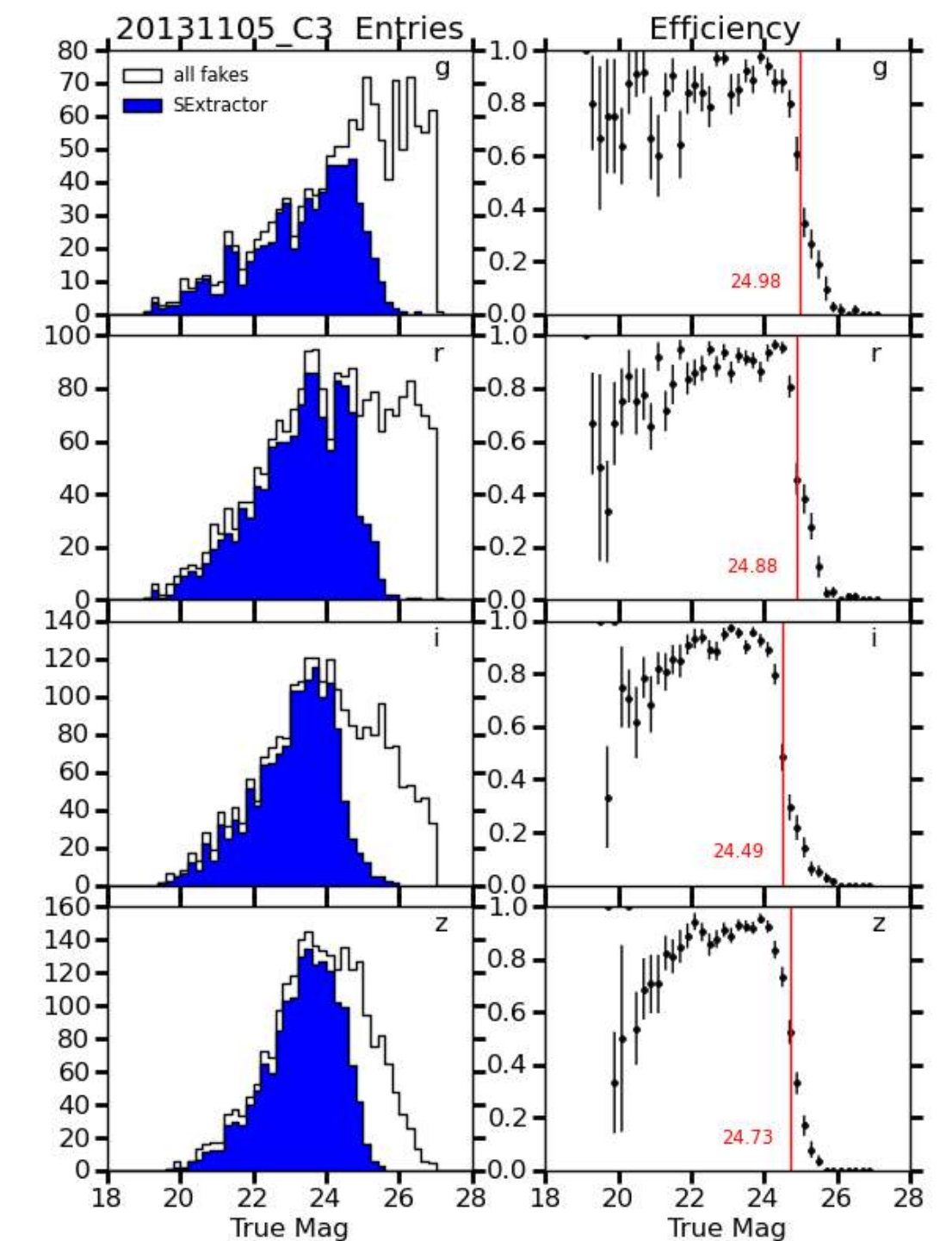
# Automated Supernova Survey Monitoring

Machine learning to filter junk detections.  
~200-500 detections per visit; only ~4% artifacts!



Goldstein et al. (2015)

Realtime monitoring  
system with fake sources



Kessler et al. (2015)



# Precision Flux Measurements For Precision Distances

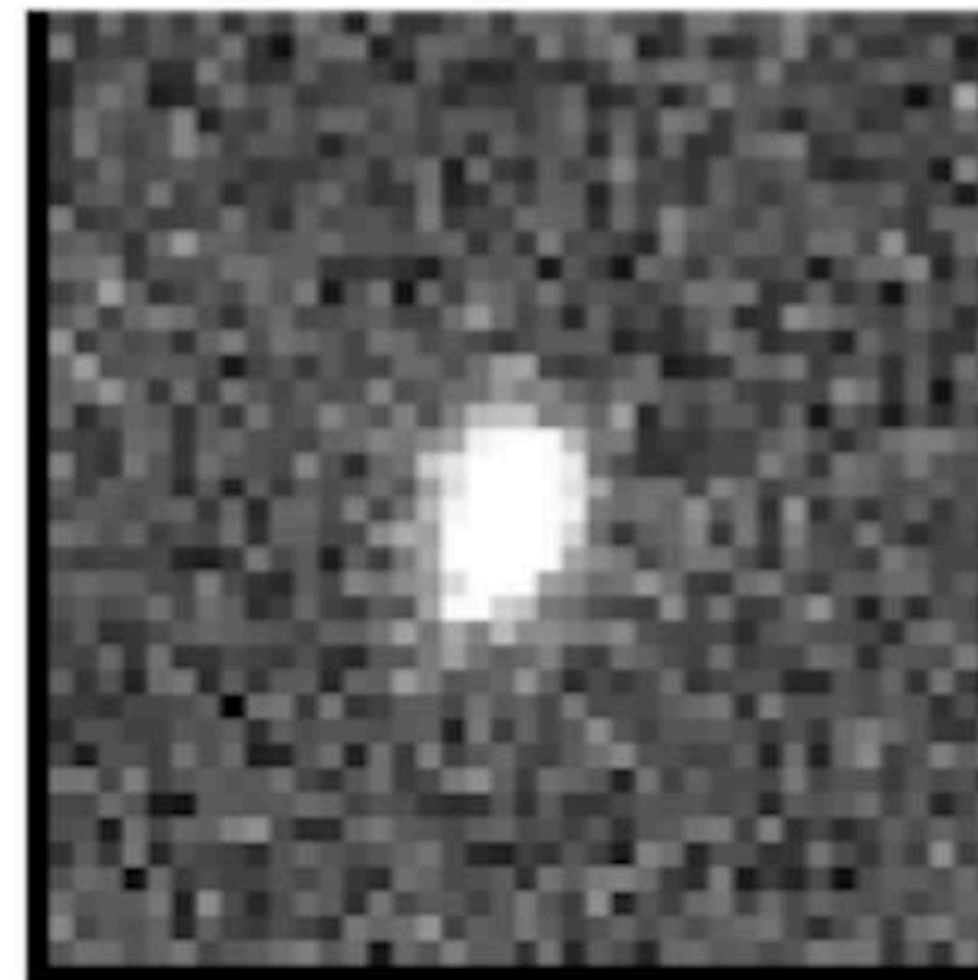
We forward model THE SCENE:

**Environment**

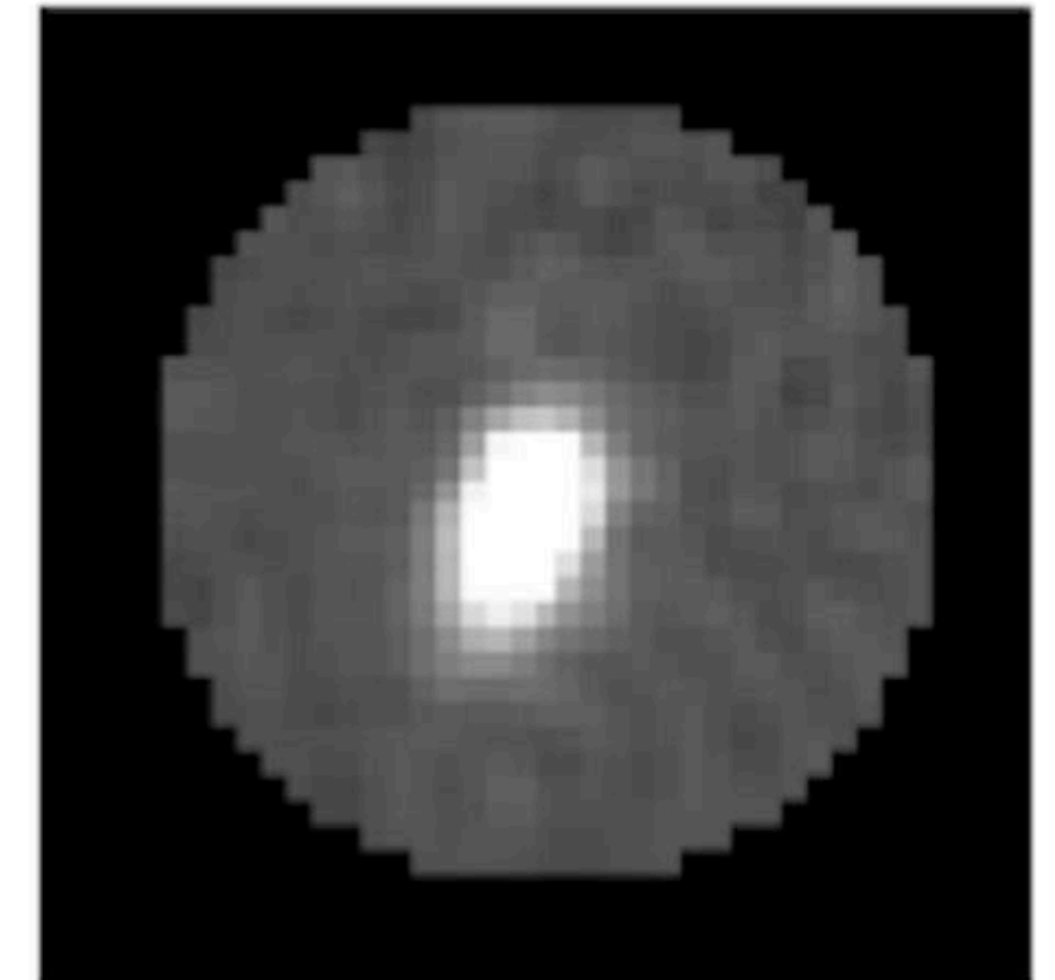
**Supernova**

**Telescope + Atmosphere**

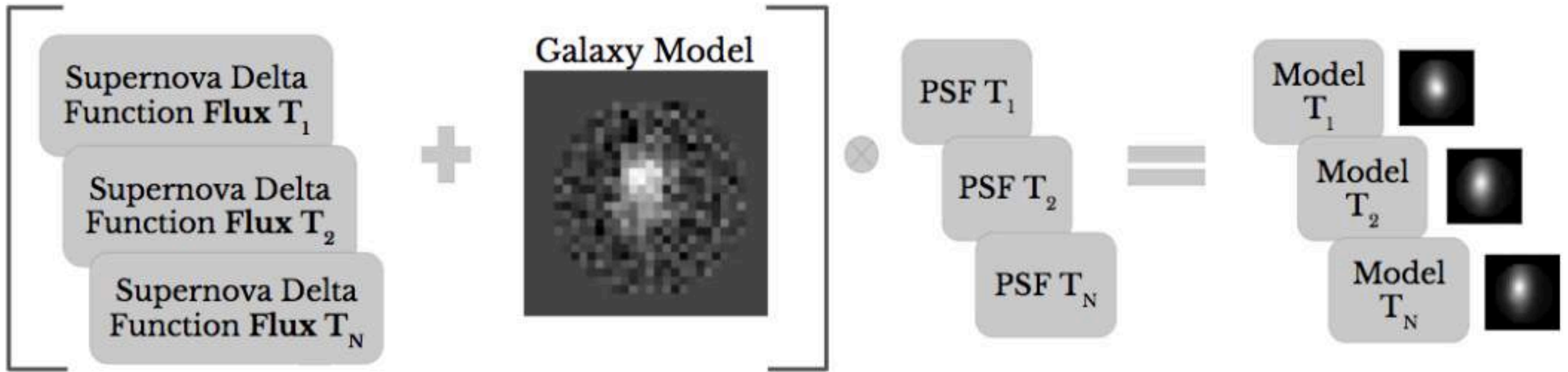
**DATA**



**MODEL**

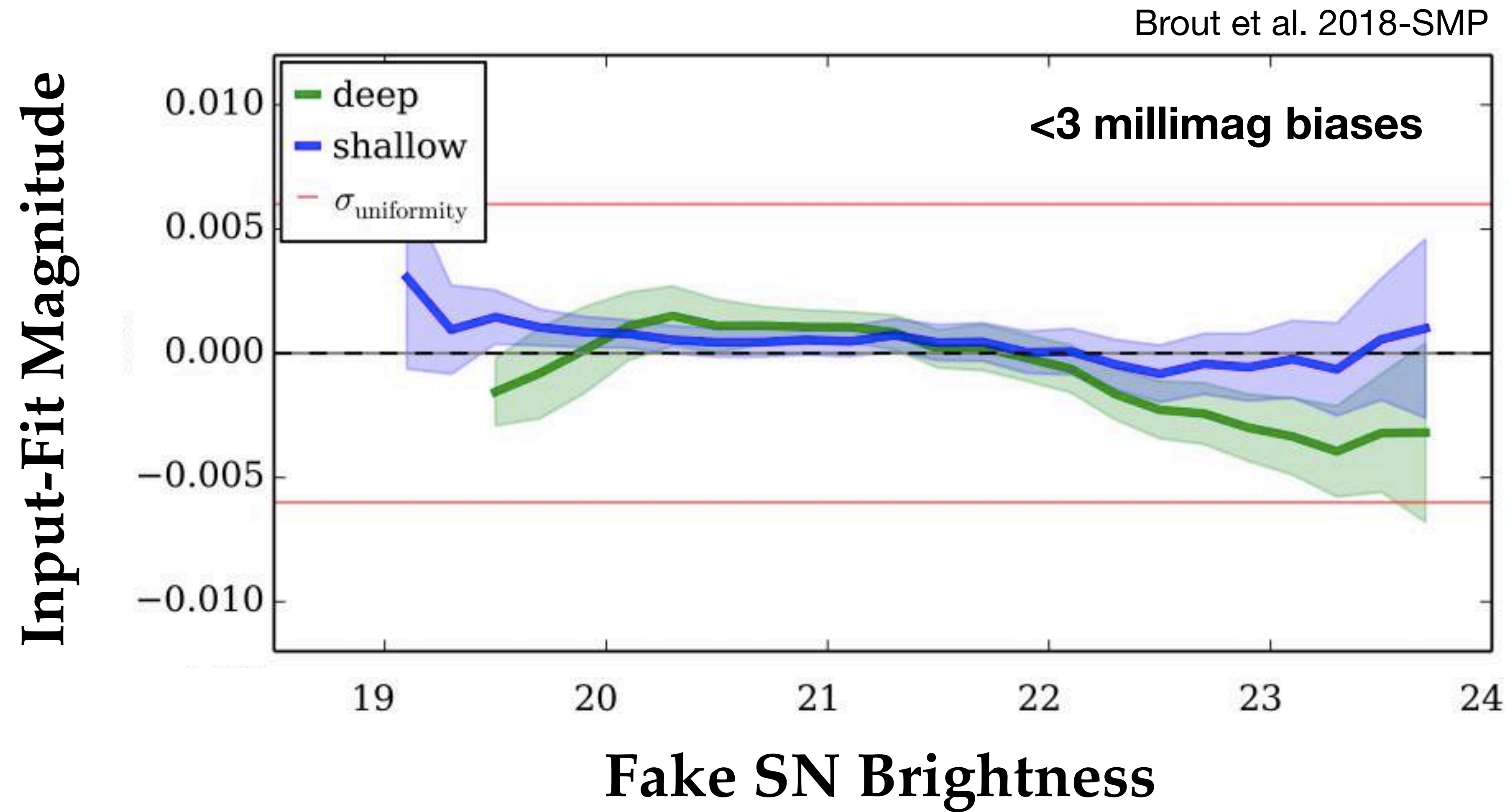


# SMP Model Visual Representation



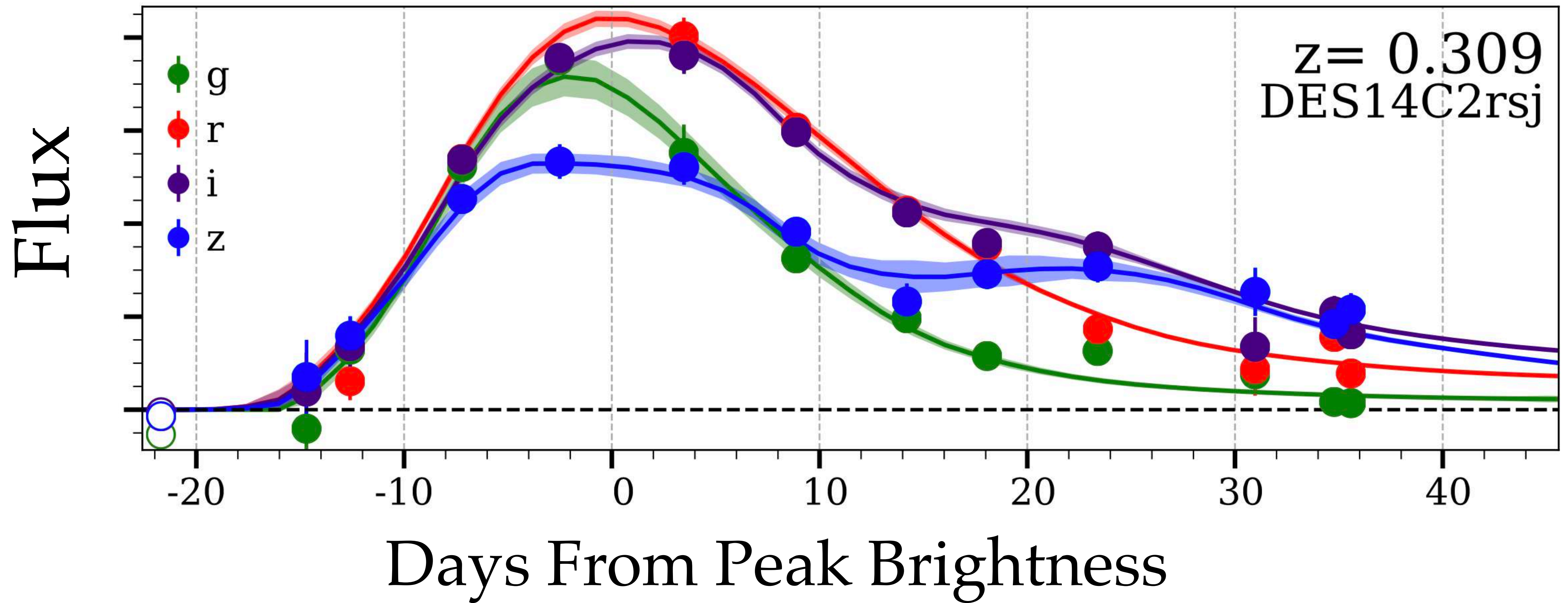


# Fake Supernovae Overlaid on Images



# DES Light curve Photometry

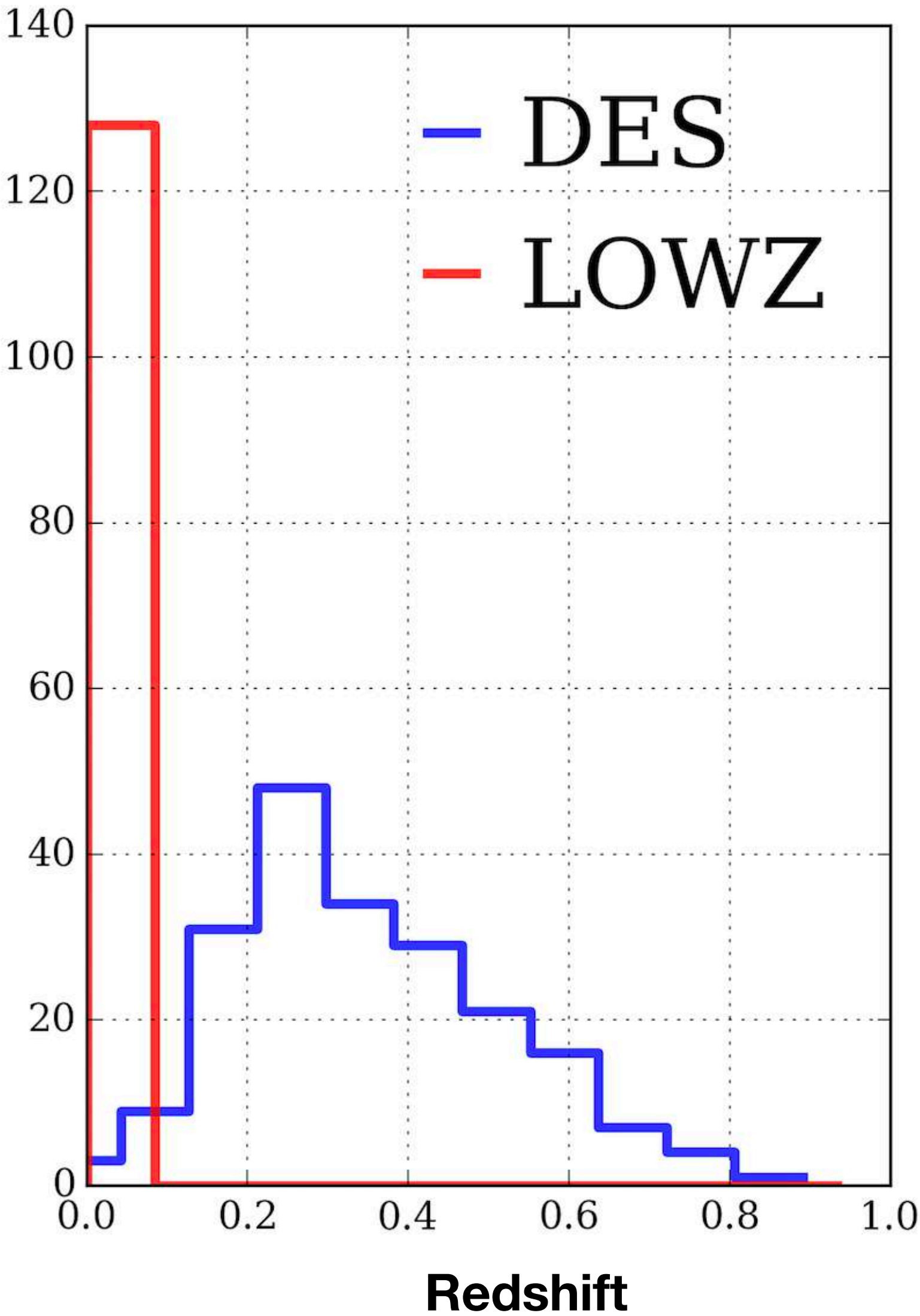
Brout et al. 2018-SMP



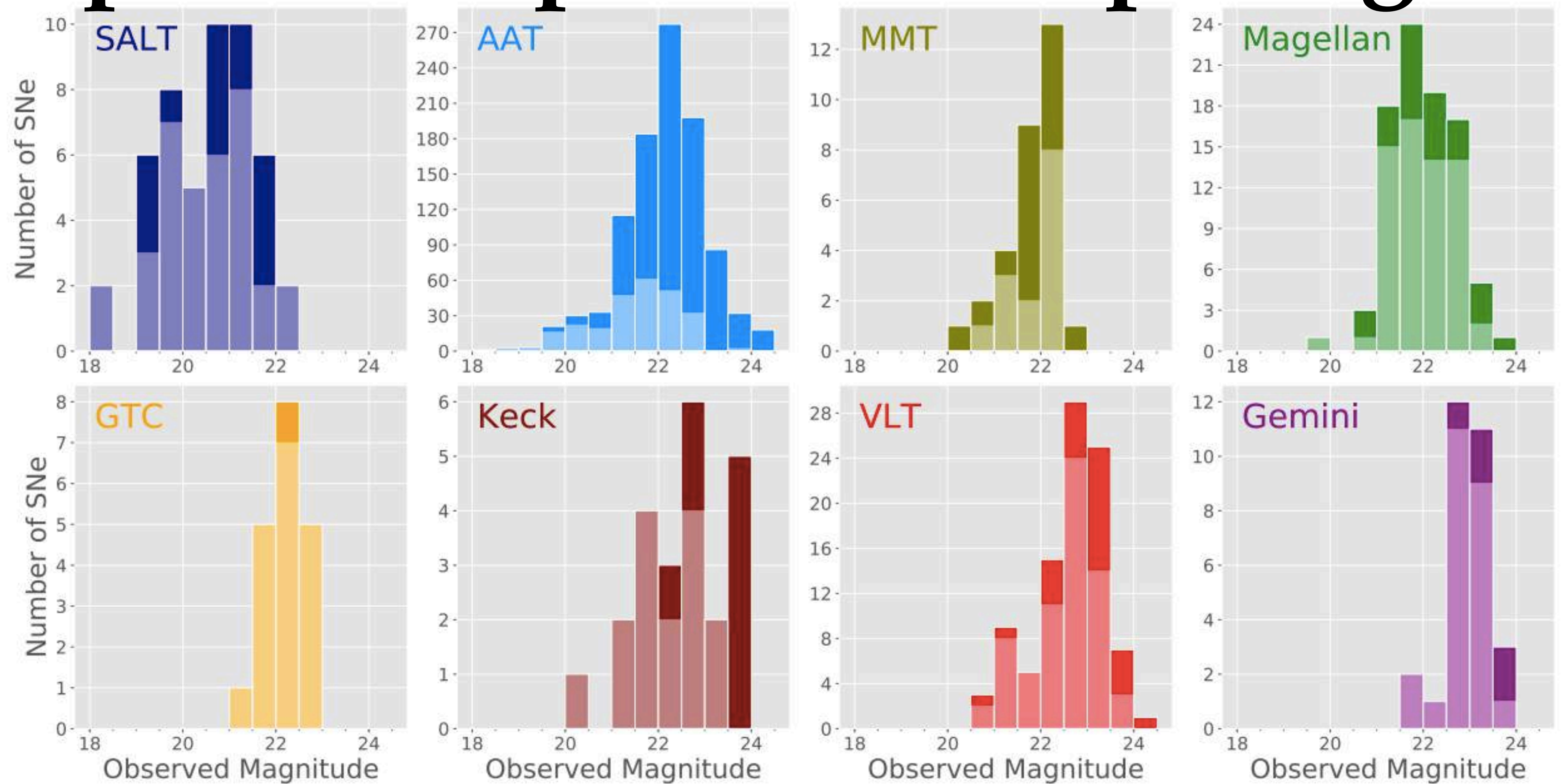


# The DES-SN3YR Spec Ia Dataset

Source	Spec. Redshifts	#Spec SNe Ia
DES-SN (3yr spec sample)	$0.02 < z < 0.85$	207
External Low-z (CfA3-4, CSP)	$0.01 < z < 0.10$	122



