

# Science of the Dark Energy Survey

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Fermilab and the University of Chicago

Astronomy 41100

Lecture 3, Oct. 29, 2010

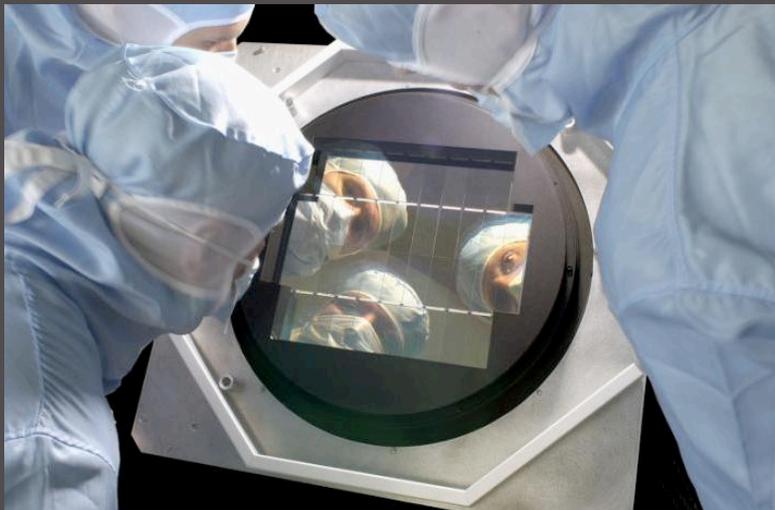
# 1998-2010 SN Ia Synopsis

- Substantial increases in both quantity and quality of SN Ia data: from several tens of relatively poorly sampled light curves to many hundreds of well-sampled, multi-band light curves from rolling surveys
- Extension to previously unexplored redshift ranges:  $z > 1$  and  $0.1 < z < 0.3$
- Extension to previously underexplored rest-frame wavelengths (Near-infrared)
- Vast increase in spectroscopic data
- Identification of SN Ia subpopulations (host galaxies)
- Entered the systematic error-dominated regime, but with pathways to reduce systematic errors

# Supernova Legacy Survey (2003-2008)



- Observed 2 1-sq deg regions every 4 nights
- ~400+ spectroscopically confirmed SNe Ia to measure  $w$
- Used 3.6-meter CFHT/“Megacam”
- 36 CCDs with good blue response
- 4 filters *griz* for good K-corrections and color measurement
- Spectroscopic follow-up on 8-10m telescopes



Megaprime Mosaic CCD camera

**VLT**



**120 hr/yr: France/UK**  
FORS 1&2 for types,  
redshifts

**Magellan**



**3 nights/yr: Toronto**  
IMACS for host  
redshifts

**Spectra**

SN Identification

Redshifts

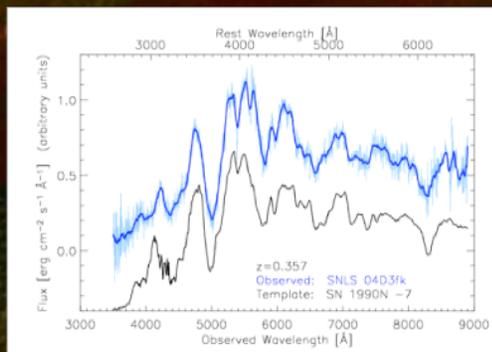
**Gemini**



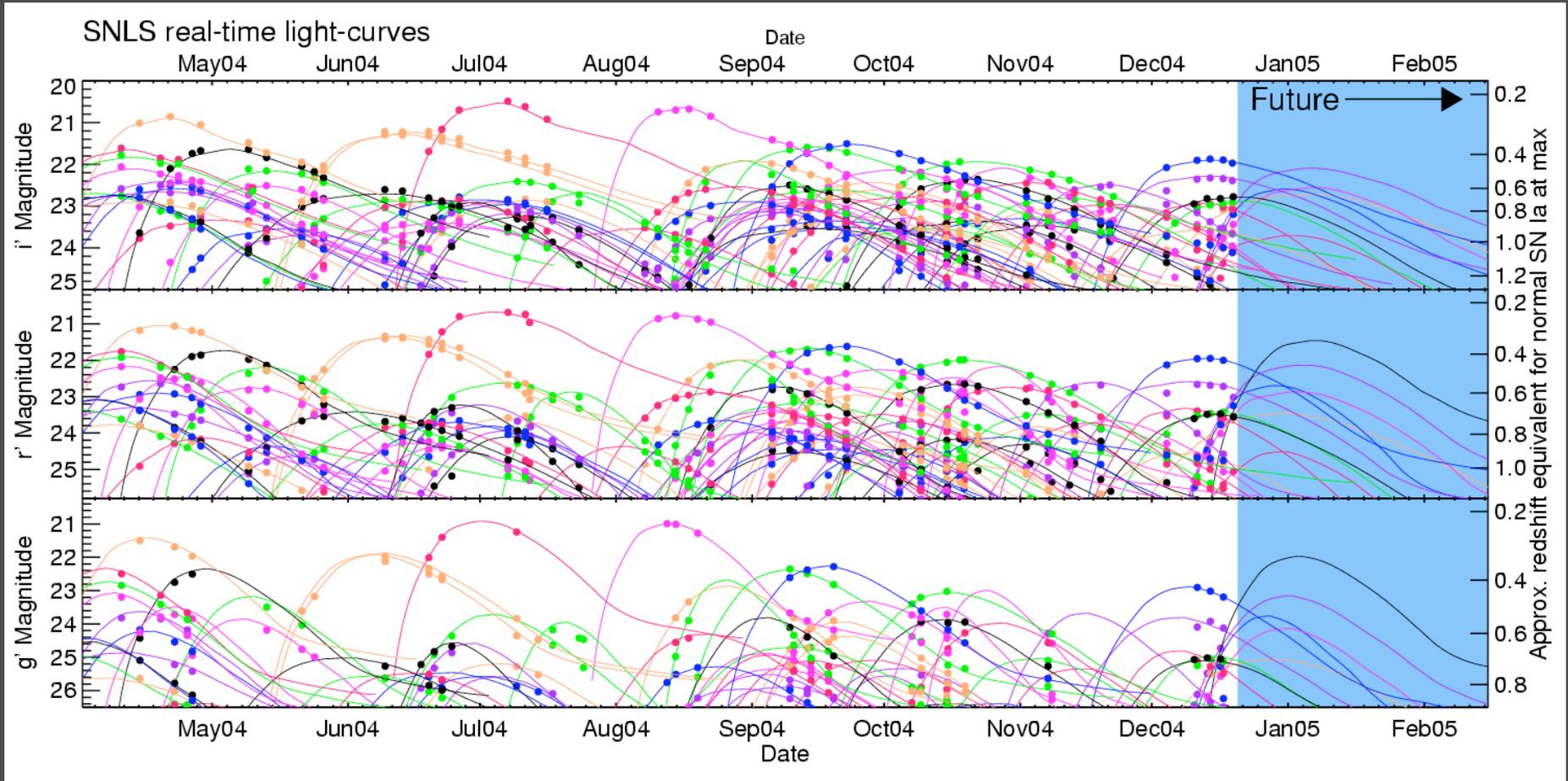
**120 hr/yr: Canada/US/  
UK**  
GMOS for types, redshifts

**Keck**

**8 nights/yr:**  
LBL/Caltech  
DEIMOS/LRIS  
for types,  
intensive study,  
cosmology with  
SNe II-P

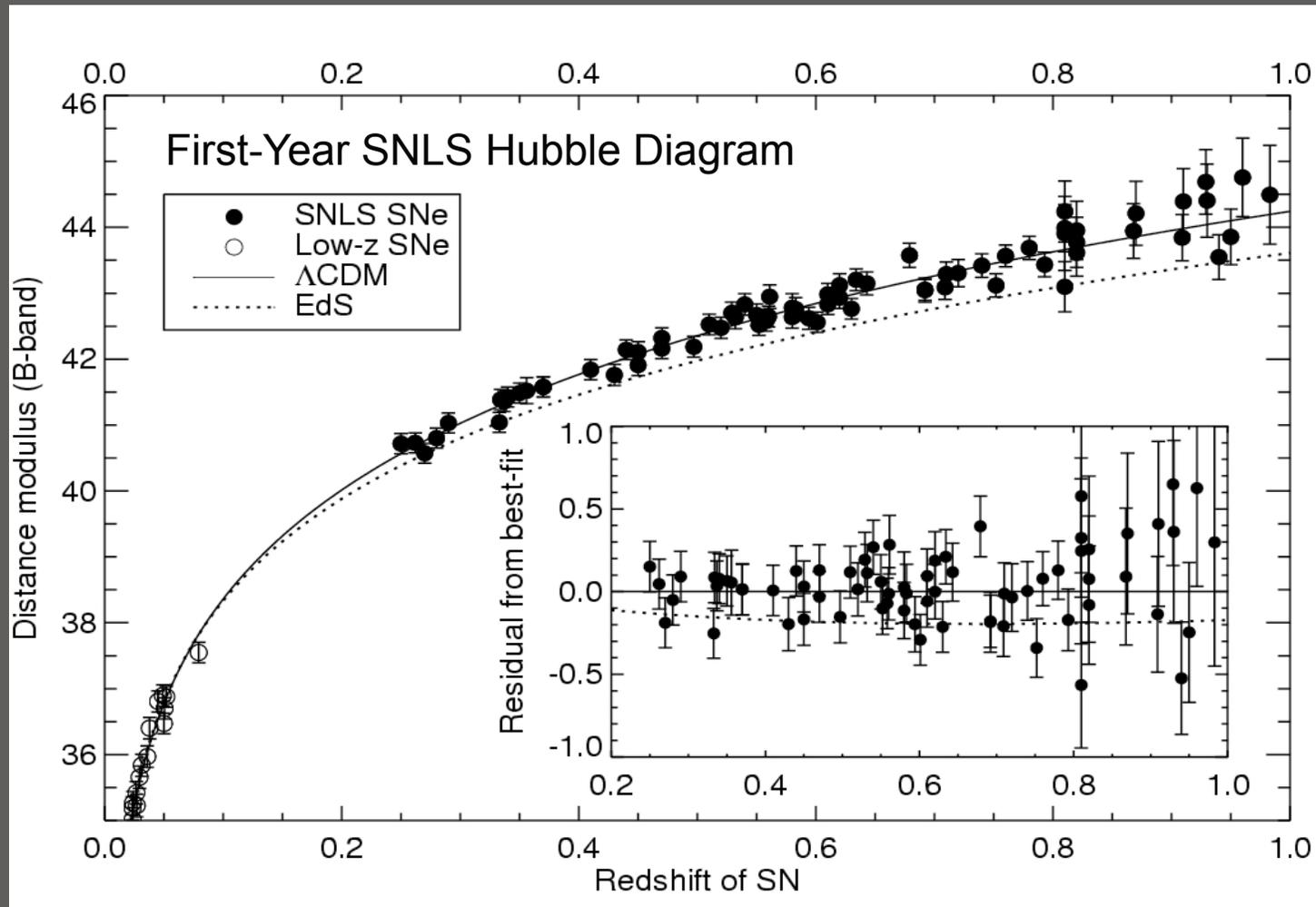


# Power of a Rolling Search



SNLS Light curves

# SNLS 1<sup>st</sup> Year Results



Astier et al.  
2006

Using 72 SNe  
from SNLS  
+40 Low-z

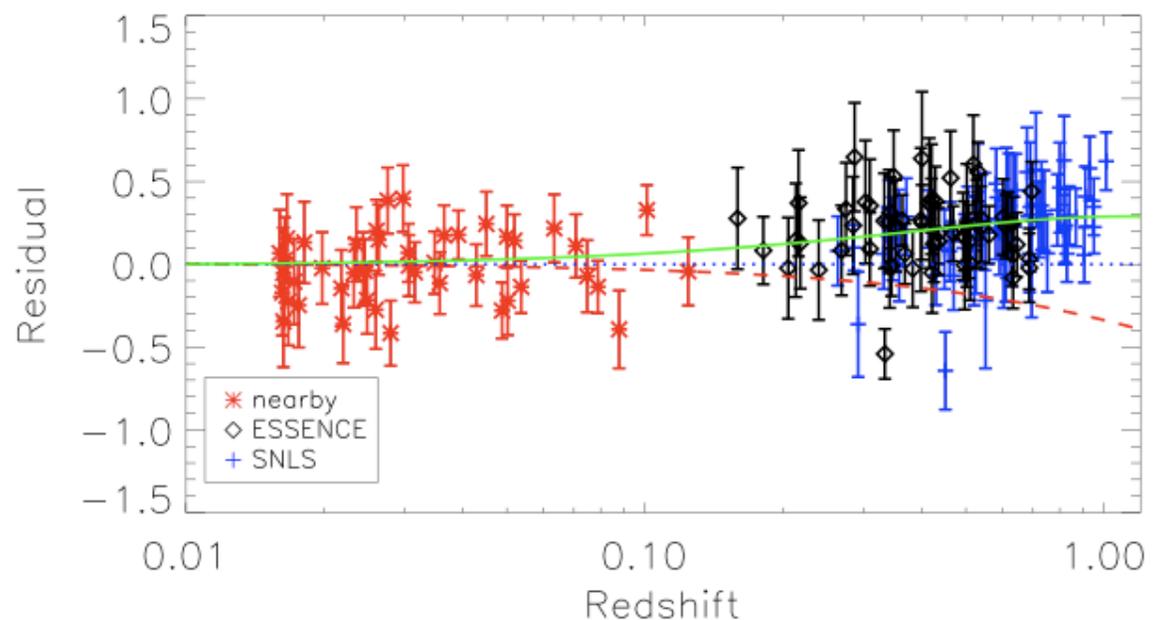
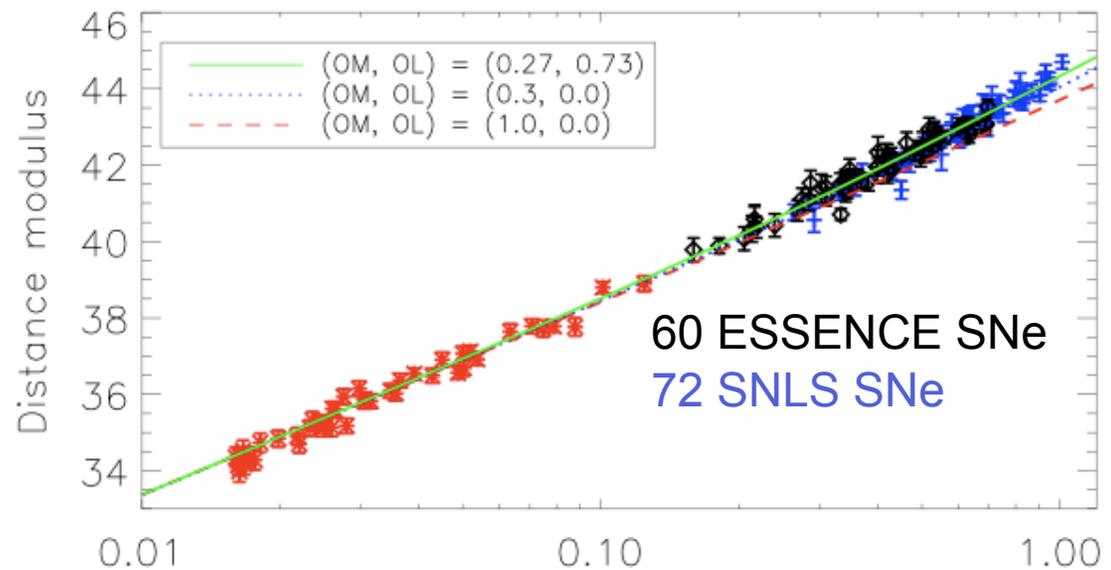
# The ESSENCE Survey



- Determine  $w$  to 10% or  $w \neq -1$
- 6-year project on CTIO 4m telescope in Chile; 12 sq. deg.
- Wide-field images in 2 bands
- Same-night detection of SNe
- Spectroscopy
  - Keck, VLT, Gemini, Magellan
- Goal is 200 SNeIa,  $0.2 < z < 0.8$

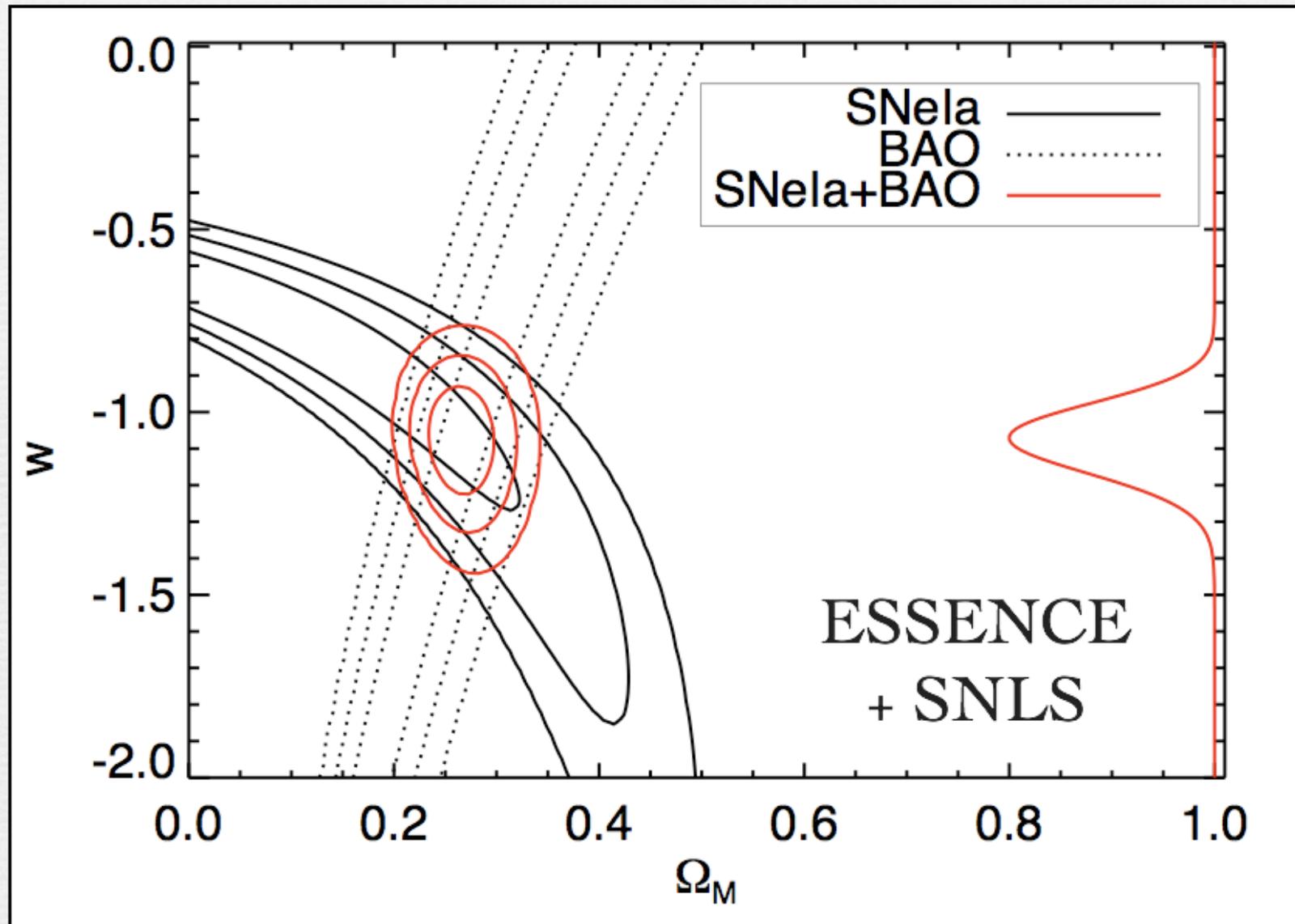
Wood-Vasey, et al (2007), Miknaitis, et al (2007):  
results from ~60 ESSENCE SNe (+Low-z)

# ESSENCE +SNLS Hubble Diagram



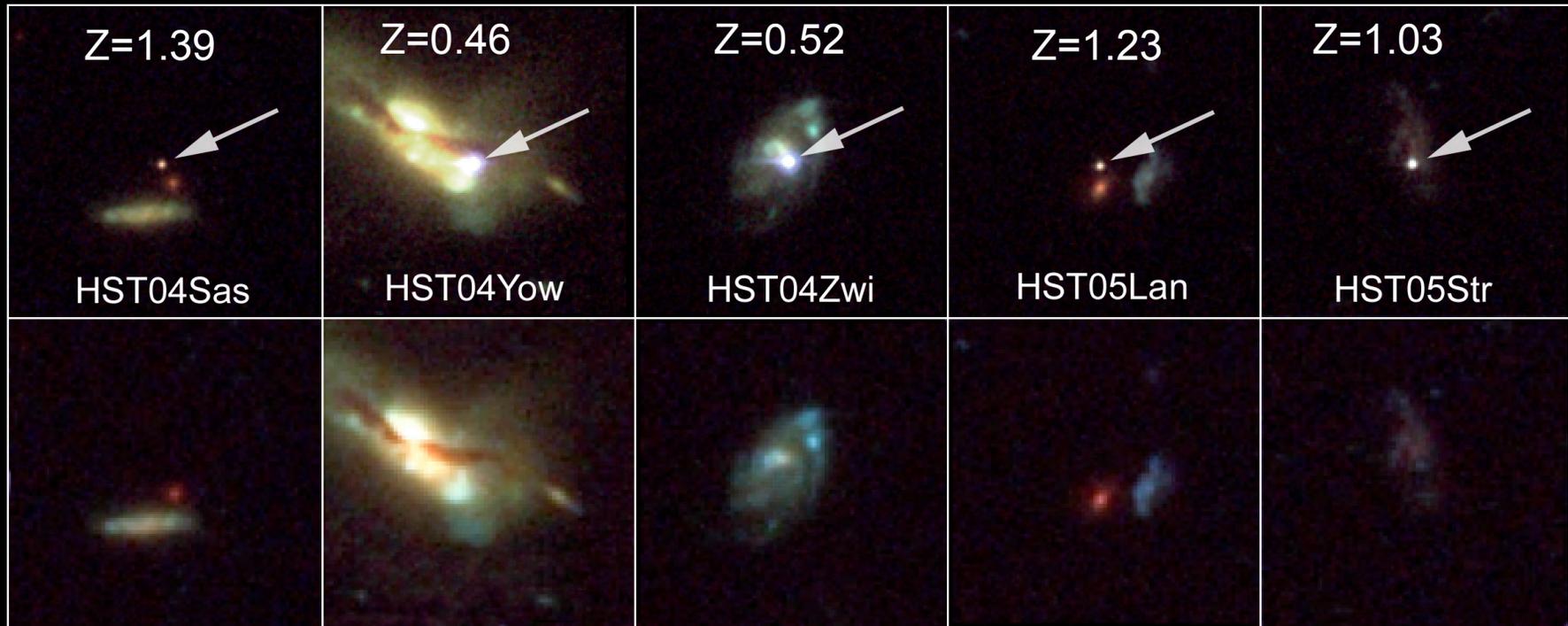
Flat,  
constant-w

$$w = -1.07 \pm 0.09 \text{ (stat)} \pm 0.13 \text{ (sys)}$$



MLCS2k2.v004

# Higher-z SNe Ia from ACS



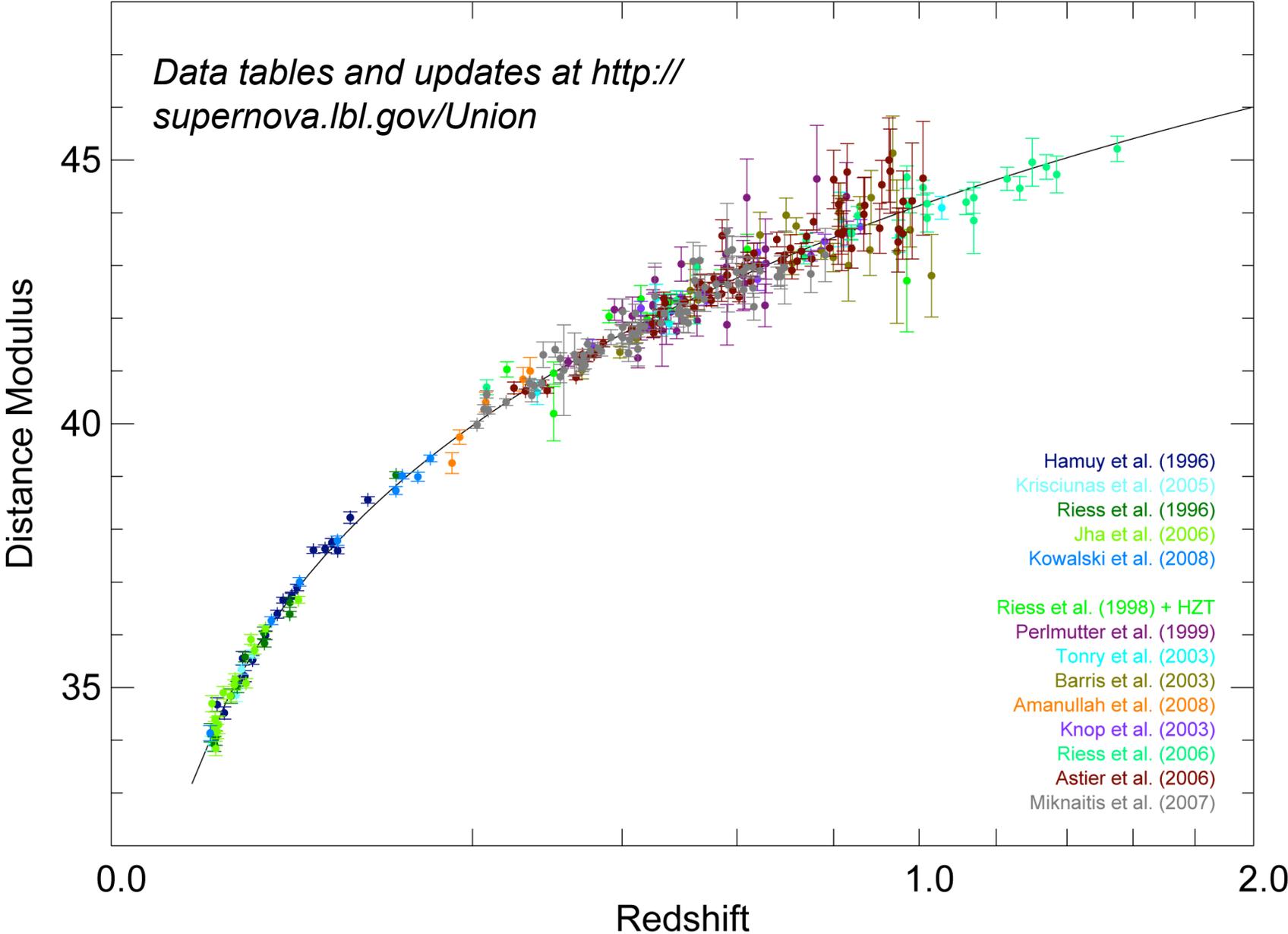
**Host Galaxies of Distant Supernovae**  
*Hubble Space Telescope* ■ *Advanced Camera for Surveys*