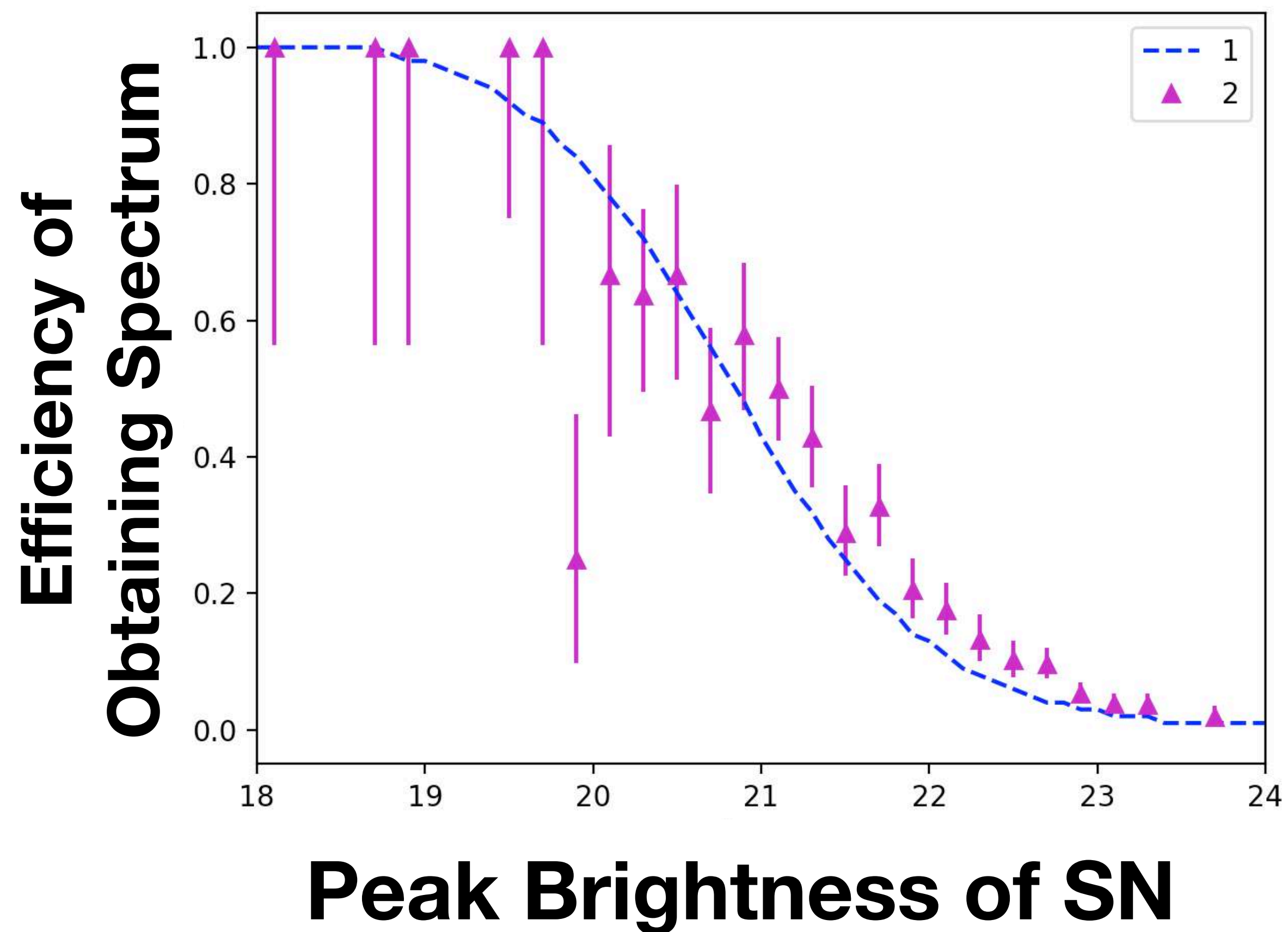
# Spectroscopic Followup Program



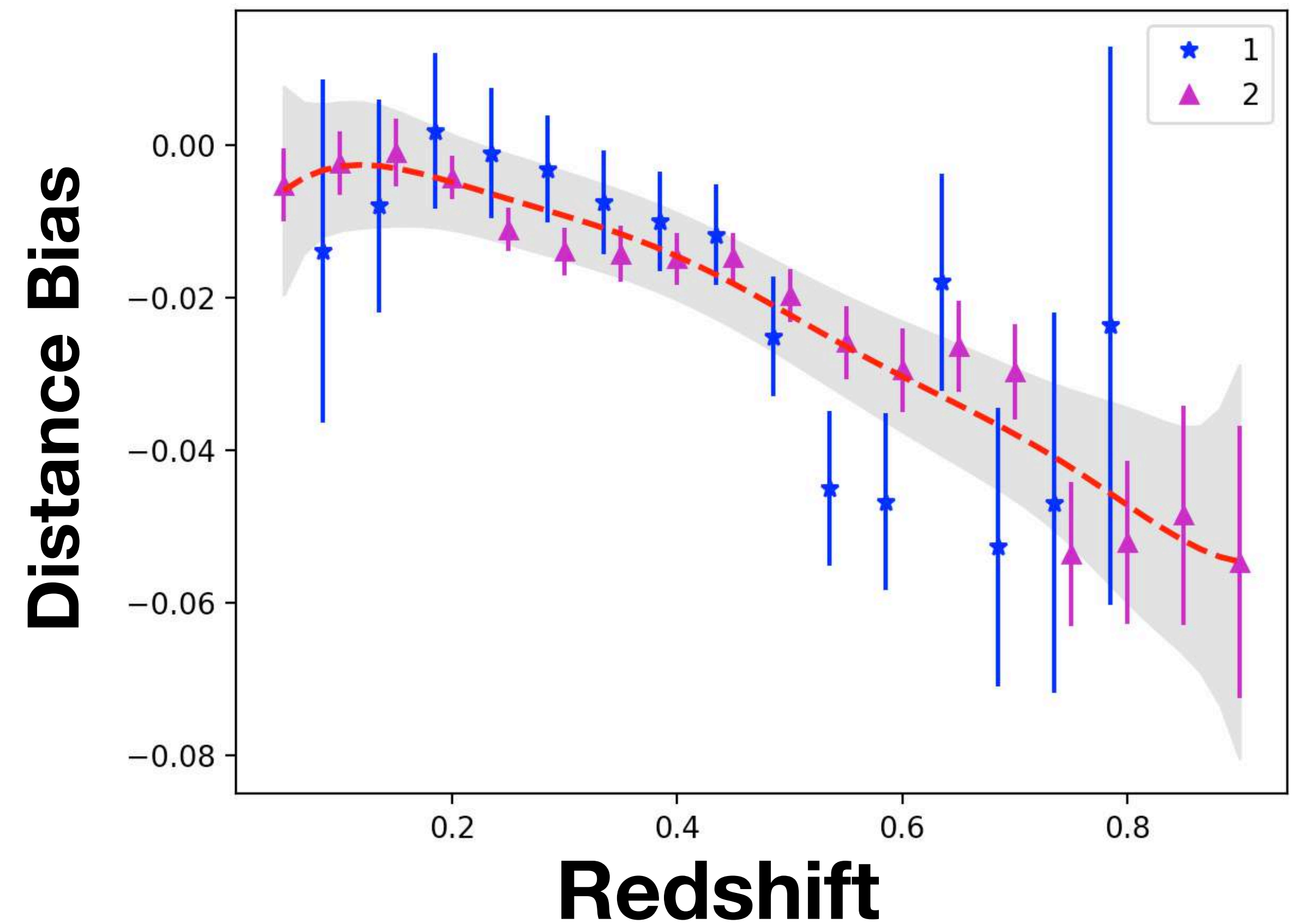
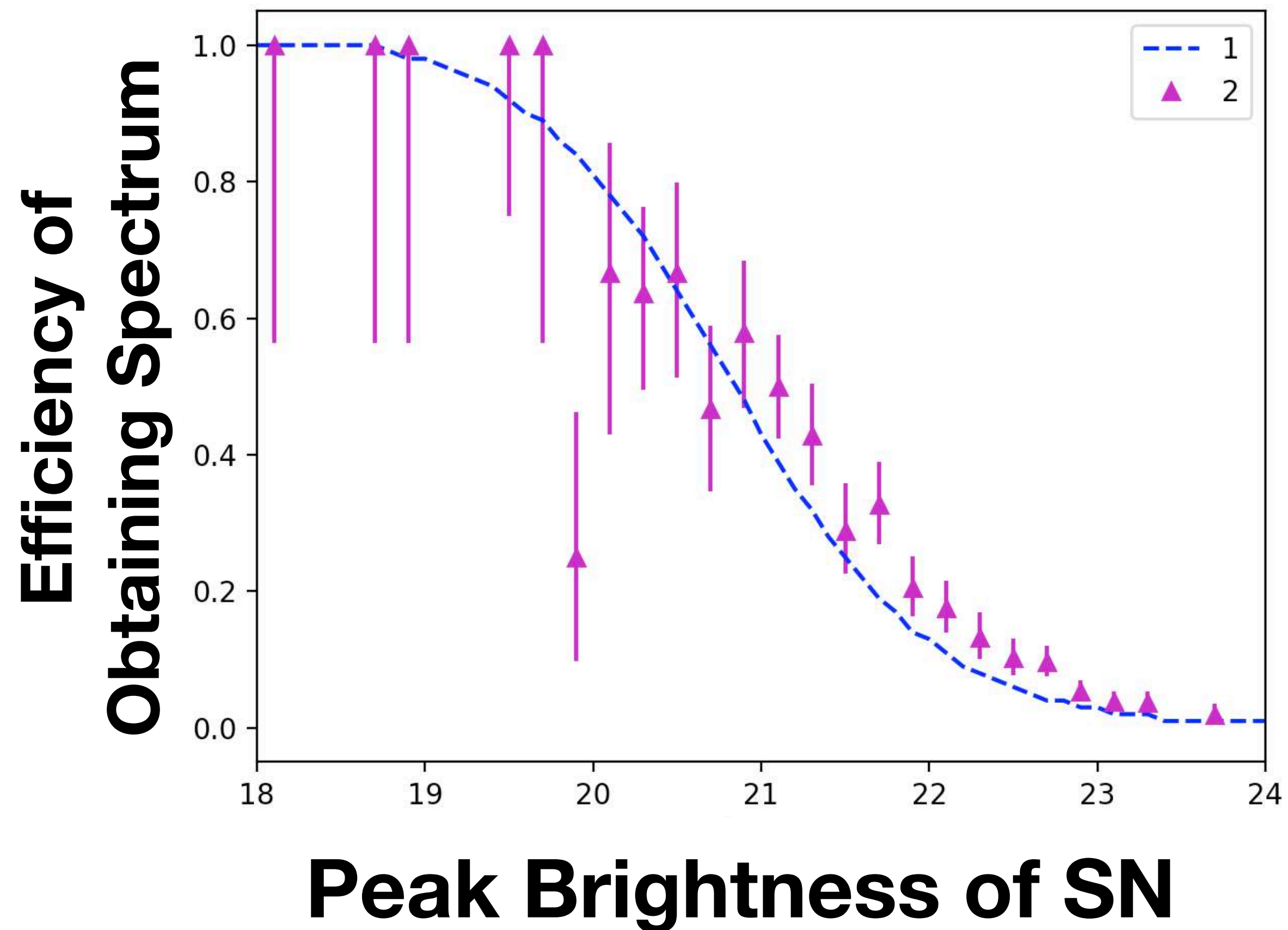
D'Andrea et al. 2018



# Selection Effects Result in Biased Distances

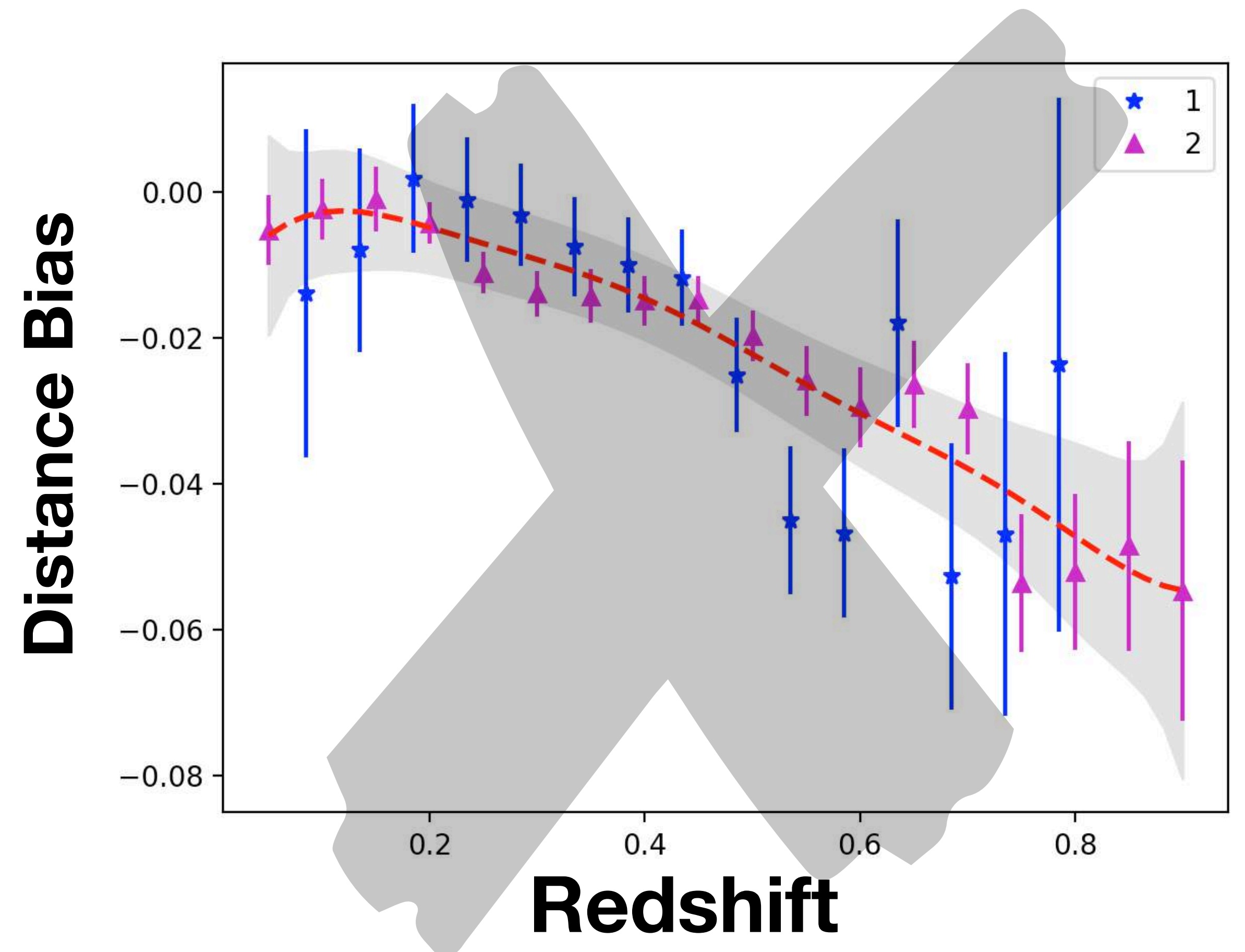
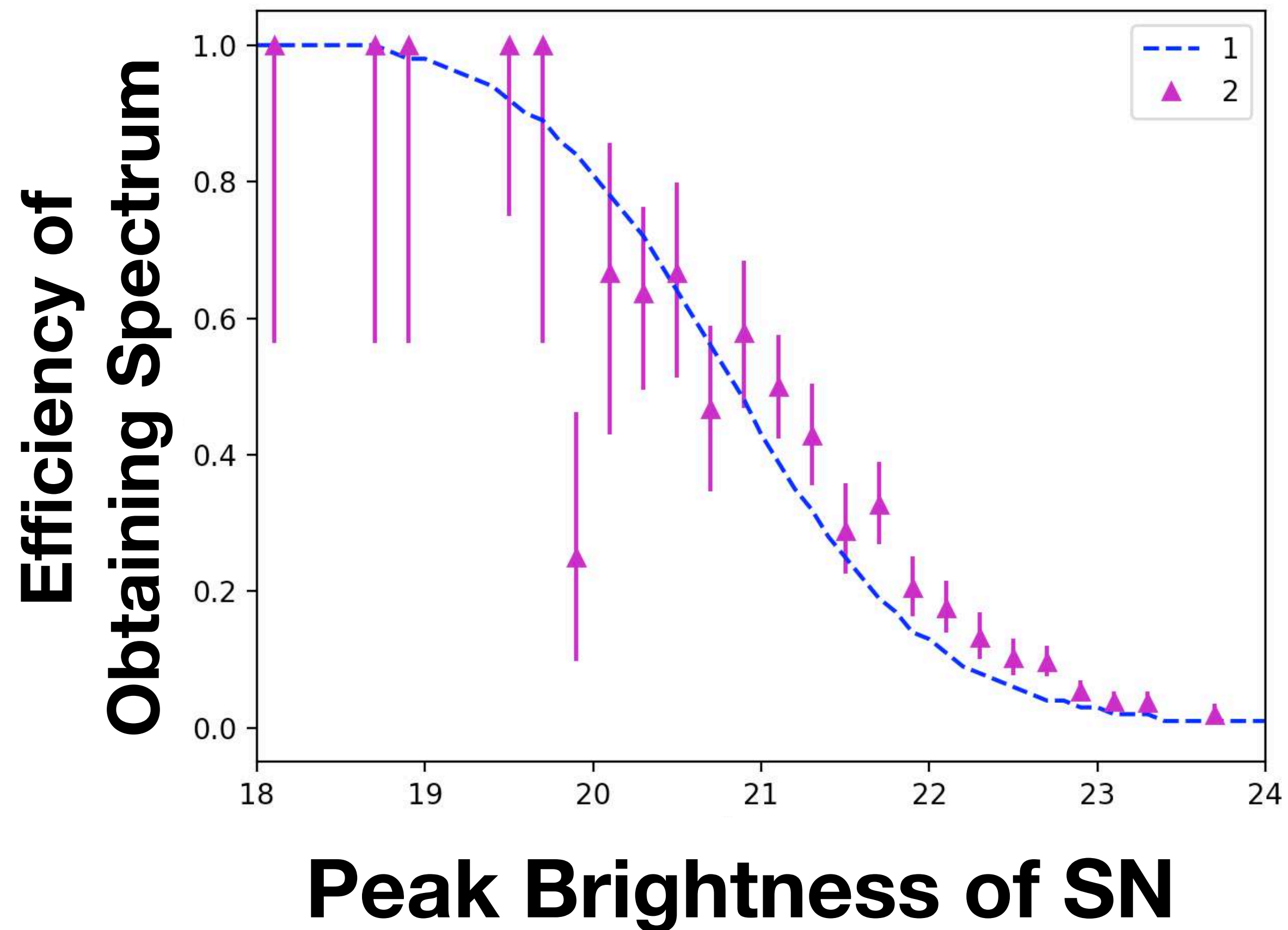


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# Selection Effects Result in Biased Distances



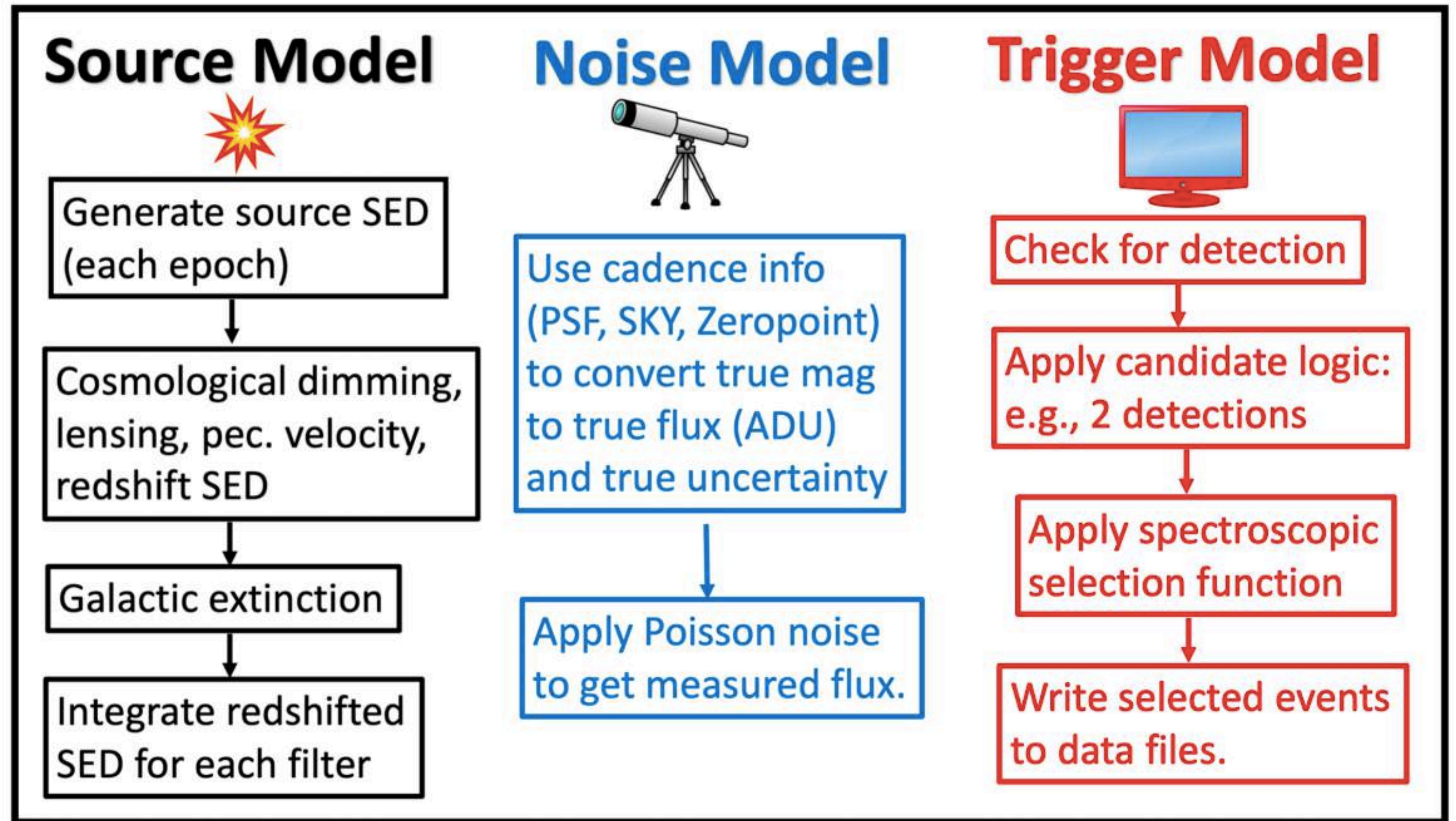


# To predict observed biases, we use accurate simulations

SNANA

Simulations are able to capture nearly every aspect of DES-SN survey.

Large sims (1 million SNe) are used to predict and correct for distance biases in the DES-SN<sub>3</sub>YR dataset.



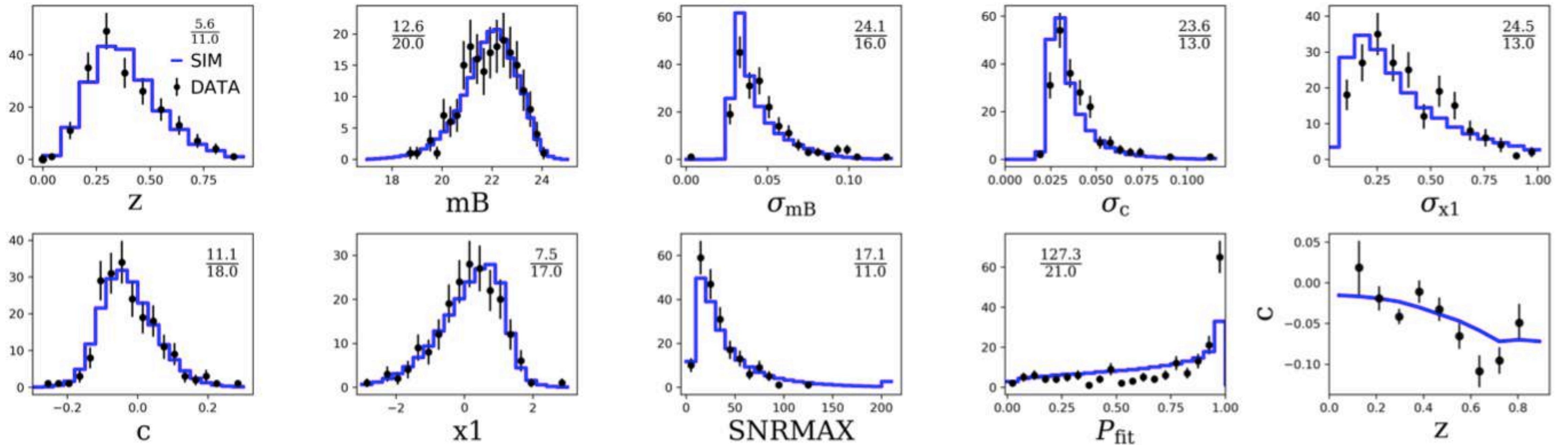
Kessler et al. 2018



# To predict biases, we need accurate simulations

DES-SN Sample Data and Simulations

Brout et al 2018

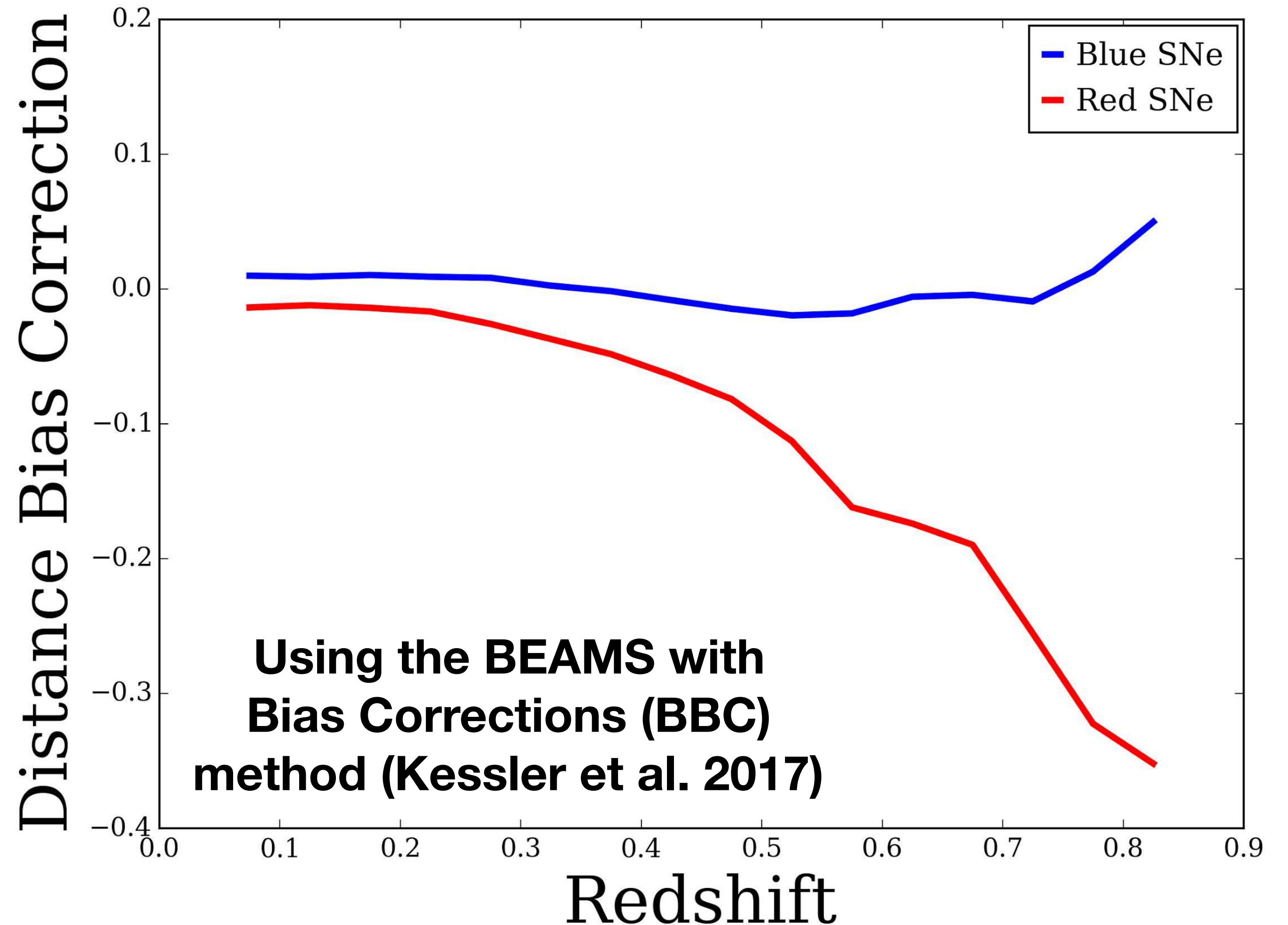


# Compute Distance Bias Corrections

$$\mu = m_B - M + \alpha x_1 - \beta c$$

We compute bias corrections in 5D

1. SN color
2. SN Light curve stretch
3. Redshift
4. Standardization nuisance parameter for SN color (beta)
5. Standardization nuisance Parameter for SN light curve stretch (alpha)

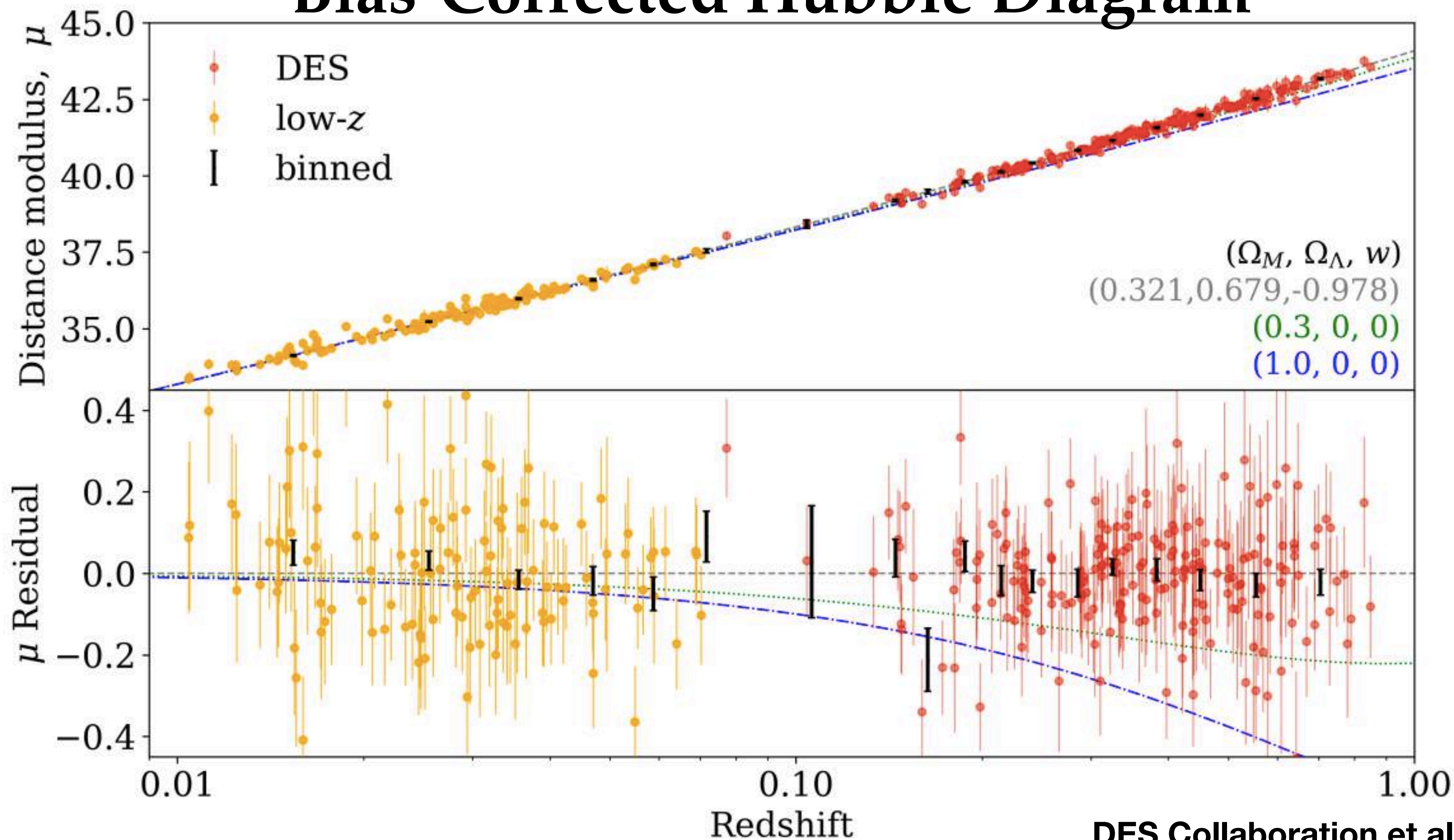






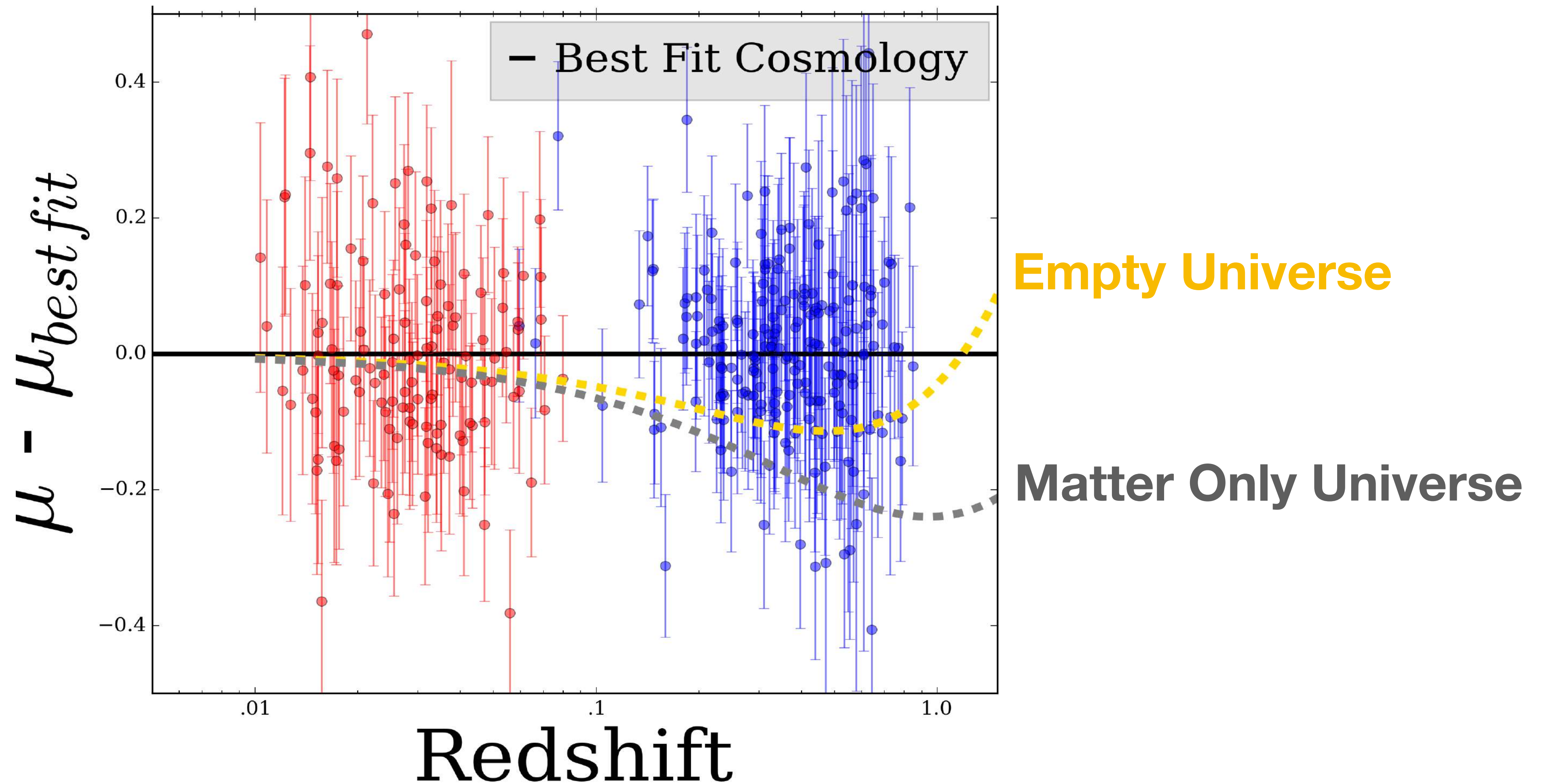
THE DARK ENERGY SURVEY

## Bias-Corrected Hubble Diagram



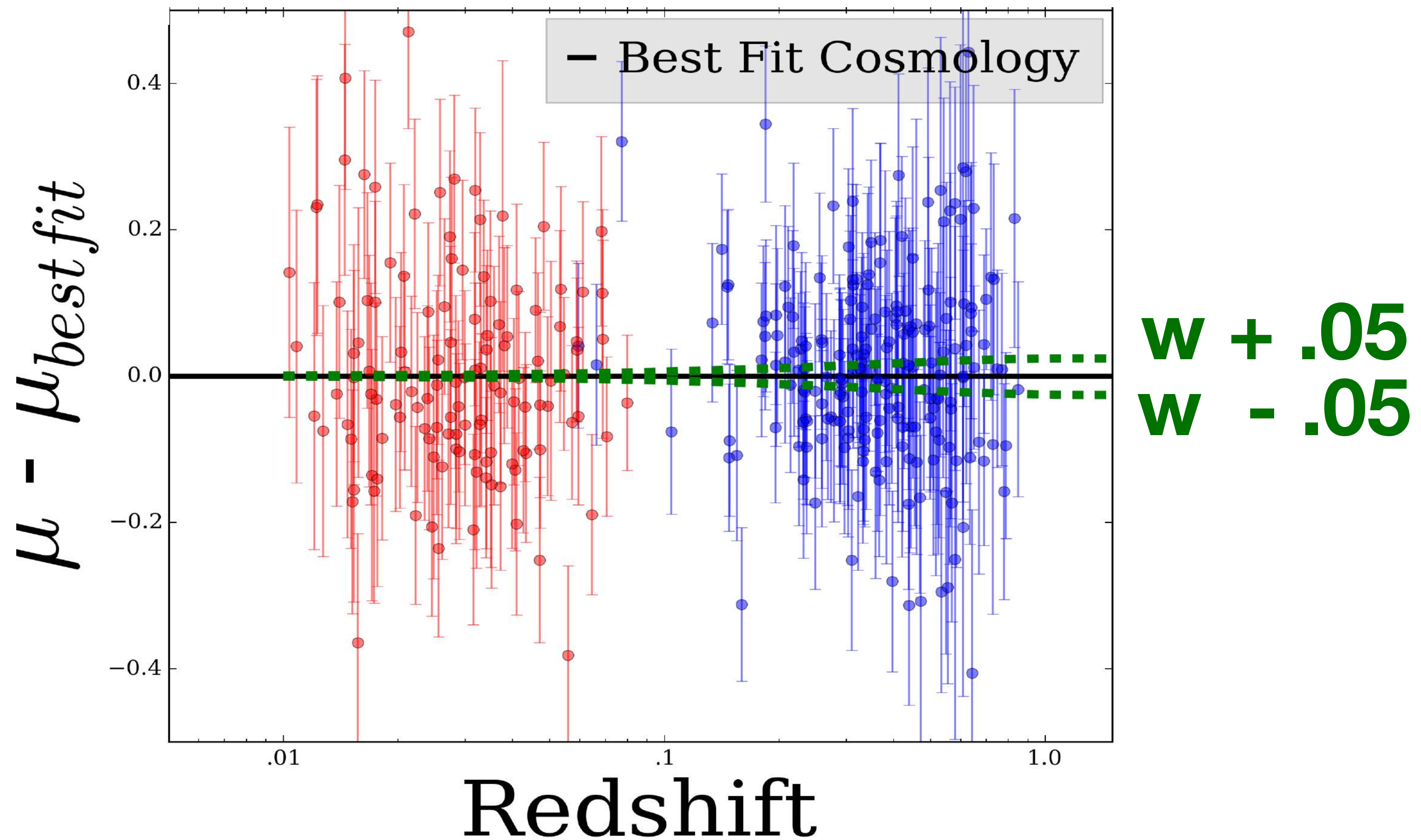


# Measuring acceleration is “easy” now...





# Precision cosmology however, is difficult





# THE DARK ENERGY SURVEY

**Cosmological Parameter Constraints**  
DES Collaboration et al.

**DES Y1 Combined Probes**  
DES Collaboration et al.

**$H_0$  Measurement**  
Macaulay et al.

**Analysis, Systematics, & Validation**  
Brout et al.

**Photometric Pipeline**  
Brout et al.

**Spectroscopic Followup**  
D'Andrea et al.

**Simulations to Correct Distance Biases**  
Kessler et al.

**Effect of Chromatic Corrections**  
Lasker et al.

**Bayesian Hierarchical Method**  
Hinton et al.



# Our systematics fall in the following categories

TABLE 4  
SOURCES OF UNCERTAINTY

Size <sup>a</sup>	Description	Reference
SN Photometry		
1 mmag	From astrometry	Bernstein et al. (2017)
1 mmag	Non-linearity of the CCD.	Bernstein et al. (2017)
1-2 mmag	Photometric zero pointing.	B18-SMP
3 mmag	Photometric bias determined by fakes.	B18-SMP
Calibration		
$6/\sqrt{3}$ mmag	DECam $\sigma_{\text{uniformity}}$	Burke et al. (2018)
0.6 nm	DECam filter curves uncertainty.	Abbott et al. (2018)
$[-2, -2, -1, 5]$ mmag	Modeling of C26202 implemented as coherent shift $[g, r, i, z]$	Figure 4
5mmag/700 nm	HST Calspec spectrum modeling uncertainty	Bohlin et al. (2014)
1/3 No SuperCal	SuperCal process	S18, Scolnic et al. (2015)
Following S18	Low-z samples photometric calibration.	S18, CfA3-4, CSP-1
Following S18	Low-z samples filter curve measurement.	S18, CfA3-4, CSP-1
Following B14	SALT2 light curve model calibration.	B14
Bias Corrections (Astrophysical)		
Table 3	$c, x_1$ Parent populations resulting in $\Delta\chi^2 = 2.3$	§ 4.3
1/2 (G10 – C11)	Model of intrinsic scatter variations	§ 4.2
Two $\sigma_{\text{int}}$	Separate fit $\sigma_{\text{int}}$ for each subset	§ 4.2
0.05 in $w$	<sup>†</sup> Cosmology in which the bias correction sample is simulated.	§ 4.5
4% Scaling	MW Extinction maps	§ 4.9, Schlafly & Finkbeiner (2011b)
Bias Corrections (Survey)		
$3.5\sigma \rightarrow 3\sigma$ outlier cut	<sup>†</sup> Low- $z$ Hubble diagram outlier cut.	§ 4.7
$1\sigma_{\text{stat}}$ Fluctuation	Spectroscopic selection function statistical fluctuations.	§ 4.4, Figure 8
Low- $z$ Selection	Low- $z$ subset magnitude $\rightarrow$ volume limited survey.	§ 4.3
5% $\sigma_{\text{phot}}$ Underestimation	<sup>†</sup> Incorrect SN photometric uncertainties.	§ 4.8
Redshifts		
$4 \times 10^{-5}$ in $z$	<sup>†</sup> Coherent $z$ -shift.	§ 4.6, Calcino & Davis (2017)
$0.9 \times \beta_{\text{bias}}$	Peculiar velocity modeling	§ 4.6, Zhang et al. (2017)

<sup>a</sup> Size adopted for each source of systematic uncertainty.

<sup>†</sup> Sources of systematic uncertainty that have not been included in previous analyses.

Brout et al. 2018

1. Photometry + Calibration  
(20 low- $z$  bands + 4 DES bands)

2. Astrophysics Modeling

3. Survey Modeling

4. Redshifts

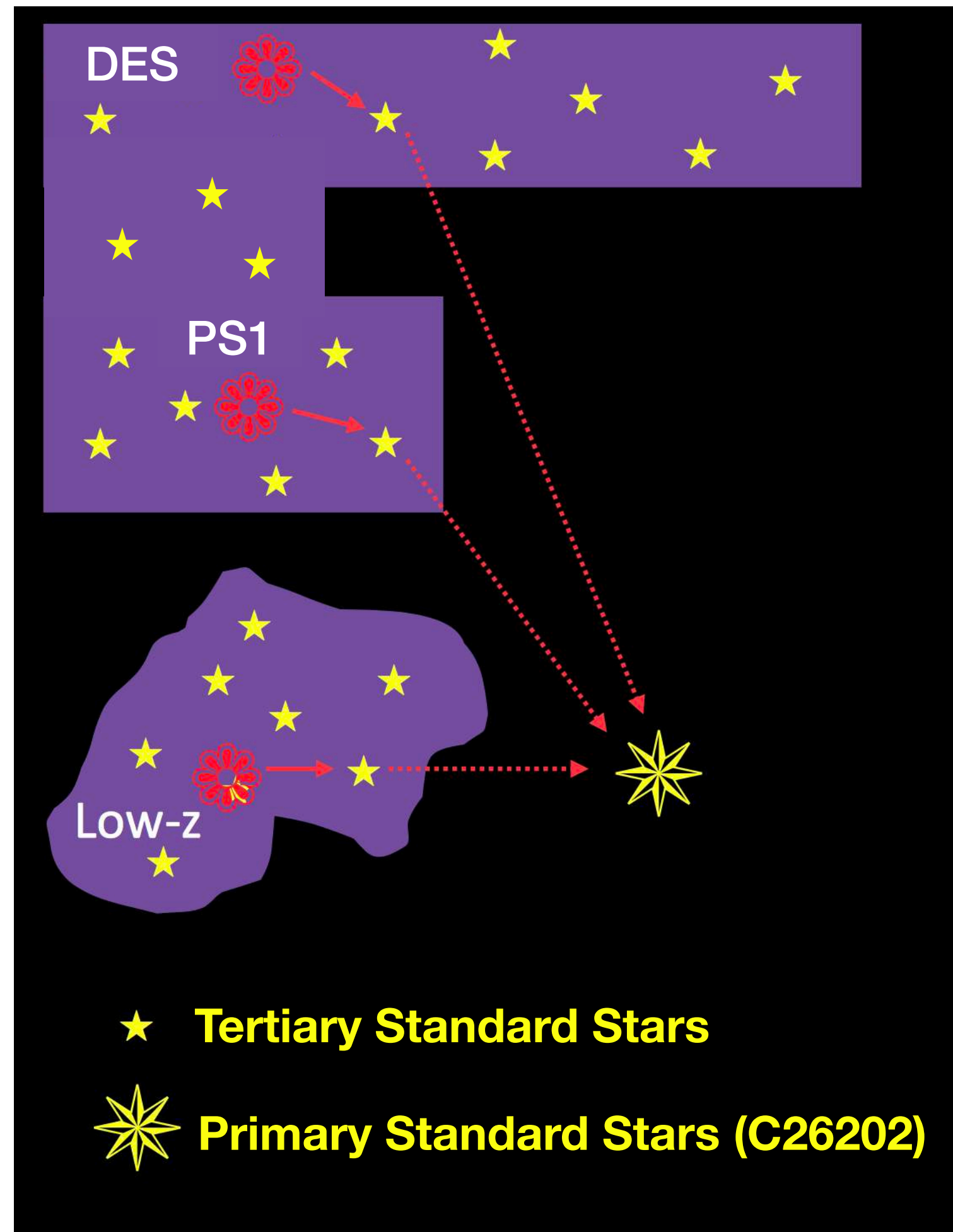
$\rightarrow$  Total 74 Sources of Systematic Uncertainty

# Calibration historically has been the largest systematic uncertainty

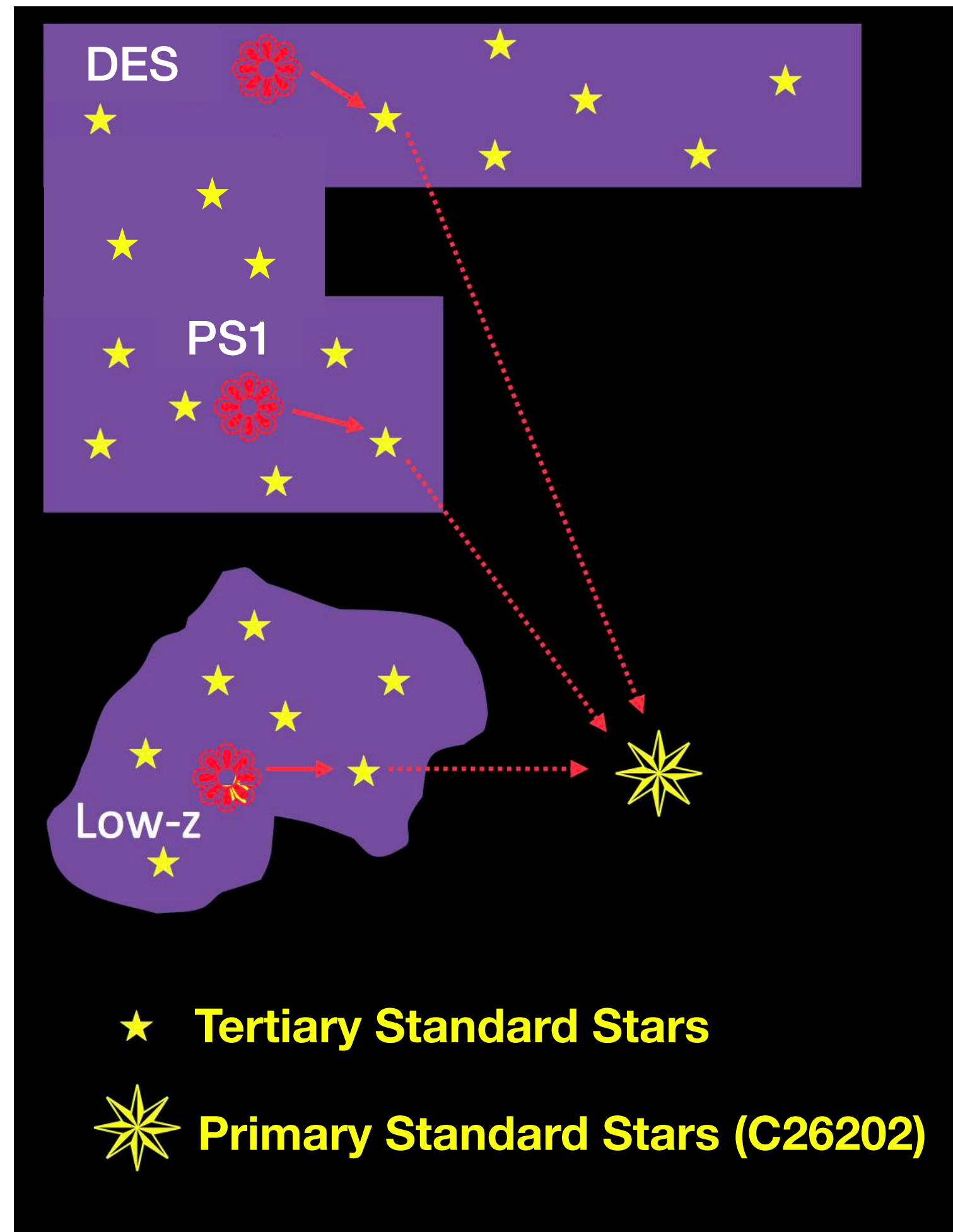
- Every image needs to be internally calibrated.
- And each supernova sample needs to be calibrated to each other



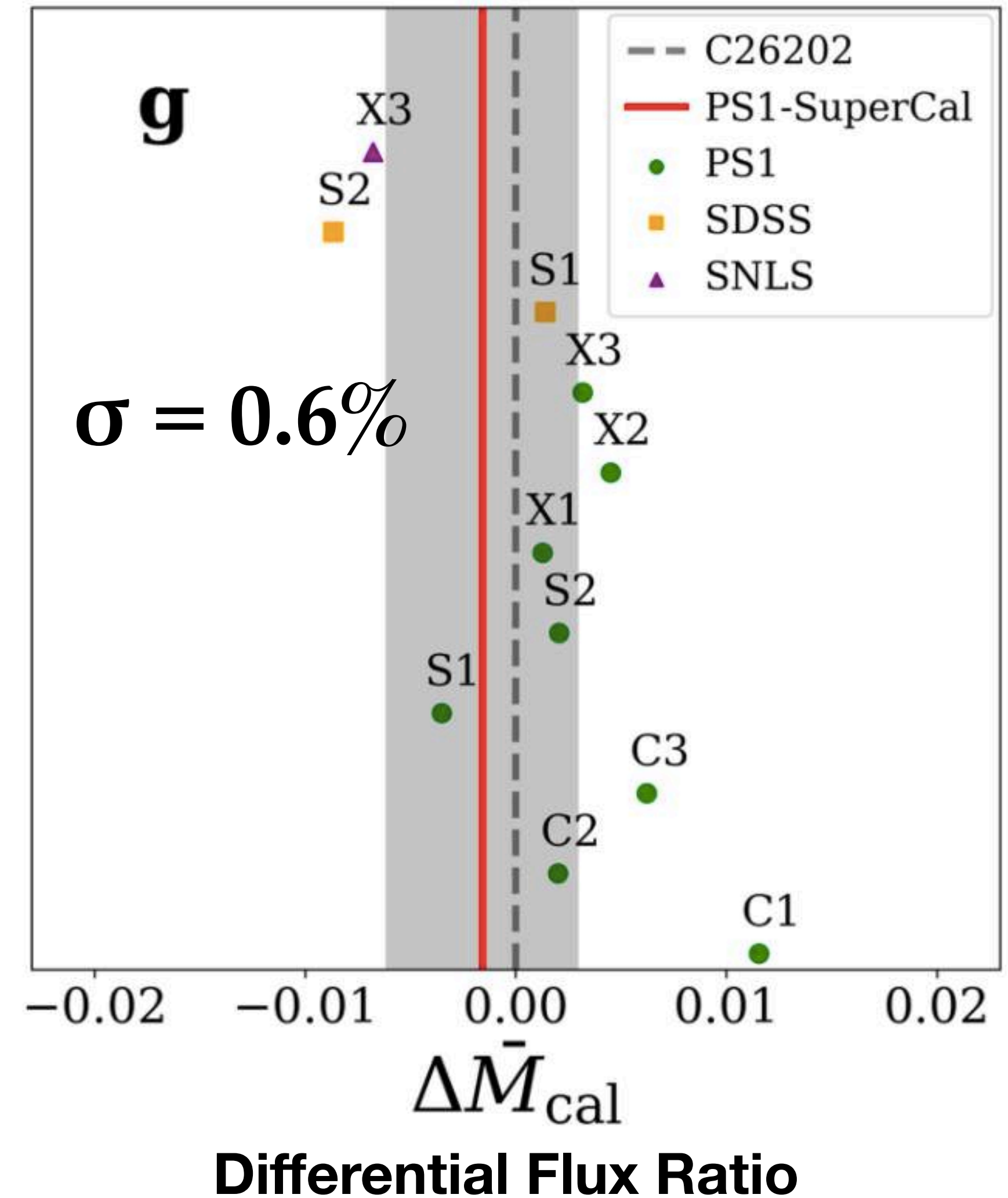
# Calibration systematic uncertainty



# Calibration systematic uncertainty



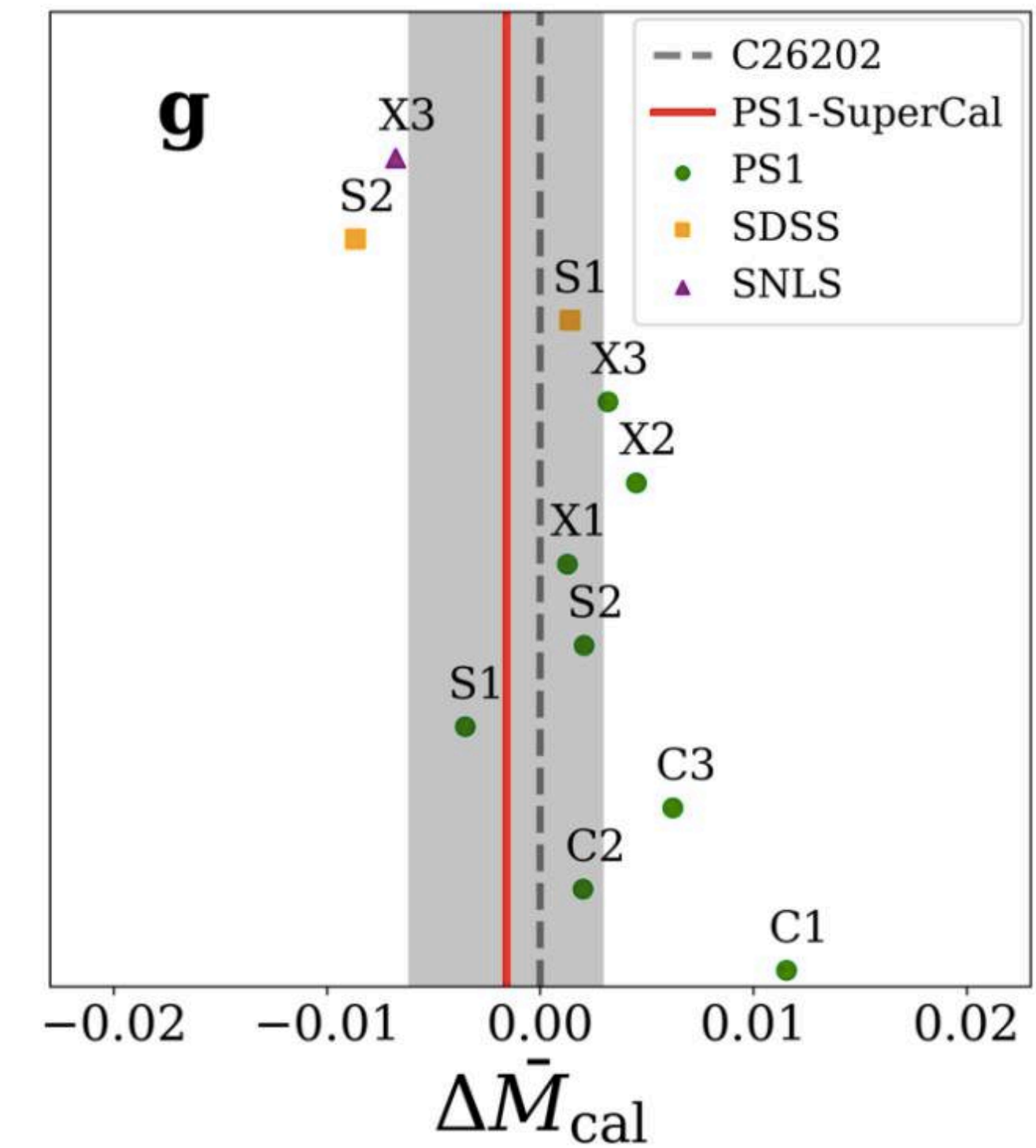
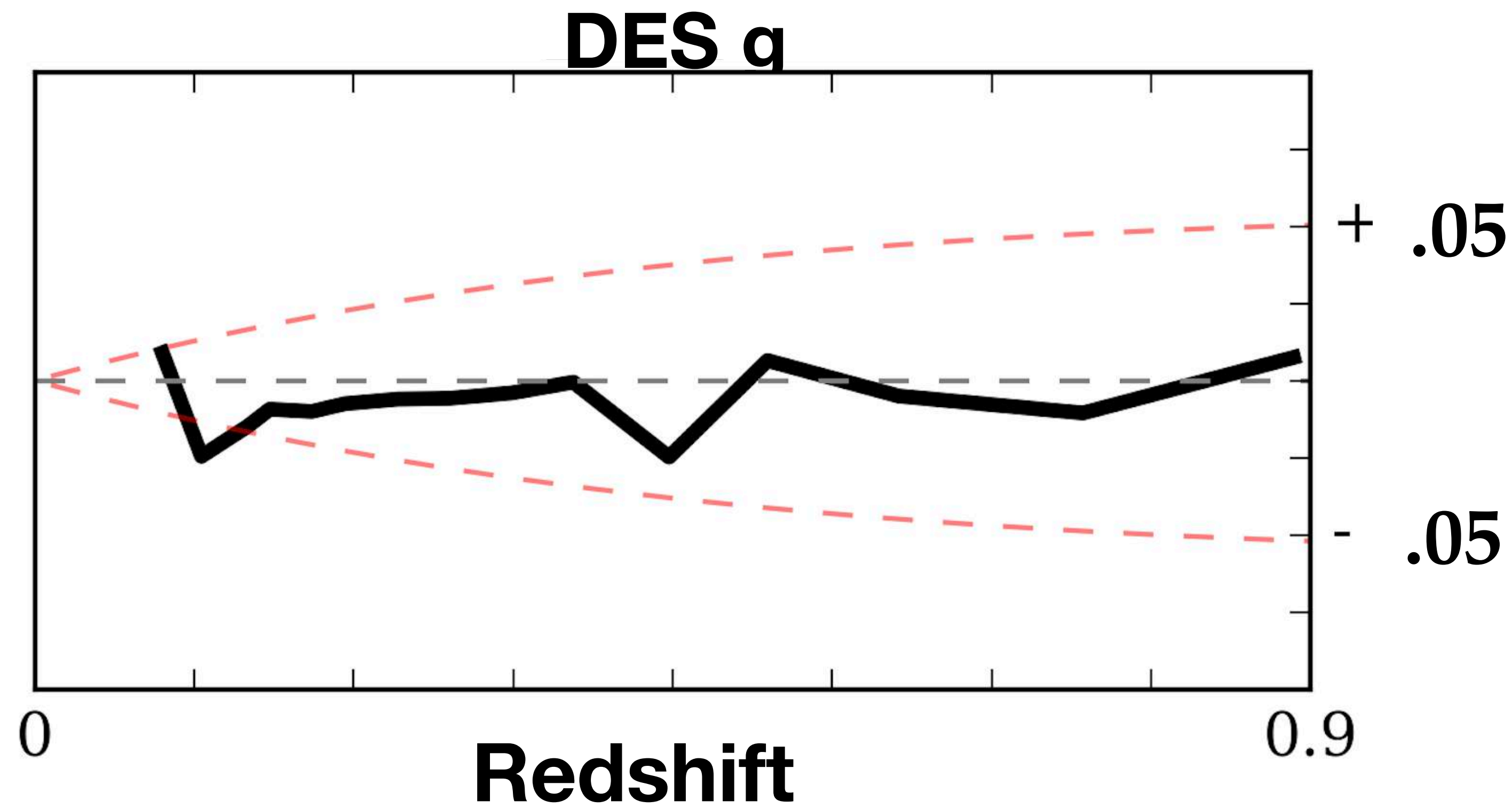
Brout et al. 2018





# The change in distance after varying each systematic

$\Delta$ distance  
(relative to stat-only)





# The change in distance after varying each systematic

We build our redshift-binned  $20 \times 20$  systematic covariance matrix  $C_{\text{syst}}$  for all sources ( $\text{SYS}_k$ ),