50 SNe Ia, 25 at  $z > 1$

Riess, et al

# Supernova Cosmology Project SN Ia Union Compilation

Kowalski et al., ApJ, 2008



## Likelihood Analysis with BAO and CMB Priors

$$-2\ln P_{\text{posterior}} = \sum_i \frac{(\mu_i - \mu_{\text{mod}}(z_i; w, \Omega_m, \Omega_{DE}))^2}{\sigma_{\mu,i}^2} + \chi_{\text{BAO}}^2 + \chi_{\text{CMB}}^2$$

where latter terms incorporate BAO and CMB priors :

BAO (SDSS LRG, Eisenstein etal 05):

$$A(z_1; w, \Omega_m, \Omega_{DE}) = \frac{\sqrt{\Omega_m}}{E(z_1)^{1/3}} \left[ \frac{1}{z_1 \sqrt{|\Omega_k|}} S_k \left( |\Omega_k|^{1/2} \int_0^{z_1} \frac{dz}{E(z)} \right) \right]^{2/3}$$

with

$$\chi_{\text{BAO}}^2 = [(A(z_1; w, \Omega_m, \Omega_{DE}) - 0.469)/0.017]^2 \text{ for } z_1 = 0.35$$

CMB (WMAP5, Komatsu etal 08):

$$R(z_{\text{CMB}}; w, \Omega_m, \Omega_{DE}) = \frac{\sqrt{\Omega_m}}{\sqrt{|\Omega_k|}} \left[ S_k \left( |\Omega_k|^{1/2} \int_0^{z_{\text{CMB}}} \frac{dz}{E(z)} \right) \right]$$

with

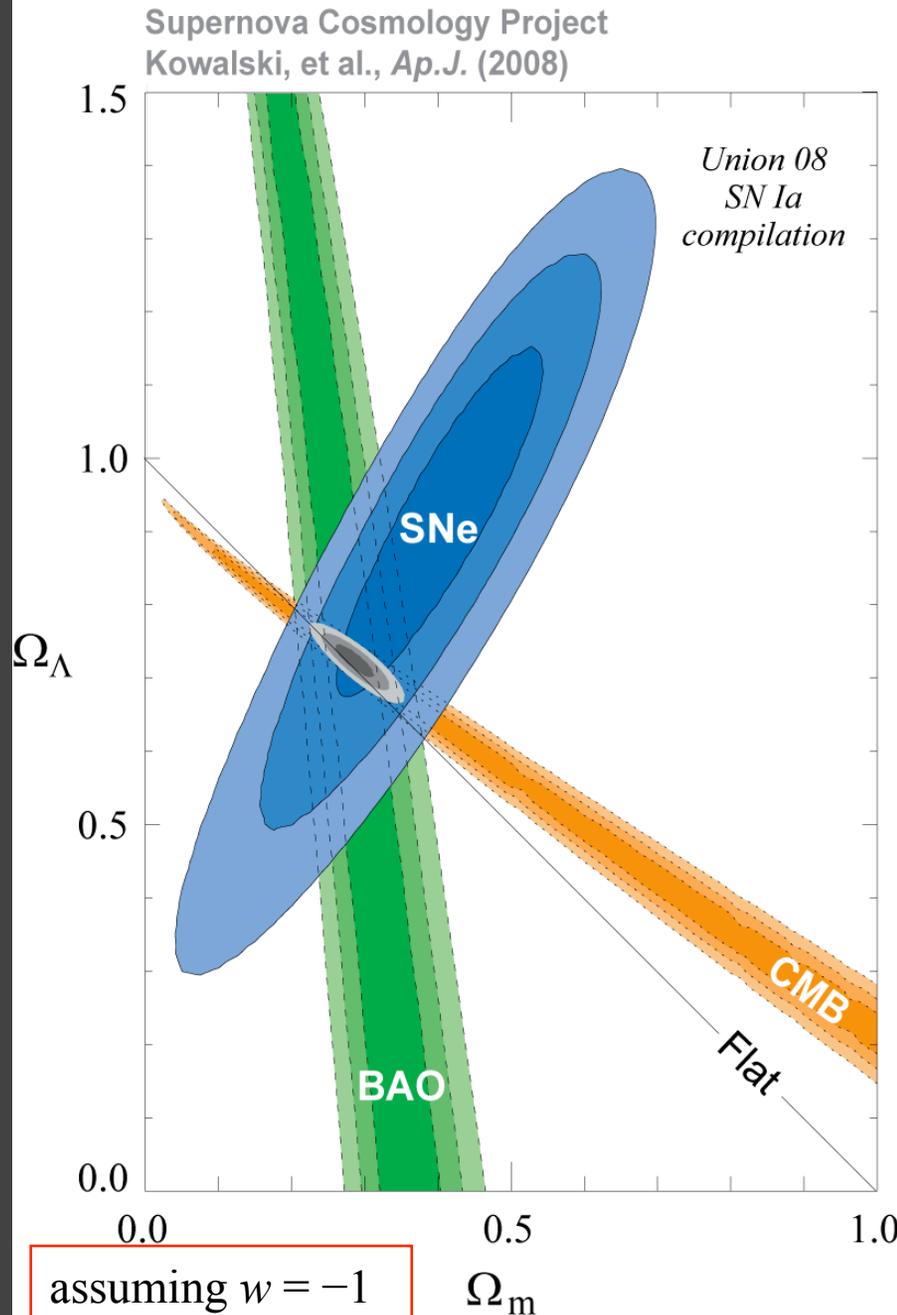
$$\chi_{\text{CMB}}^2 = [(R(z_{\text{CMB}}; w, \Omega_m, \Omega_{DE}) - 1.710)/0.019]^2 \text{ for } z_{\text{CMB}} = 1090$$

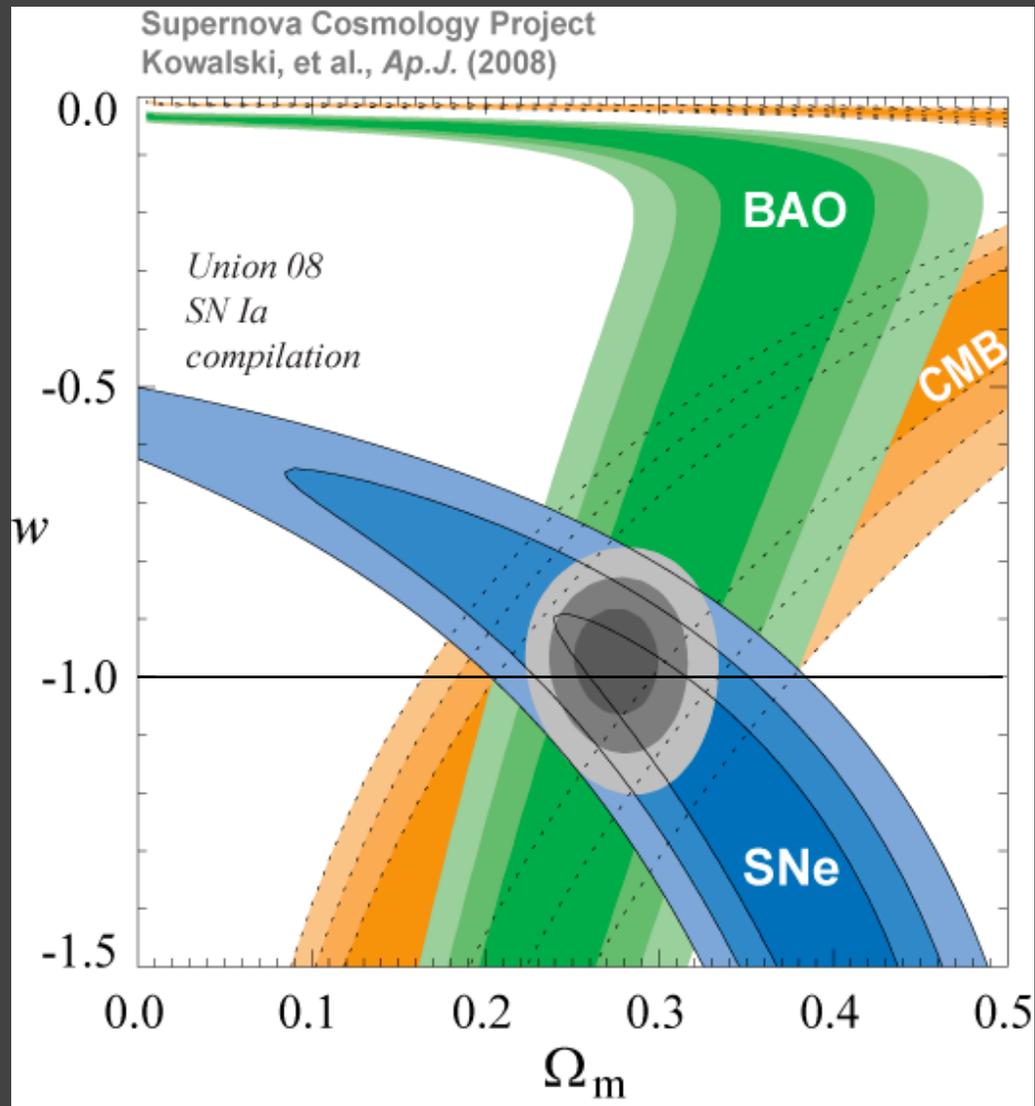
# Recent Dark Energy Constraints

Improved SN constraints

Inclusion of constraints from WMAP Cosmic Microwave Background Anisotropy and SDSS Large-scale Structure (Baryon Acoustic Oscillations)

Only statistical errors shown

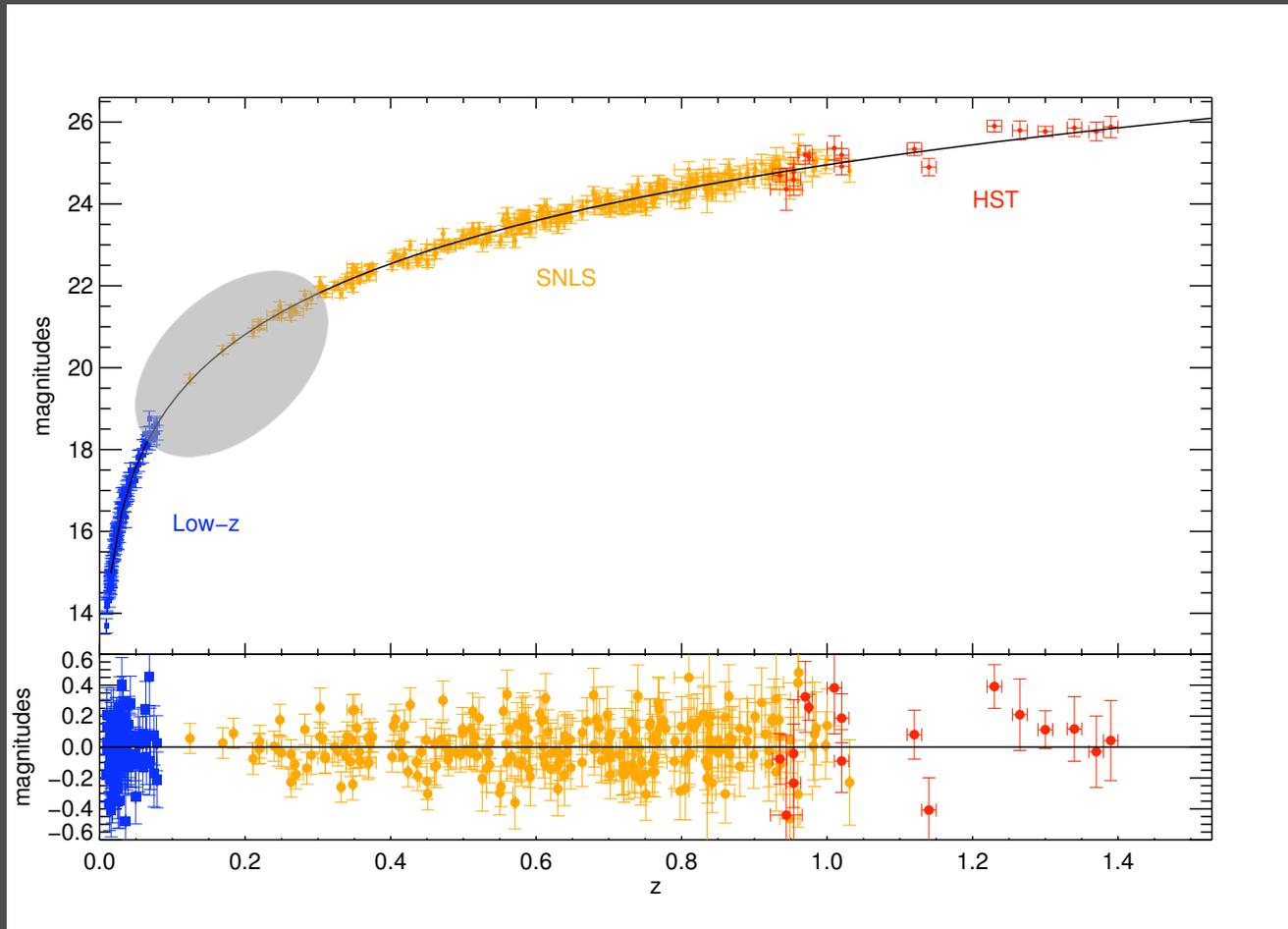




assuming flat Univ.  
and constant  $w$

Only statistical errors shown

# SNLS Preliminary 3<sup>rd</sup> year Hubble Diagram

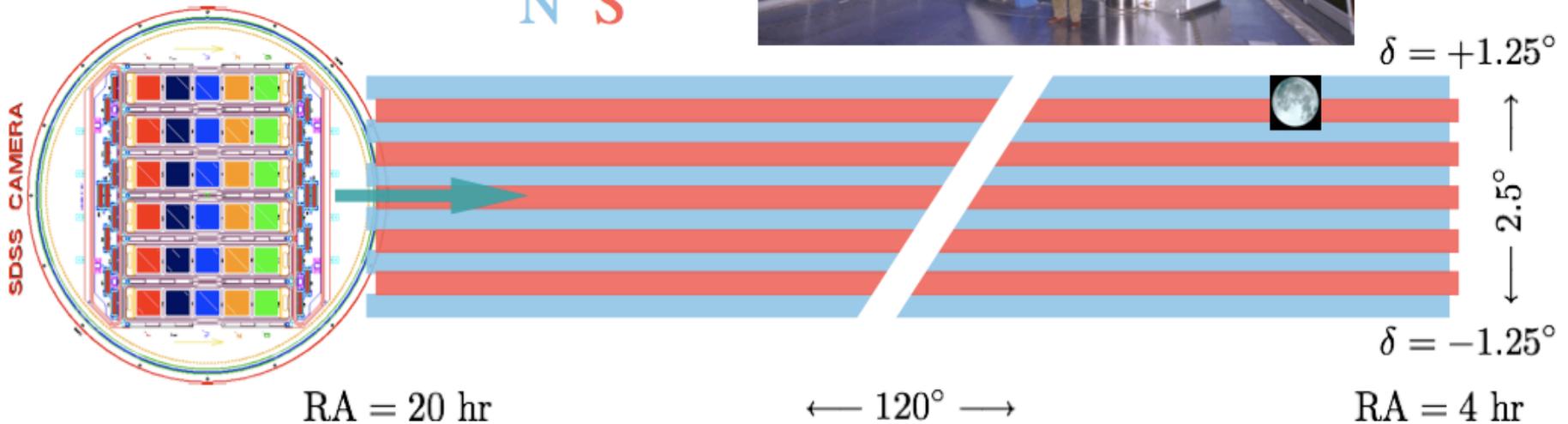
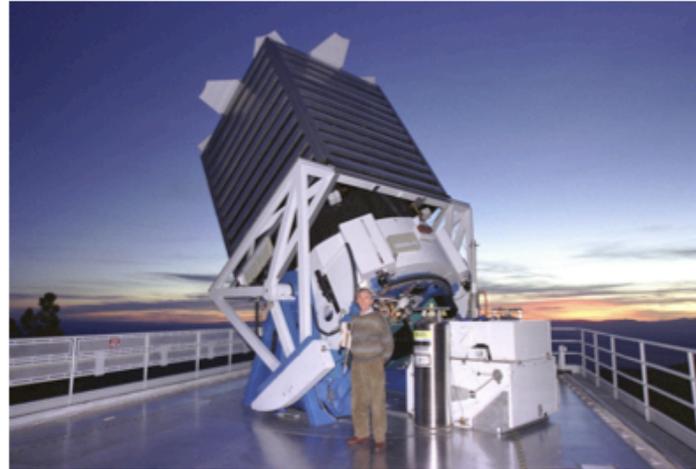


- Conley et al, Guy et al (2010): results with  $\sim 252$  SNLS SNe
- Independent analyses with 2 light-curve fitters: SALT2, SiFTO

# SDSS-II SN Survey

Frieman, et al (2008); Sako, et al (2008)

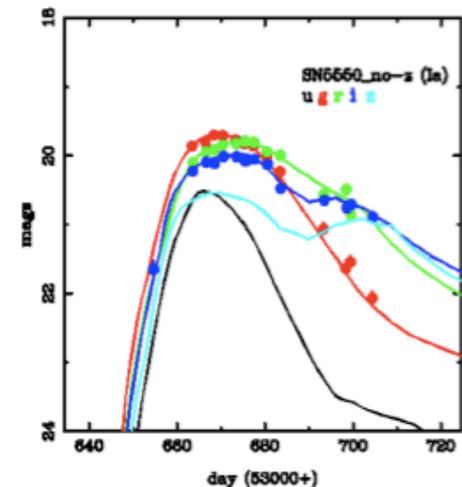
N S



Use the SDSS 2.5m telescope

- September 1 - November 30 of 2005-2007
- Scan 300 square degrees every 2 days
- Obtain densely sampled multi-color light curves
- Results published from 2005 season

Kessler, et al 09; Lampeitl et al 09; Sollerman et al 09



# SDSS II Supernova Survey Goals

- Obtain few hundred *high-quality*\* SNe Ia light curves in the 'redshift desert'  $z \sim 0.05-0.4$  for continuous Hubble diagram
- Probe Dark Energy in  $z$  regime complementary to other surveys
- Well-observed sample to anchor Hubble diagram, train light-curve fitters, and explore systematics of SN Ia distances
- Rolling search: determine SN/SF rates/properties vs.  $z$ , environment
- Rest-frame  $u$ -band templates for  $z > 1$  surveys
- Large survey volume: rare & peculiar SNe, probe outliers of population

\*high-cadence, multi-band, well-calibrated

# SDSS-II SN Survey Team

**Fermilab**  
**U Chicago**  
**APO**

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Watters

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**U Portsmouth**

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**U Penn**

C. D'Andrea, J. Mosher, M. Sako

**Rutgers**

S. Jha

**SAAO**

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**RIT**

M. Richmond

**Penn State**

D. Schneider

**Notre Dame**

P. Garnavich

**STScI**

A. Riess

**Wayne State**

D. Cinabro, Matt Taylor

**SNU**

C. Choi, M. Im

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Hoeflich)

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Sollerman, M. Stritzinger, M. Turatto R. Miquel, M. Molla, L. Galbany

**MDM team**

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**Subaru team**

Y. Ihara

**KPNO team**

M. Florack, A. Hirschauer, D. O'Connor

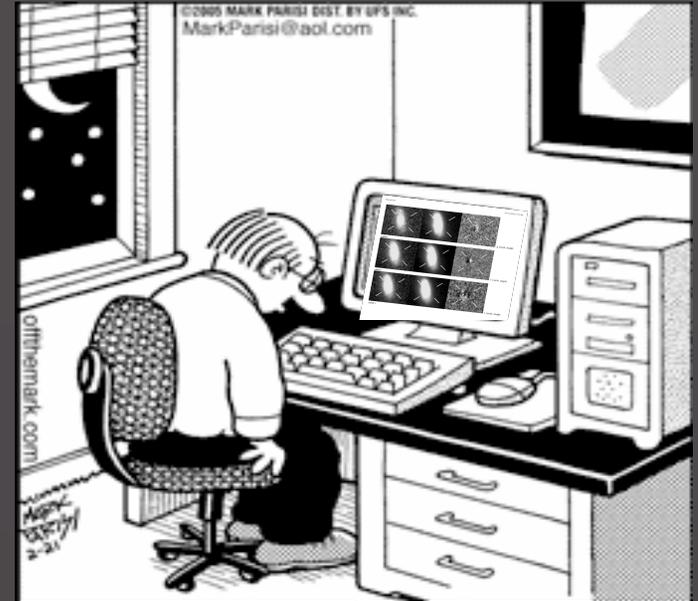
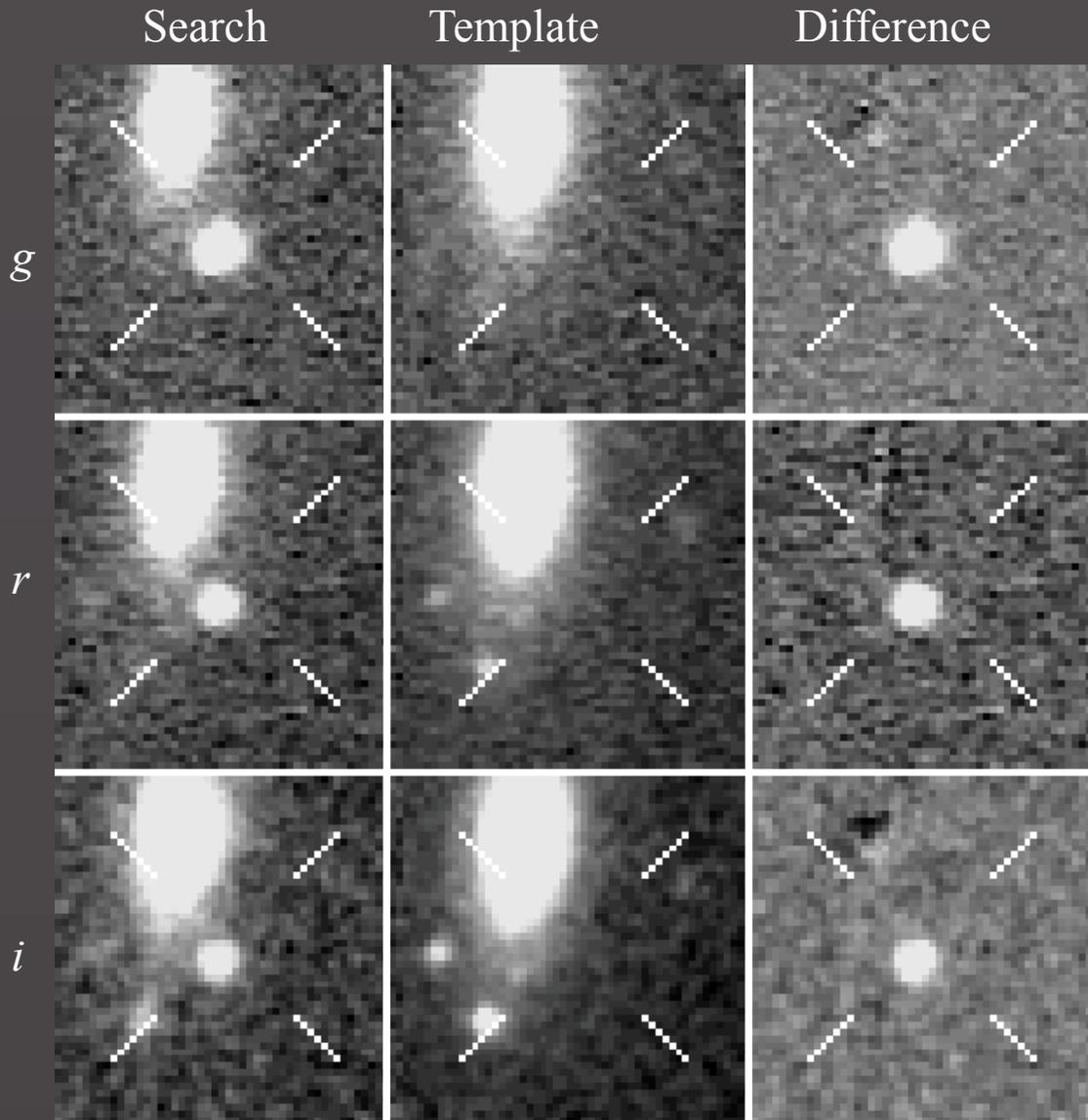
**Keck team**

R. Foley, A. Filippenko

Spectroscopic follow-up telescopes



# Searching For Supernovae



– 193 confirmed Ia

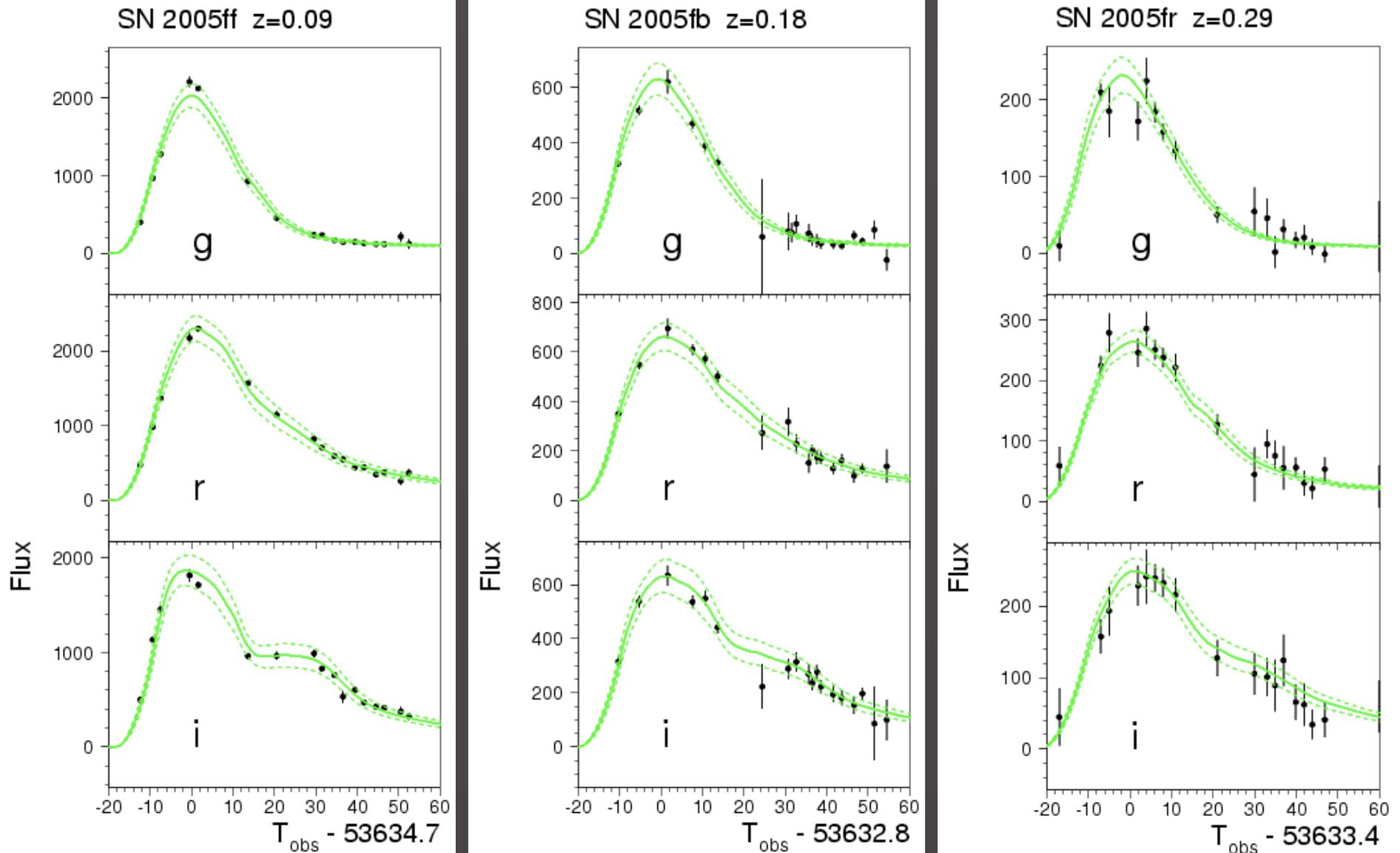
• 2007

– 175 confirmed Ia

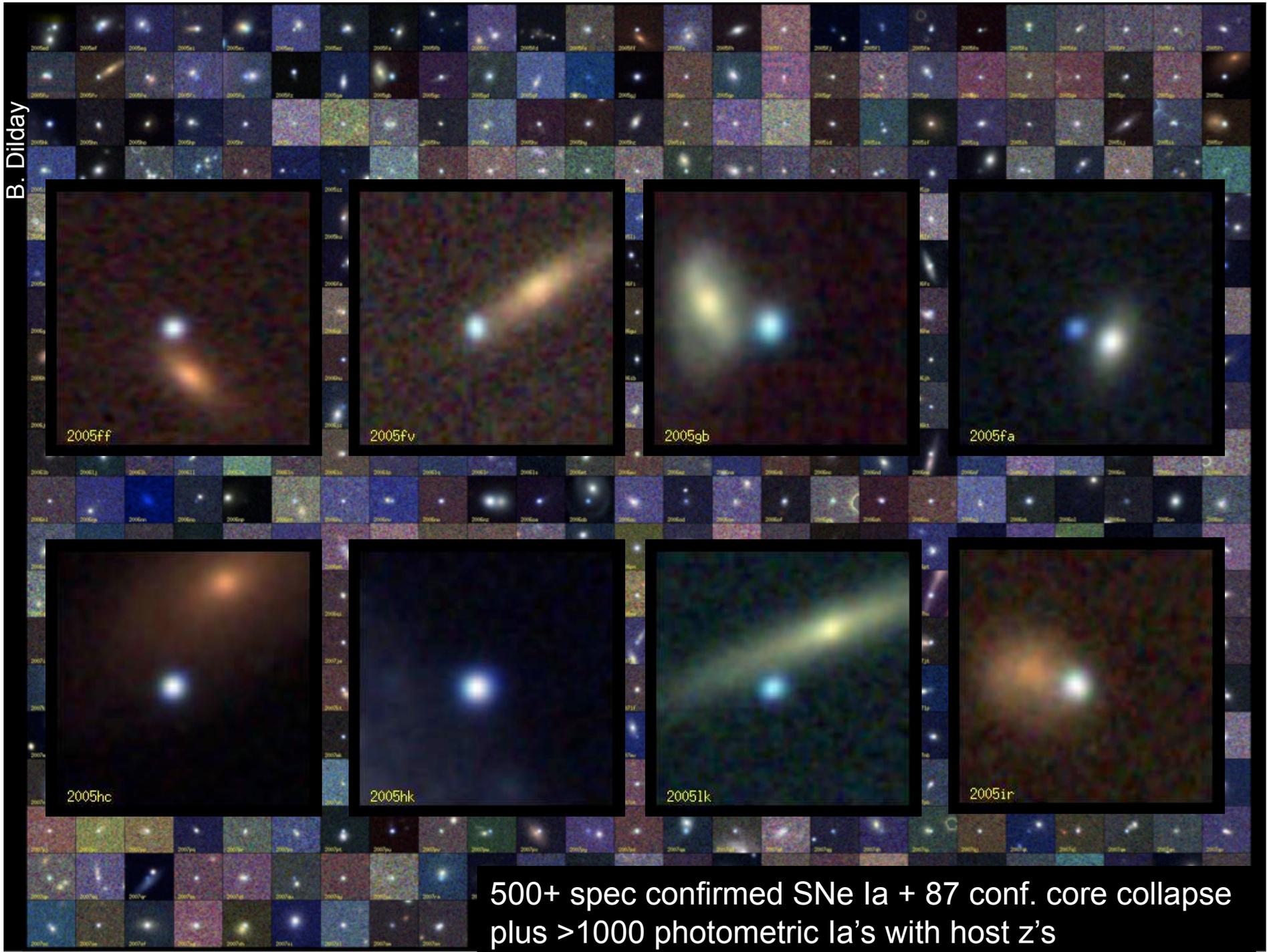
- Positional match to remove movers
- Insert fake SNe to monitor efficiency

# SDSS SN Photometry

Holtzman et al  
(2008)



B. Dilday



500+ spec confirmed SNe Ia + 87 conf. core collapse  
plus >1000 photometric Ia's with host z's

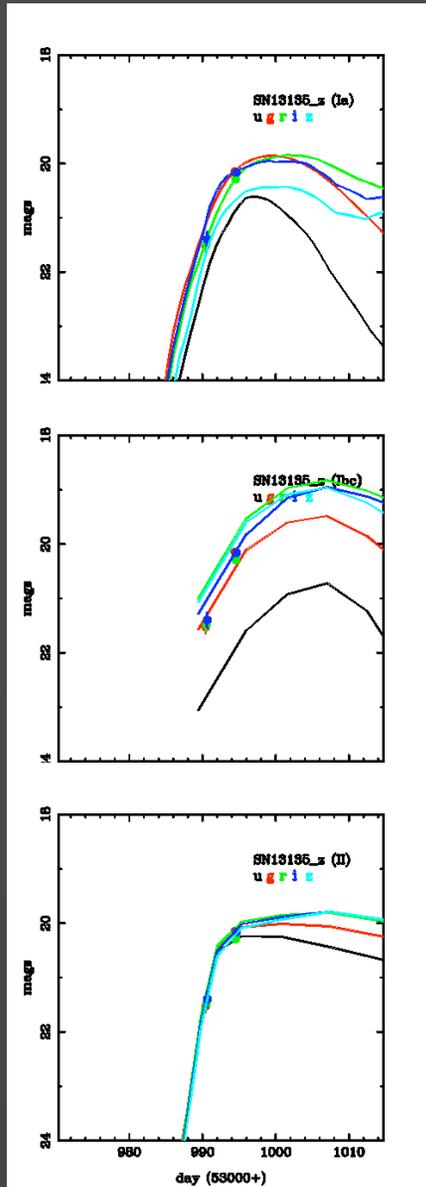
# Spectroscopic Target Selection

2 Epochs

SN Ia Fit

SN Ibc Fit

SN II Fit

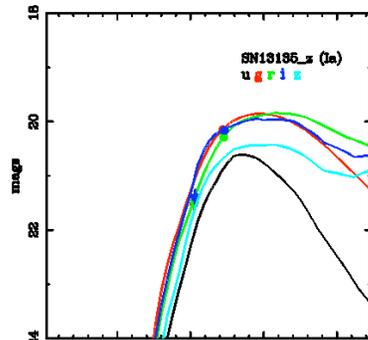


Sako etal 2008

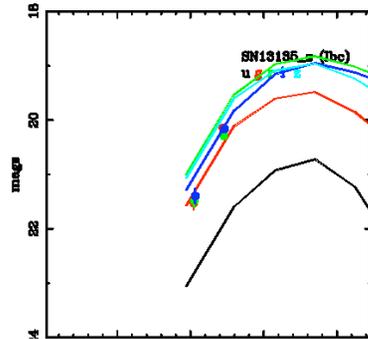
# Spectroscopic Target Selection

2 Epochs

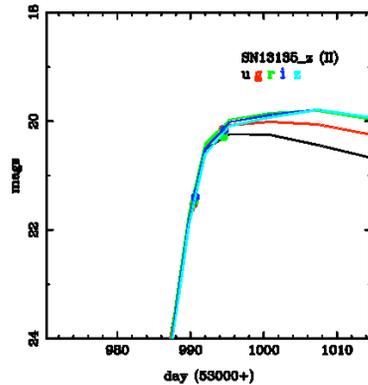
SN Ia Fit



SN Ibc Fit

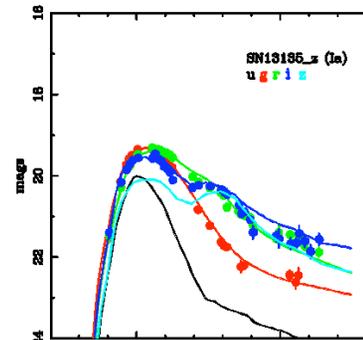


SN II Fit

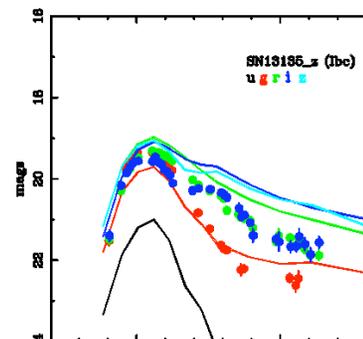


31 Epochs

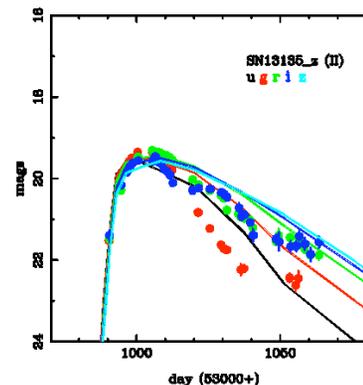
SN Ia Fit



SN Ibc Fit



SN II Fit



Fit with  
template  
library

Classification  
>90%  
accurate after  
2-3 epochs

Redshifts  
5-10%  
accurate

Sako et al 2008

# SN and Host Spectroscopy



MDM 2.4m

NOT 2.6m

APO 3.5m

NTT 3.6m

KPNO 4m

WHT 4.2m

Subaru 8.2m

HET 9.2m

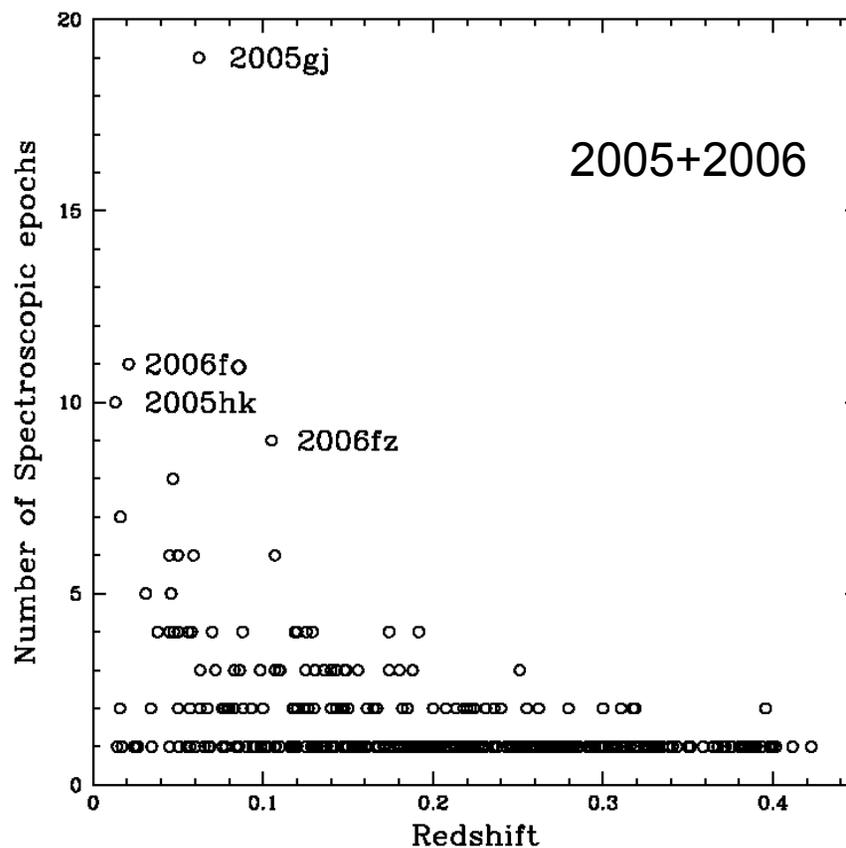
Keck 10m

Magellan 6.5m

TNG 3.5m

SALT 10m SDSS 2.5m

Determine  
SN Type  
and  
Redshift



# Fitting SN Ia Light Curves

- Multi-color Light Curve Shape (MLCS2k2)

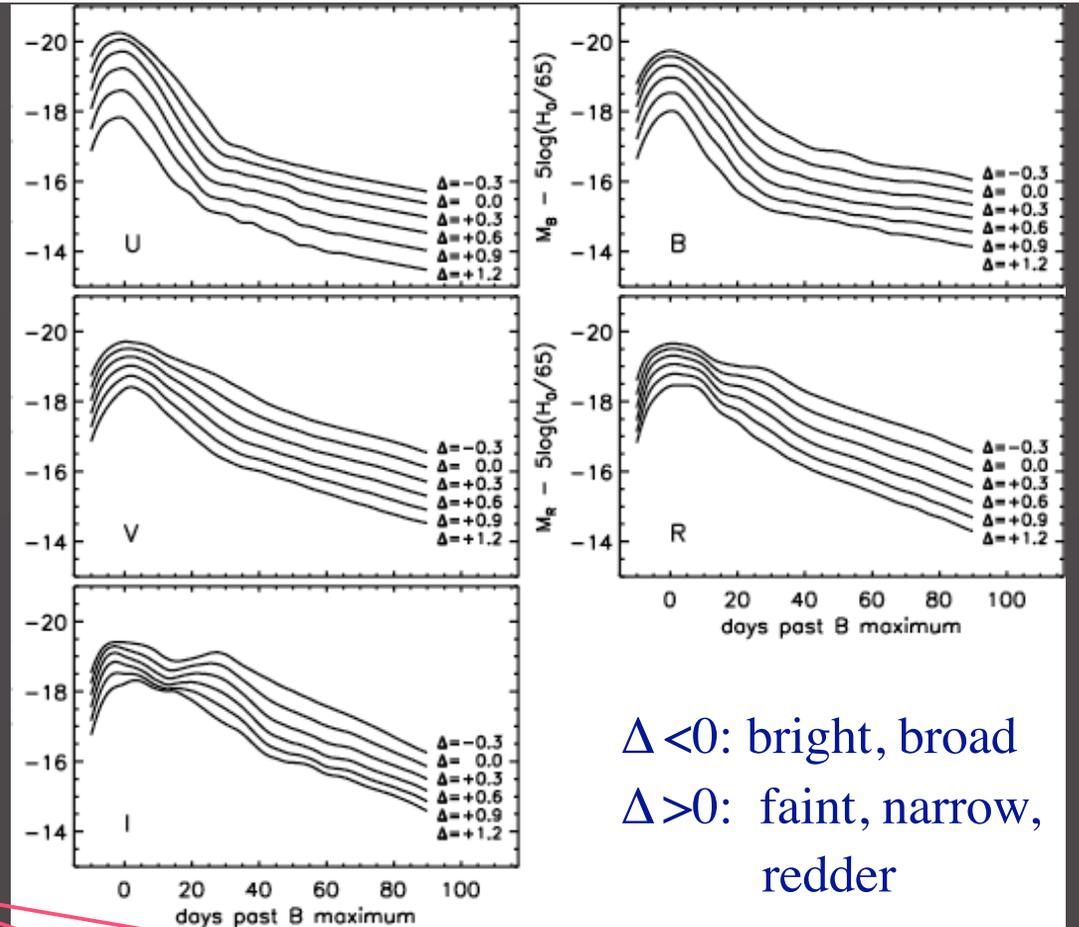
Riess, etal 96, 98; Jha, etal 2007

- SALT-II

Guy, etal 05,08

# MLCS2k2 Light-curve Templates

in rest-frame  $j=UBVRI$ ;  
built from  $\sim 100$   
well-observed, nearby SNe Ia



$\Delta < 0$ : bright, broad  
 $\Delta > 0$ : faint, narrow,  
redder

time-dependent model “vectors”  
trained on Low-z SNe

observed passband  $\rightarrow$

$$m_{\text{mod}}^i(t - t_0) = \mu + M^j(t - t_0) + P^j(t - t_0)\Delta + Q^j(t - t_0)\Delta^2 + K^{ij}(t - t_0) + X_{\text{host}}^j(t - t_0) + X_{\text{MW}}^i(t - t_0)$$

fit parameters

Time of maximum

distance modulus

host gal extinction

stretch/decline rate

# Host Galaxy Dust Extinction

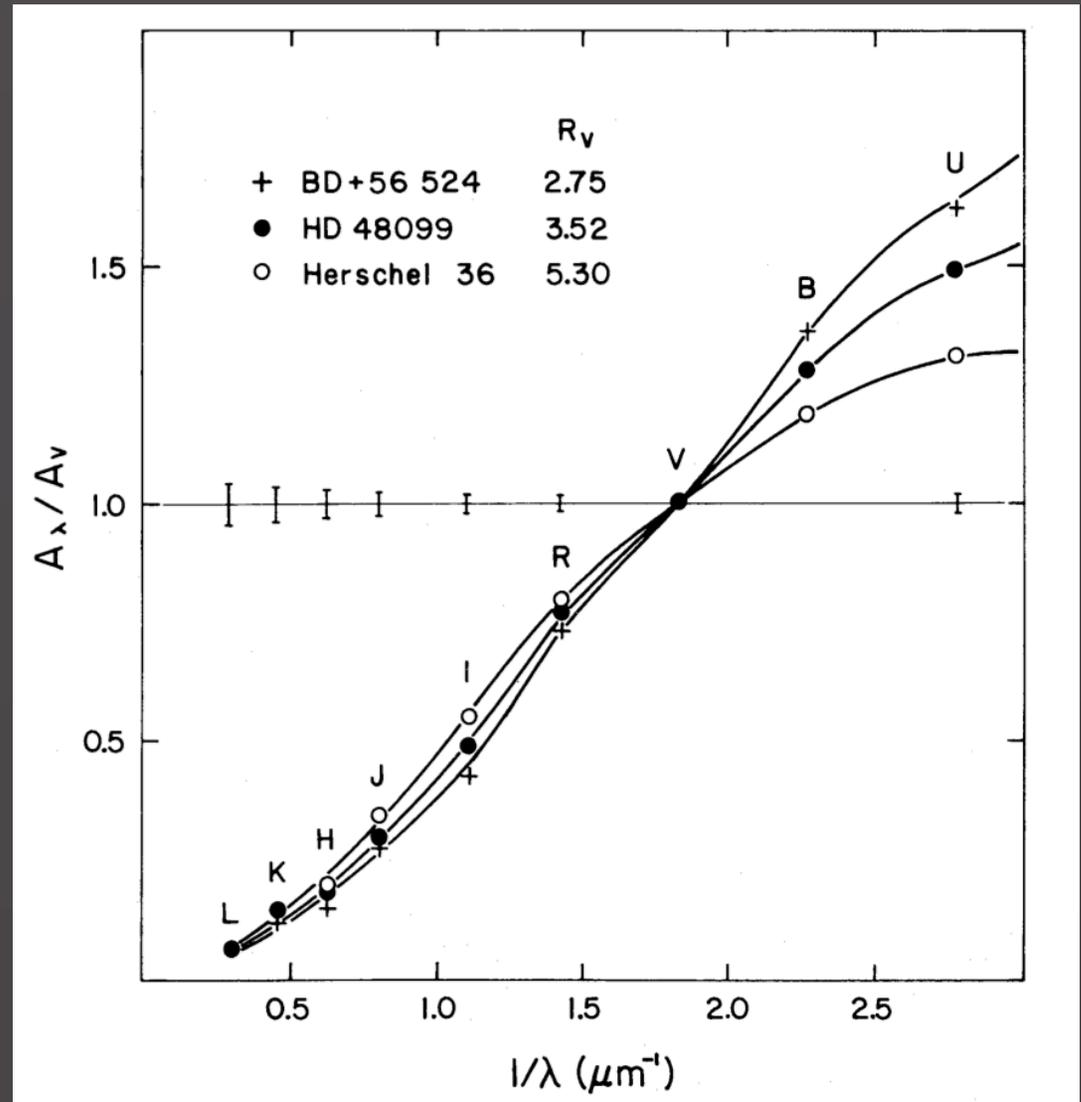
- Extinction:

$$A_\lambda = -2.5 \log \left( \frac{f_{obs}(\lambda)}{f_{true}(\lambda)} \right)$$

- Empirical Model for wavelength dependence:

$$\frac{A_\lambda}{A_V} = a(\lambda) + \frac{b(\lambda)}{R_V}$$

- MLCS:  $A_V$  is a fit parameter, but  $R_V$  is usually fixed to a global value (sharp prior) since it's usually not well determined SN by SN