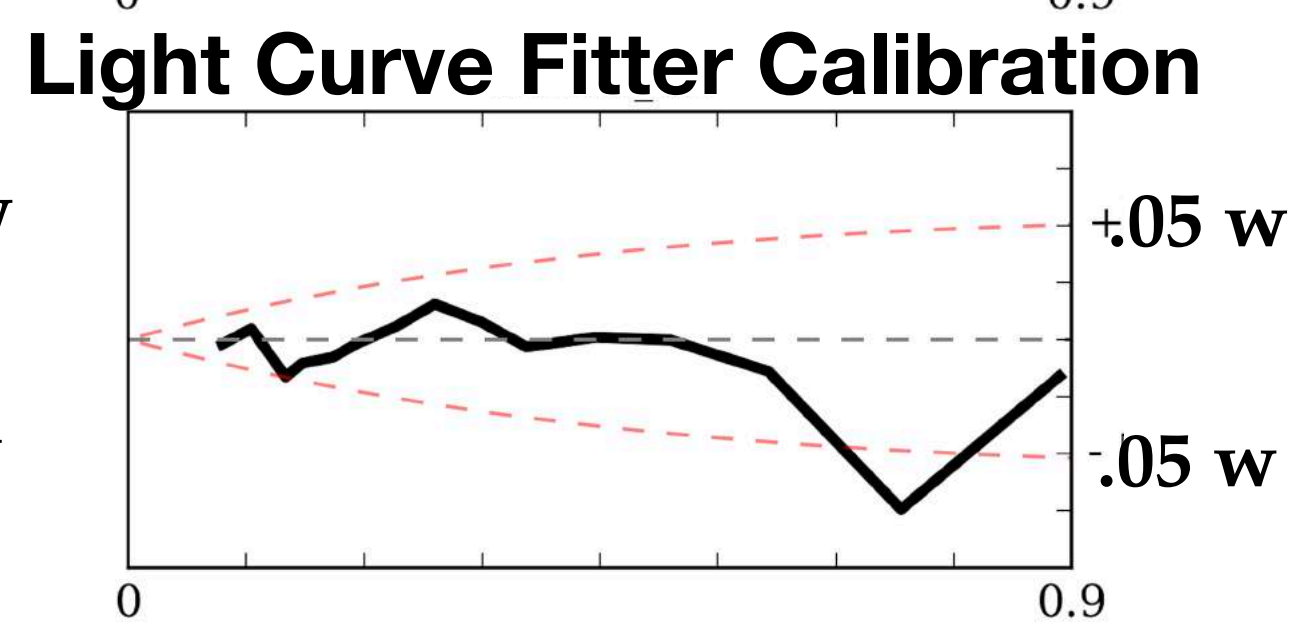
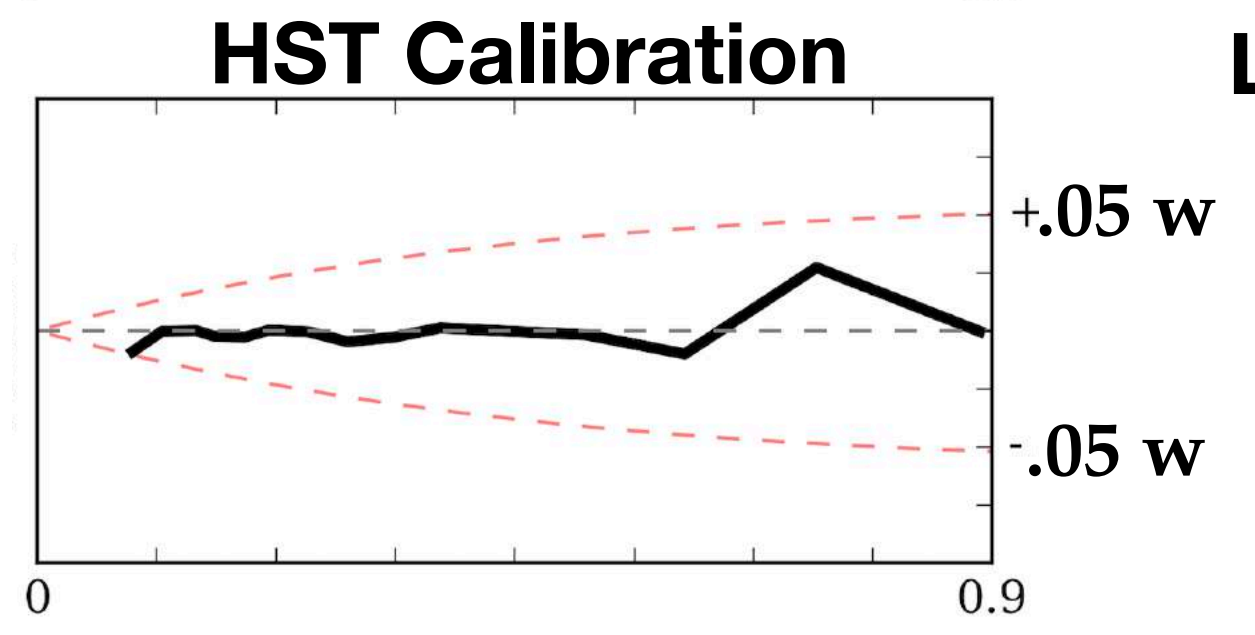
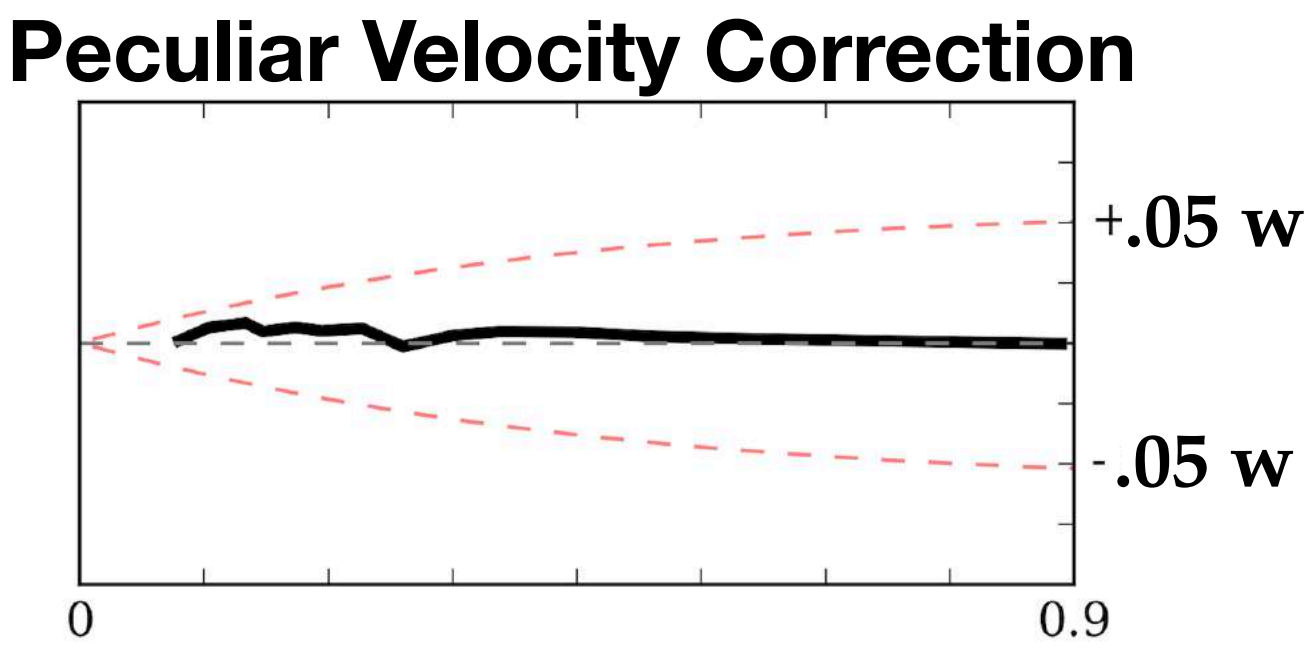
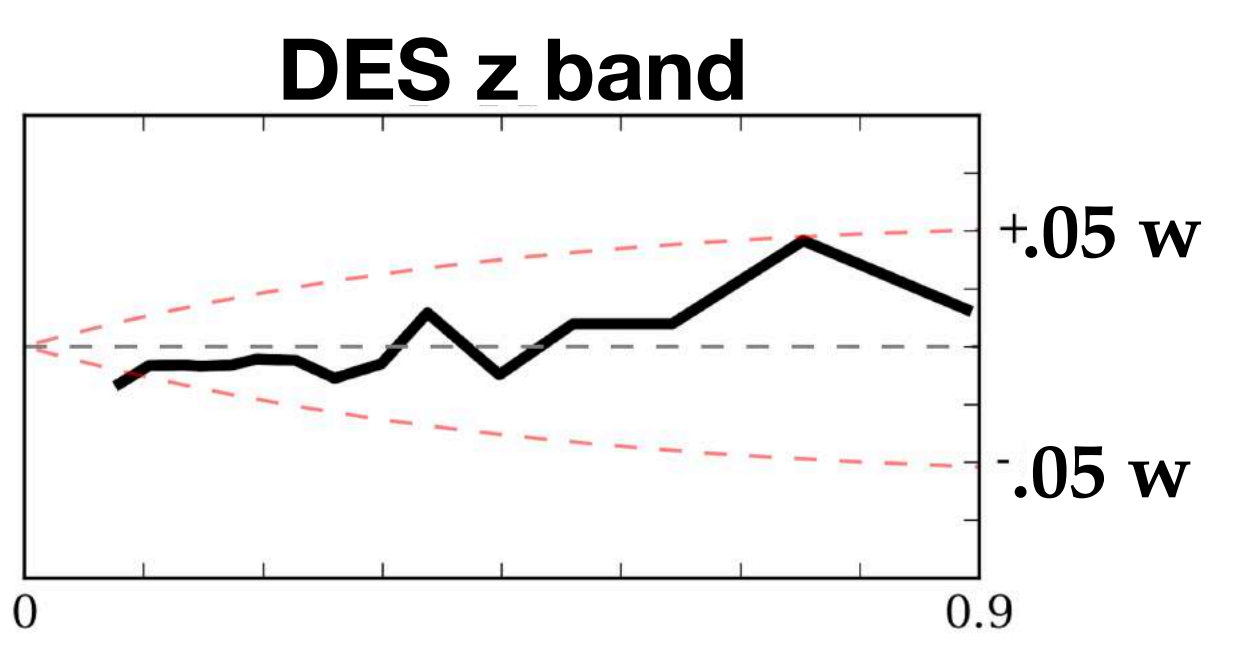
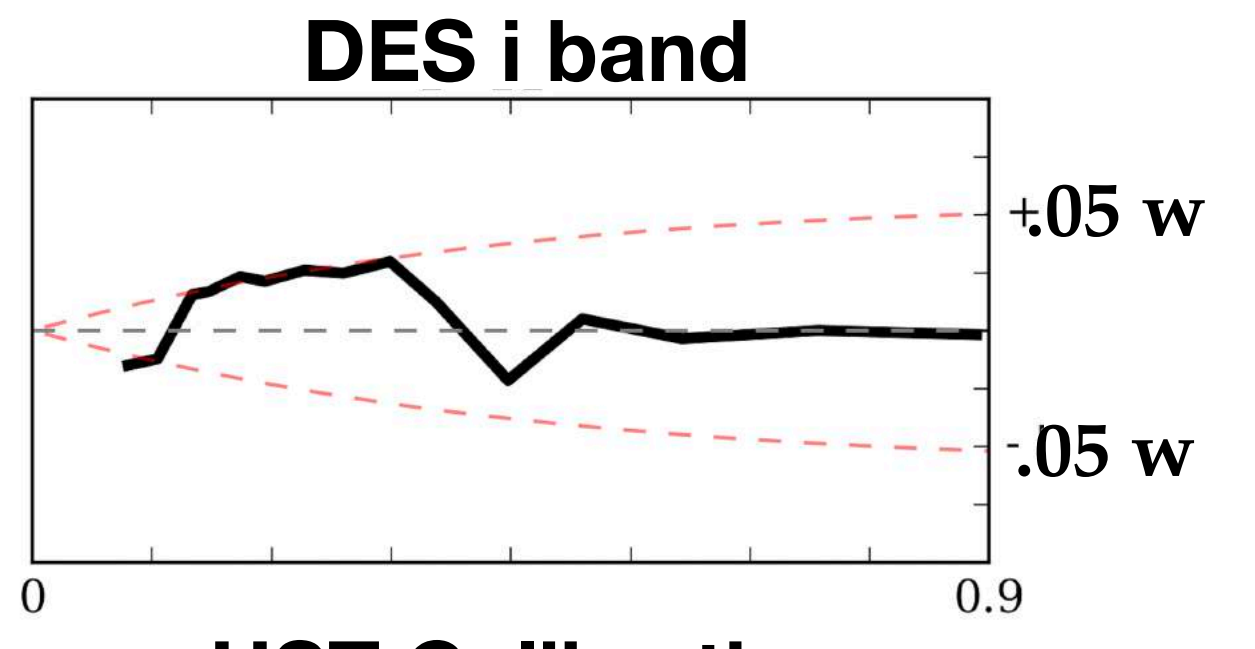
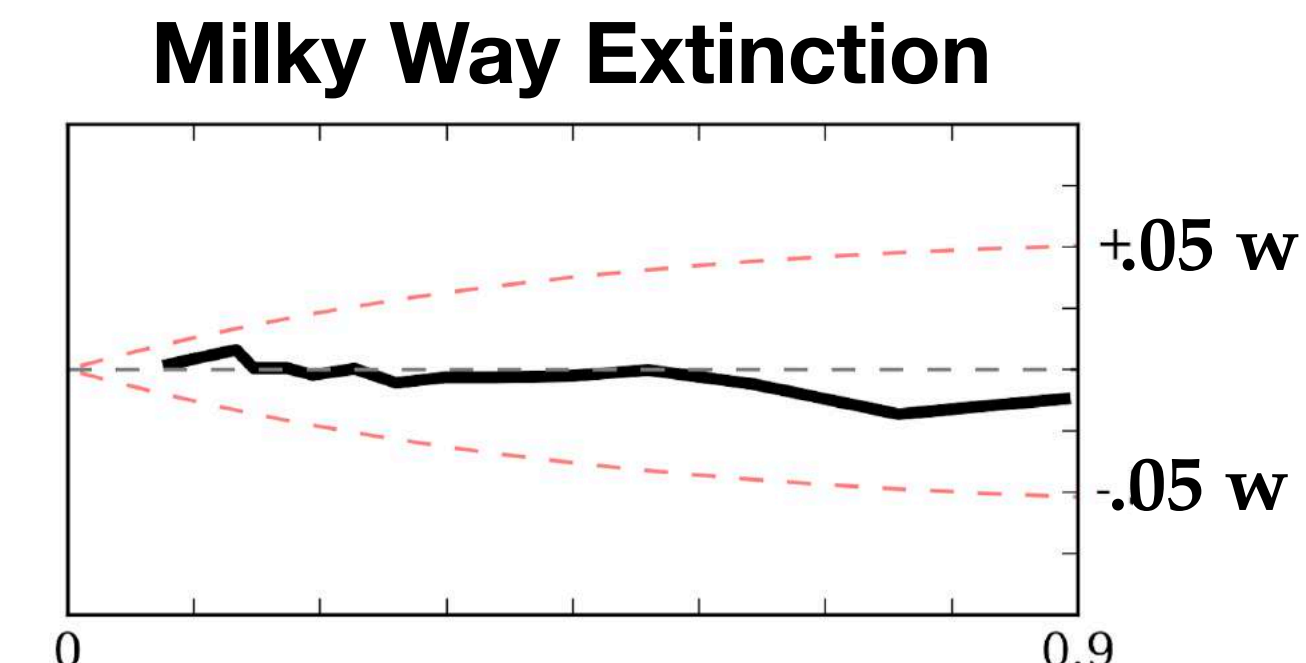
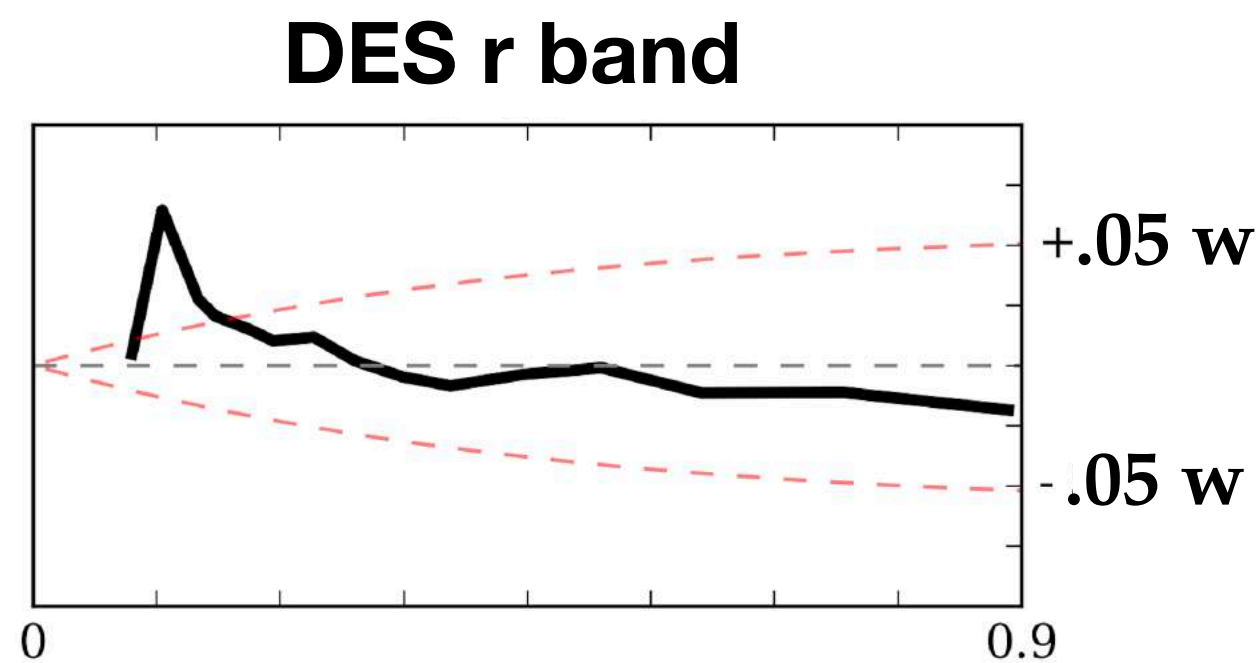
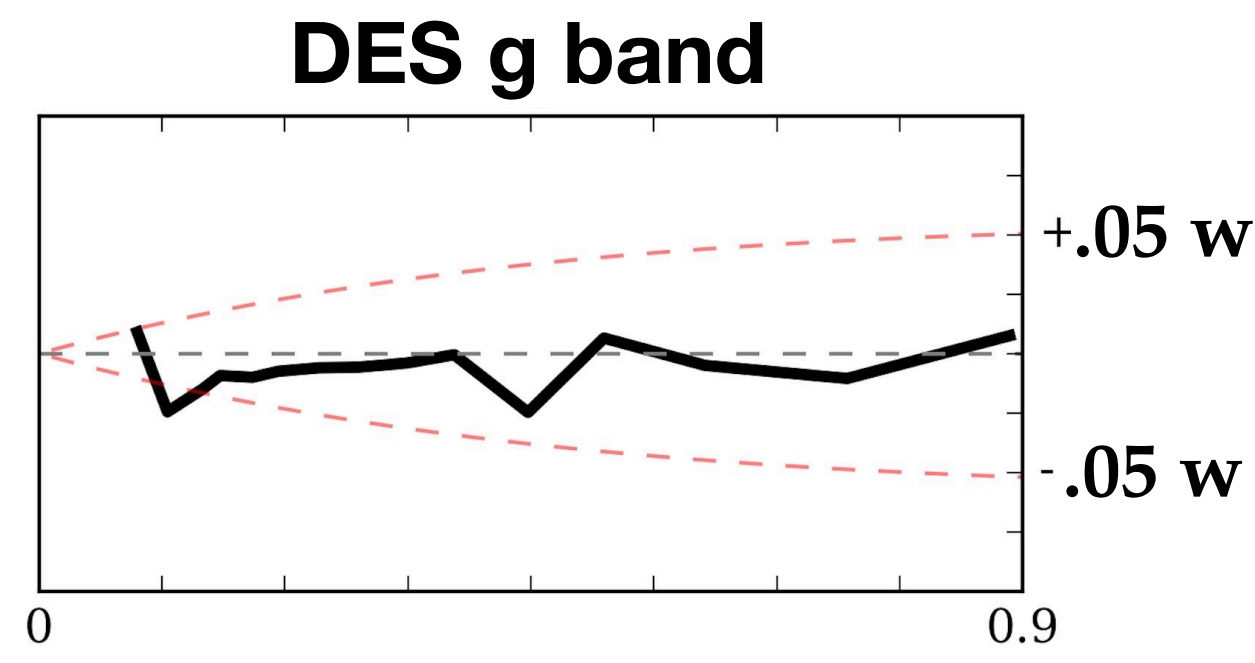
$$C_{\mathcal{Z}_i \mathcal{Z}_j, \text{syst}} = \sum_{k=1}^{K=74} \frac{\partial \Delta \langle \mu_{\text{SYS}} \rangle_{\mathcal{Z}_i}}{\partial \text{SYS}_k} \frac{\partial \Delta \langle \mu_{\text{SYS}} \rangle_{\mathcal{Z}_j}}{\partial \text{SYS}_k} \sigma_k^2,$$

which denotes the covariance between the  $\mathcal{Z}_i^{\text{th}}$  and  $\mathcal{Z}_j^{\text{th}}$  redshift bin summed over the  $K$  different sources of systematic uncertainty ( $K = 74$ ) with magnitude  $\sigma_k$ .



# The change in distance after varying each systematic

$\Delta$ distance  
(relative to stat-only)



Redshift

Redshift

Redshift

Subset of all 74 sources  
of systematic uncertainty

# Fitting for Cosmology

$$\chi^2 = \Delta\mu C^{-1} \Delta\mu$$

$$C = C_{stat} + C_{syst}$$

CosmoMC + Planck 2015 CMB Priors



# **We need to be careful about confirmation bias**

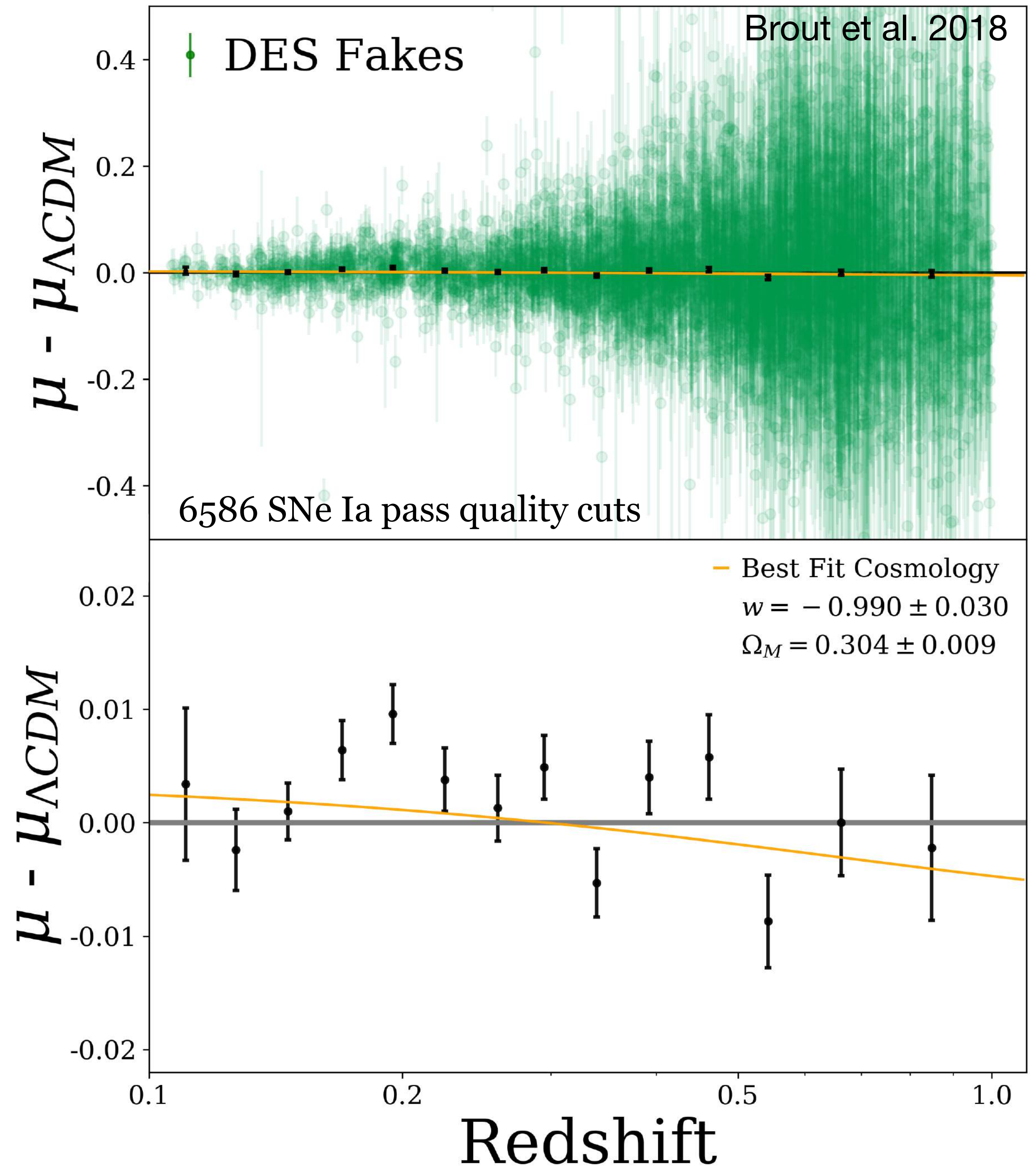
We implemented **blinding** and we **validated** more rigorously than any previous supernova survey.

# Validation

First large scale, end to end validation of the DES-SN pipelines using 10,000 Fake SN Ia light curves inserted into real DECam images.

These fake light curves are analyzed by:

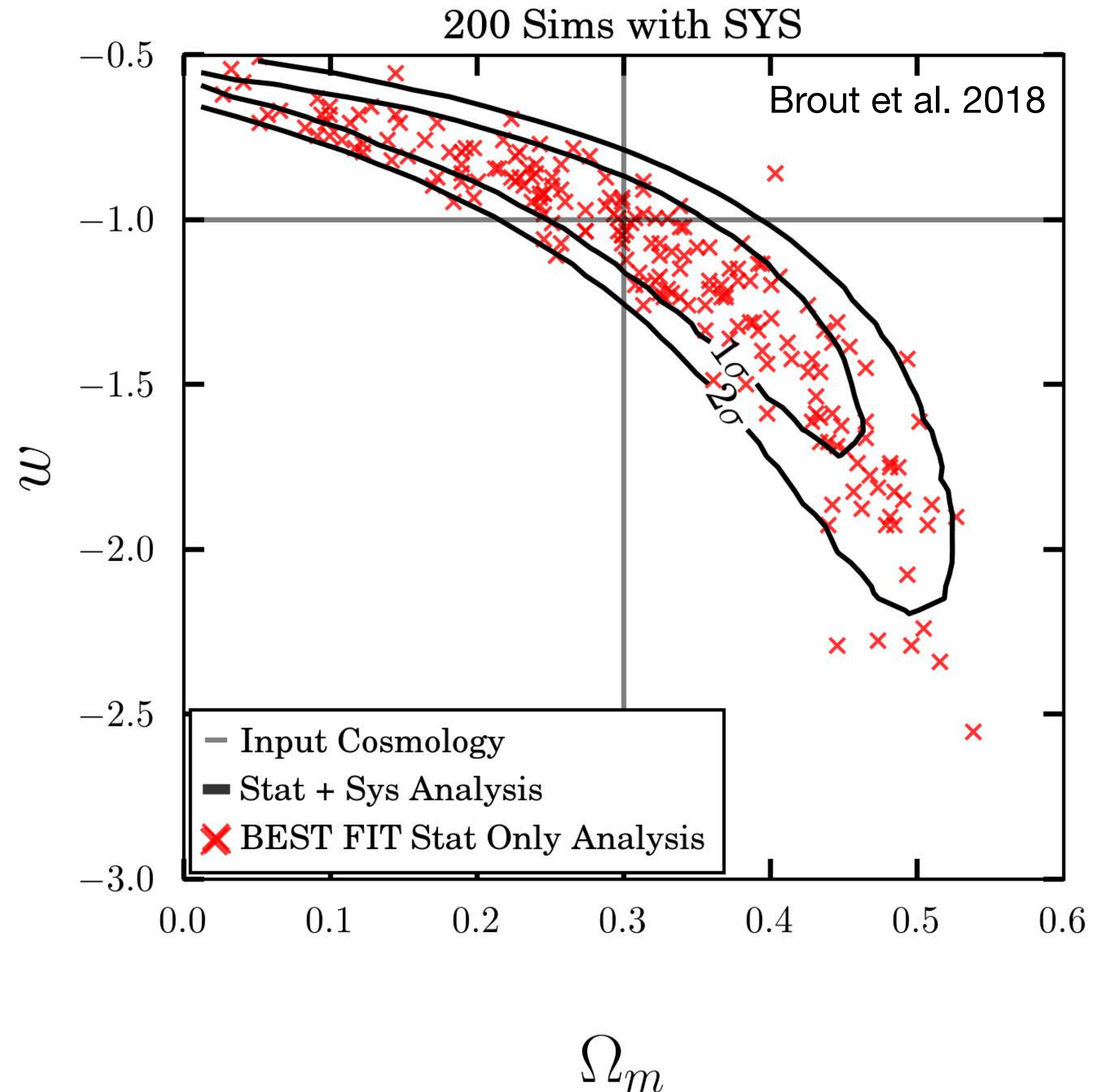
Difference imaging  
+  
Scene Modeling Photometry  
+  
Bias Corrections  
+  
Cosmology Analysis





# Validation

We validate the cosmological analysis pipeline (BBC) best fit cosmology and uncertainties:  
using 400 simulated datasets with simulated sources of systematic uncertainty.