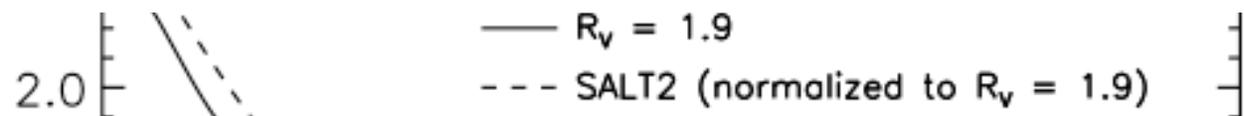
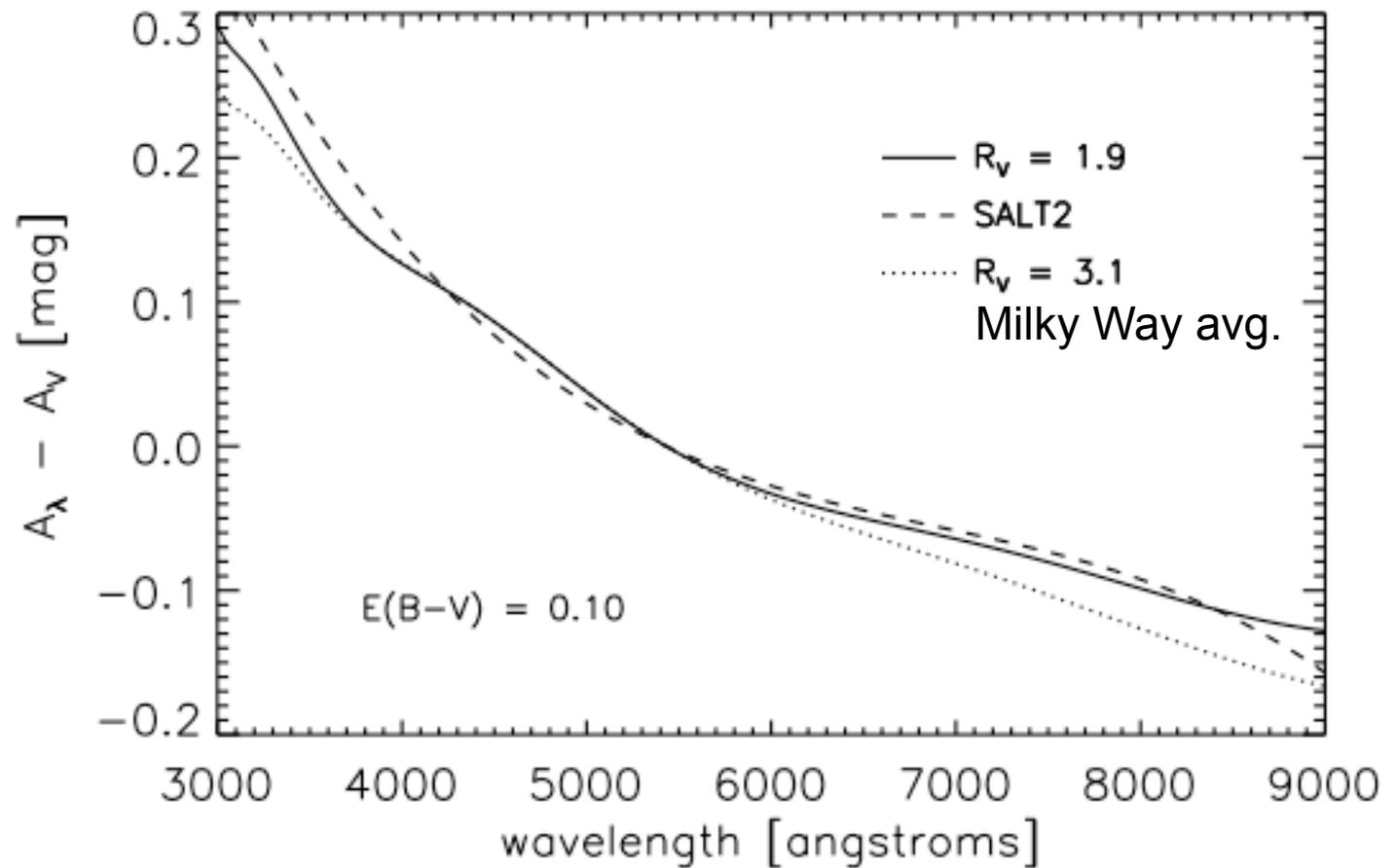


# Host Galaxy Dust Extinction

Historically,  
MLCS used  
Milky Way  
average of  
 $R_V=3.1$

Growing  
evidence that  
this doesn't  
represent SN  
host galaxy  
population  
well

Jha

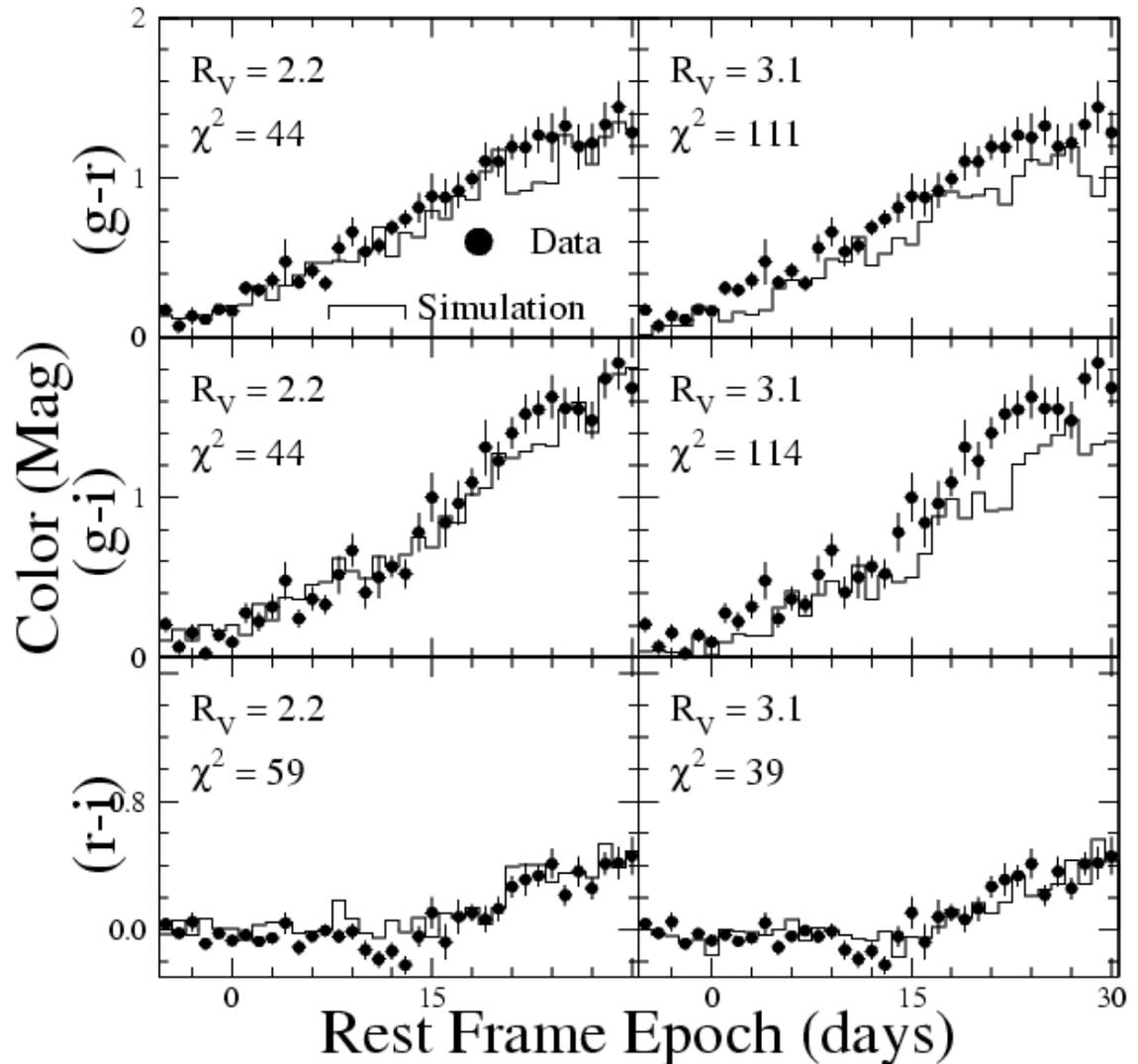


# Extract $R_V$ by matching colors of SDSS SNe to MLCS simulations

$$\langle R_V \rangle = \frac{A_V}{E(B-V)} \approx 2$$

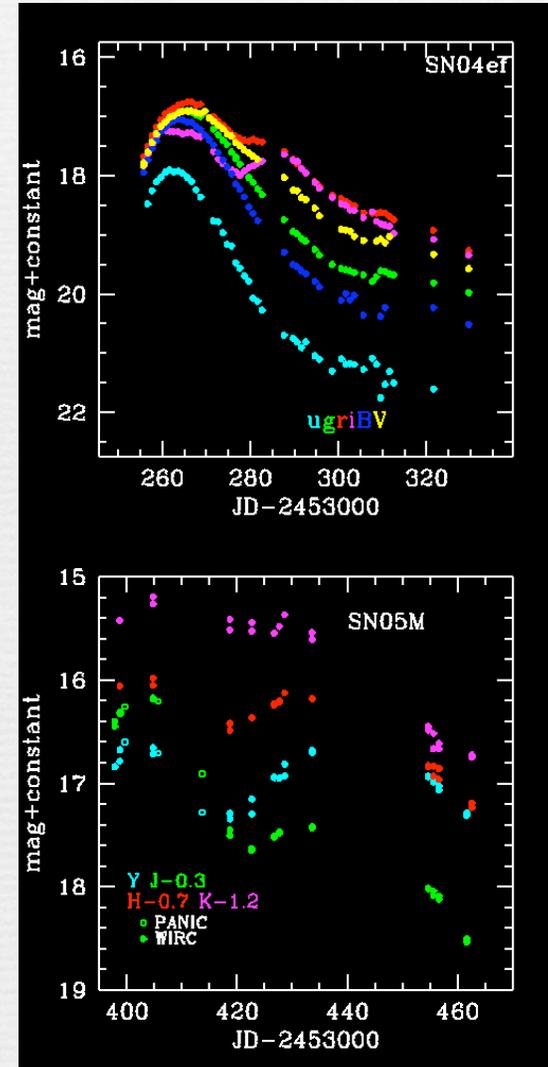
- Use nearly complete (spectroscopic + photometric) sample
- MLCS previously used Milky Way avg  $R_V=3.1$
- Lower  $R_V$  more consistent with SALT color law and other recent SN  $R_V$  estimates

D. Cinabro

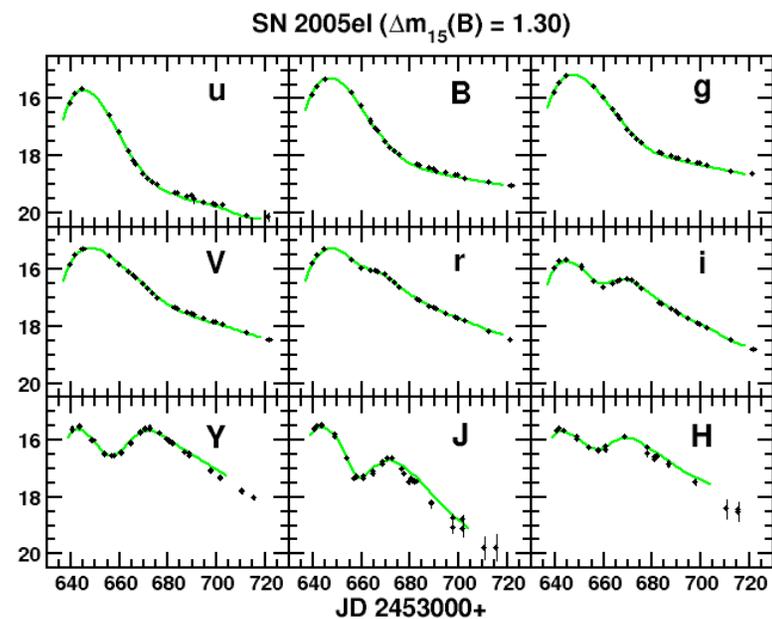
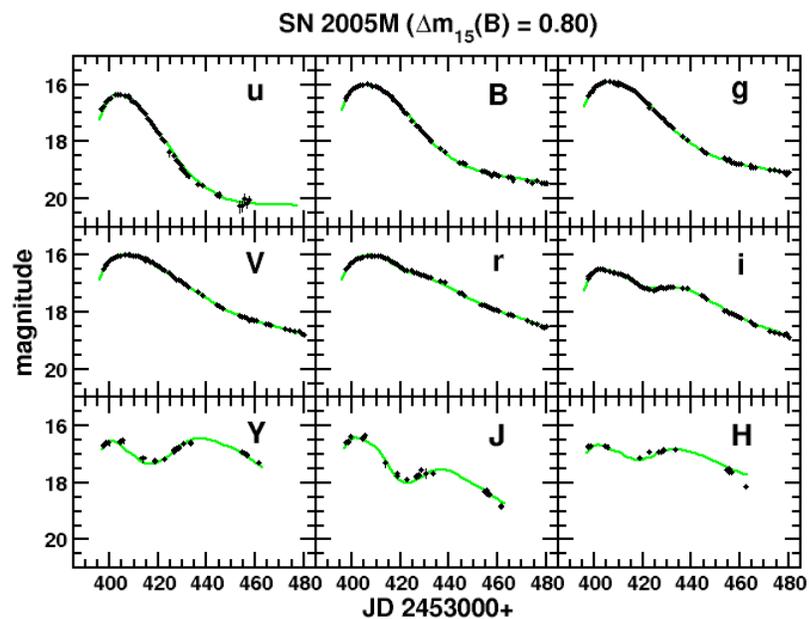


# Carnegie Supernova Project: Low-z

- CSP is a follow-up project
- Goal: optical/NIR light-curves and spectro-photometry for
  - > 100 nearby SNIa
  - > 100 SNIIf
  - > 20 SNIbc
- Filter set: BV + u'g'r'i' + YJHK
- Understand SN physics
- Use as standard candles.
- Calibrate distant SN Ia sample



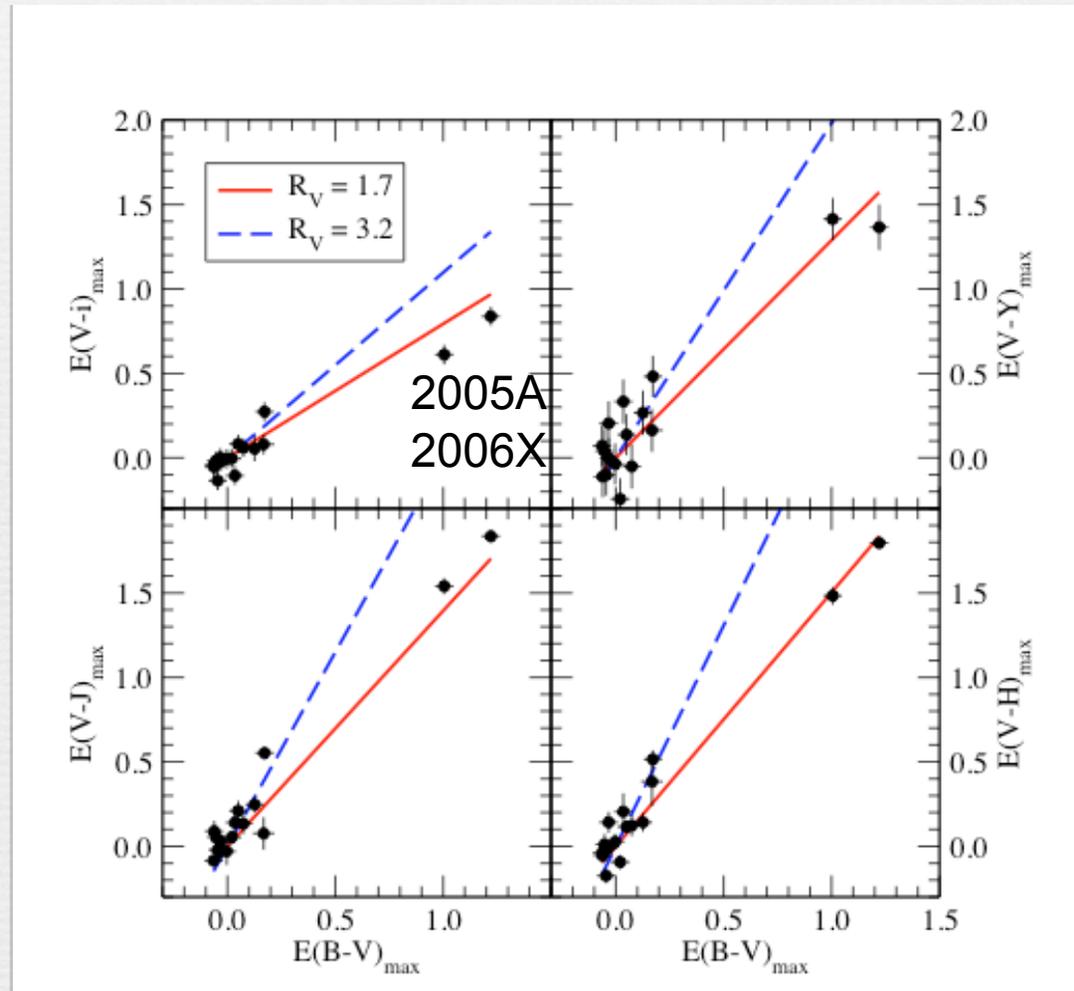
# CSP Low-z Light Curves



Folatelli, et al. 2009

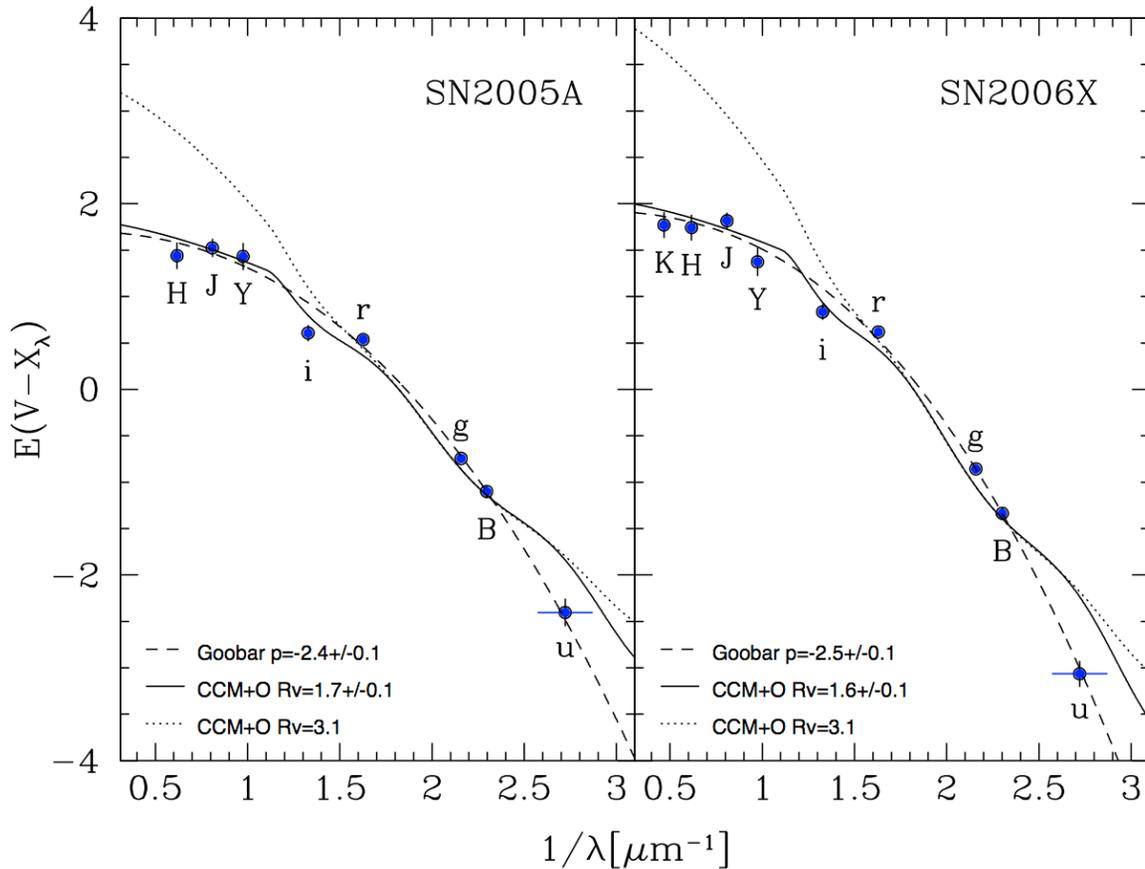
Contreras, et al. 2009: 35 optical light curves (25 with NIR)

# Varying Reddening Law?



Folatelli et al. (2009)

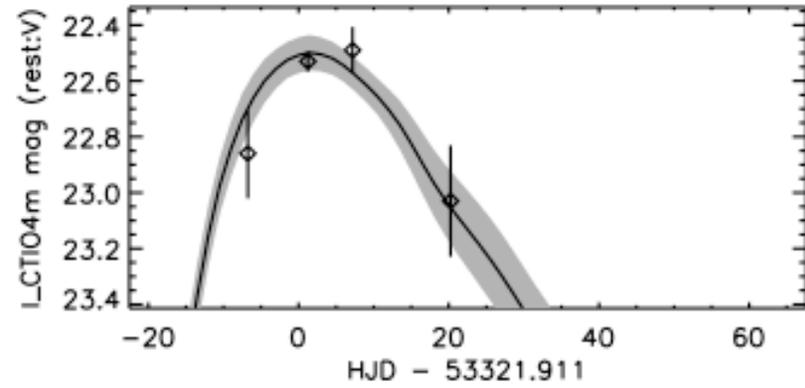
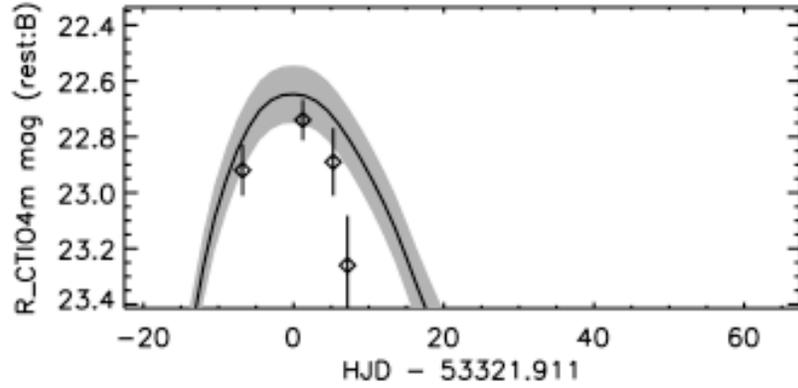
# Local Dust?



Two Highly Reddened SNe

Goobar (2008):  
higher density of  
dust grains in a  
shell surrounding  
the SN: multiple  
scattering  
steepens  
effective dust law  
(also Wang)

Folatelli et al. (2009)

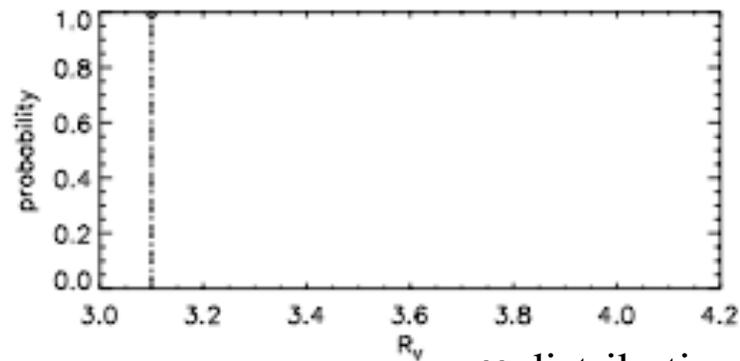
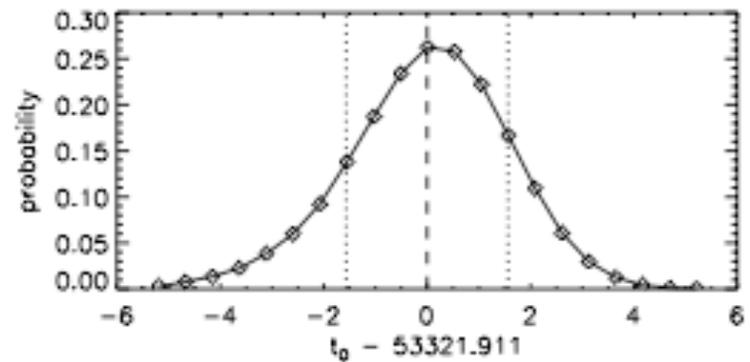
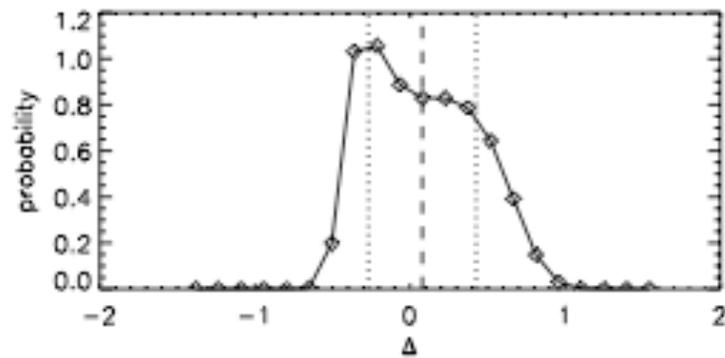
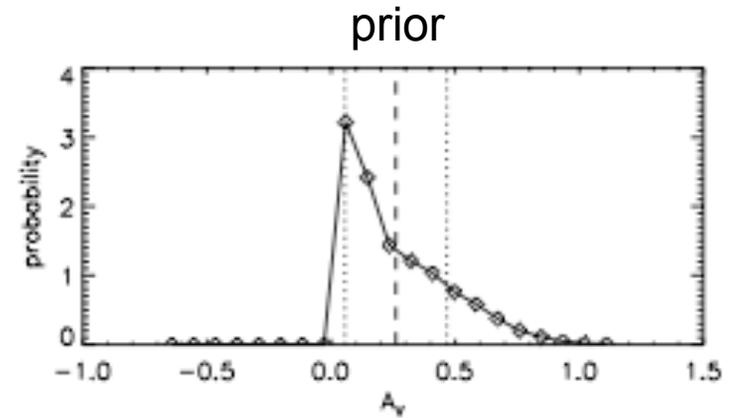
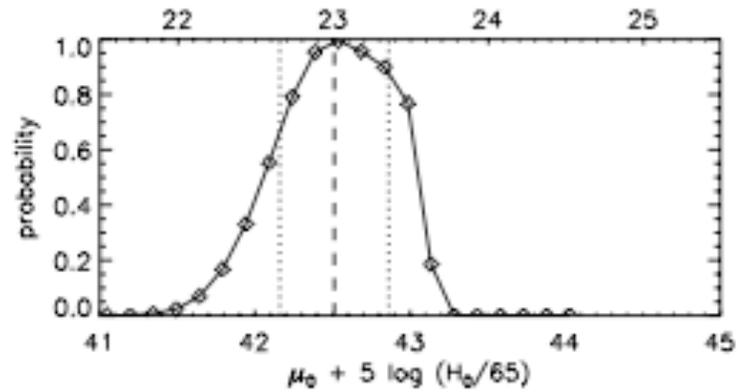


MLCS fit to one of the  
ESSENCE SNe

h283.v025.nn2

$$\begin{aligned}
 t_0 &= 53321.911 & R_V &= 3.10 \\
 \Delta &= 0.08 & A_V &= 0.26 \\
 \mu_0 + 5 \log (H_0/65) &= 42.51 \\
 E(B-V)_{\text{MW}} &= 0.03 & z &= 0.5020 \\
 \chi^2/\nu &= 5.54/4
 \end{aligned}$$

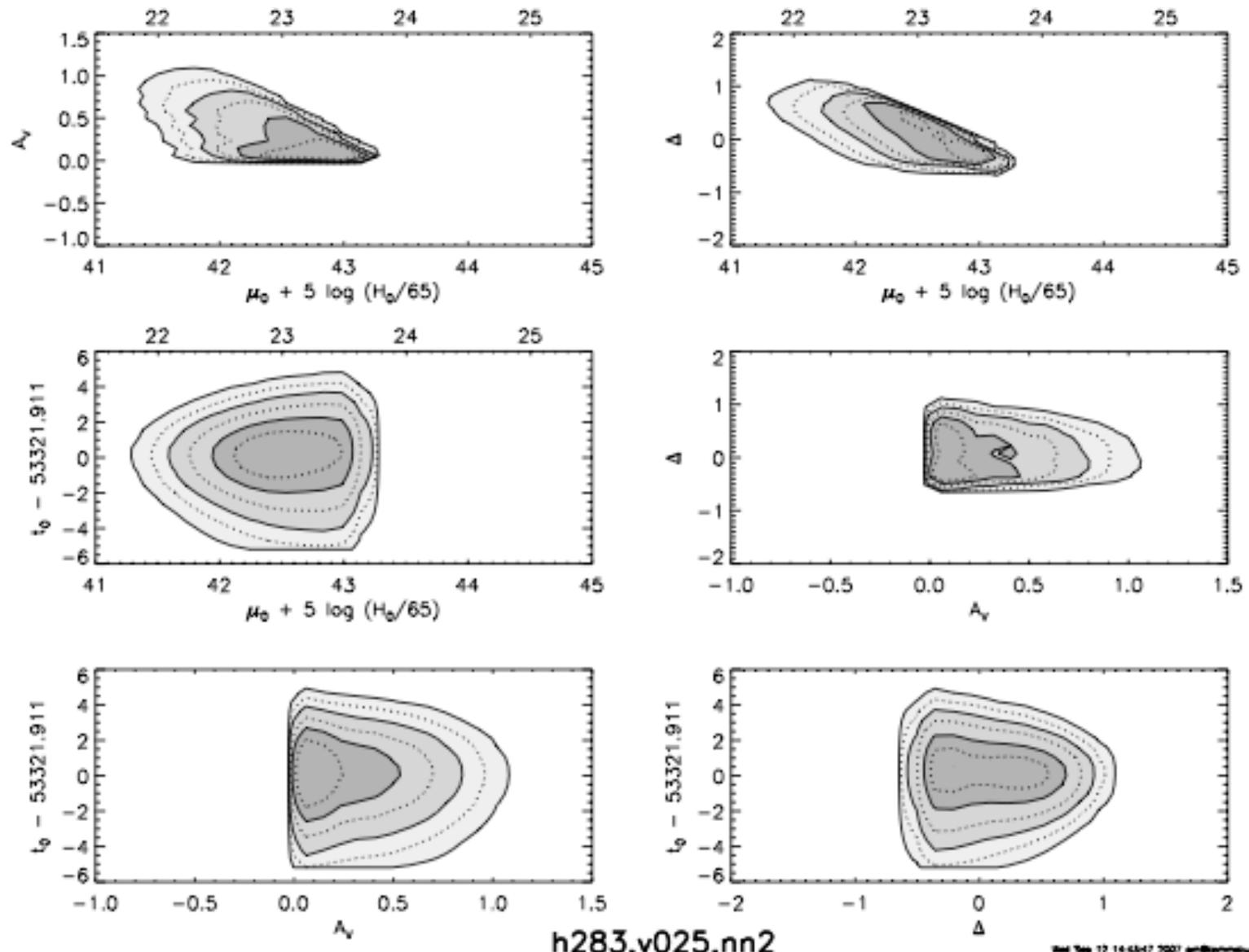
# Marginalized PDFs



h283.v025.nn2

$$\begin{aligned} \mu_0 + 5 \log(H_0/65) &= 42.51 \pm 0.35 \\ m_v^0 &= 23.01 \pm 0.35 \\ \Delta &= 0.08 \pm 0.35 \\ A_v &= 0.26 \pm 0.21 \\ R_v &= 3.10 \pm 0.00 \\ t_0 &= 53321.91 \pm 1.56 \quad (-0.01 \pm 1.04) \end{aligned}$$

$\mu$  distribution approximated by Gaussian for cosmology fit



h283.v025.nn2

Red Sea 12 14 4347 2007 gnd@stonybrook

MLCS Likelihood Contours for this object

# SALT-II Light-curve Fits

- Fit each light curve using rest-frame *spectral* surfaces:

$$\frac{dF_{\text{rest}}}{d\lambda}(t, \lambda) = x_0 \times [M_0(t, \lambda) + x_1 \times M_1(t, \lambda)] \times \exp[c \times CL(\lambda)]$$

light-curve shape
color term

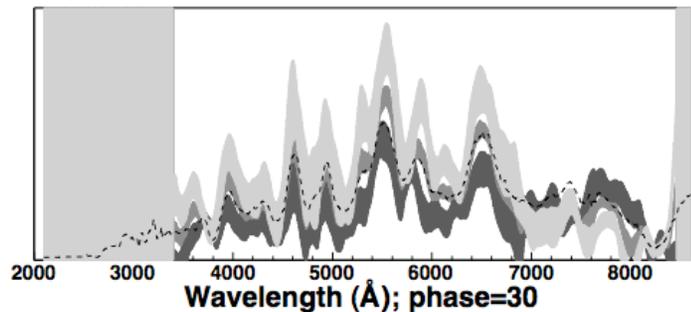
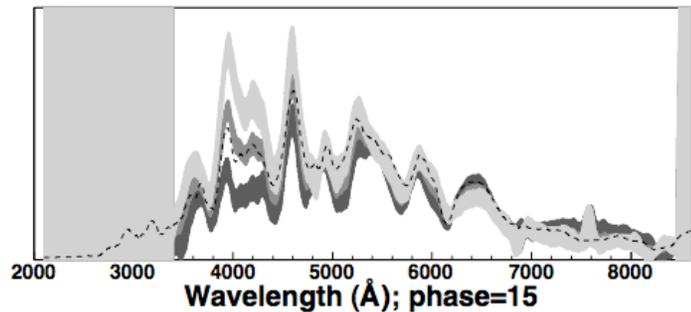
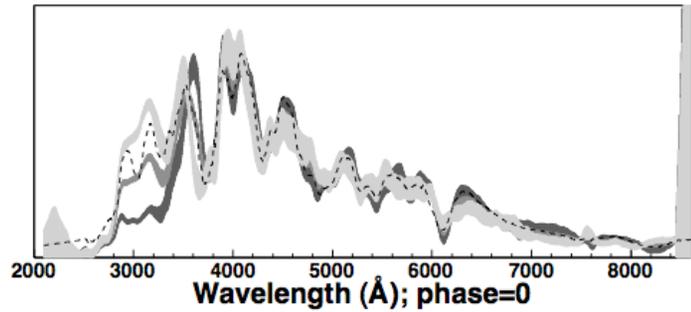
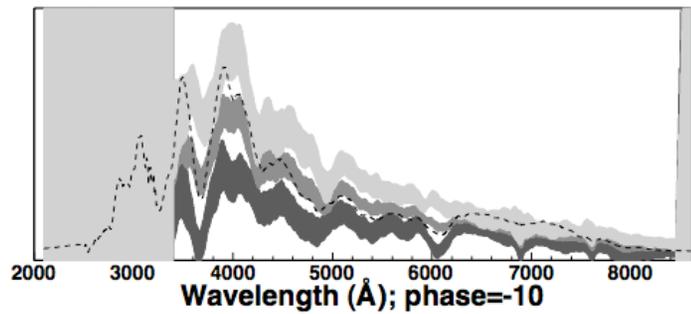
- Light curves fit individually, but distances only estimated globally:

$$\mu_i = m_{B_i}^* - M + \alpha \cdot x_{1,i} - \beta \cdot c_i$$

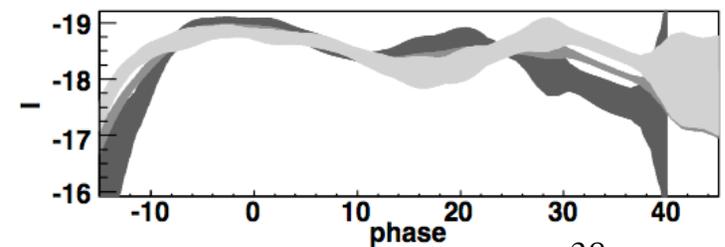
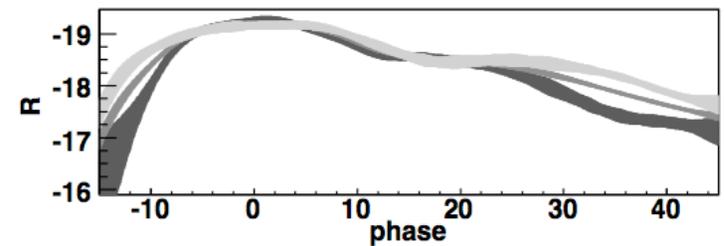
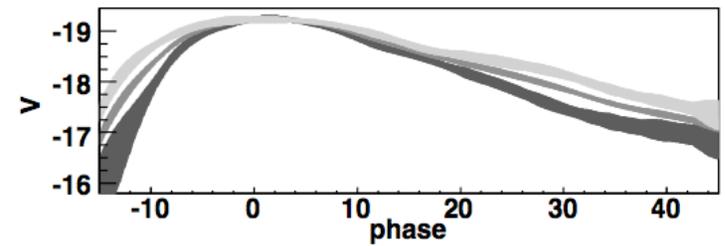
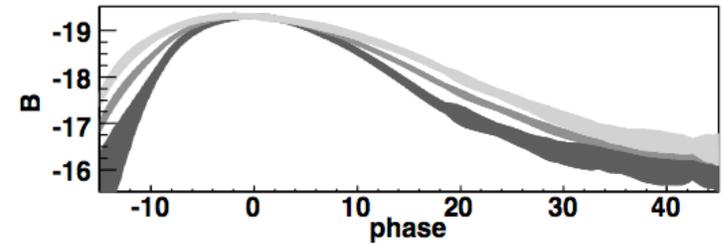
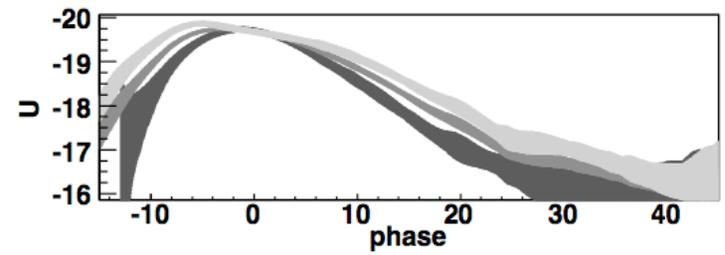
$$\alpha \sim 0.15, \beta \sim 2.5$$

Global fit parameters, determined *along with* cosmological parameters by fit to Hubble diagram (so in principle you should not use SALT distance tables to test some other cosmological model)

- **Differences from MLCS:** not trained just on low-redshift data; flat priors on model parameters; color variations *not* assumed only from dust. *If* dust, then  $\beta = R_V + 1$ . Find  $\beta \sim 2.5$  empirically.

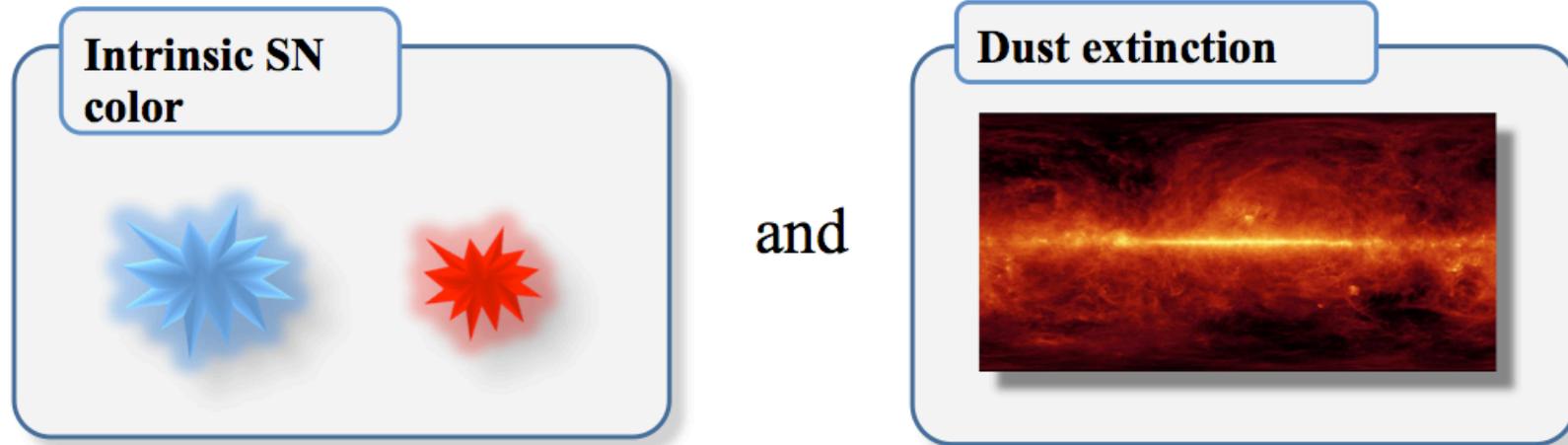


SALT-II  
templates  
for  
 $x_1 = -2, 0, 2$



# Color correction: technique matters

Redder SNe are fainter because of:



Extinction correction methods:

## MLCS: Separate effects of intrinsic color and dust

- Must assume intrinsic SN color distribution with stretch, phase
- Use color to get extinction from assumed dust extinction law

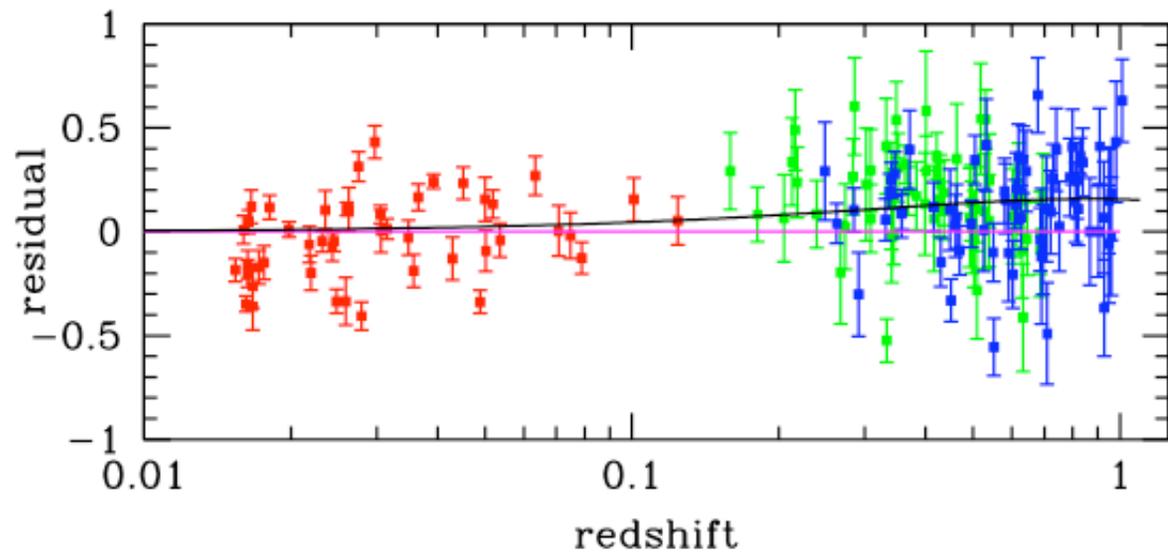
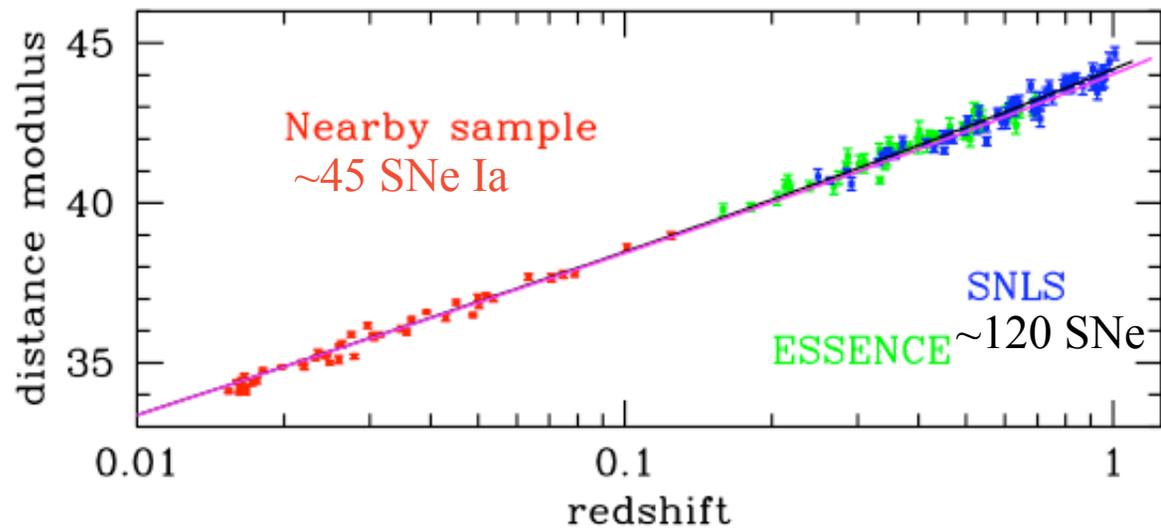
## SNLS: Empirical correction

$$\mu_B = m_B - M_B + \alpha(s-1) - \beta c$$

$$\beta \sim R_B = A_B / E(B-V)$$

4.1 if MW dust

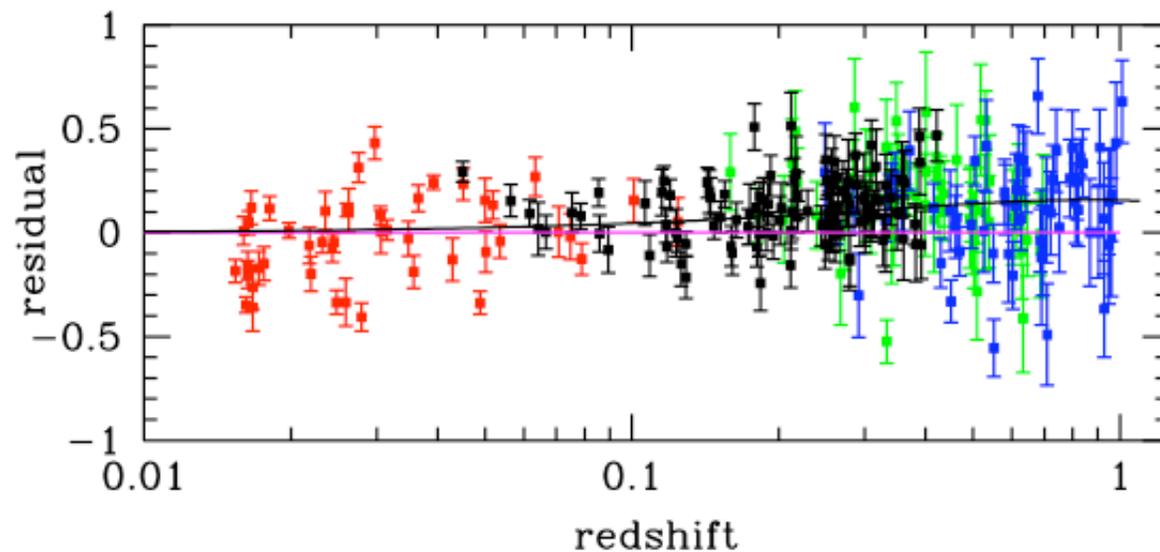
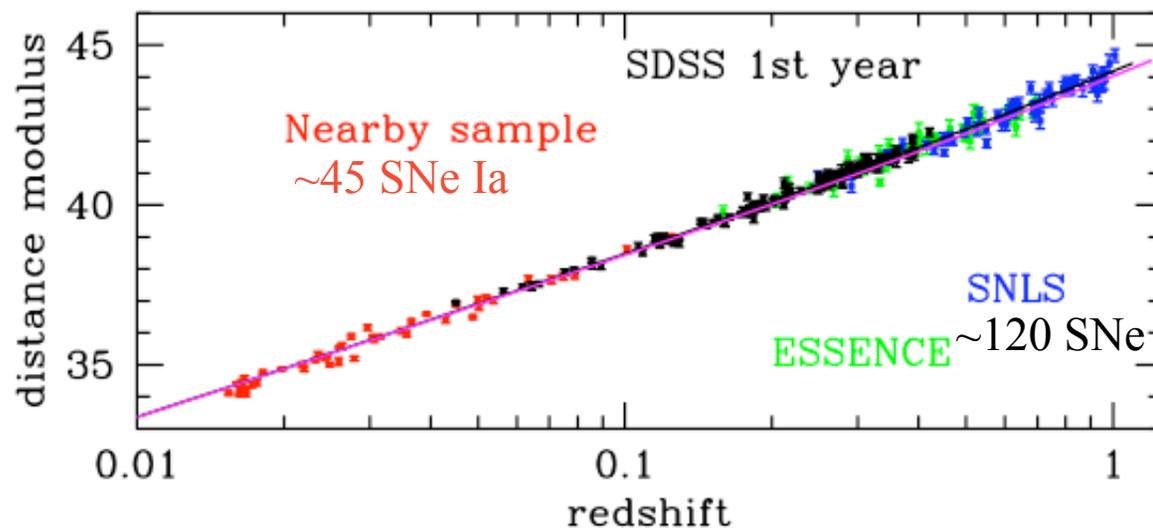
# Hubble Diagram



# Hubble Diagram with SDSS SNe

103 SNe Ia from first  
season that pass  
stringent light-curve  
quality cuts

Kessler et al (2009)  
Lampeitl et al (2009)  
Sollerman et al (2009)



SAUCS

SDSS only:

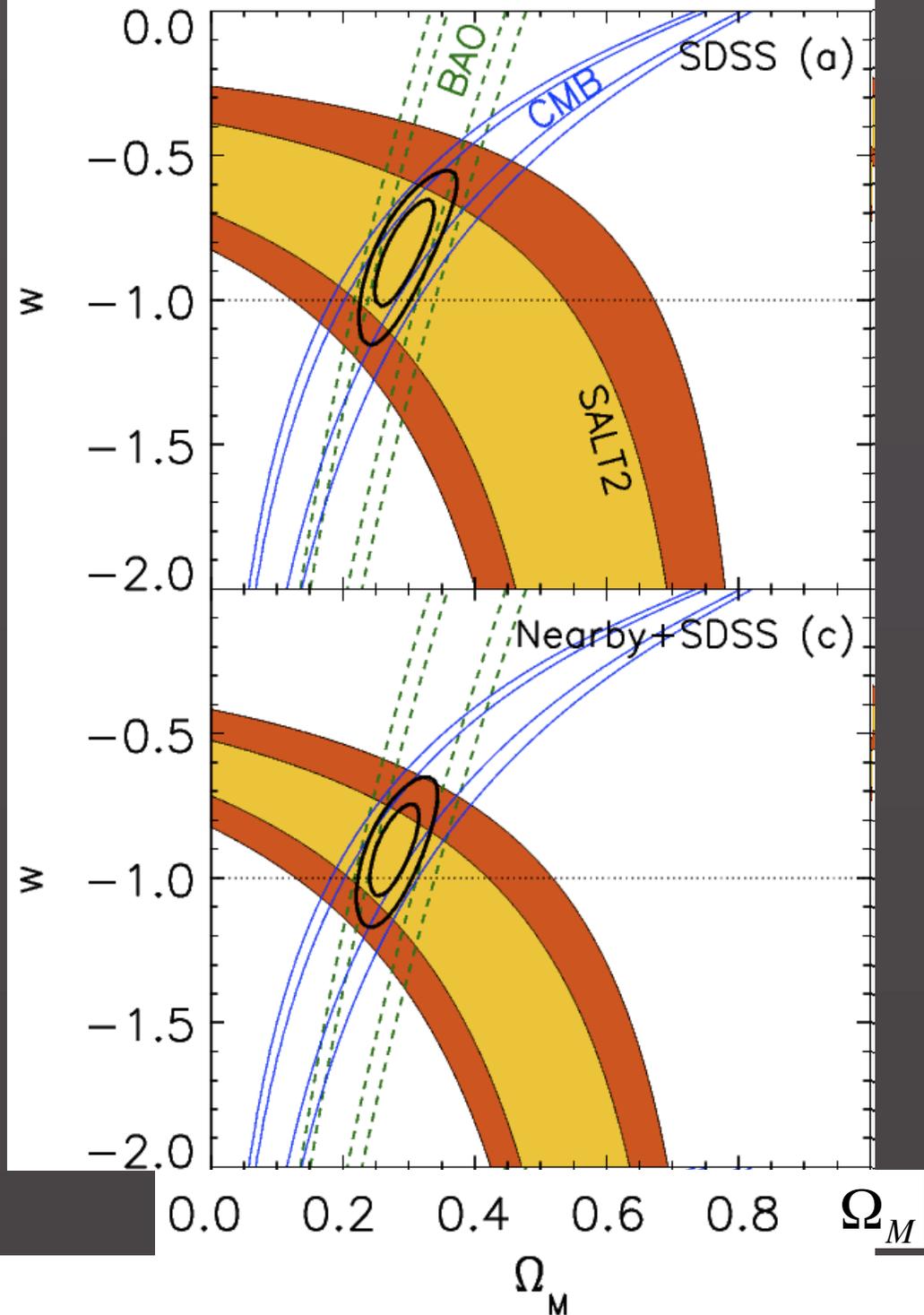
Nearby+SDSS:

MLCS

$$w = -0.93 \pm 0.13(\text{stat})_{-0.32}^{+0.10}(\text{syst})$$

SALT

$$w = -0.92 \pm 0.11(\text{stat})_{-0.15}^{+0.07}(\text{syst})$$



SAUCS

Nearby+SDSS:

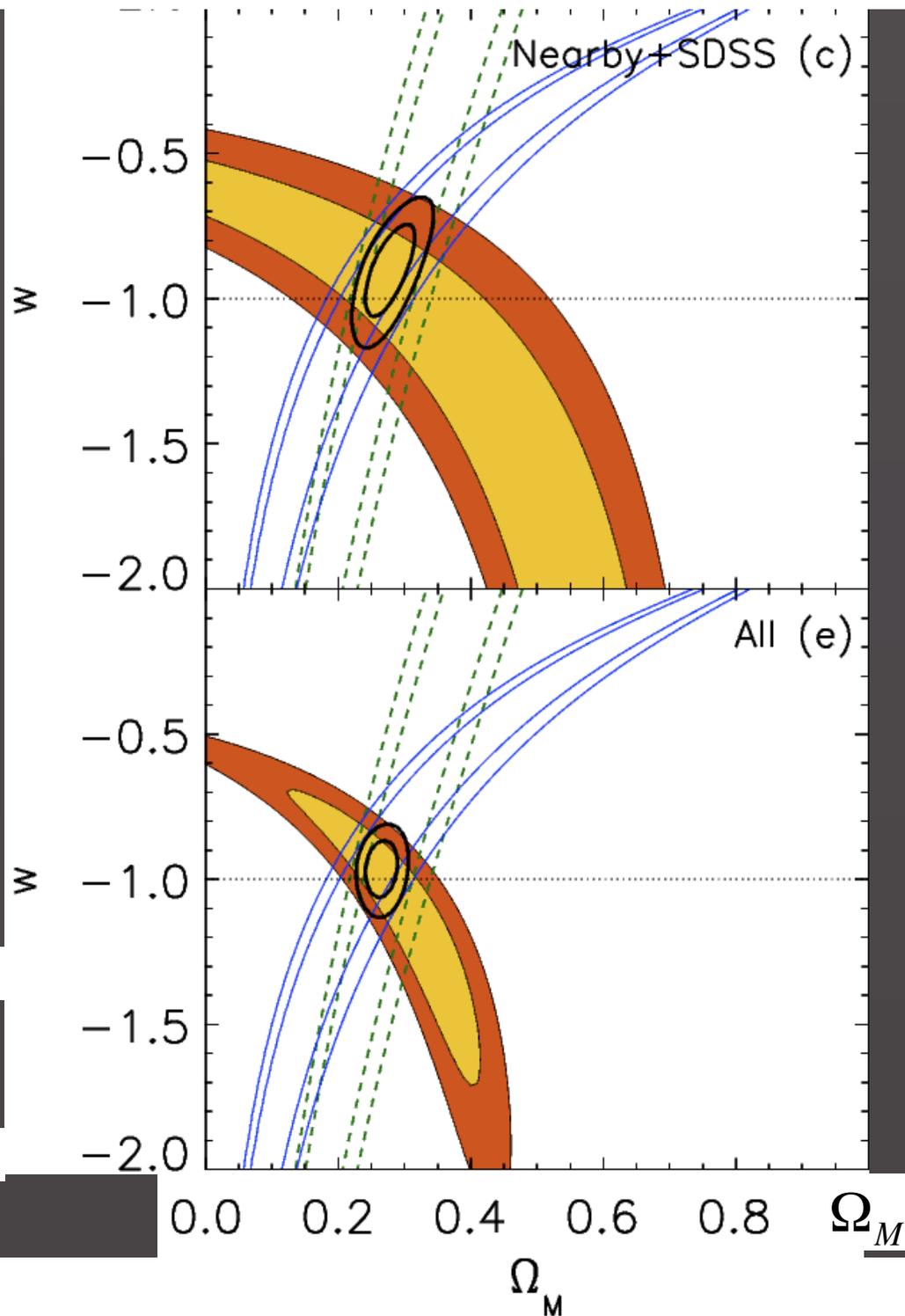
Nearby+SDSS+SNLS  
+ESSENCE+HST:

MLCS

$$w = -0.76 \pm 0.07(\text{stat}) \pm 0.12(\text{syst})$$

SALT

$$w = -0.96 \pm 0.06(\text{stat}) \pm 0.12(\text{syst})$$

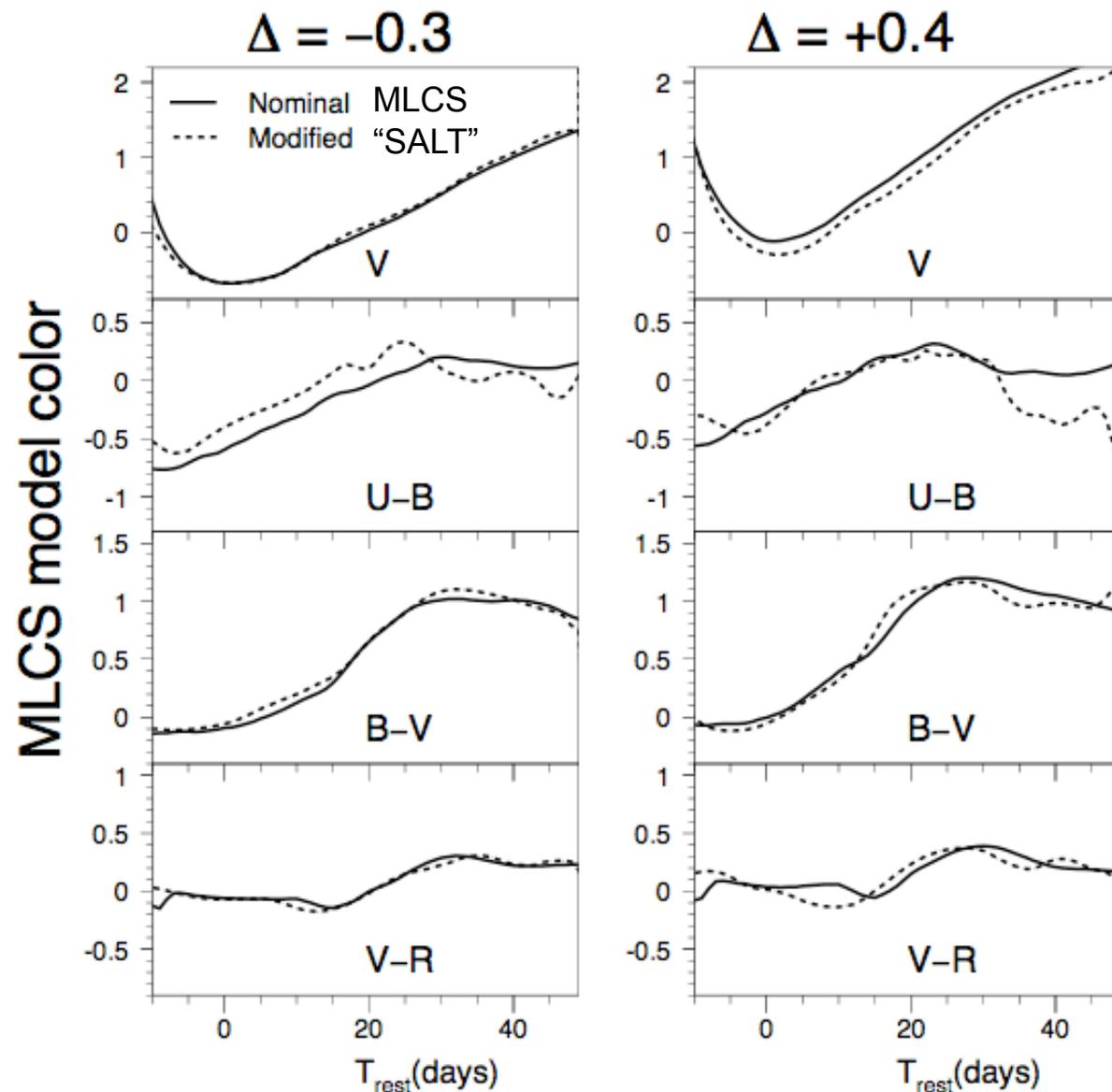


# SALT vs MLCS template light curves

## Diagnosis:

Large difference  
in Light-curve  
model in U-band

Use of prior on  
extinction in  
MLCS



# A Tale of Two Fitters

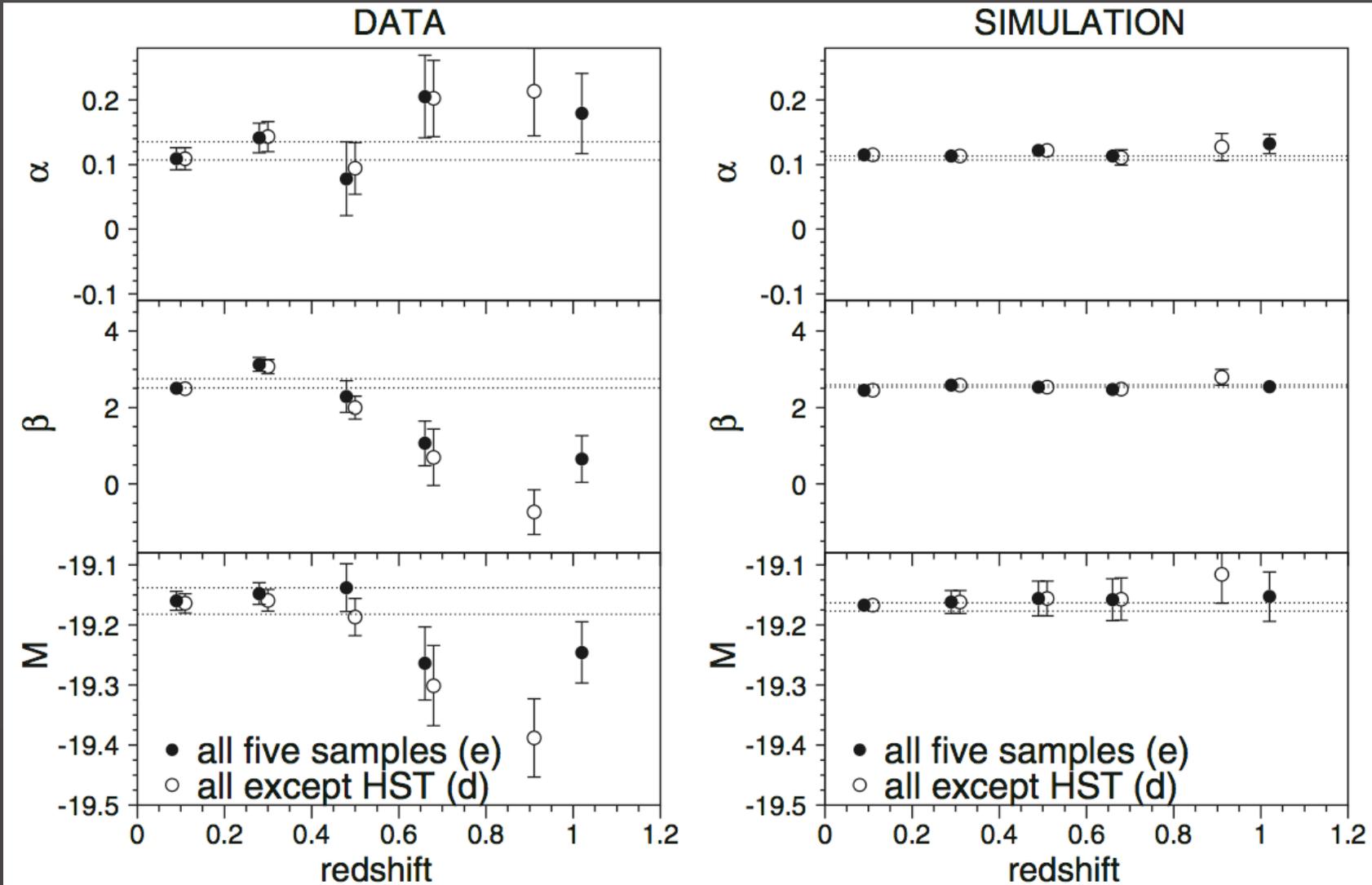
## MLCS:

- U-band model trained only on low-redshift (observer-frame) U-band data (calibration, atmospheric variations)
- Assumes *all* excess color due to dust extinction (some of it must be); dust prior dominates at high-redshift

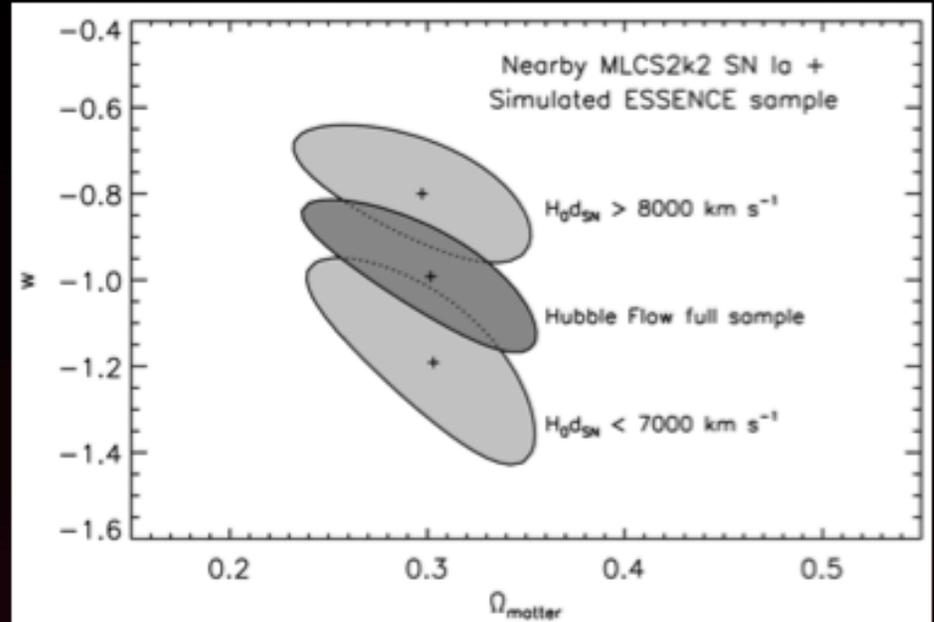
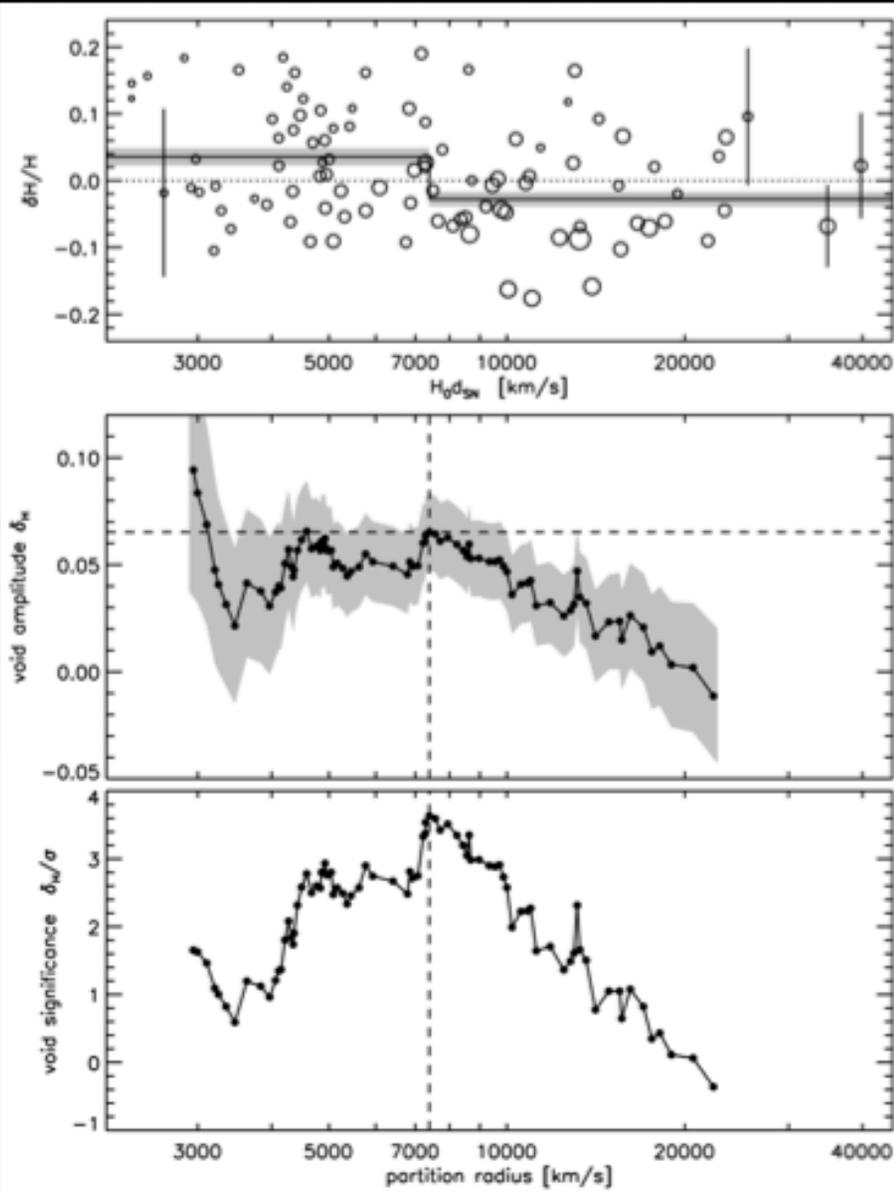
## SALT:

- Global fit for color/dust parameter  $\beta$ : minimizing Hubble-scatter can lead to bias
- Trend toward bluer colors at high- $z$ : if allow  $\beta(z)$ , see strong trend with redshift
- Retrain and refine the models with newer data

# SALT Parameters vs. Redshift



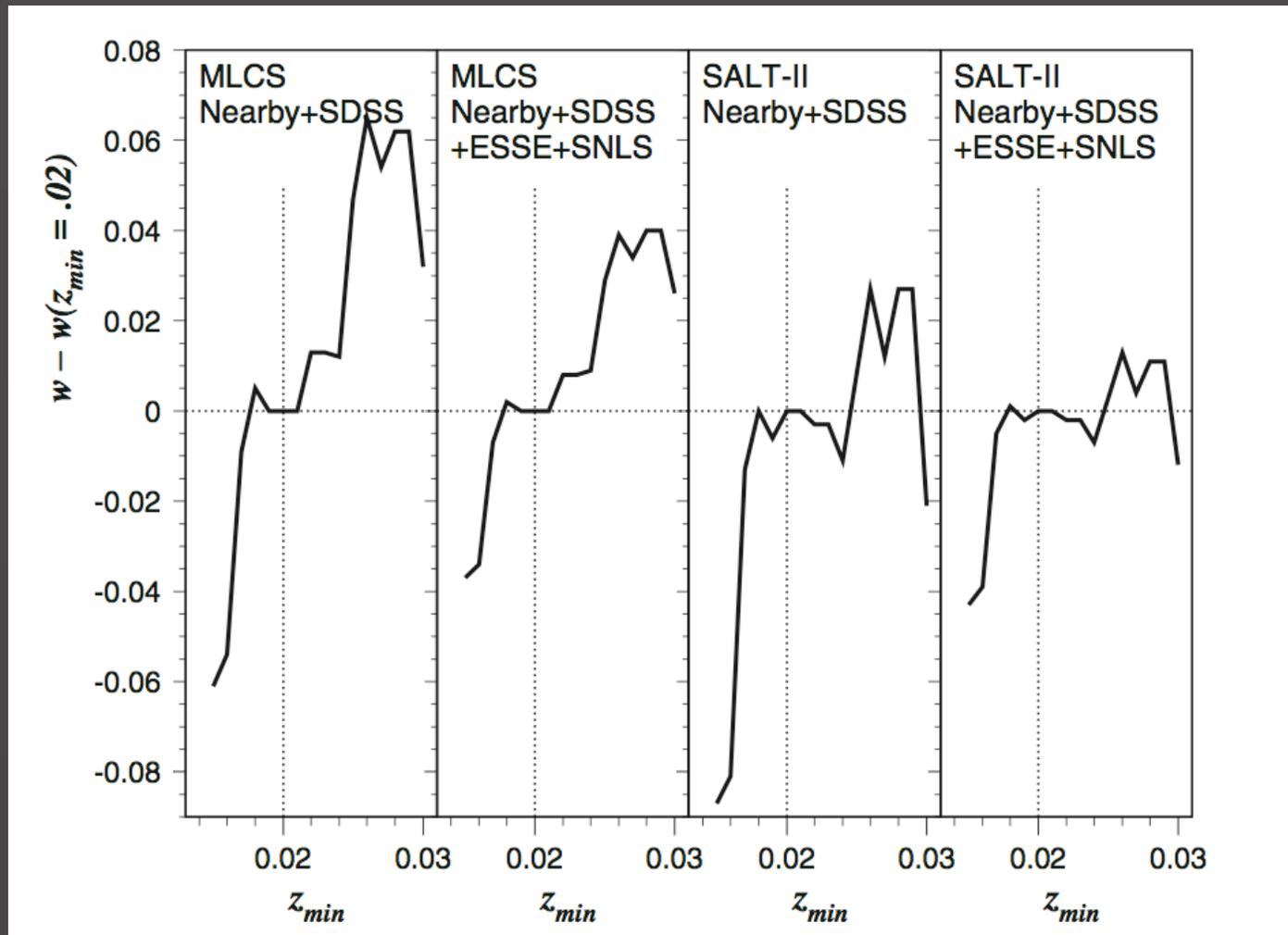
# A Hubble Bubble?



**Whatever the cause (real void or systematic effect), this signal is in the low- $z$  data and has a huge impact on measuring  $w$ ! To proceed we need to check and understand this result.**

See also Conley et al 2007:  
treatment of dust & SN colors

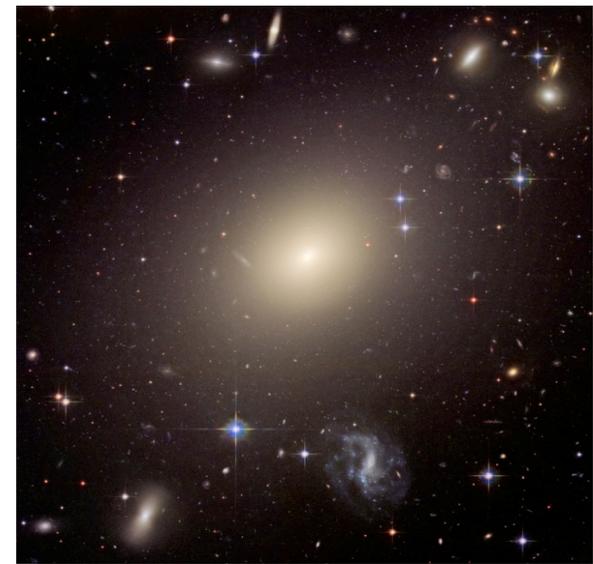
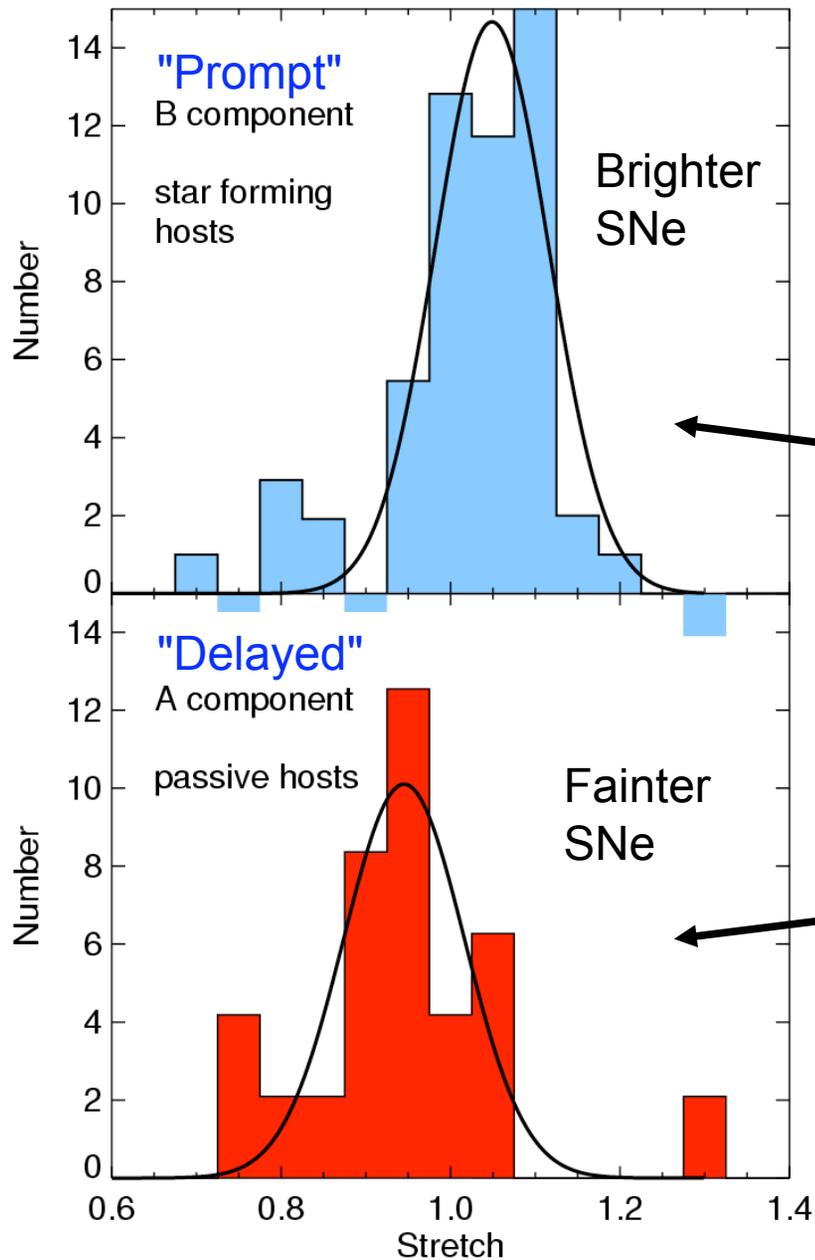
# Vary minimum redshift