# How did we know we were ready to unblind?

400 “DES Like” Catalog level simulations with simulated systematic uncertainties are used to check for

w BIAS

**-0.002 +- 0.003**

**UNCERTAINTY CROSSCHECK**

**< 8%**





**Motivation**

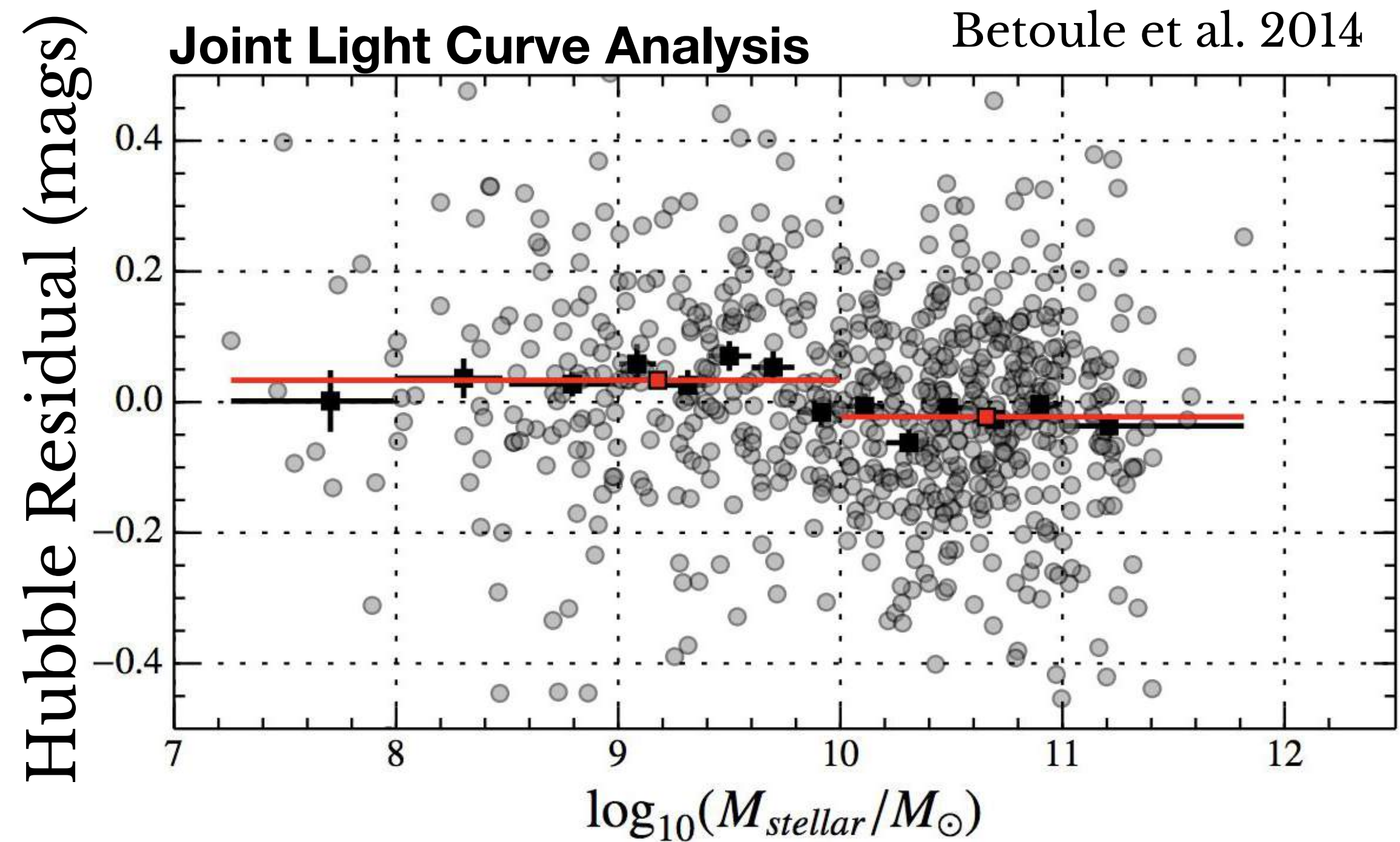
**Ingredients for SN Ia Cosmology**

**Results from the First 3 Years**

**The Future of DES-SN**

# Results

## Fitted Hubble residual step across $M_{host}$

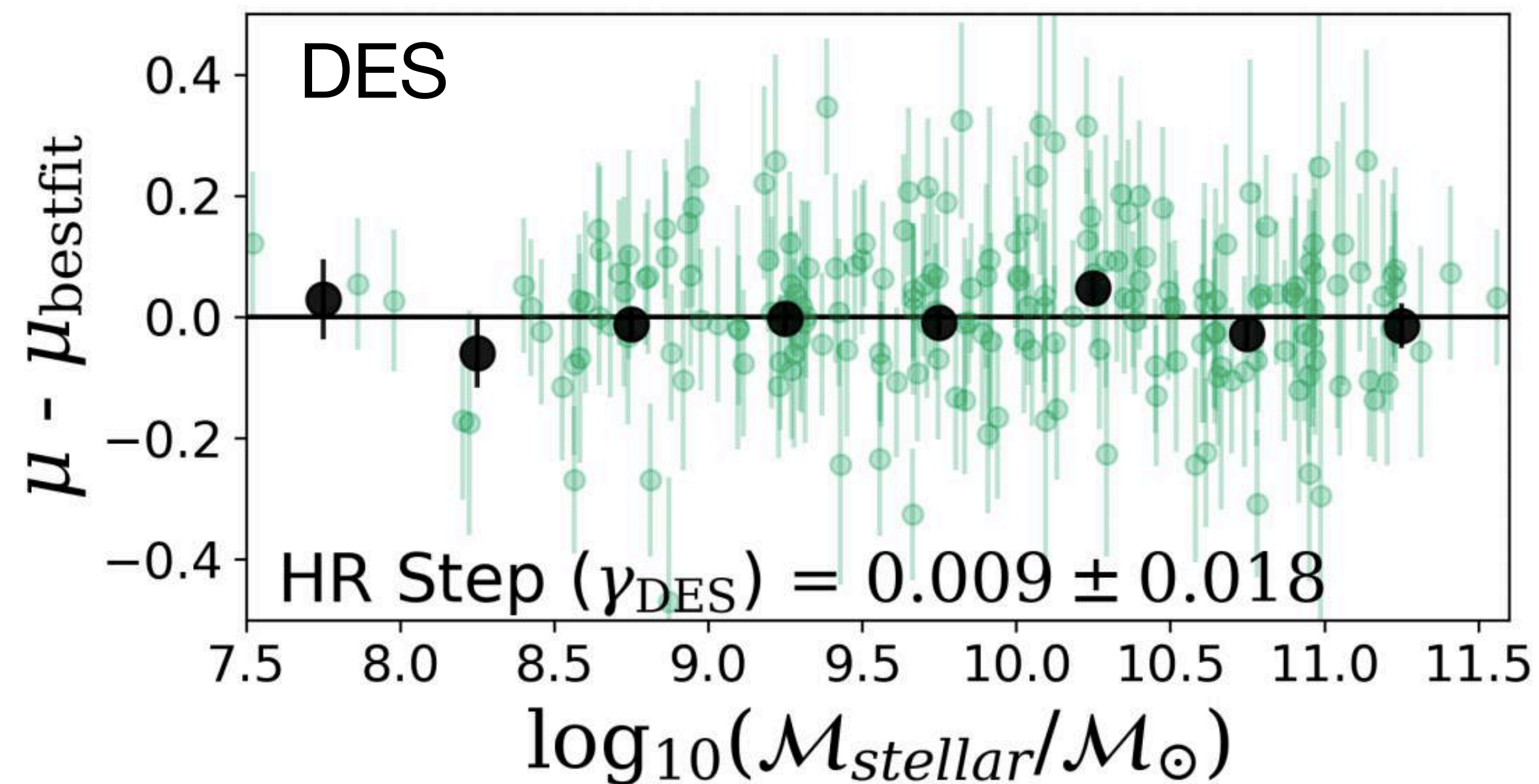




# Results

Fitted Hubble  
residual step  
across  $M_{host}$

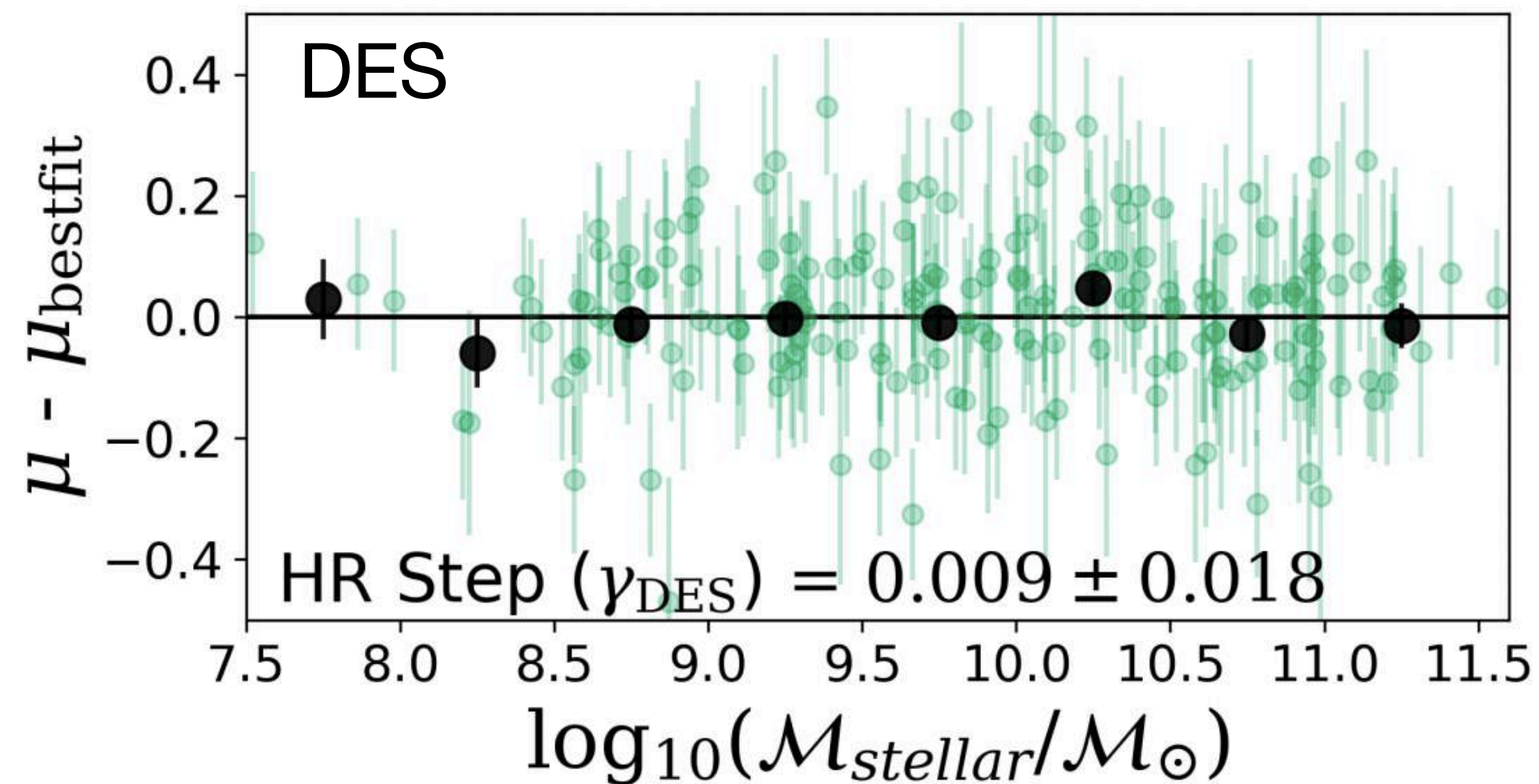
We see no correlation...



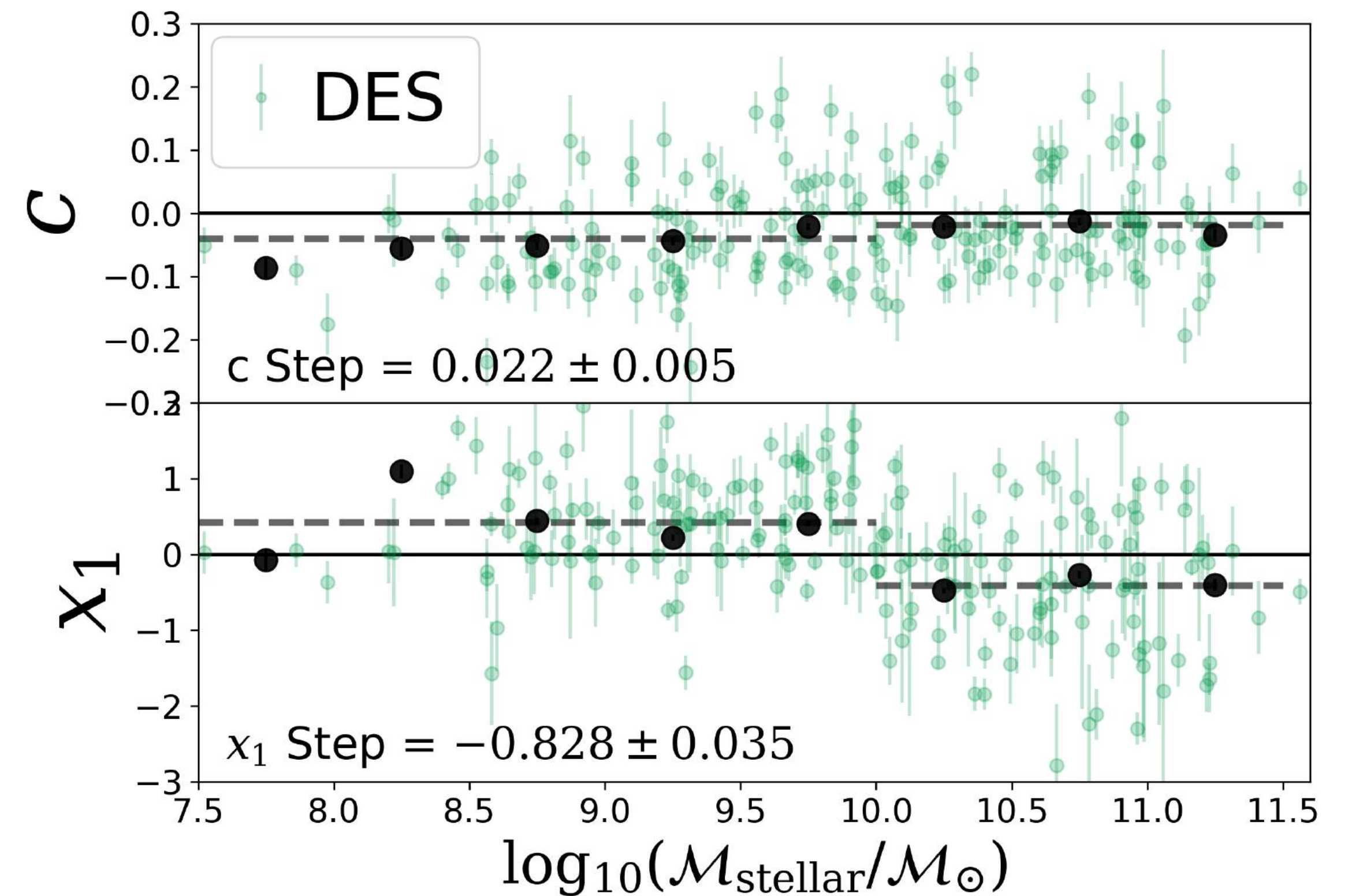
# Results

Fitted Hubble  
residual step  
across  $M_{host}$

We see no correlation...



We do see correlations with  $c$ ,  $x_1$





# Results

## Fitted Hubble residual step across $M_{host}$

We see no correlation...

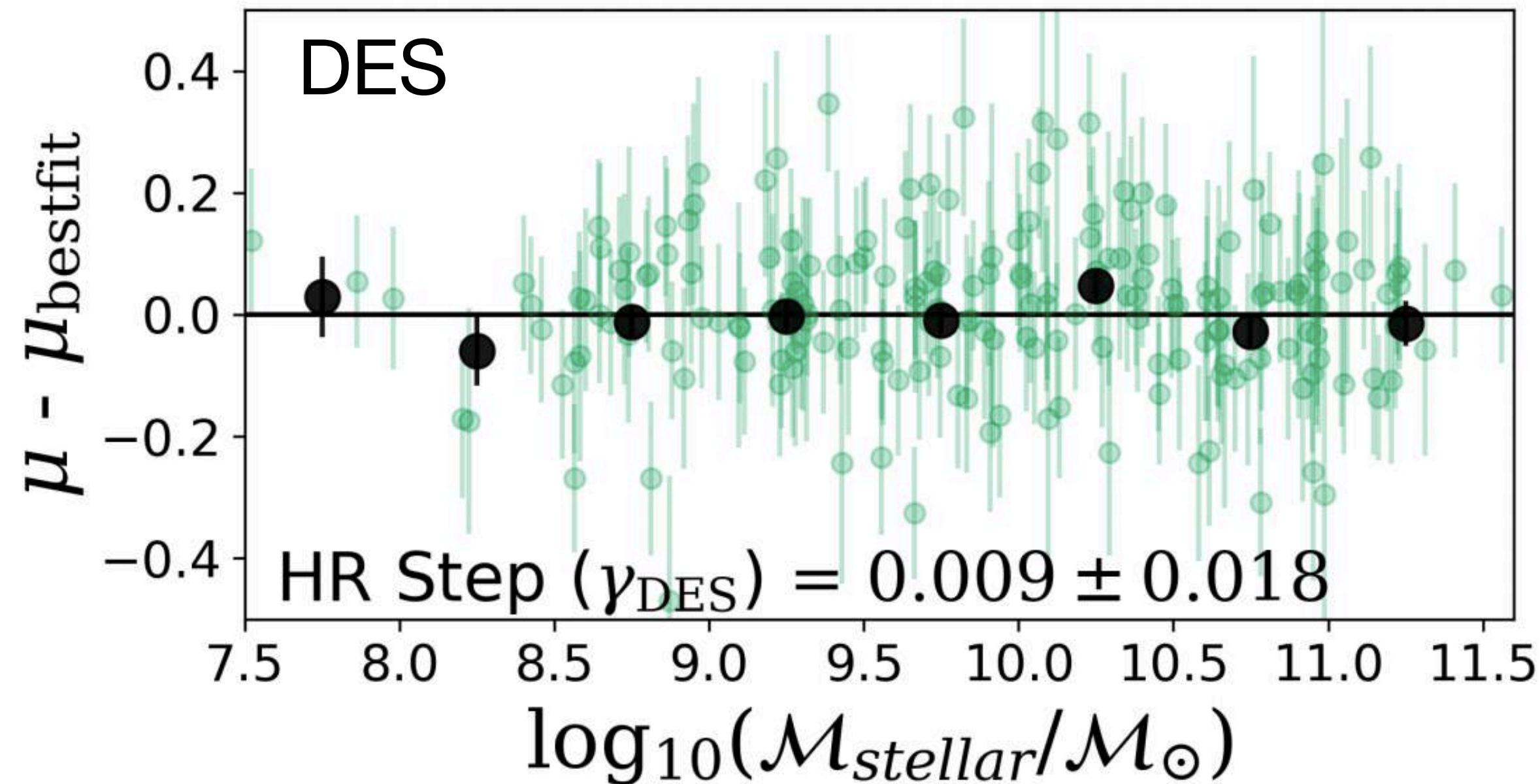


TABLE 7  
SYSTEMATIC VARIATIONS FOR  $\gamma_{\text{DES}}$

Variation	$\gamma$ [mag]	# SNe Ia
Nominal	$0.009 \pm 0.018$	207
$c > 0$	$0.069 \pm 0.039$	70
$c < 0$	$-0.005 \pm 0.020$	137
$x_1 > 0$	$0.018 \pm 0.025$	119
$x_1 < 0$	$-0.013 \pm 0.029$	88
no $z$ band	$0.000 \pm 0.021$	202
1D BiasCorr.	$0.041 \pm 0.021$	207
DiffImg Photometry	$0.001 \pm 0.020$	207
$\mathcal{M}_{\text{stellar}} \neq \text{null}$	$0.010 \pm 0.020$	207
$\mathcal{R}_{\text{step}} = 10.1$	$0.021 \pm 0.019$	207
10 $z$ -bins	$0.015 \pm 0.018$	207
Le Phare	$0.008 \pm 0.020$	207

NOTE. — Changes in  $\gamma$  for the DES subset after perturbations to analysis. Parameter values are shown for the G10 model of intrinsic scatter only.

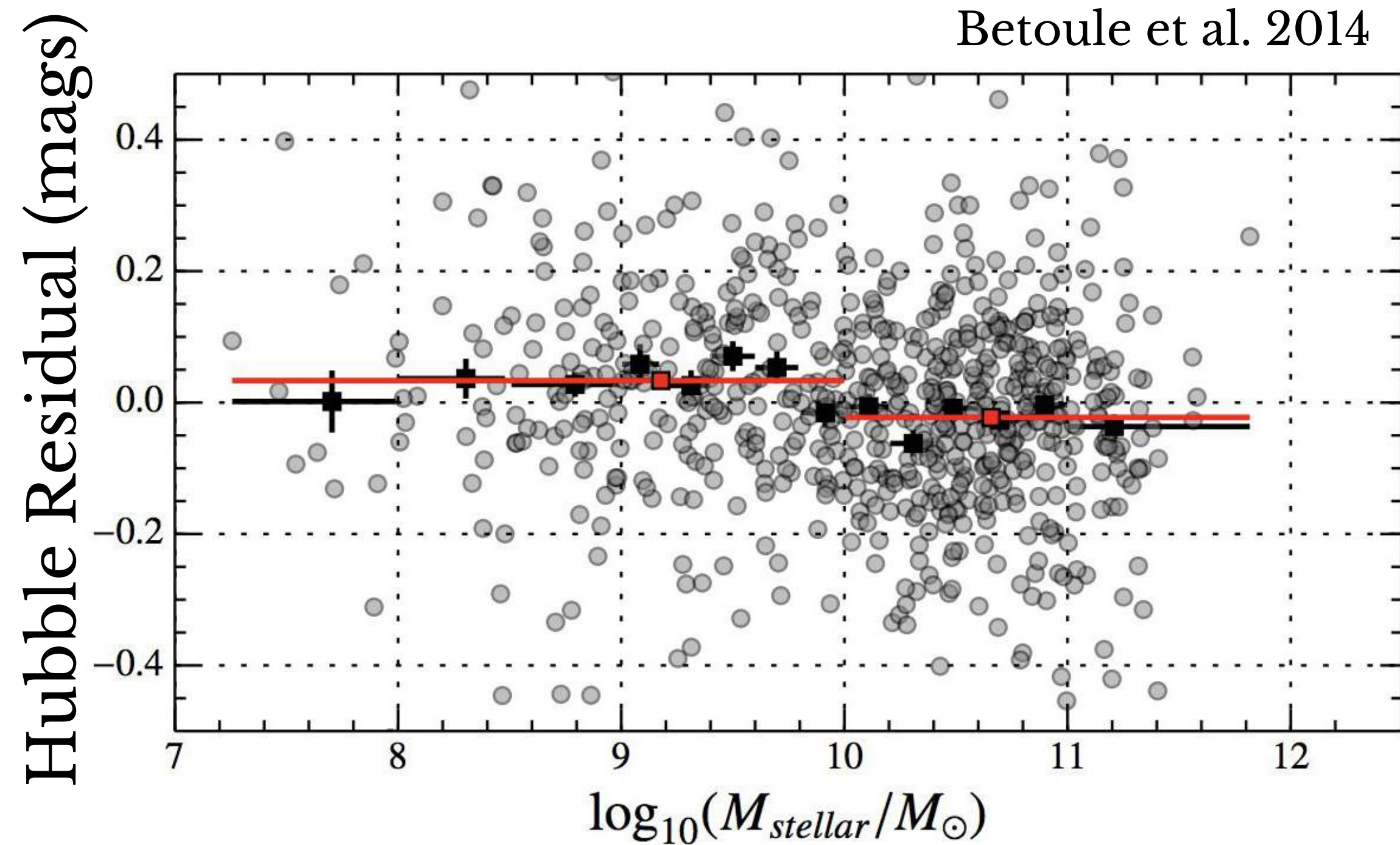


# Results

Fitted Hubble  
residual step  
across  $M_{host}$

vs.

Intrinsic Scatter





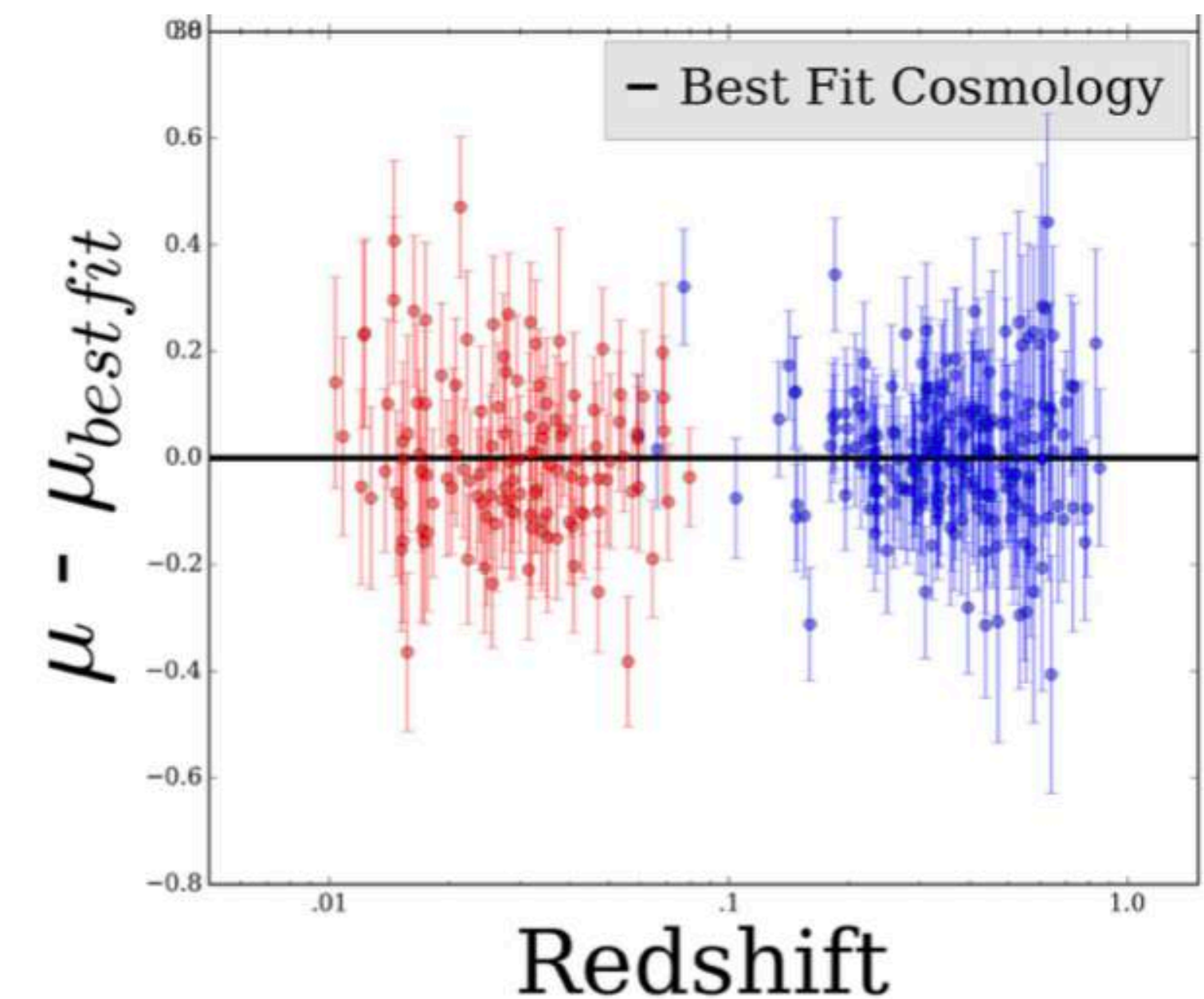
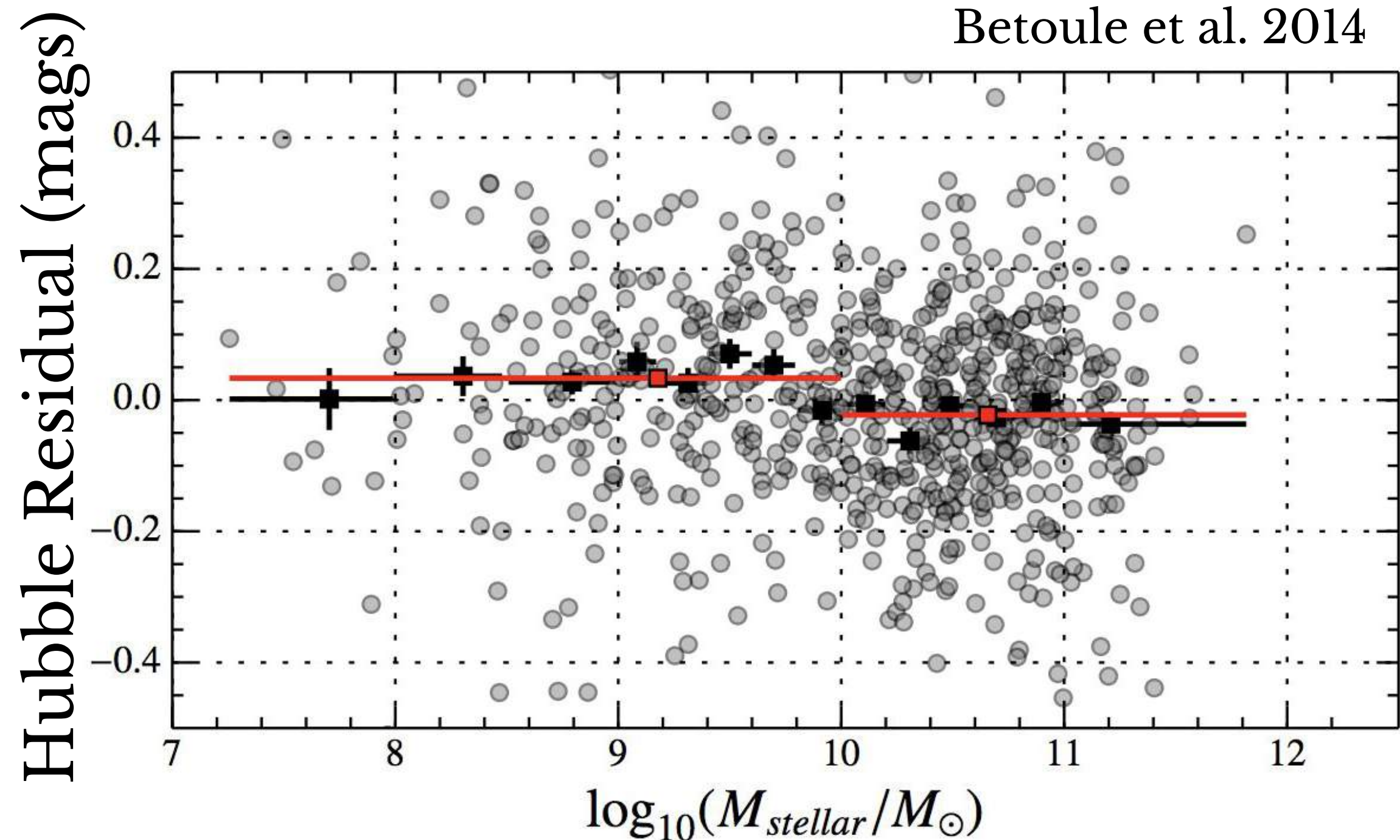
# Results

Fitted Hubble  
residual step  
across  $M_{host}$

vs.

Intrinsic Scatter

$$\sigma_{\mu}^2 = C_{m_B, m_B} + \alpha^2 C_{x_1, x_1} + \beta^2 C_{c, c} + 2\alpha C_{m_B, x_1} - 2\beta C_{m_B, c} - 2\alpha\beta C_{x_1, c} + \sigma_{\text{vpec}}^2 + \sigma_z^2 + \sigma_{\text{lens}}^2 + \sigma_{\text{int}}^2$$





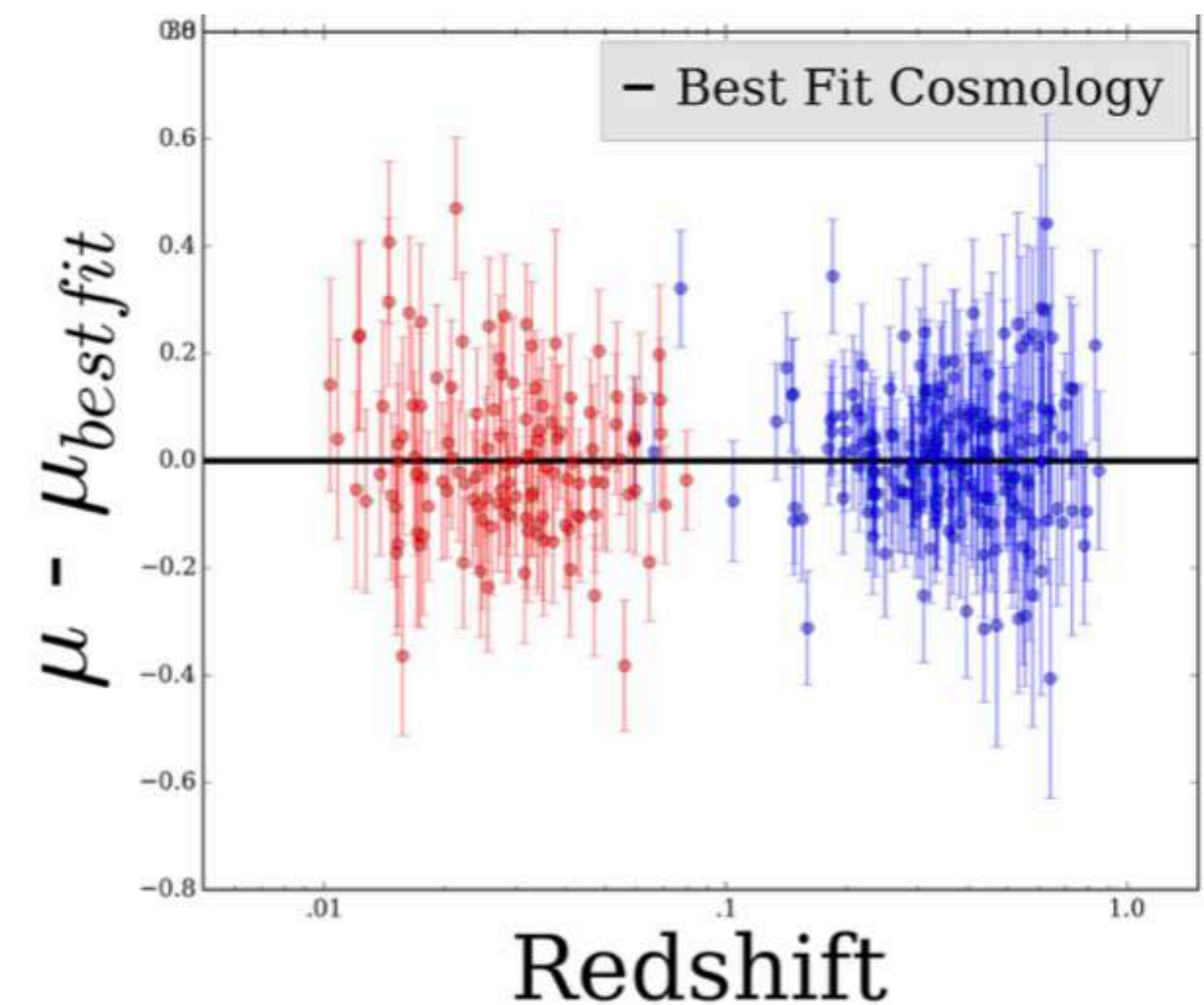
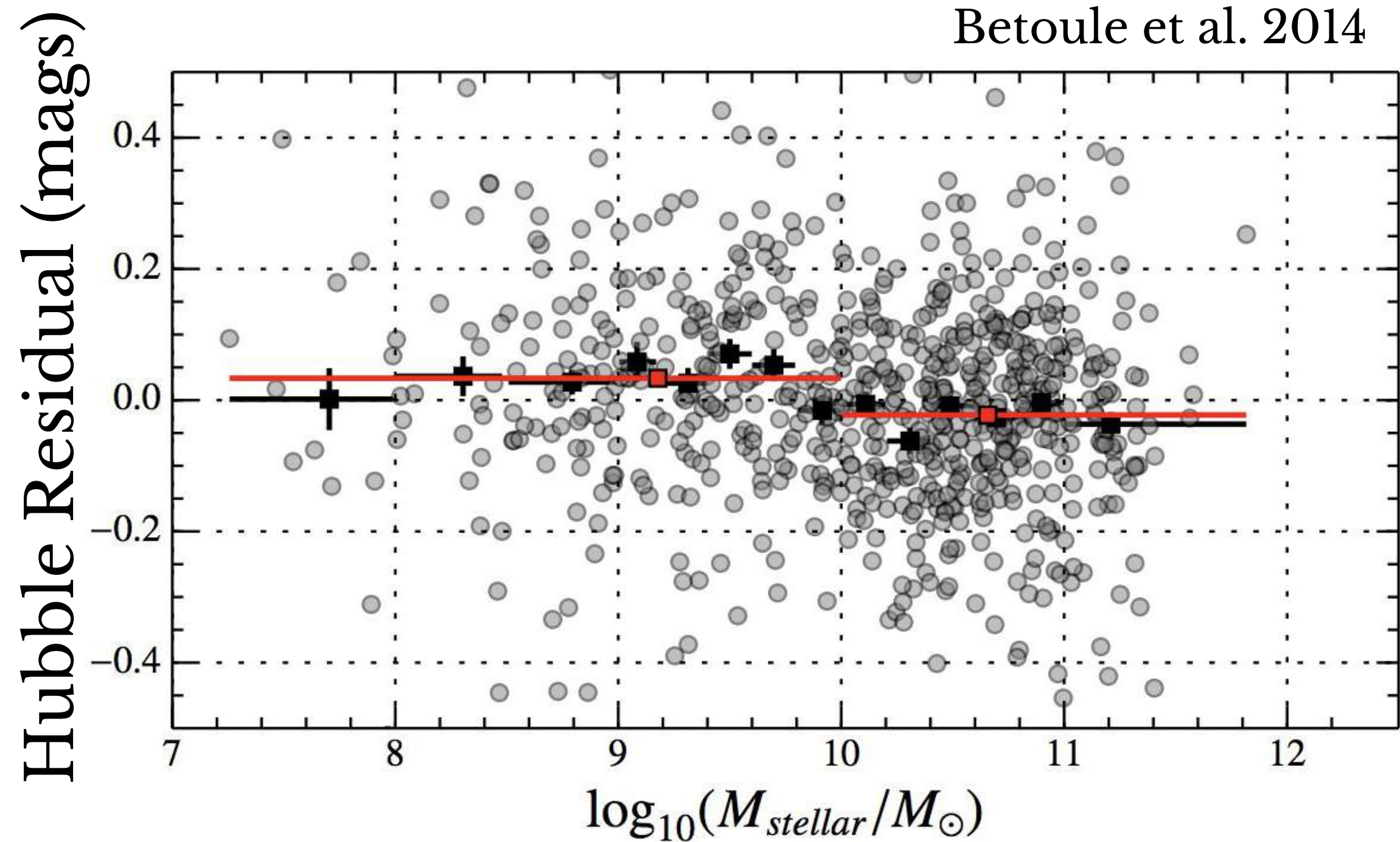
# Results

Fitted Hubble  
residual step  
across  $M_{host}$

vs.

Intrinsic Scatter

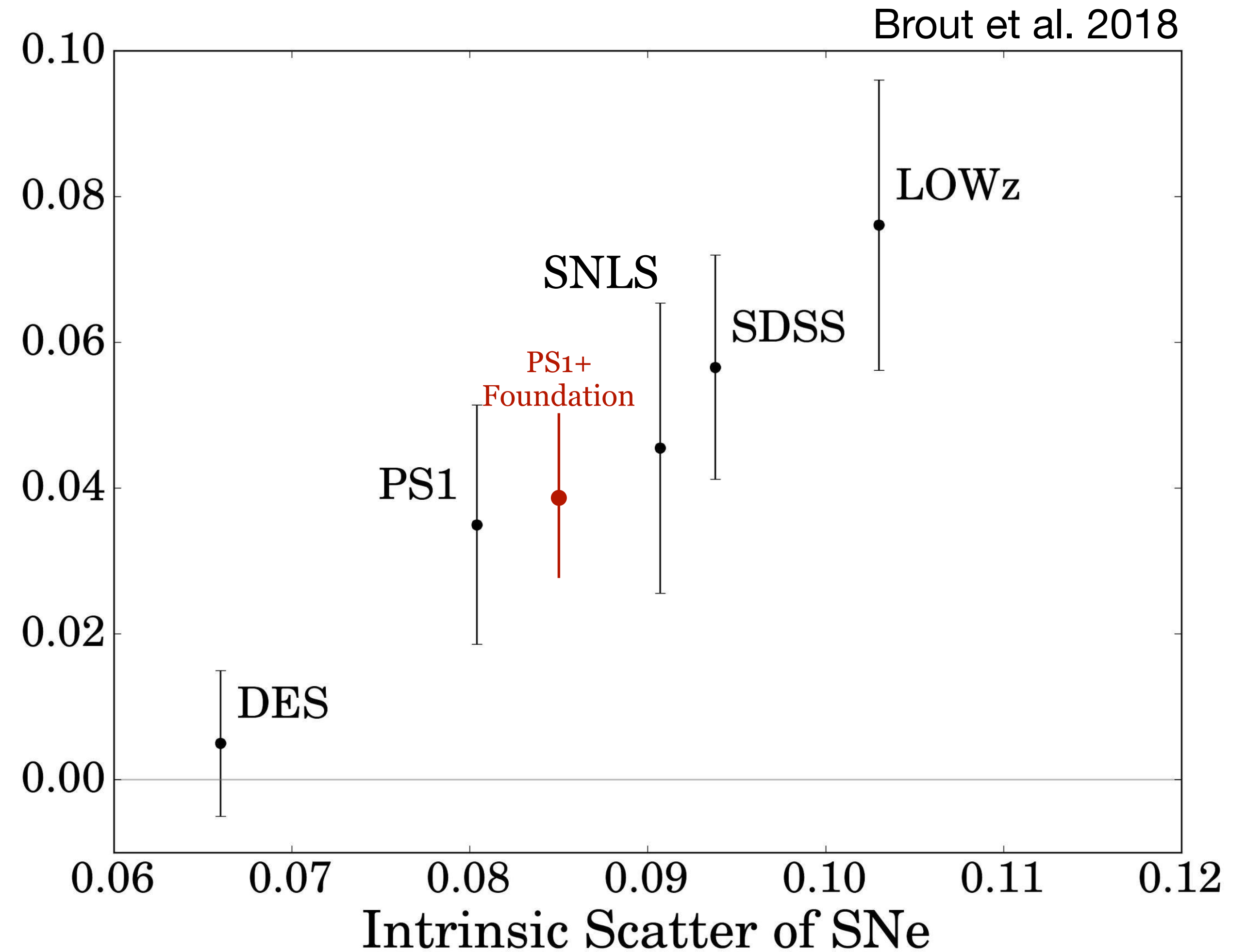
$$\sigma_{\mu}^2 = C_{m_B, m_B} + \alpha^2 C_{x_1, x_1} + \beta^2 C_{c, c} + 2\alpha C_{m_B, x_1} - 2\beta C_{m_B, c} - 2\alpha\beta C_{x_1, c} + \sigma_{\text{vpec}}^2 + \sigma_z^2 + \sigma_{\text{lens}}^2 + \sigma_{\text{int}}^2$$





# Results

Fitted Hubble  
residual step  
across  $M_{host}$



DES has lowest intrinsic scatter and doesn't see HR effect. Not understood, but interesting clue...

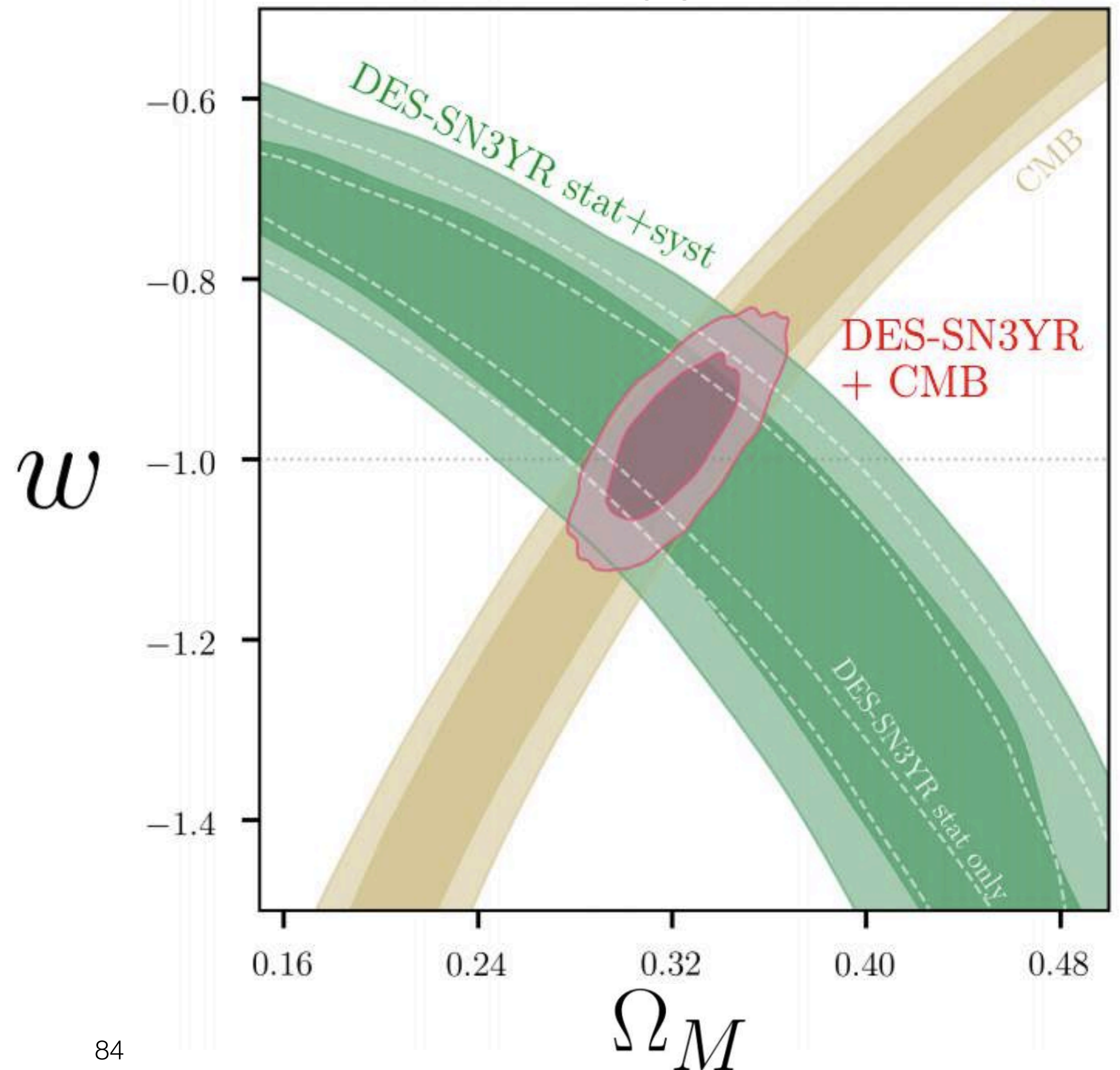
# DES-SN3YR Results!



# DES-SN3YR Results!

## Flat $w$ CDM

DES Collaboration et al. 2018

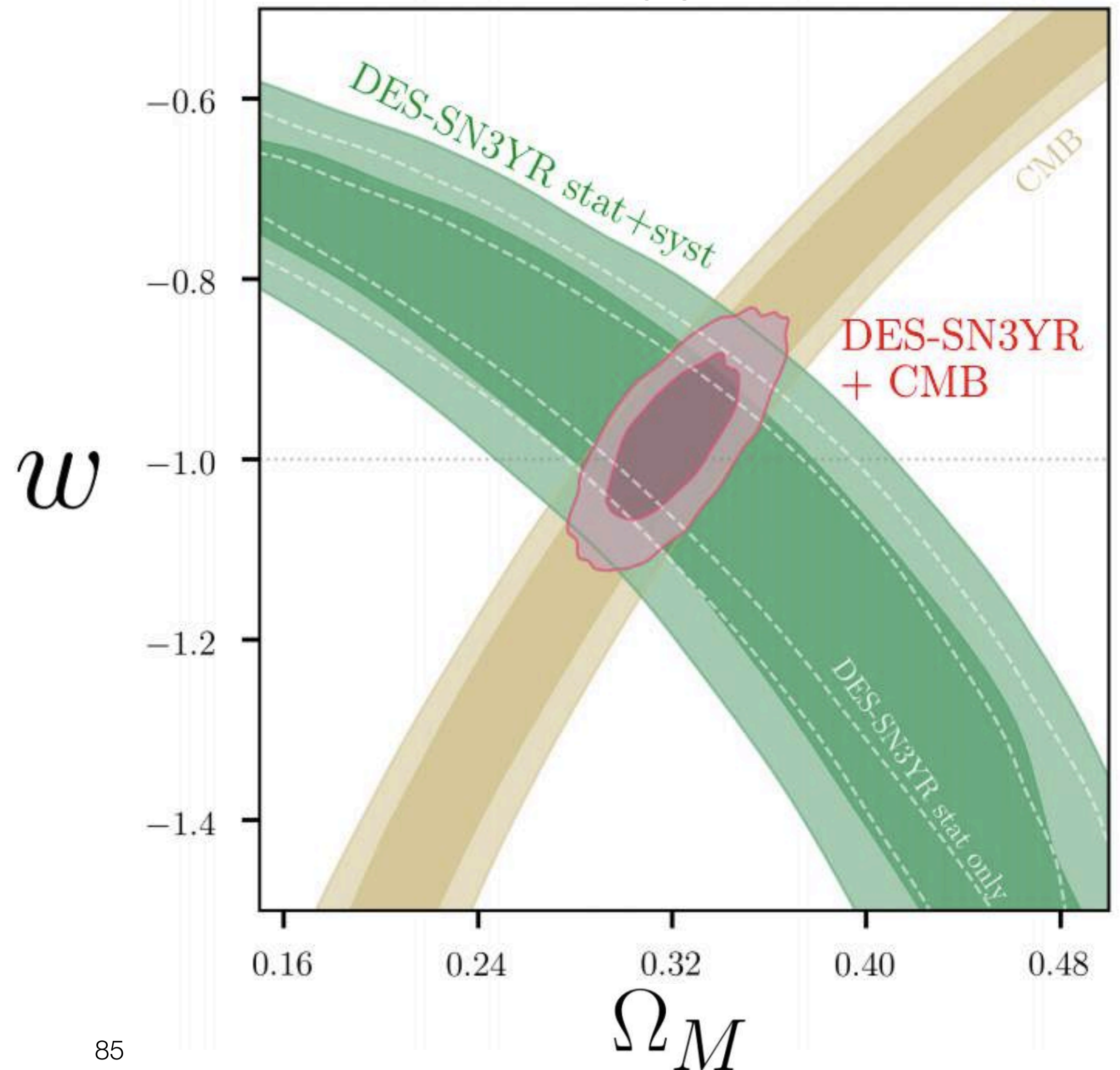


# DES-SN3YR Results!

## Flat $w$ CDM

DES Collaboration et al. 2018

$$w = -0.978 \pm 0.059$$





# DES-SN3YR Results!

## Flat $w$ CDM

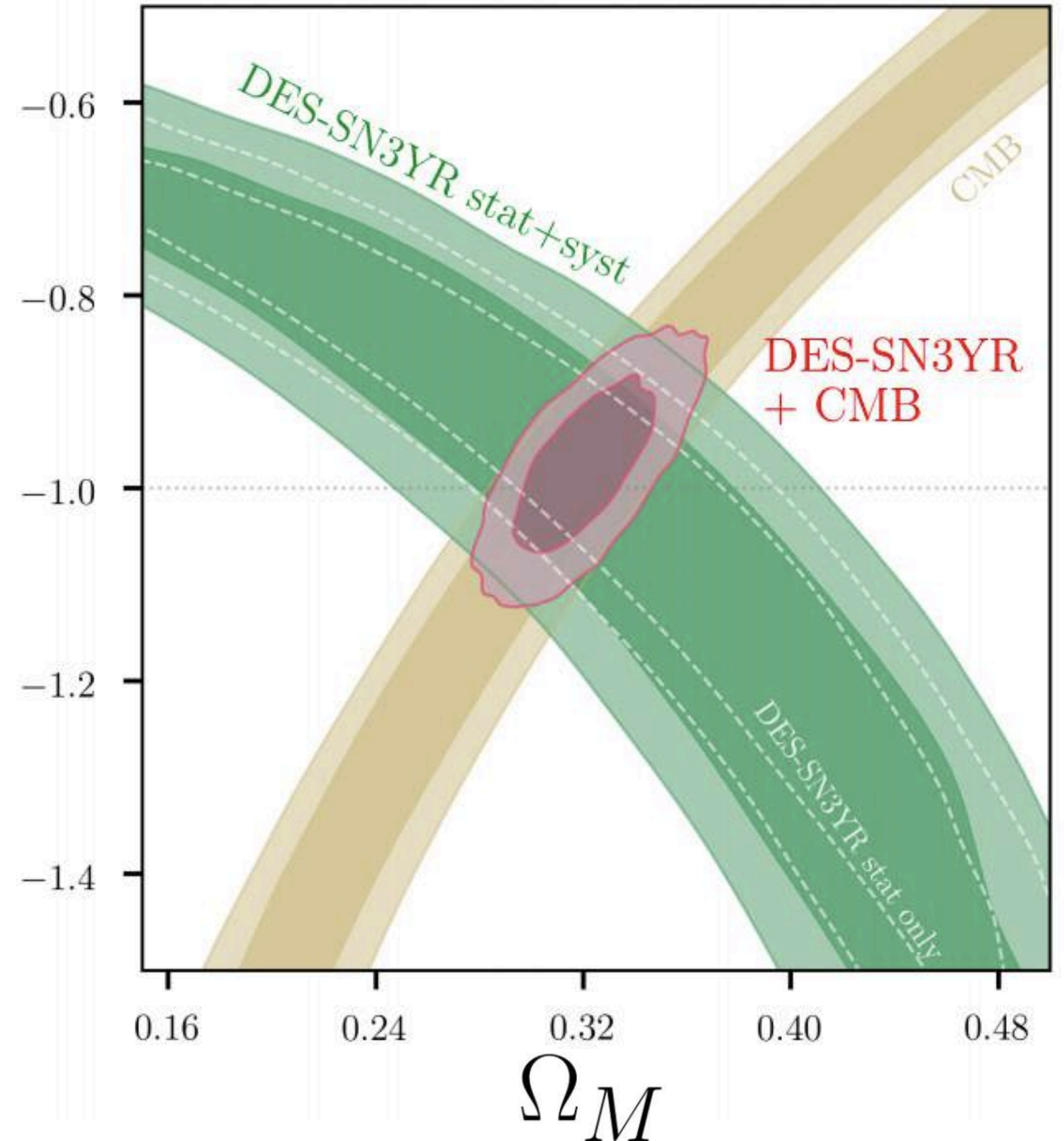
DES Collaboration et al. 2018

$$w = -0.978 \pm 0.059$$

$$\sigma_w = 0.042 \text{ (STAT)}, 0.042 \text{ (SYST)}$$

**The beginning of an era dominated  
by systematic uncertainties**

$w$





# DES-SN3YR Results!

## Flat $w$ CDM

DES Collaboration et al. 2018

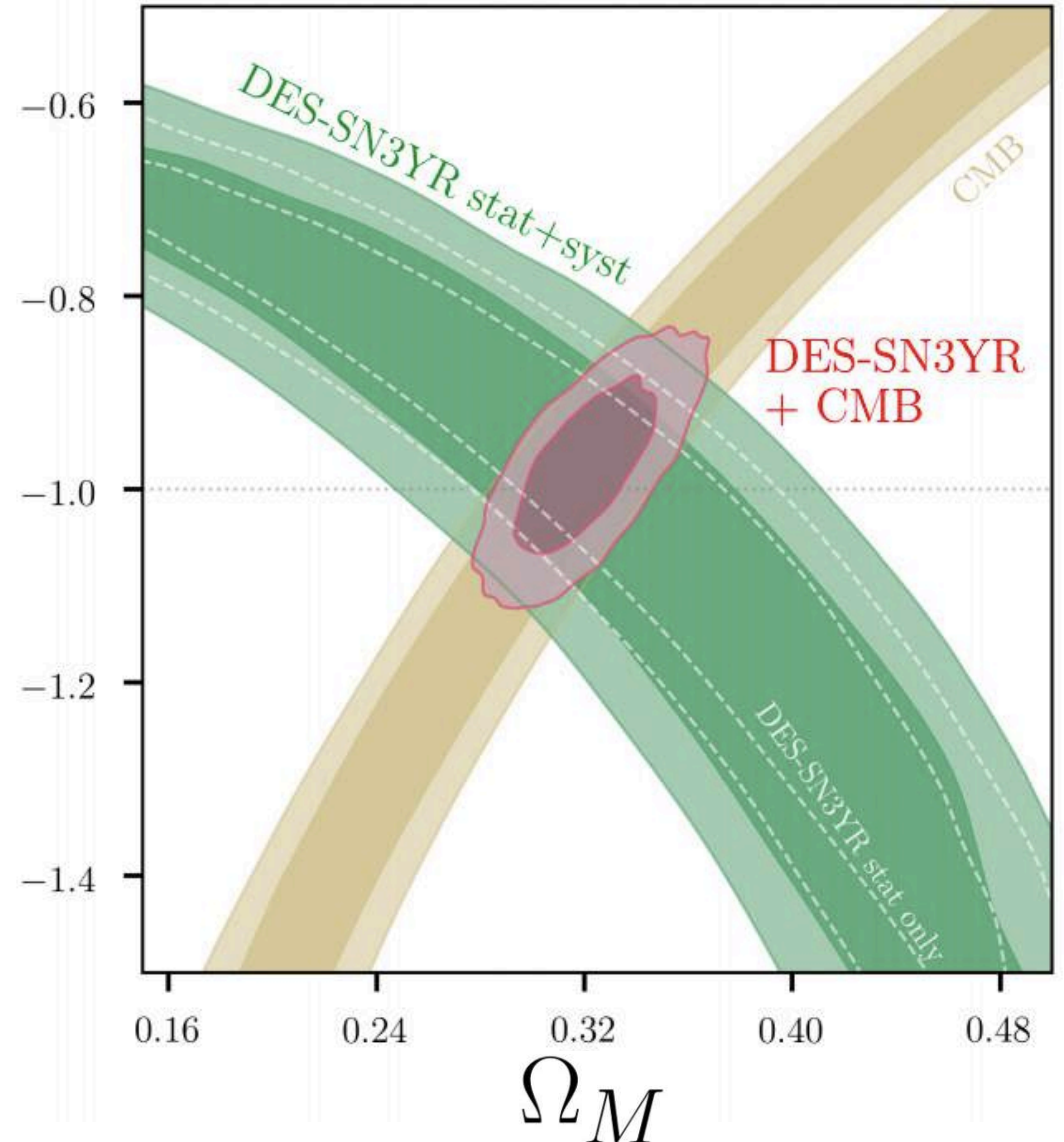
$$w = -0.978 \pm 0.059$$

$$\sigma_w = 0.042 \text{ (STAT)}, 0.042 \text{ (SYST)}$$

**The beginning of an era dominated  
by systematic uncertainties**

All hope is not lost! With higher  
statistics we can improve our  
understanding of SN astrophysics  
and survey modeling