# Correlations of SN Ia and Host-galaxy Properties

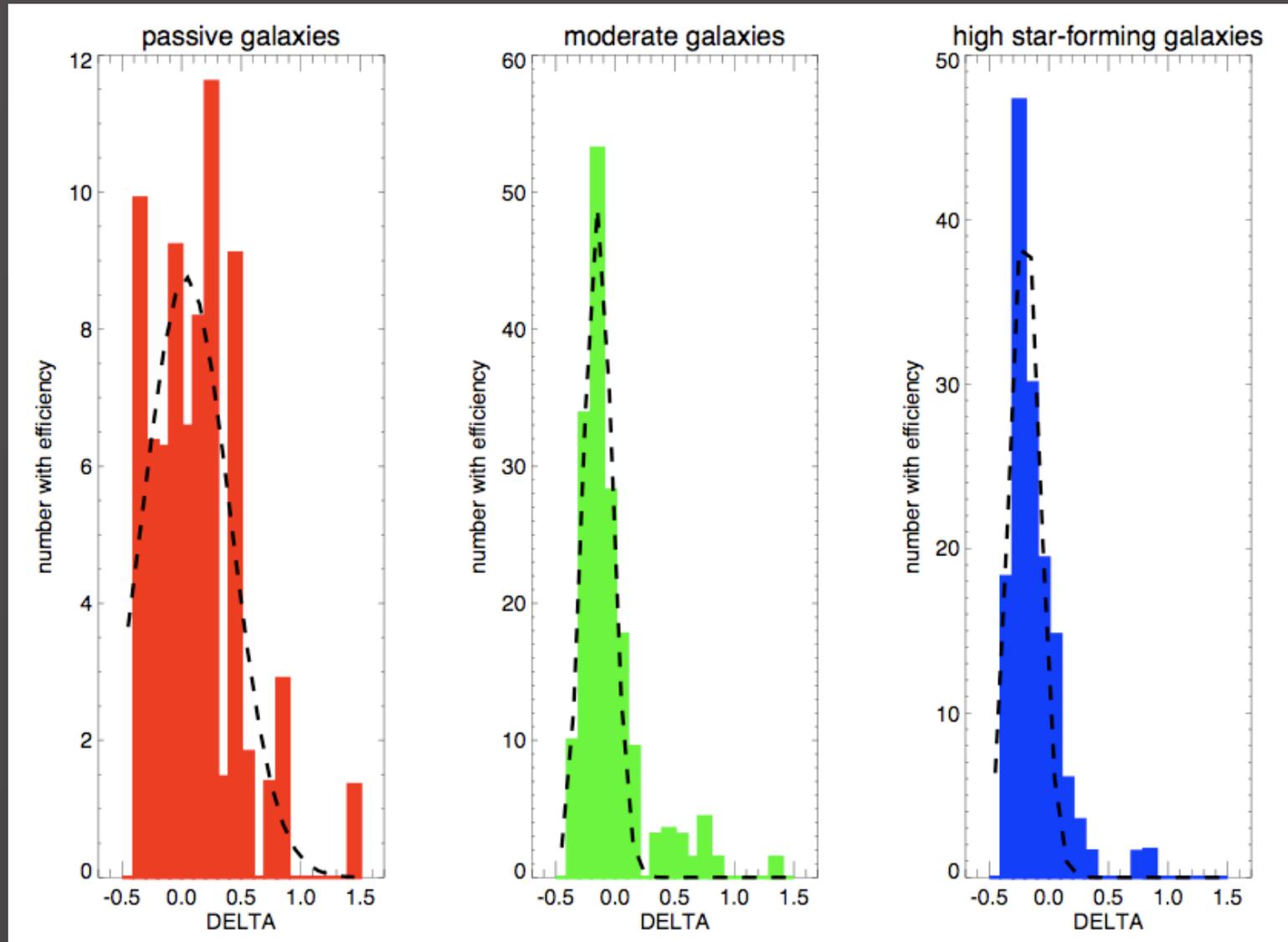
# Host Population correlated with SN Ia Luminosity

Sullivan et al. 2006, Howell et al. 2007, Jha et al 2007



Also brighter SNe in lower-stellar-mass hosts

# SN Ia Luminosity correlates with Host Galaxy Type



SDSS

Bright

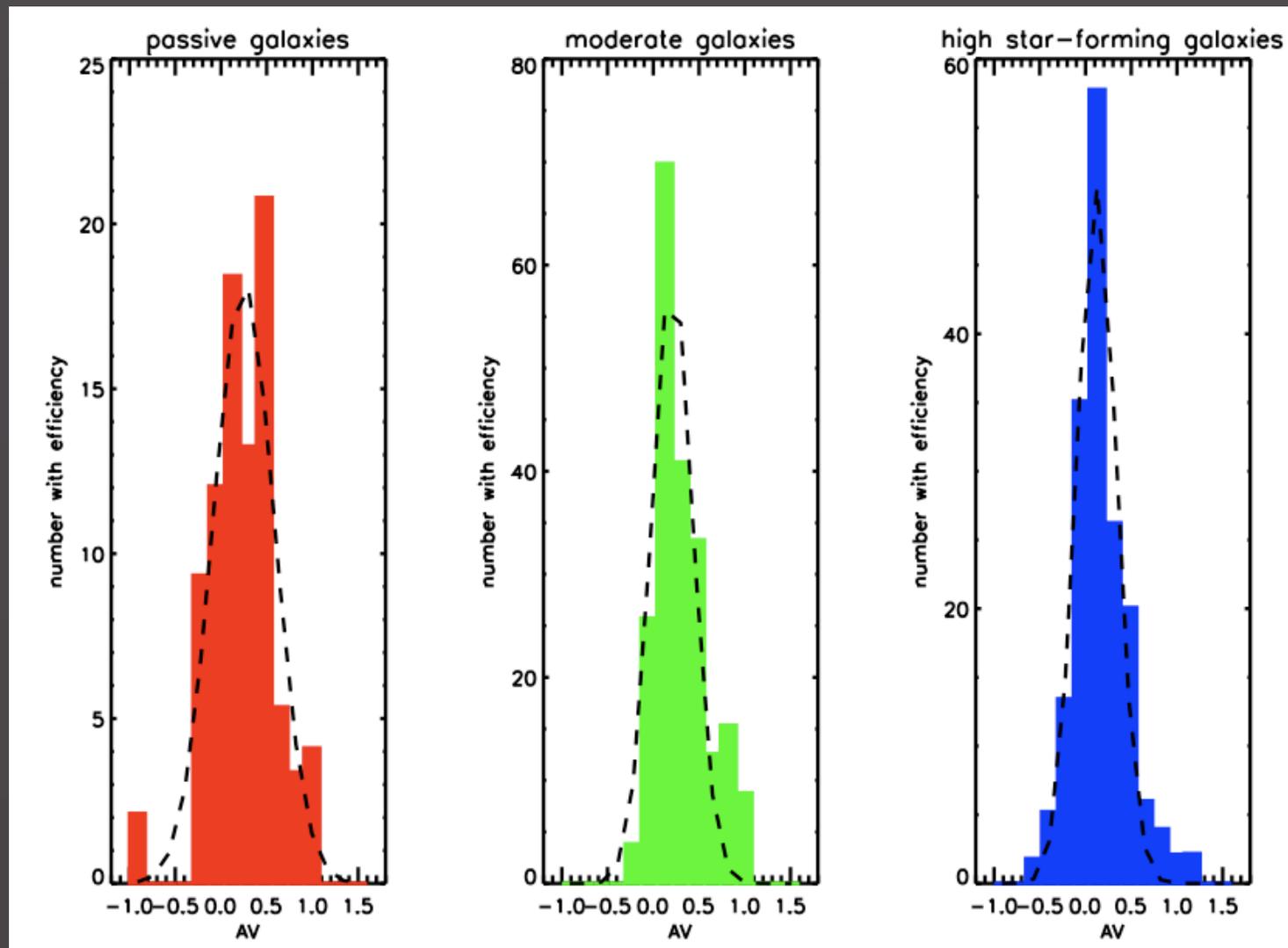
SN Luminosity/Decline Rate

Faint

Smith  
et al

# SN Ia Color doesn't correlate strongly with Host Galaxy Type

Why aren't  
'spirals'  
dustier than  
'ellipticals'?

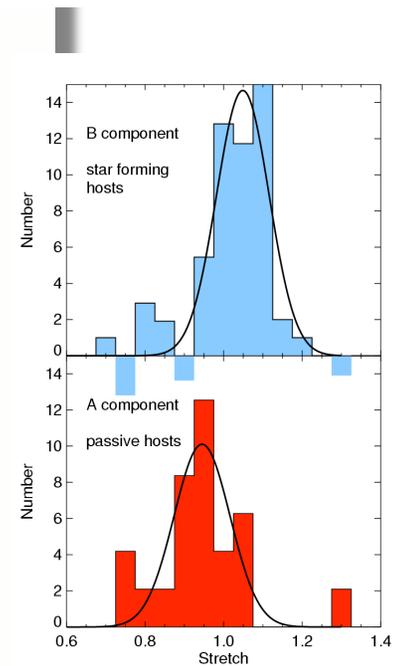
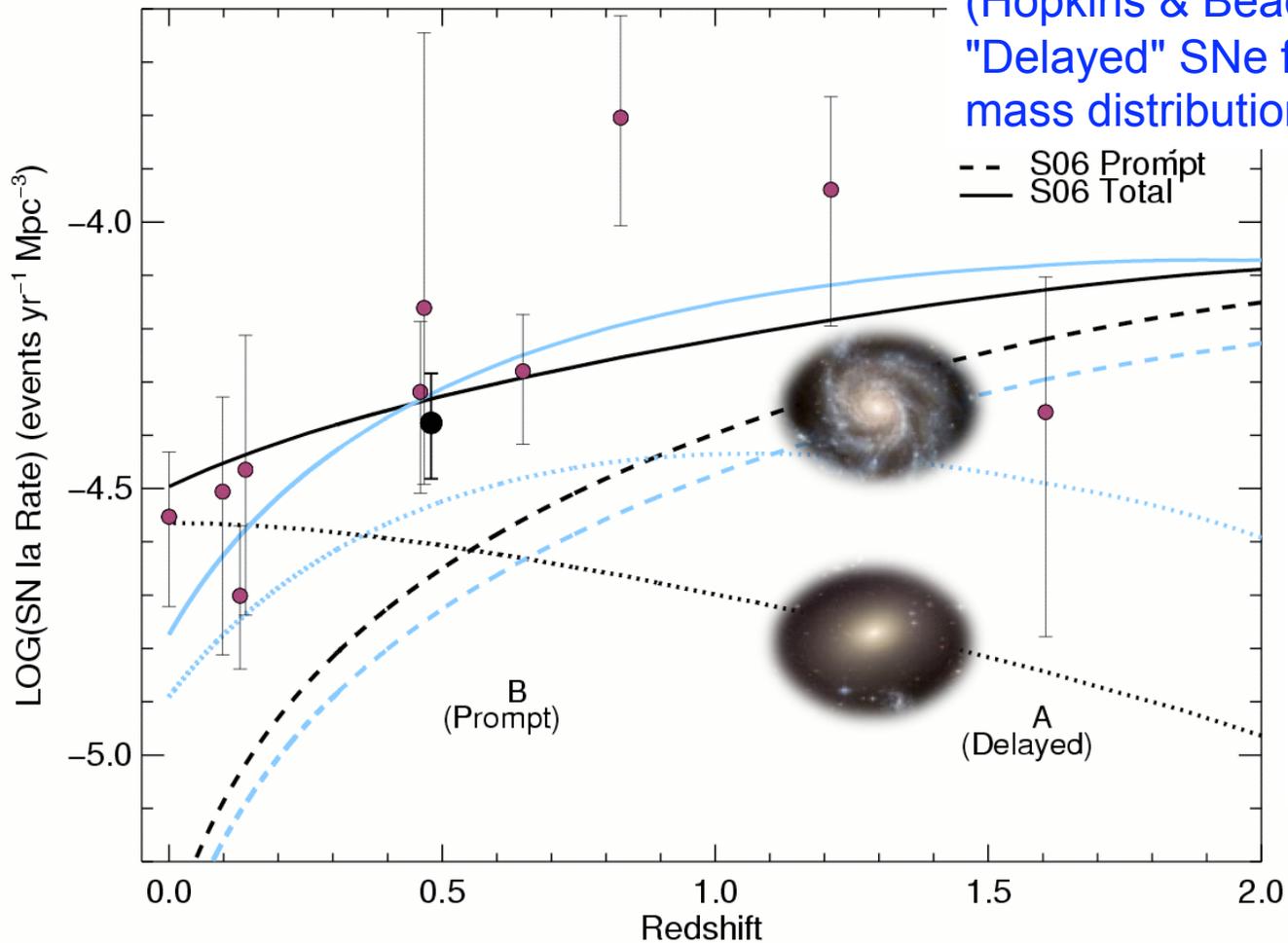


Color/reddening

# SN Rates vs. redshift

Sullivan et al. 2006, Howell et al. 2007

"Prompt" SNe follow declining cosmic star formation history (Hopkins & Beacom 2006),  
"Delayed" SNe follow growing stellar mass distribution



Predict relative contribution from each component vs. redshift

# SN population drift vs. $z$

Howell et al. 2007

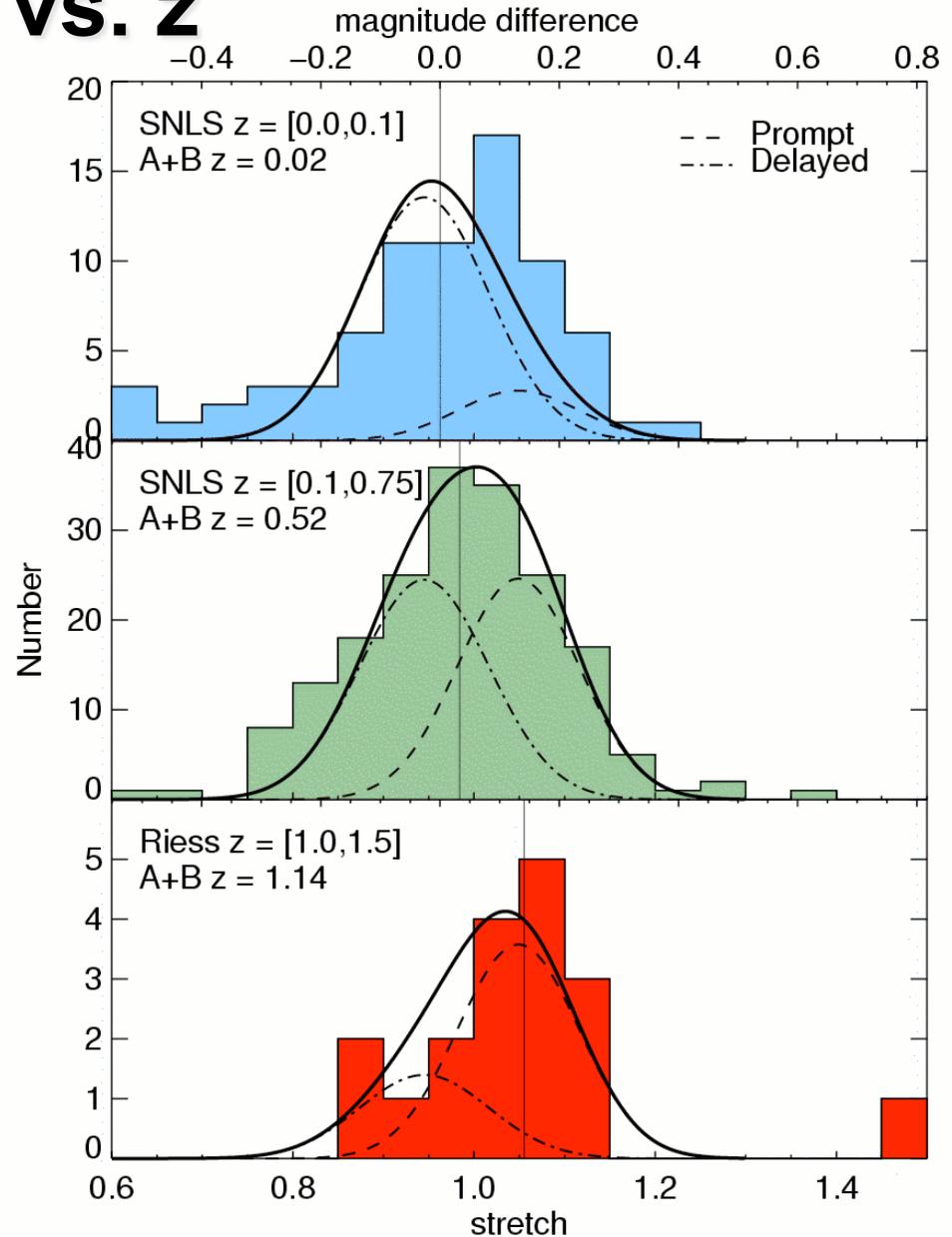
**Histograms:** data

**Gaussians:** prediction from rates

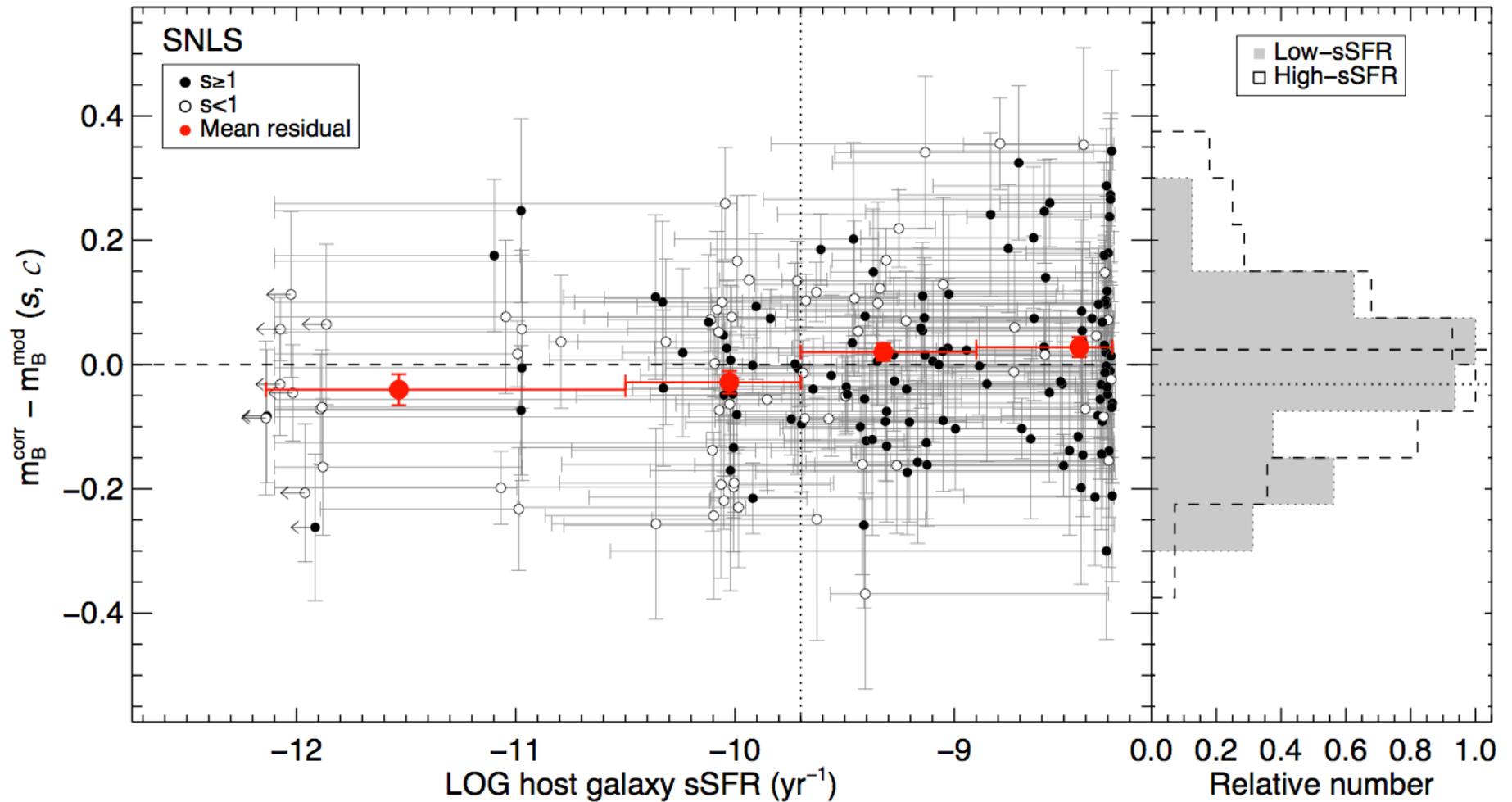
**Conclusion:** Average stretch, and thus average *observed* brightness of SNe Ia **evolves with redshift.**

**Average SN Ia was 12% brighter at  $z > 1$ .**

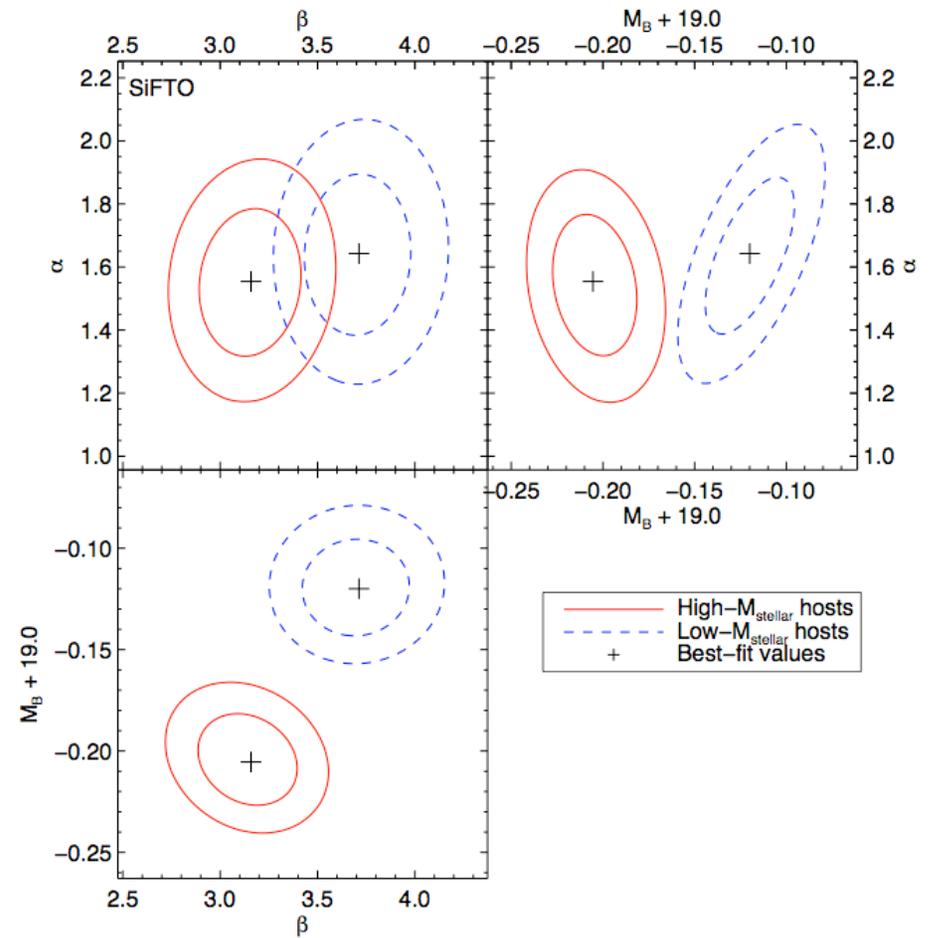
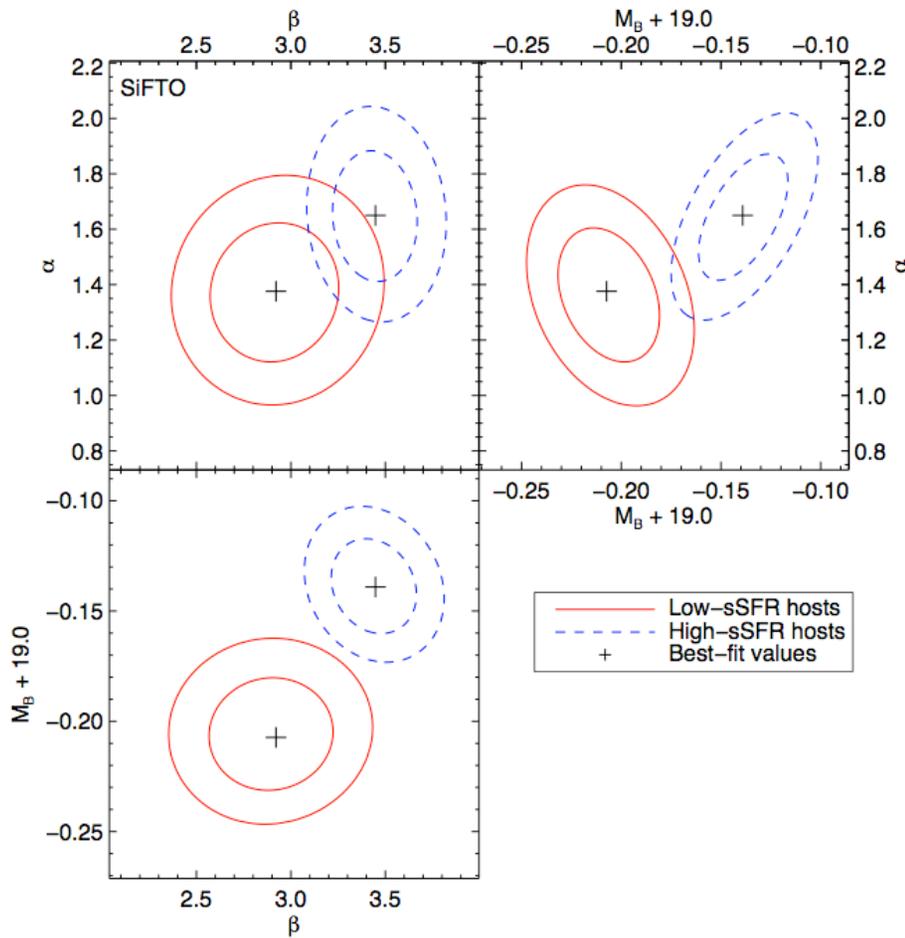
However, if stretch correction works, this population evolution should not affect cosmology