$w$



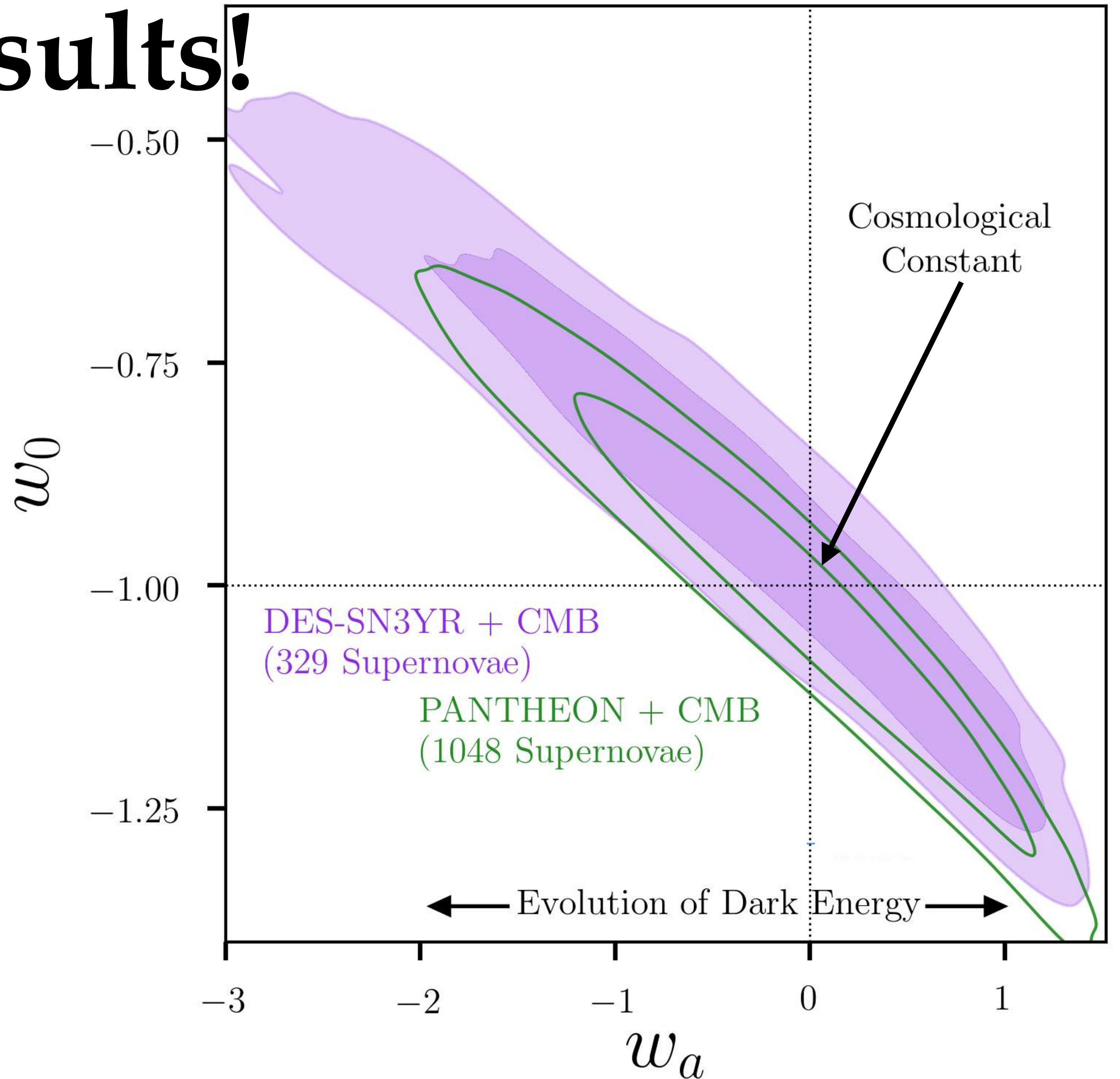


# DES-SN3YR Results!

Flat  $w_0w_a$ CDM

$$w = w_0 + w_a(1 - a)$$

$$w_a = -0.387 \pm 0.430$$





# $w$ UNCERTAINTY CONTRIBUTIONS FOR $w$ CDM MODEL<sup>i</sup>

Description <sup>b</sup>	$\sigma'_w$
Total Stat ( $\sigma_w^{\text{stat}}$ )	0.042
Total Syst <sup>c</sup> ( $\sigma_w^{\text{total syst}}$ )	0.042
[Photometry & Calibration]	[0.021]
[ $\mu$ -Bias Corrections: Survey]	[0.023]
[ $\mu$ -Bias Corrections: Astrophysical]	[0.026]



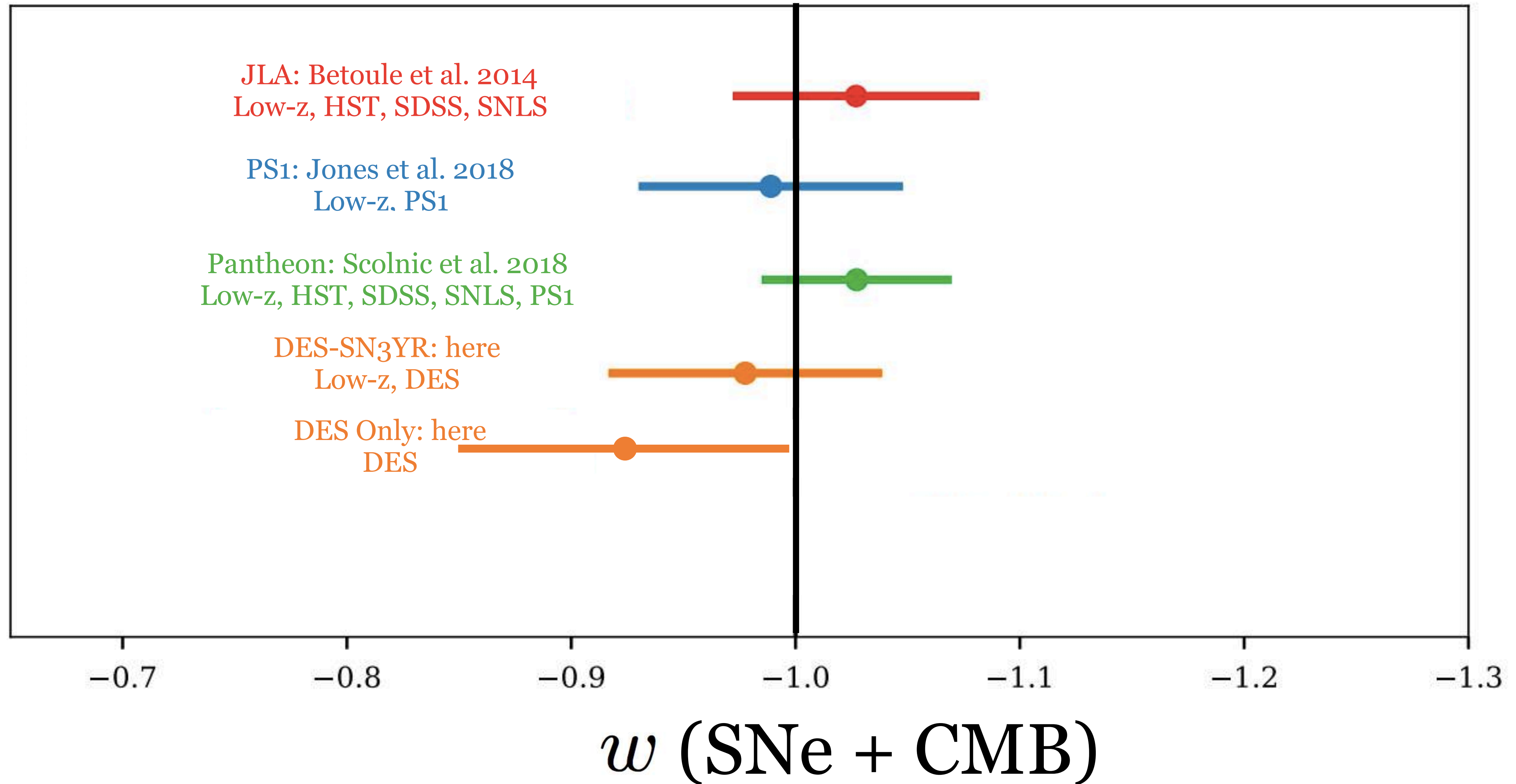
# Previously Unforeseen Systematics

- Low-z outlier cuts\*
- A non-constant value for the intrinsic scatter scaling. (one for each SN sample)
- The cosmology of the simulated samples used for bias corrections.
- A  $z+0.00004$  redshift systematic

These new systematics combine to  $\sigma_w = 0.02$  which is comparable to previously listed groupings.

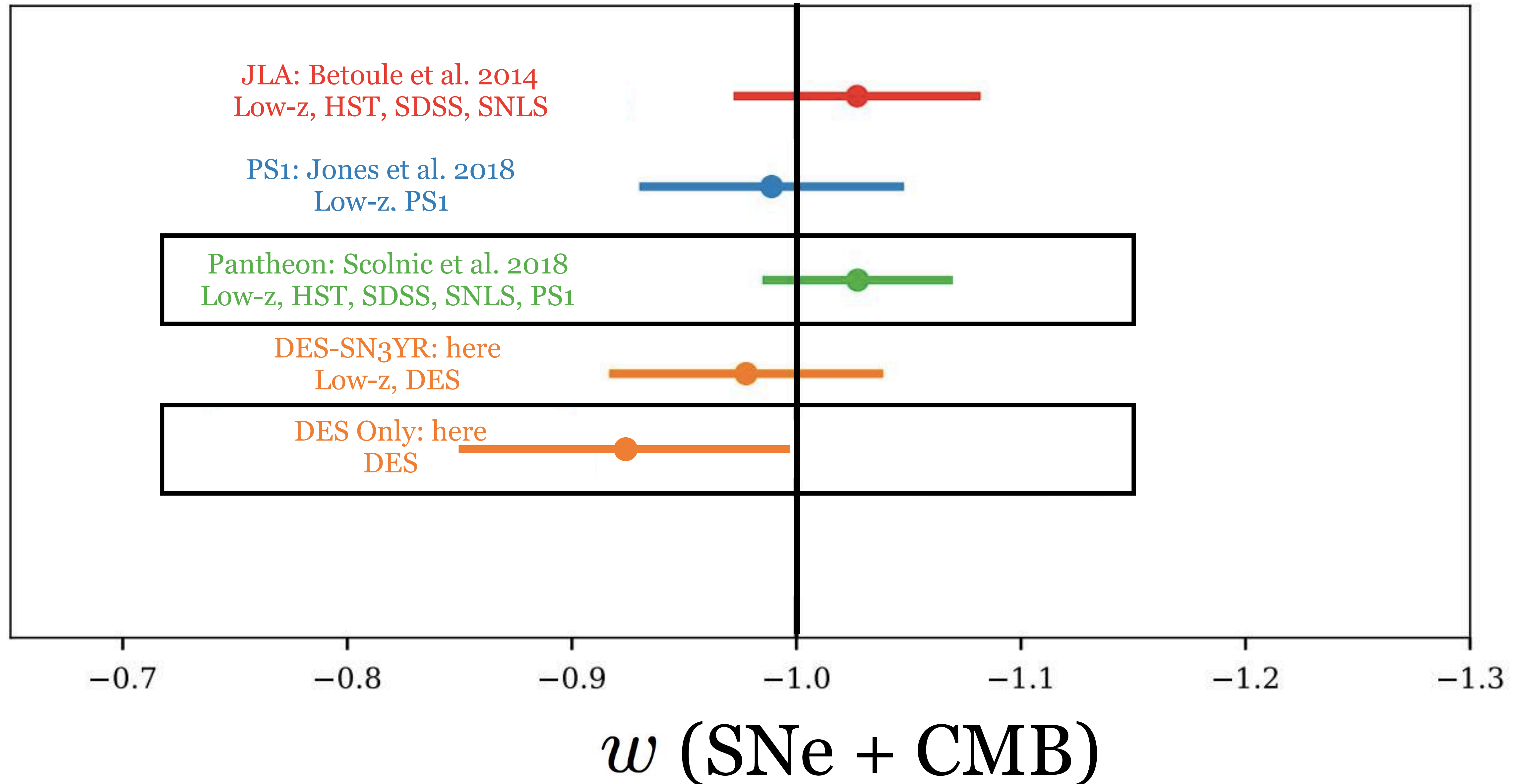
\*the single largest systematic  
In the entire DES-SN3YR analysis

# Cosmological Results for Recent Analyses





# Cosmological Results for Recent Analyses



# DES Only Results From Combined Probes

First single photometric probe to independently rule out a no dark energy universe.

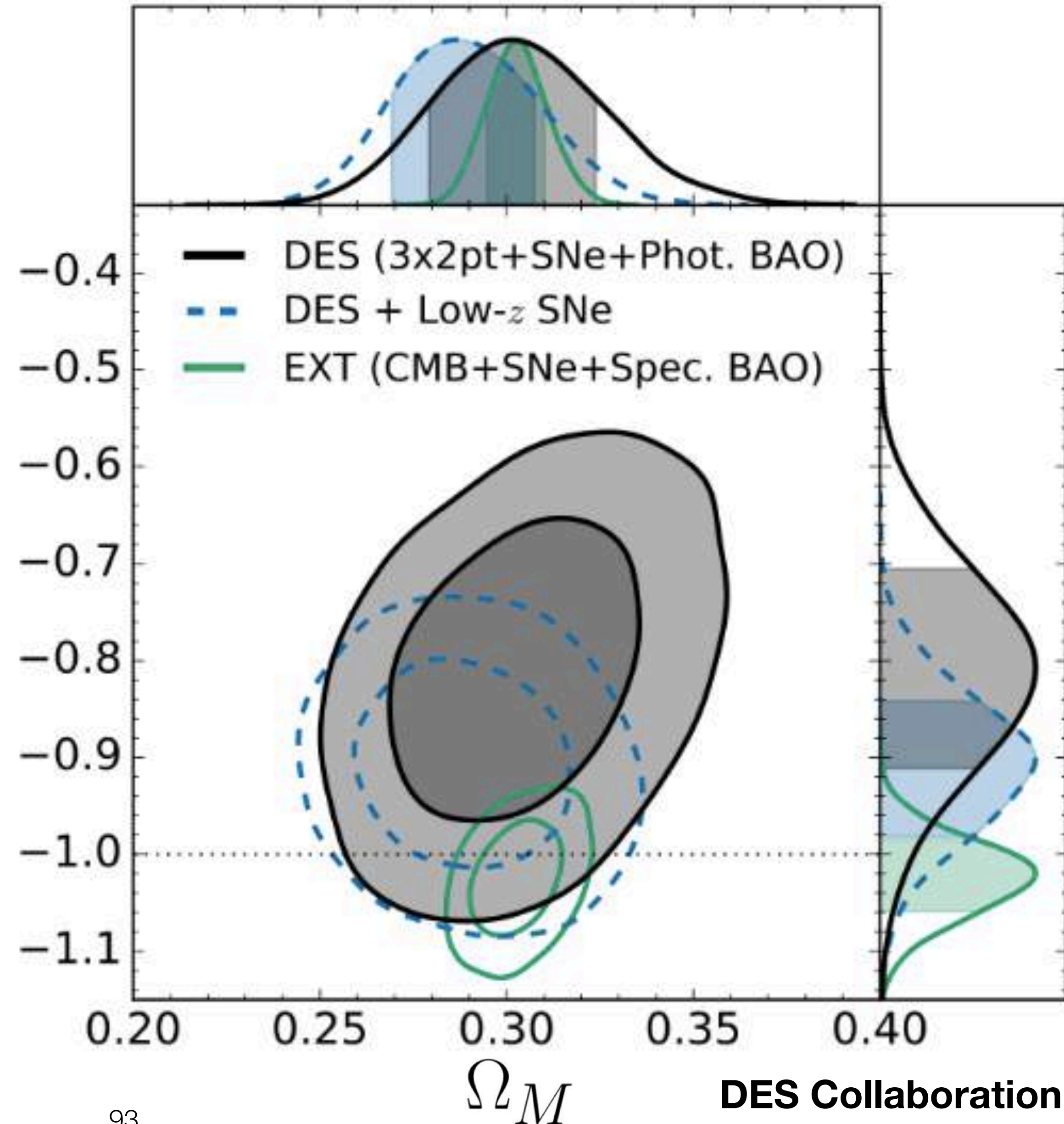
DES: SN + 3x2pt + Phot. BAO

$$w = -0.80^{+0.09}_{-0.11}$$

DES-SN + Planck16

$$w = -0.911 \pm 0.087$$

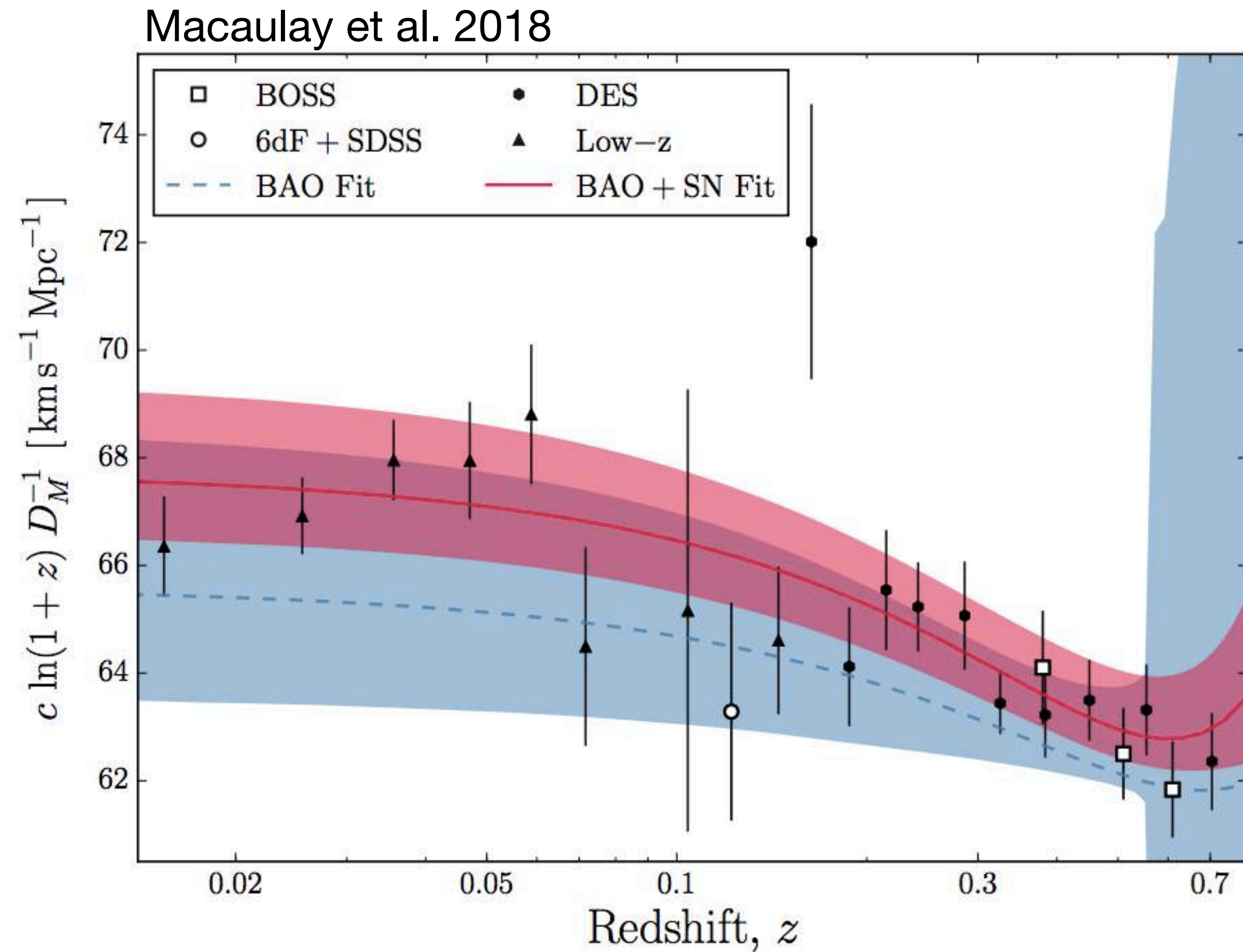
$w$



DES Collaboration et al. 2018



# Inverse Distance Ladder H0 Technique



Breaks degeneracy with peak intrinsic and  $H_0$

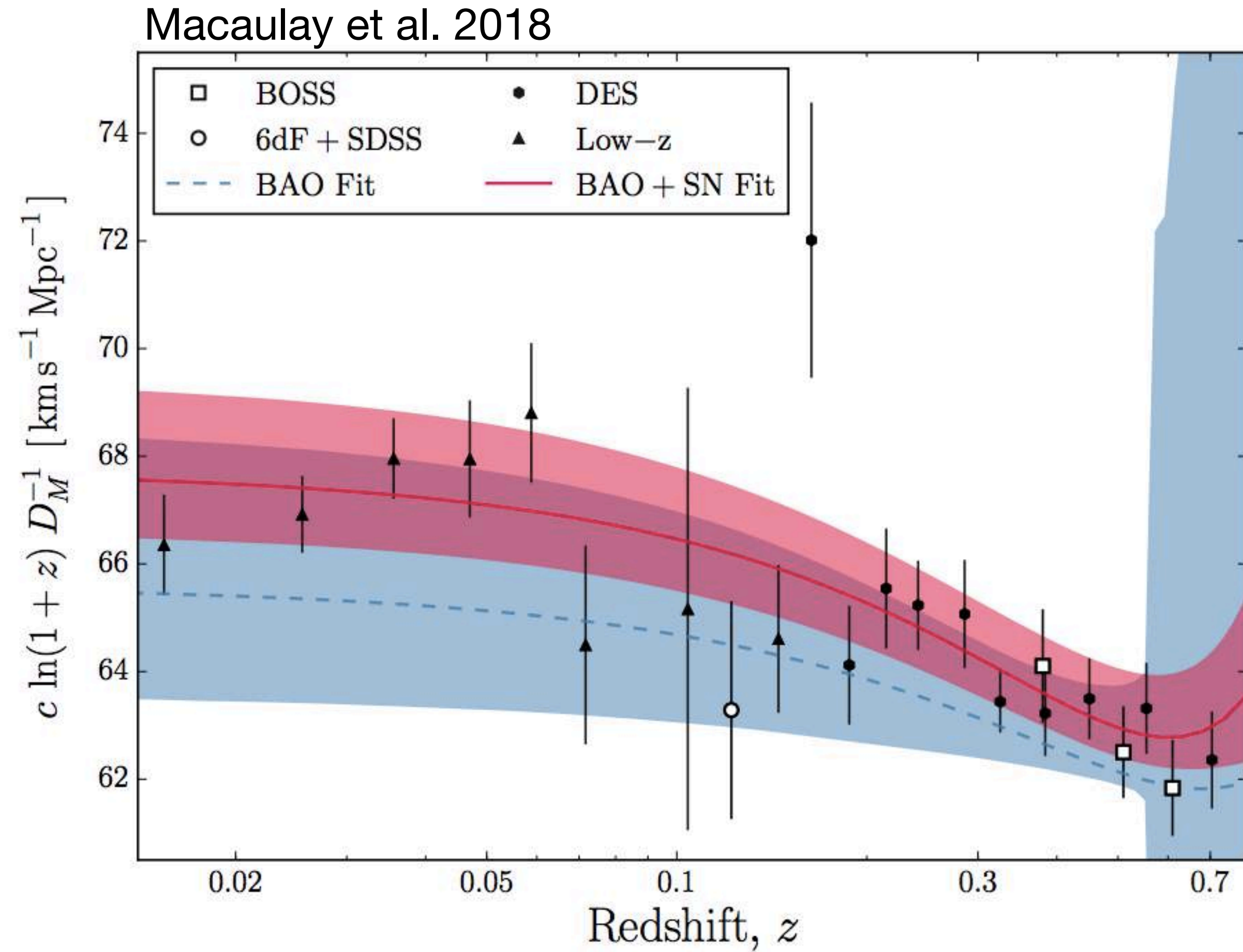
Minimal assumptions about the underlying cosmological model.

Polynomial cosmographic model.

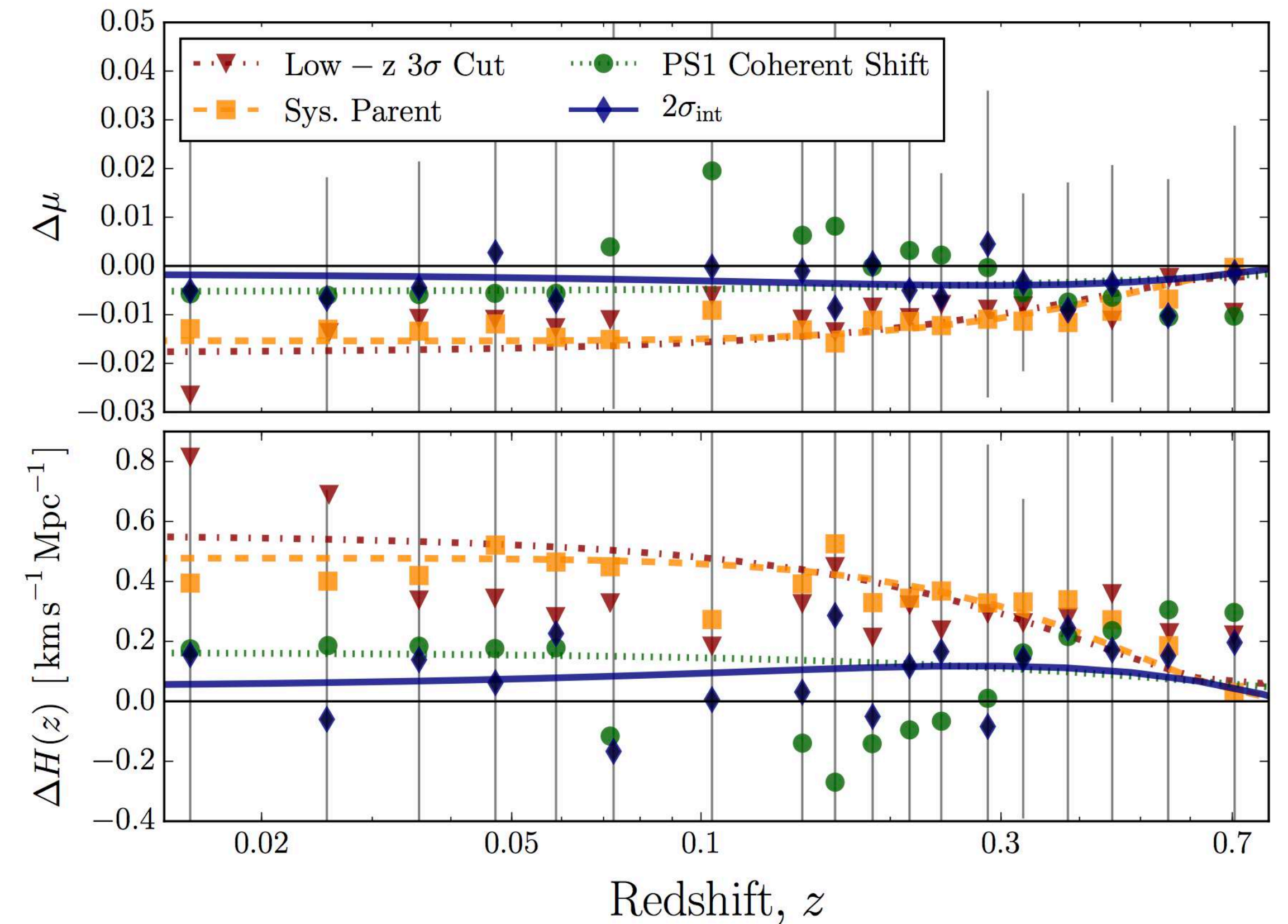
Gaussian prior on  $r_s = 147 \pm 1$

$H_0 = 67.77 \pm 1.30 \text{ km/s/Mpc}$

# Inverse Distance Ladder H0 Technique

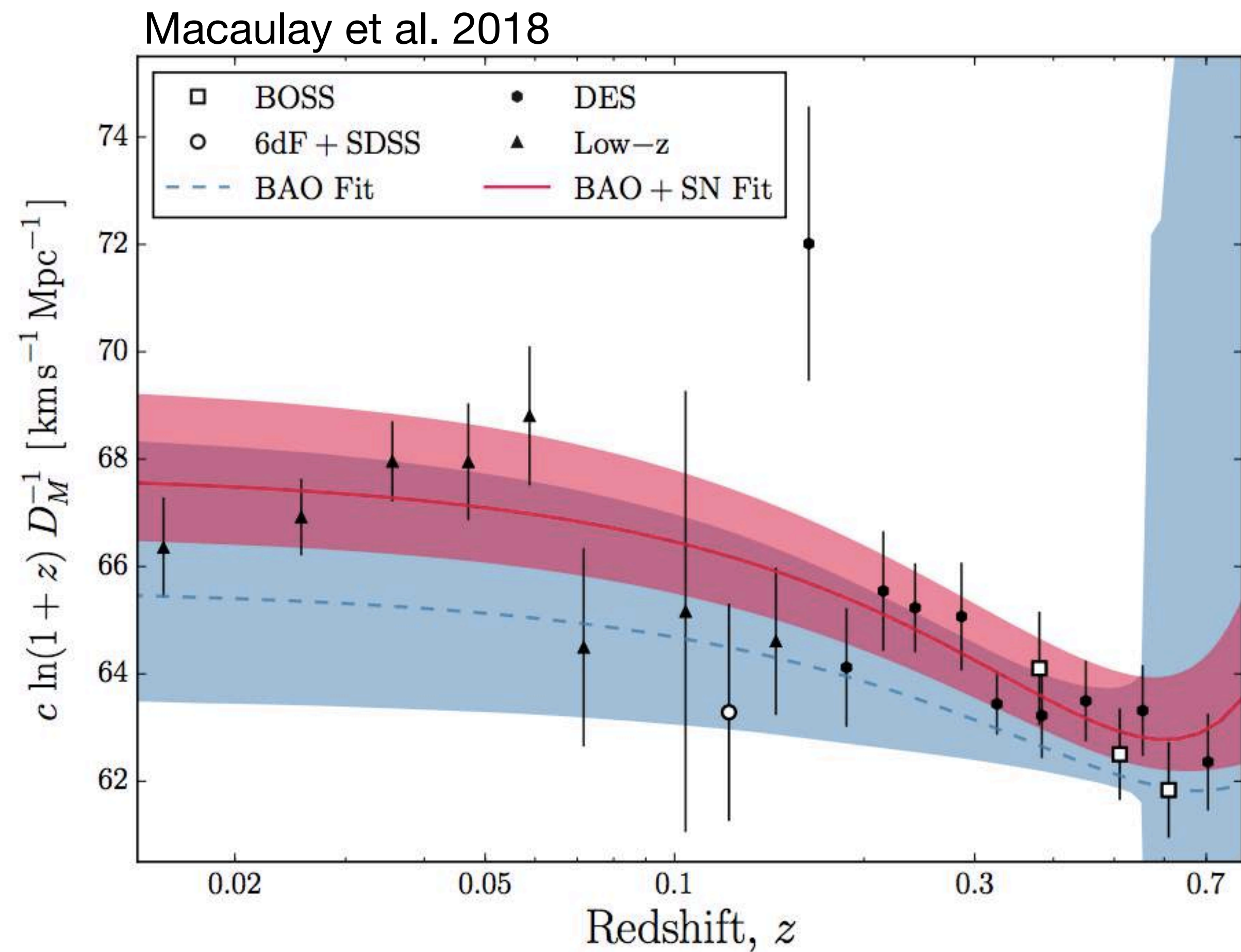


First H0 inverse distance ladder  
systematic error budget.





# Inverse Distance Ladder H0 Technique



Description	$H_0$ shift	$\sigma_{\text{syst}}$	$\sigma_{\text{syst}} / \sigma_{\text{stat}}$
Total Stat.	0.000	1.048	1.00
Total Sys.	0.162	0.760	0.72
ALL Calibration	-0.078	0.375	0.36
DES Cal.	-0.016	0.276	0.26
Low-z Cal	-0.026	0.254	0.24
SALT	0.053	0.217	0.21
ALL Other	0.004	0.661	0.63
Intrinsic Scatter	0.129	0.330	0.31
$z + 0.00004$	0.036	0.083	0.08
$c, x_1$ Parent Pop.	-0.031	0.249	0.24
Low-z Vol. Lim.	-0.081	0.124	0.12
Flux Err.	-0.004	0.179	0.17
Spec. Eff	-0.091	0.125	0.12
Ref. Cosmo.	-0.065	0.134	0.13
Low-z $3\sigma$ Cut	0.498	0.193	0.18
Sys. Parent	0.370	0.222	0.21
PS1 Coherent Shift	0.064	0.246	0.23
$2 \sigma_{\text{int}}$	-0.068	0.231	0.22

# DES-SN3YR Data Release

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

- Filter+atmosphere transmission curves
- Redshifts
- Photometry
- Fit light curve parameters, distances, bias corrections
- Large simulated bias correction sample
- Binned Hubble Diagram, Full Systematics Covariance Matrix, and CosmoMC inputs and chains.





**Motivation**

**Ingredients for SN Ia Cosmology**

**Results from the First 3 Years**

**The Future of DES-SN**

# Challenges of High- $z$ Analyses

- **Photometric classification:** Addition of new systematic —  
> core collapse SNe contamination. This seems to be under control now. The difficulty remains in modeling the contamination sample.



$w$  UNCERTAINTY CONTRIBUTIONS FOR  $w$ CDM MODEL<sup>a</sup>

Description <sup>b</sup>	$\sigma'_w$
Total Stat ( $\sigma_w^{\text{stat}}$ )	0.042
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# $w$ UNCERTAINTY CONTRIBUTIONS FOR $w$ CDM MODEL<sup>a</sup>

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[Photometry & Calibration]	[0.021]
[ $\mu$ -Bias Corrections: Survey]	[0.023]
[ $\mu$ -Bias Corrections: Astrophysical]	[0.026]
[CC contamination]	[0.???



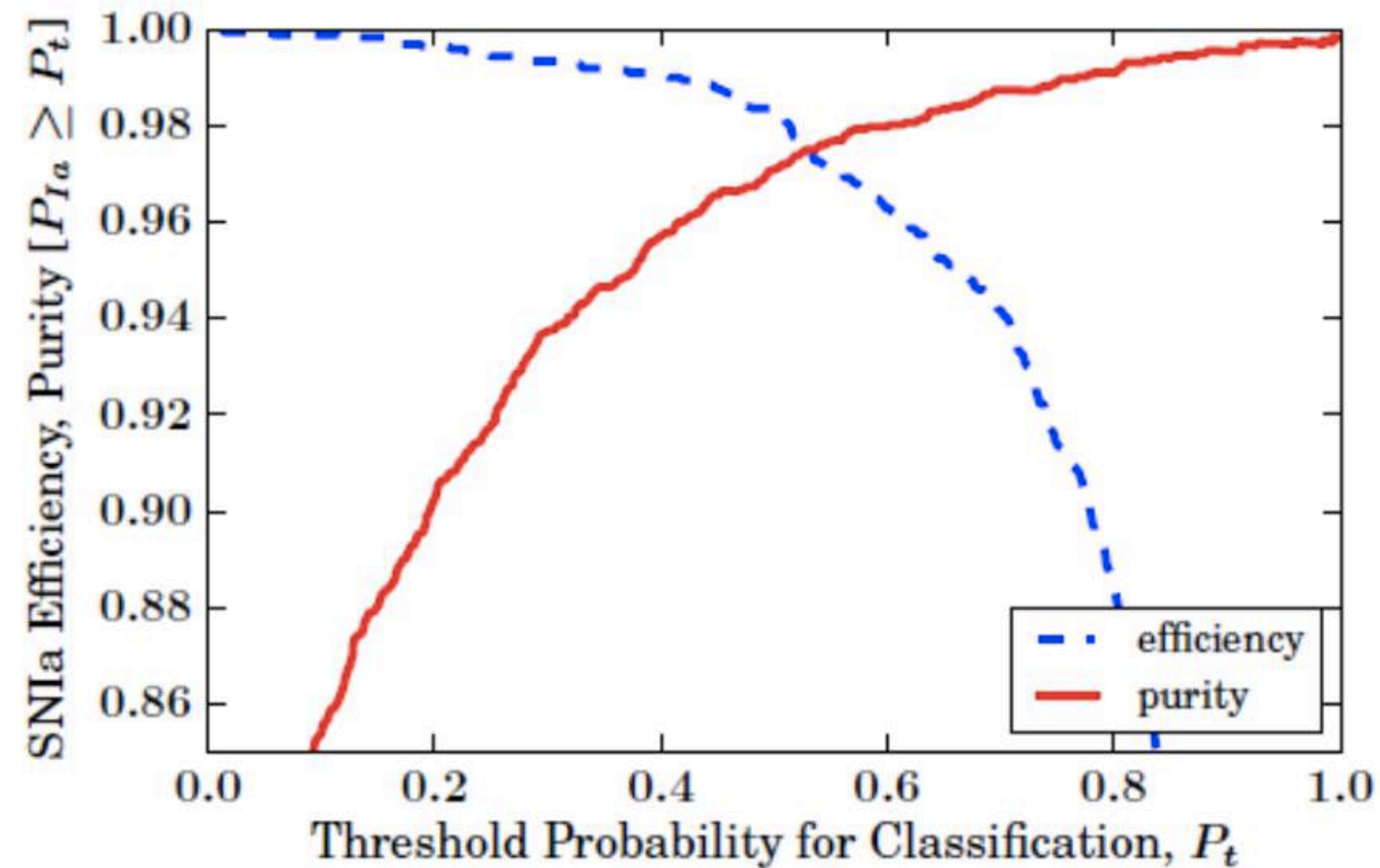
*w* UNCERTAINTY CONTRIBUTIONS FOR *w*CDM MODEL<sup>a</sup>

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[Photometry & Calibration]	[0.021]
[ $\mu$ -Bias Corrections: Survey]	[0.023]
[ $\mu$ -Bias Corrections: Astrophysical]	[0.026]
[CC contamination]	[0.???

PS1: Jones et al. 2018  
Find 0.013 due to CC contamination

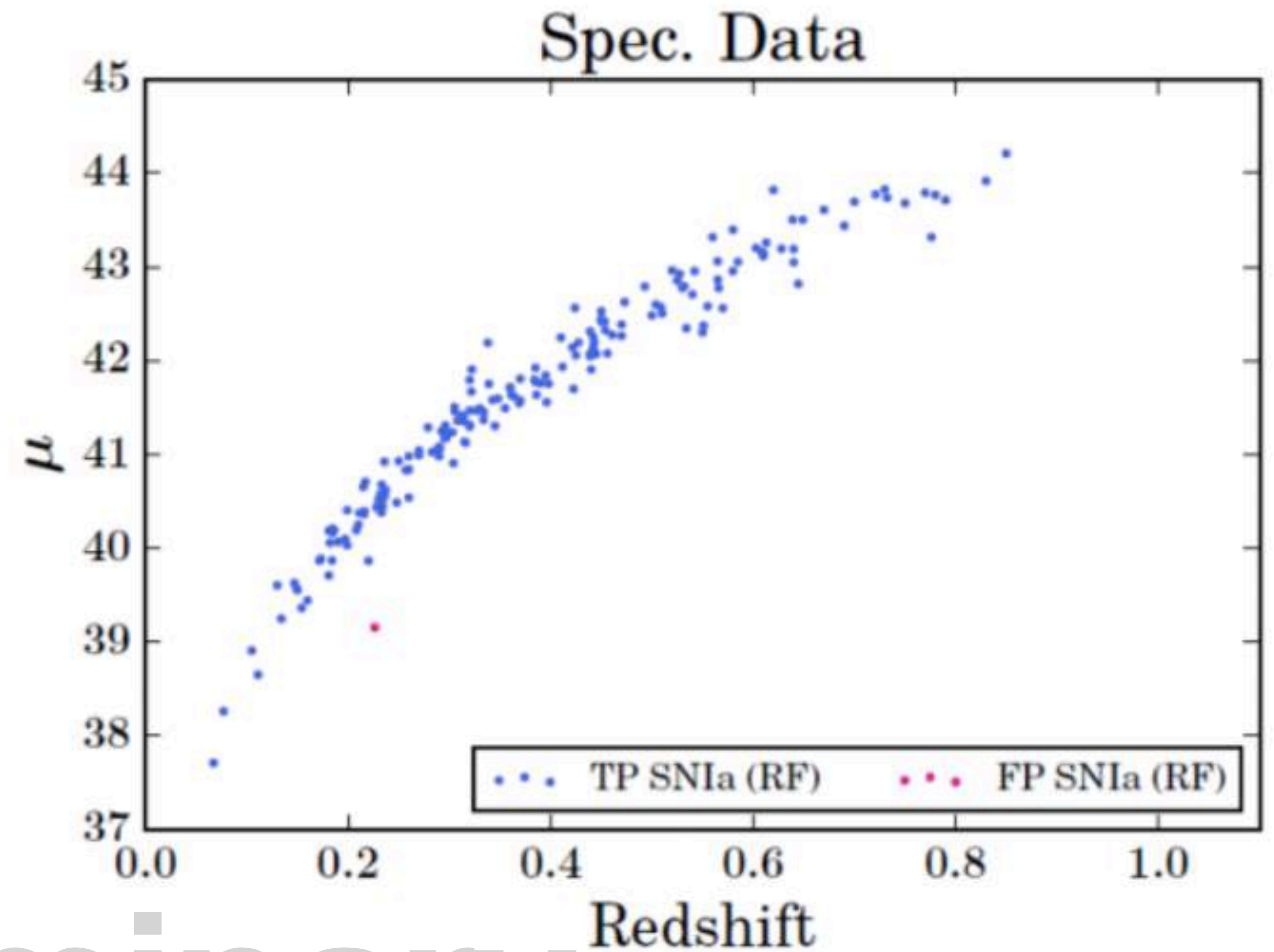


# Random Forest Phot. Classification



87% MLcut efficiency

1 False positive (using spec data type) is SNIc



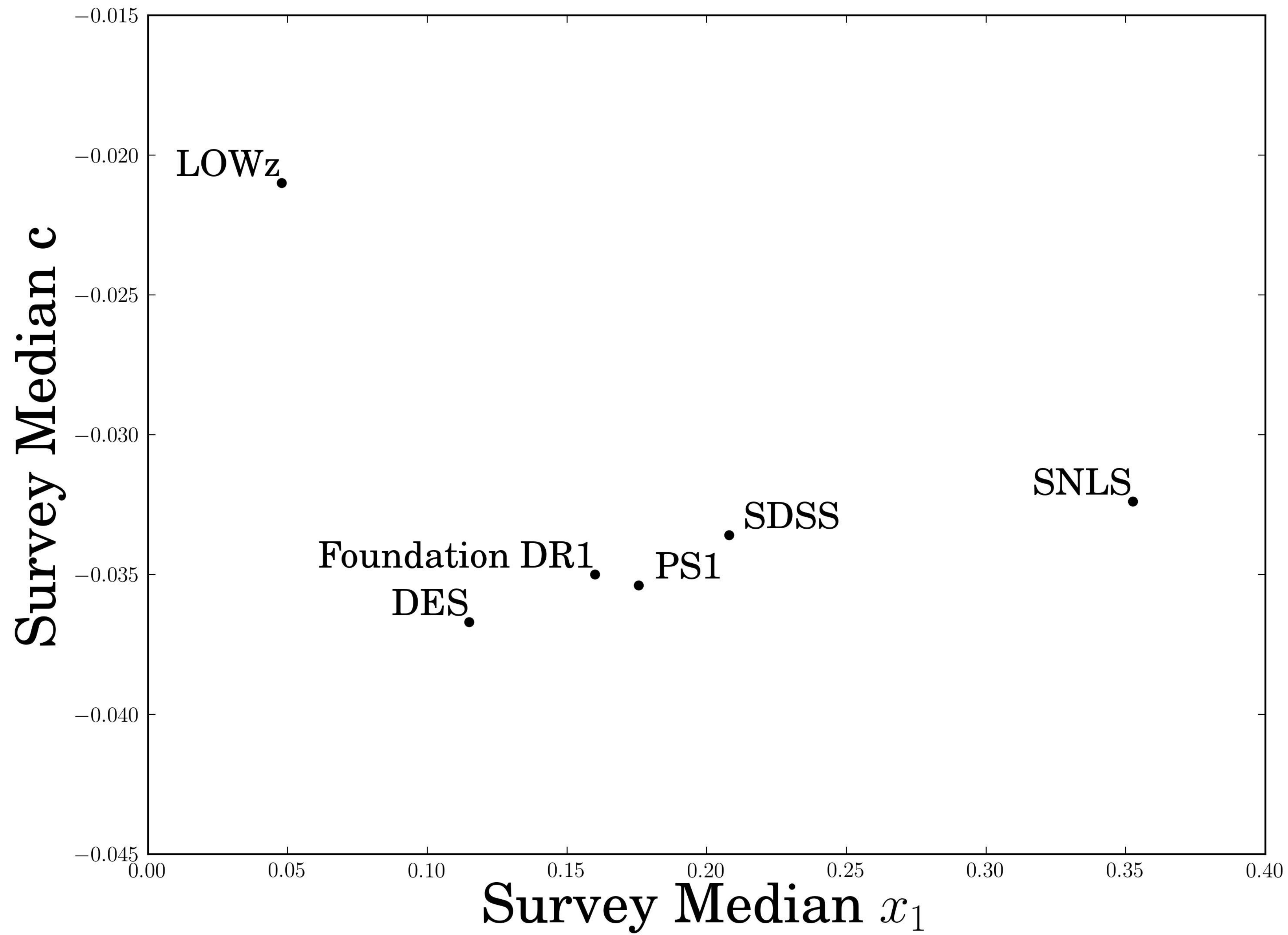
Preliminary

Credit: S. Kuhlman

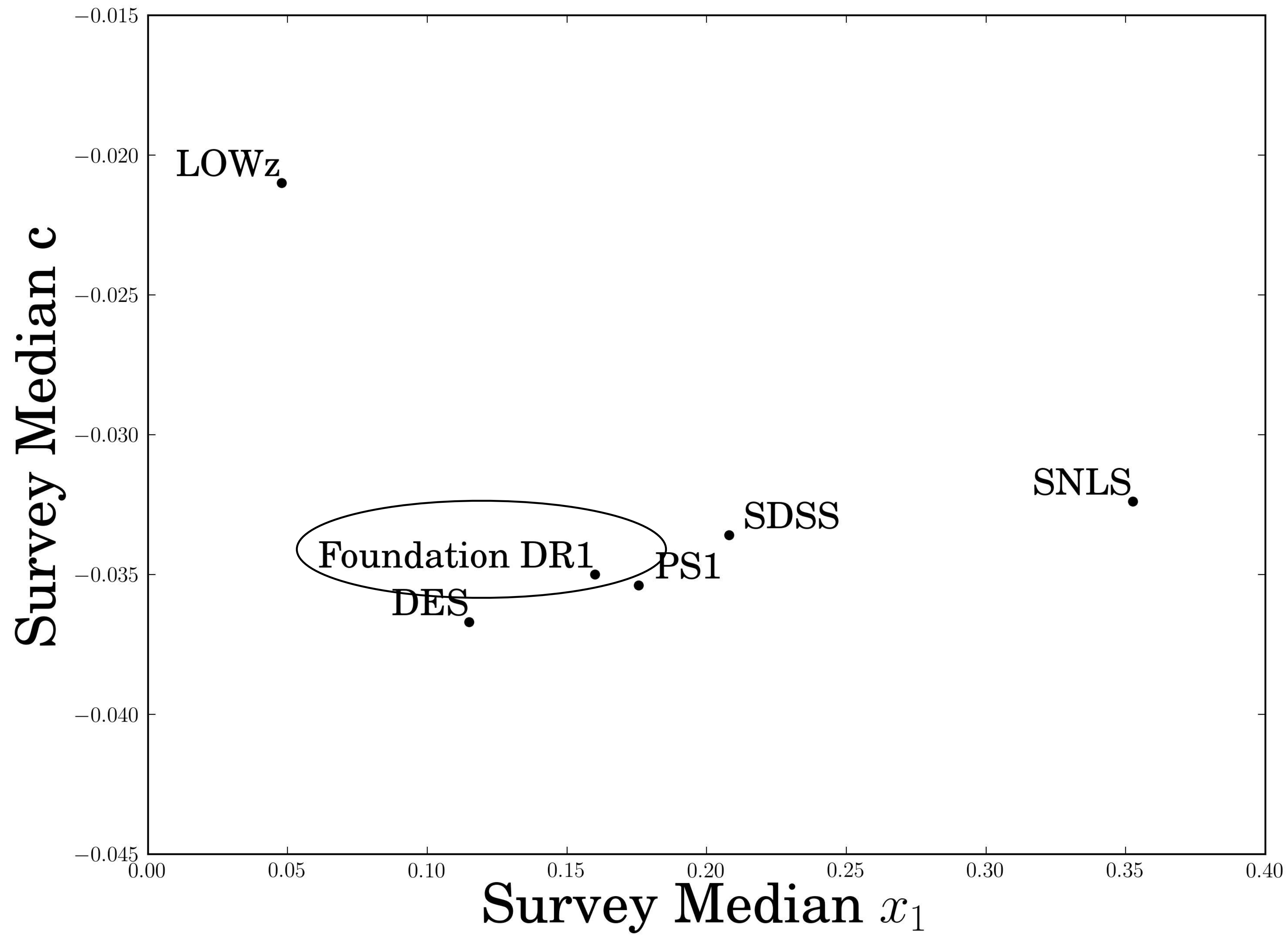


# Challenges of High- $z$ Analyses

- **Photometric classification:** Addition of new systematic —  
> core collapse SNe contamination. This seems to be under control now. The difficulty remains in modeling the contamination sample.
- **The Low- $z$  Anchor:** We are currently poorly able to model the selection function of the low- $z$  sample. This will hopefully be remedied by rolling (easily modelable) low- $z$  surveys such as Foundation (Foley et al 2017).





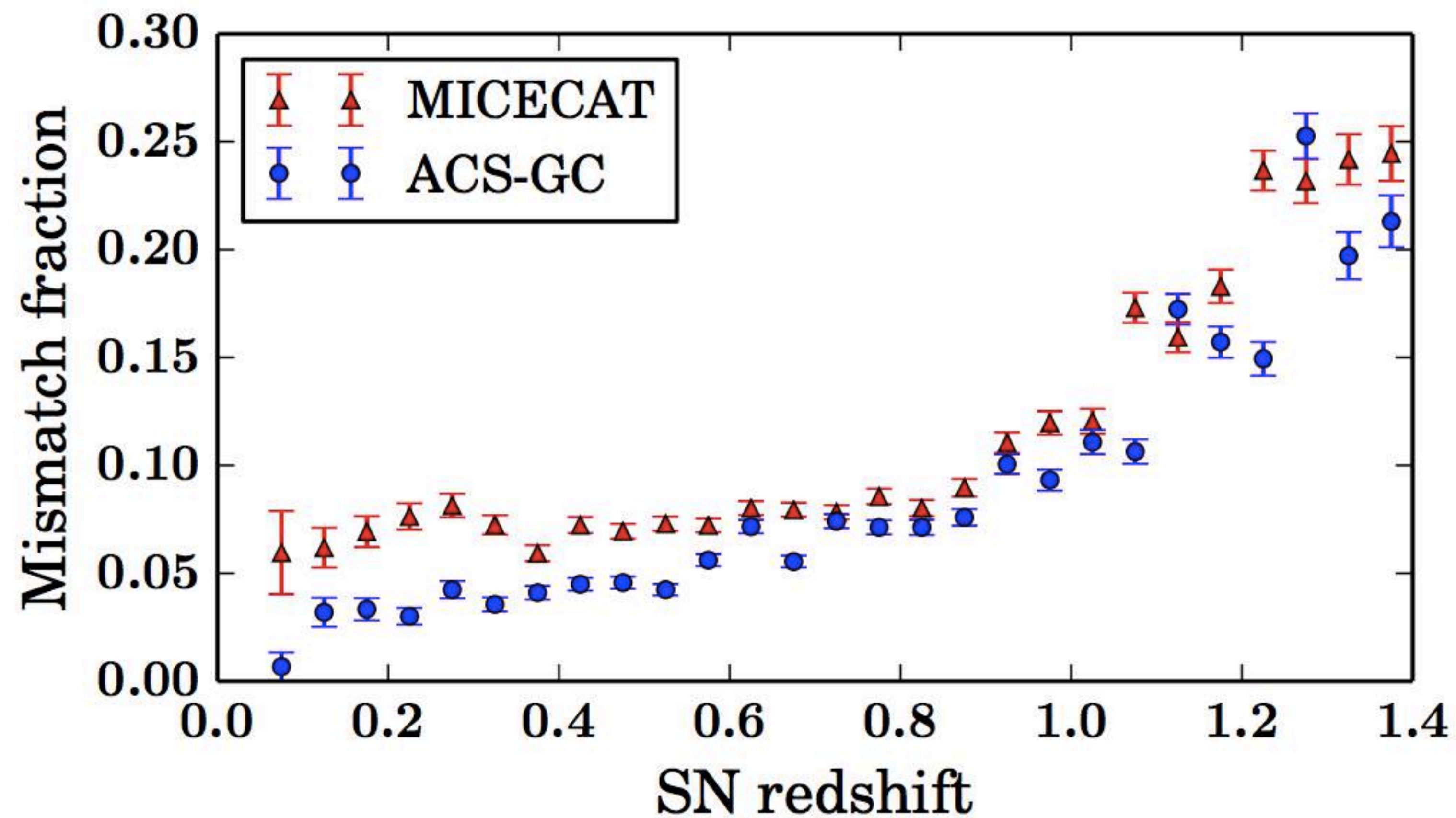


# Challenges of High- $z$ Analyses

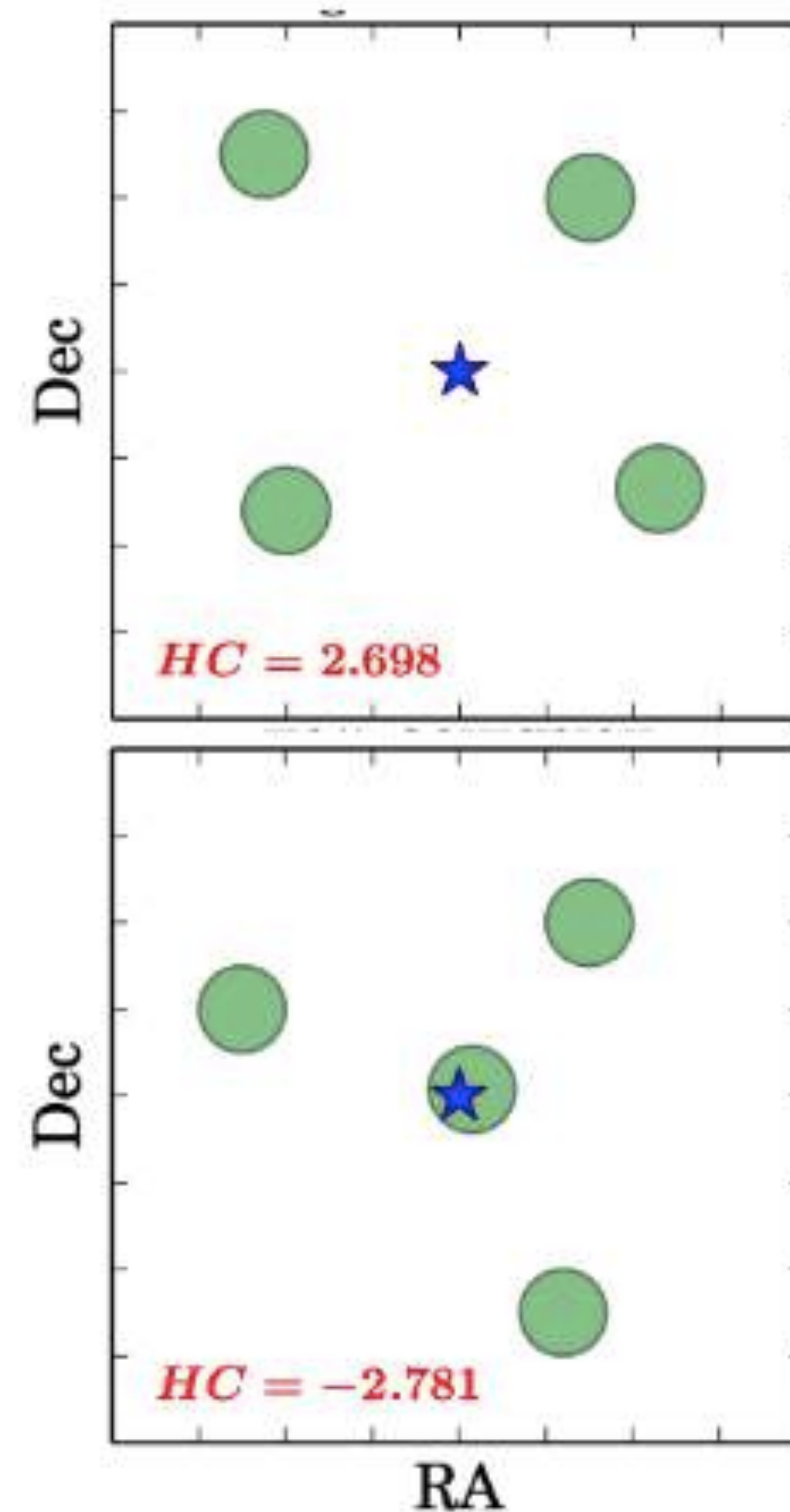
- **Photometric classification:** Addition of new systematic — > core collapse SNe contamination. This seems to be under control now. The difficulty remains in modeling the contamination sample.
- **The Low- $z$  Anchor:** We are currently poorly able to model the selection function of the low- $z$  sample. This will hopefully be remedied by rolling (easily modelable) low- $z$  surveys such as Foundation (Foley et al 2017).
- **Host Galaxy Confusion:** stronger at higher redshifts.



# Host galaxy confusion



Credit:  
*Gupta et al. 2016*



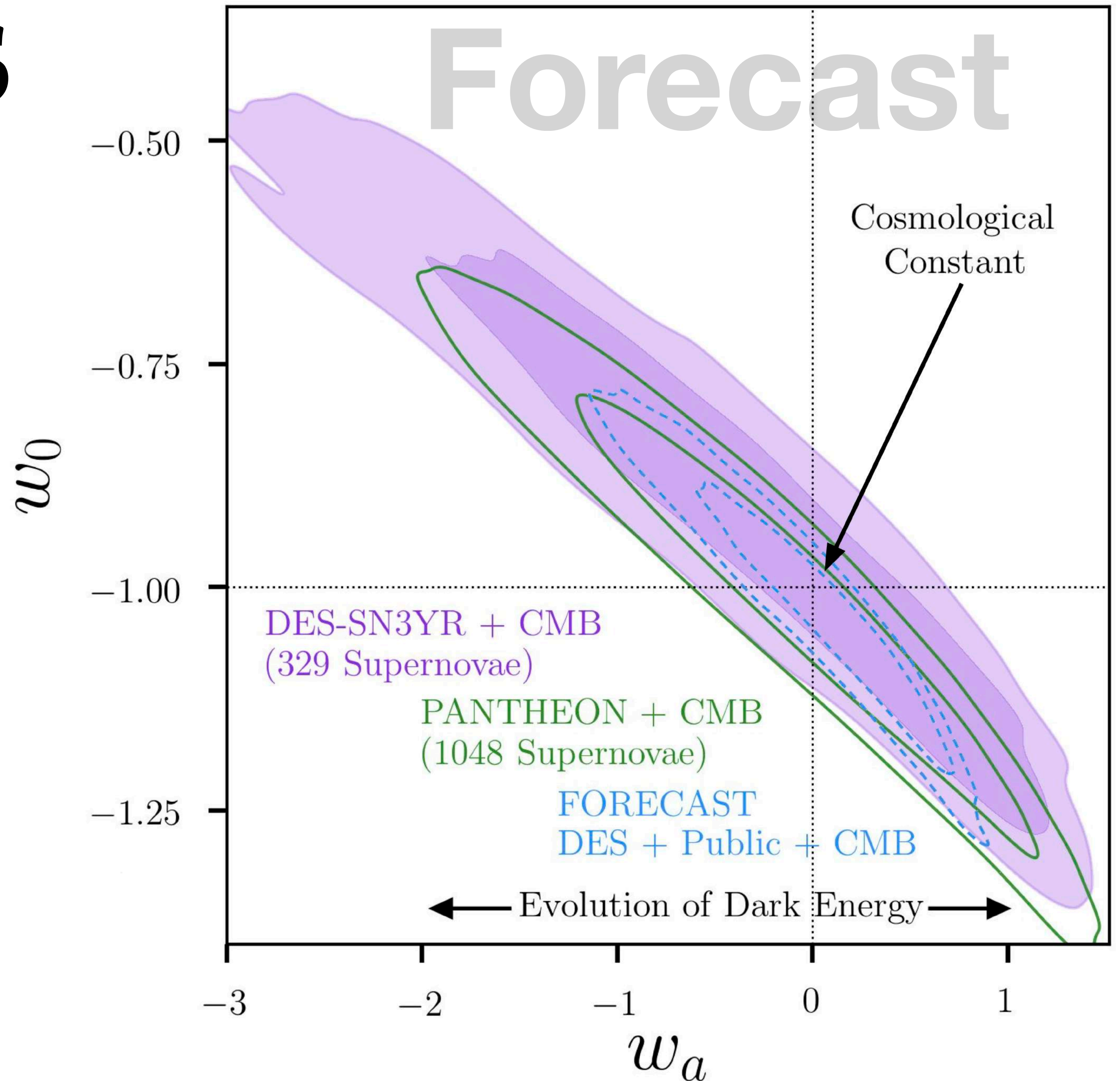


# Future of DES

DES 5 Year Photometrically  
Classified Data ~2500 Type Ia  
SNe will double currently  
available statistics.

There is much more work to do  
to analyze the full dataset and set  
the stage for future surveys  
(LSST and WFIRST)

Caveat: No assumptions in  
improvements of systematics.







THE DARK ENERGY SURVEY

**Thank You**