# Hubble Residuals vs. Host Galaxy Specific Star Formation Rate



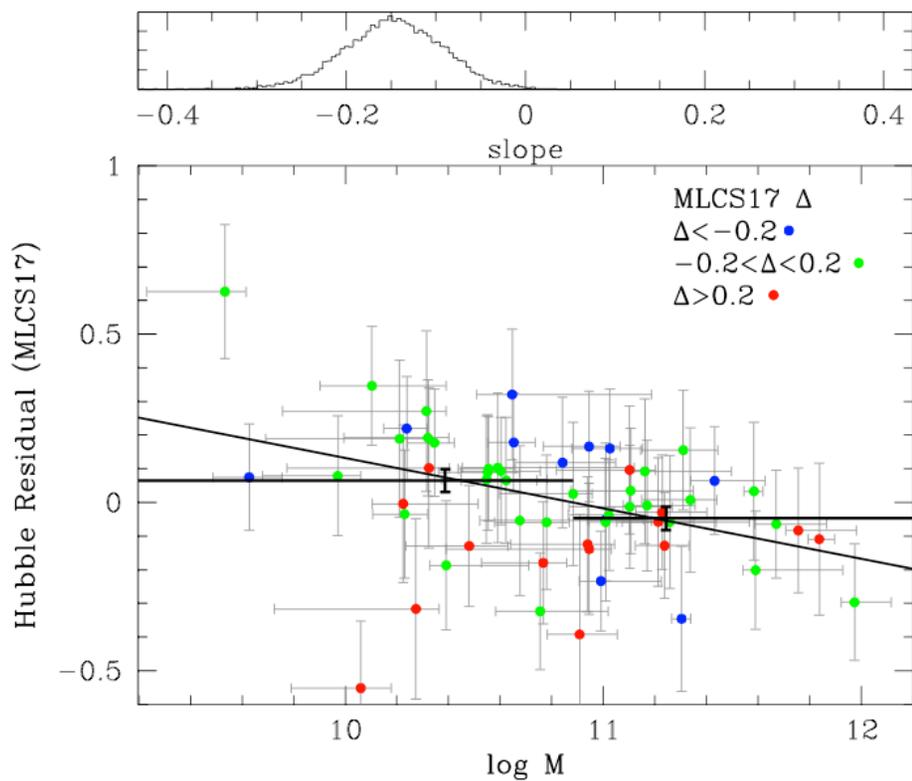
Events of same light-curve shape and color are  $\sim 0.08$  mag brighter (after LCS correction) on avg. in galaxies with low star-formation rate (or high stellar mass): *opposite* to pre-correction trend



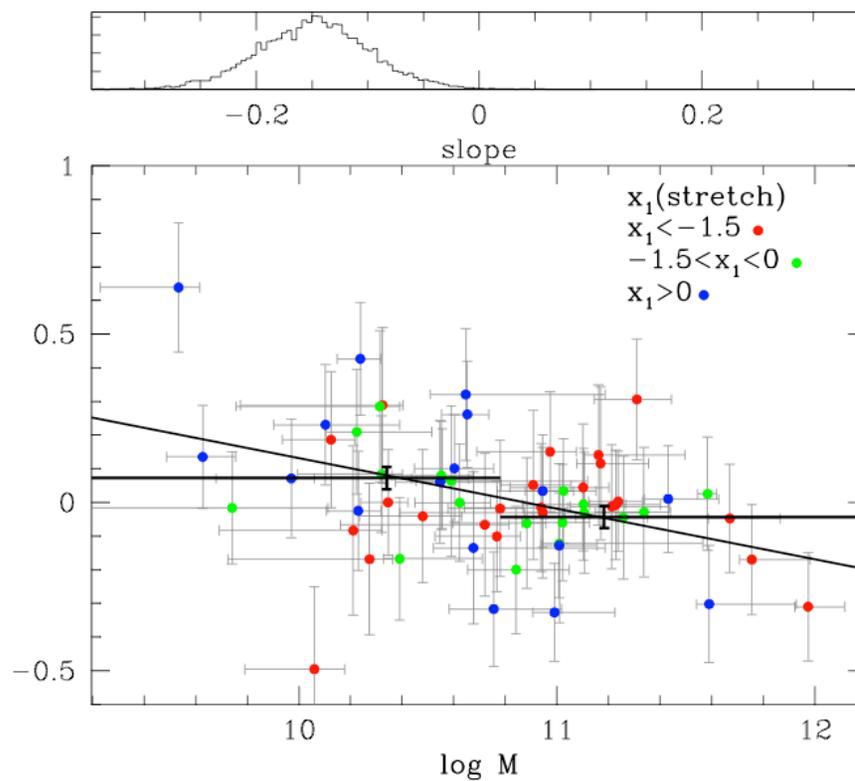
Events of same light-curve shape and color are  $\sim 0.08$  mag brighter (after LCS correction) on avg. in galaxies with low star-formation rate (or high stellar mass): opposite to pre-correction trend: metallicity effect?

Sullivan et al 10

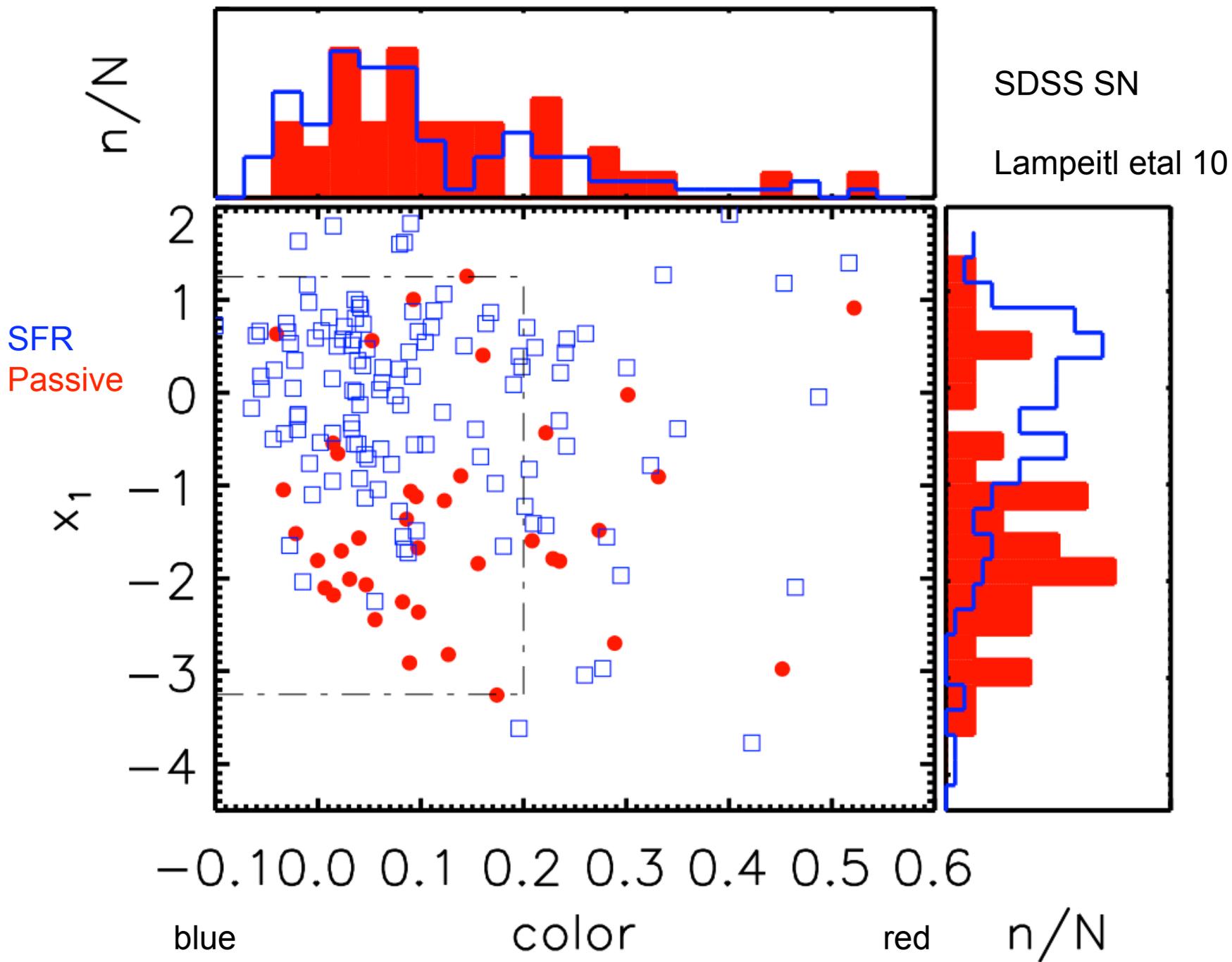
Fit cosmology with 2 populations of  $M_B$ : shifts  $w$  by  $\sim 0.04$ - $0.08$  with BAO prior

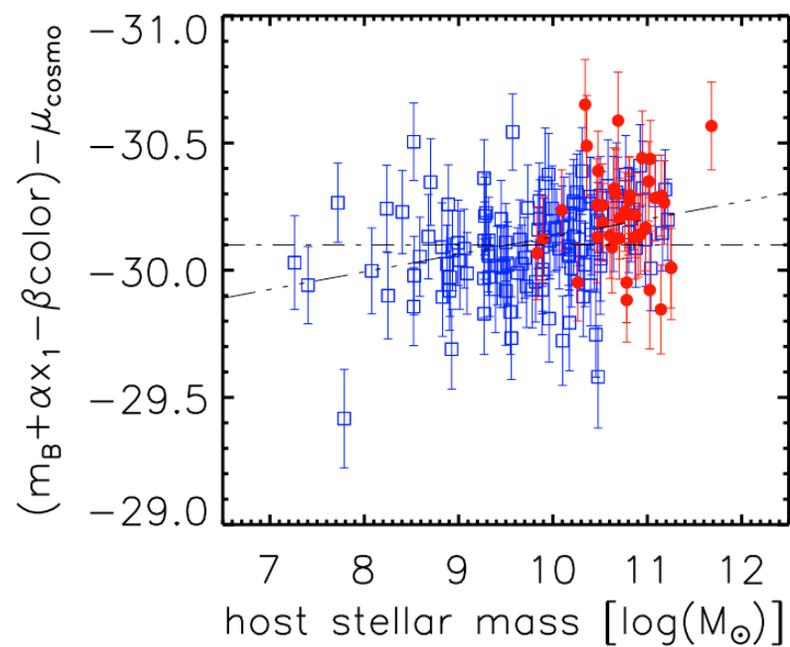
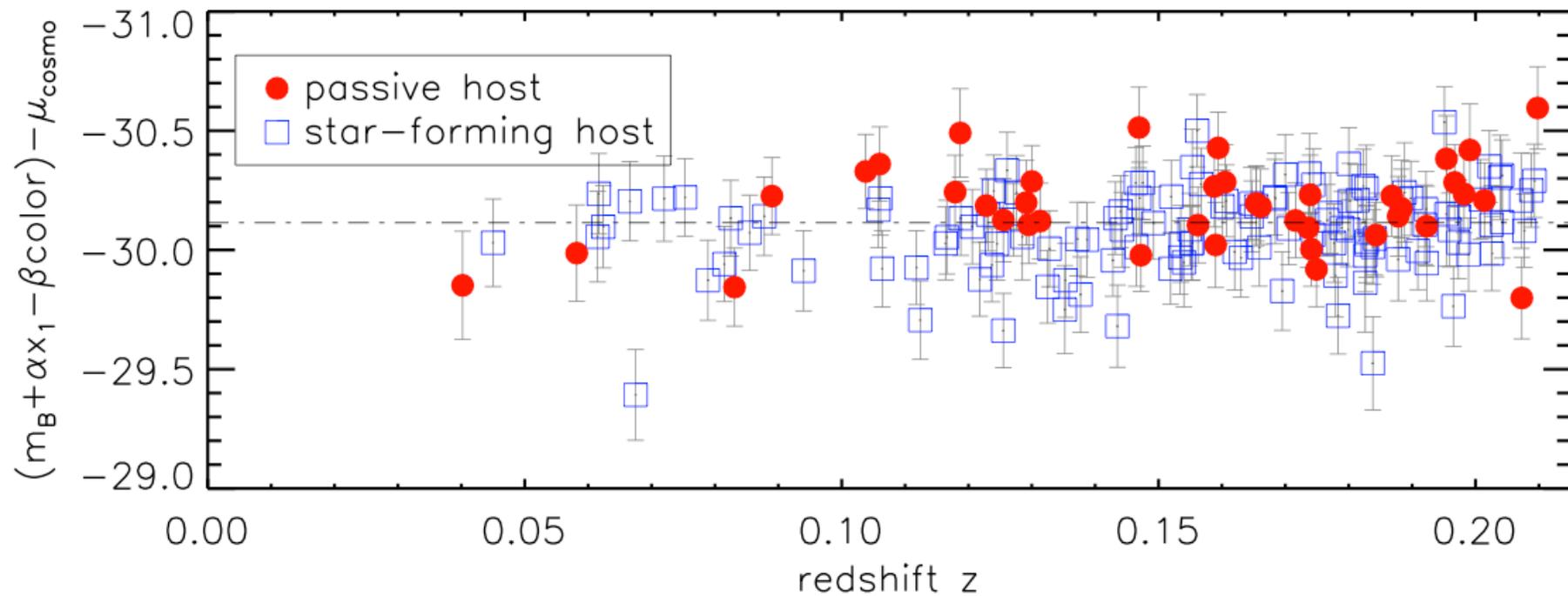


Same trend seen in low-redshift SN Ia sample



Kelly et al 09





# Systematic Errors (and Controls)

- Dust and SN color variation (multi- $\lambda$ , NIR, high S/N)
- U-band model discrepancy (retrain with better rest-frame U-band data, e.g., from SDSS SN g-band)
- Minimum redshift effect (model coherent flows; larger, better, low-redshift samples)
- Selection effects (artificial SNe, Monte Carlo simulations)
- Population evolution (SN properties vs host environment)
- Photometric calibration (system response calibration & cross-calibration of systems)
- Sample purity (spectroscopy at least for subsample)
- All (subdivide large samples to cross-check)

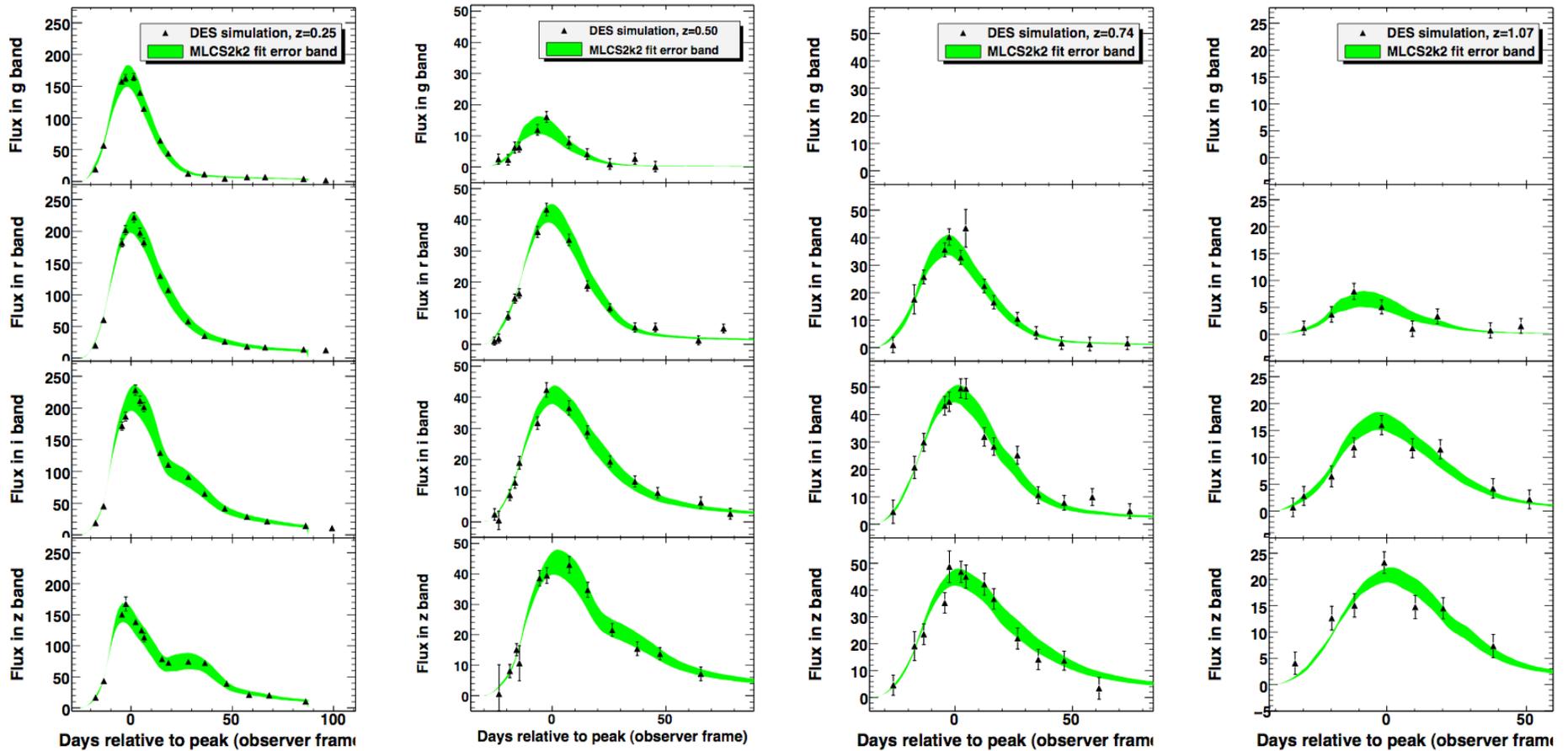
# The Future is (Mostly) Photometric

- Pan-STARRS, Dark Energy Survey, LSST: thousands to tens of thousands of multi-band light curves to  $z \sim 1$
- Limited spectroscopic resources for follow-up, replace spectroscopic with photometric SN classification
- Very large samples will enable subdivision to study correlations and control systematics
- Photometric-redshift precision at high- $z$  does not critically impact DE constraints but degrades (SN-type) sample purity
- SN spectroscopic subsamples (both Ia and non-Ia) required to quantify purity and define SN Ia color selection. SDSS SN test of photometric classifier:  $\sim 92\%$  complete, 5% impurity (M. Sako)



# DES SN Simulated Light Curves

DARK ENERGY  
SURVEY

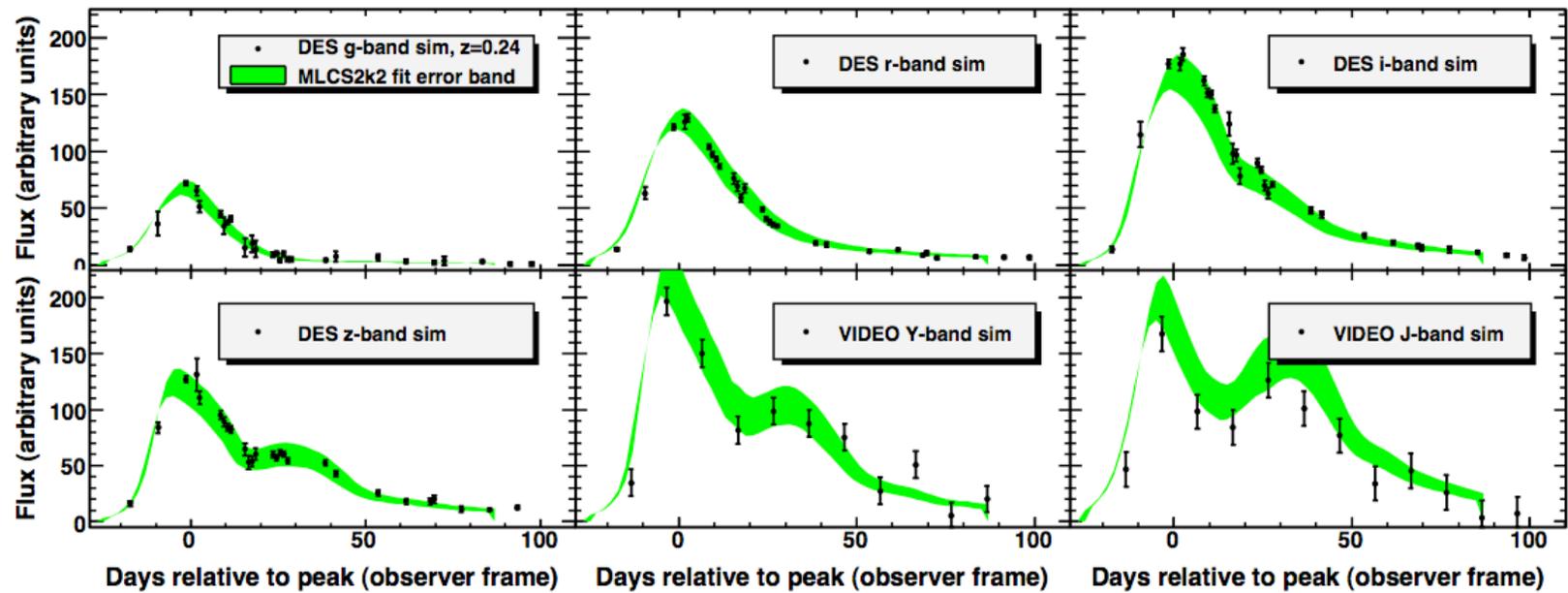


See Bernstein et al draft DES SN paper on the class website (do not circulate)



# DES + VISTA VIDEO NIR

DARK ENERGY  
SURVEY

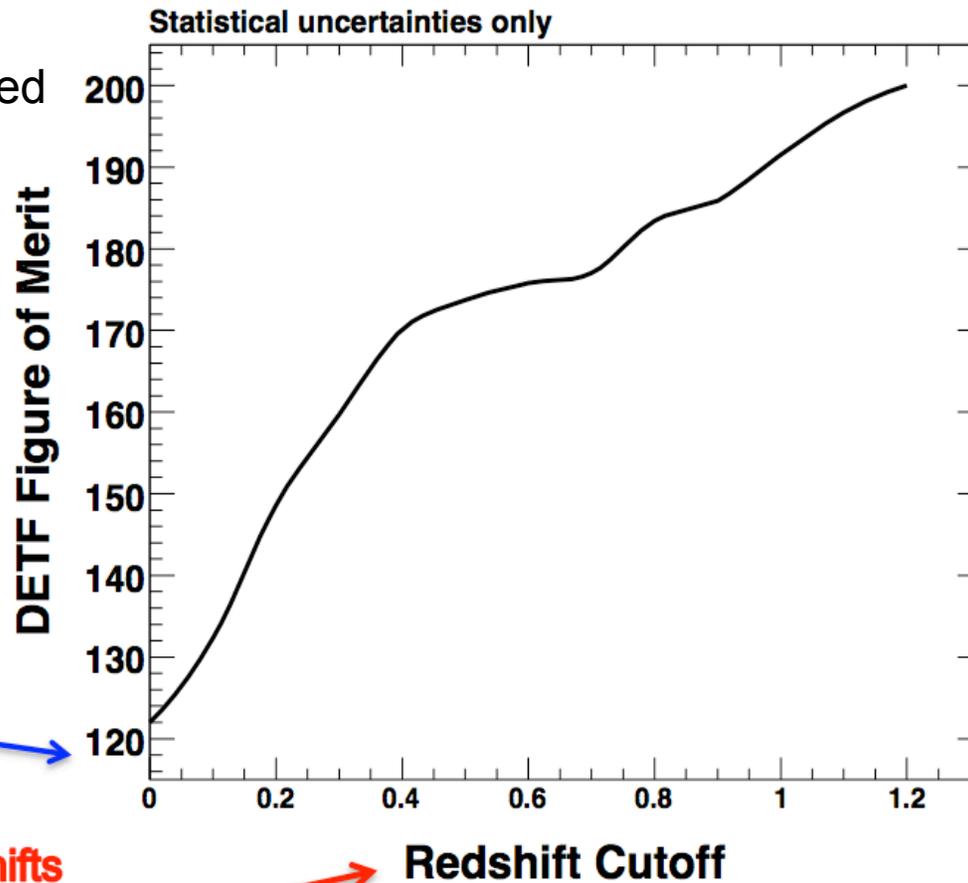




# Photometric Redshift Only?

DARK ENERGY  
SURVEY

DES simulation:  
~3000 well-measured  
SNe Ia with  
 $\langle z \rangle \sim 0.6$



Photometric  
redshift=SN  
colors plus  
galaxy colors

Statistical Errors  
Only!

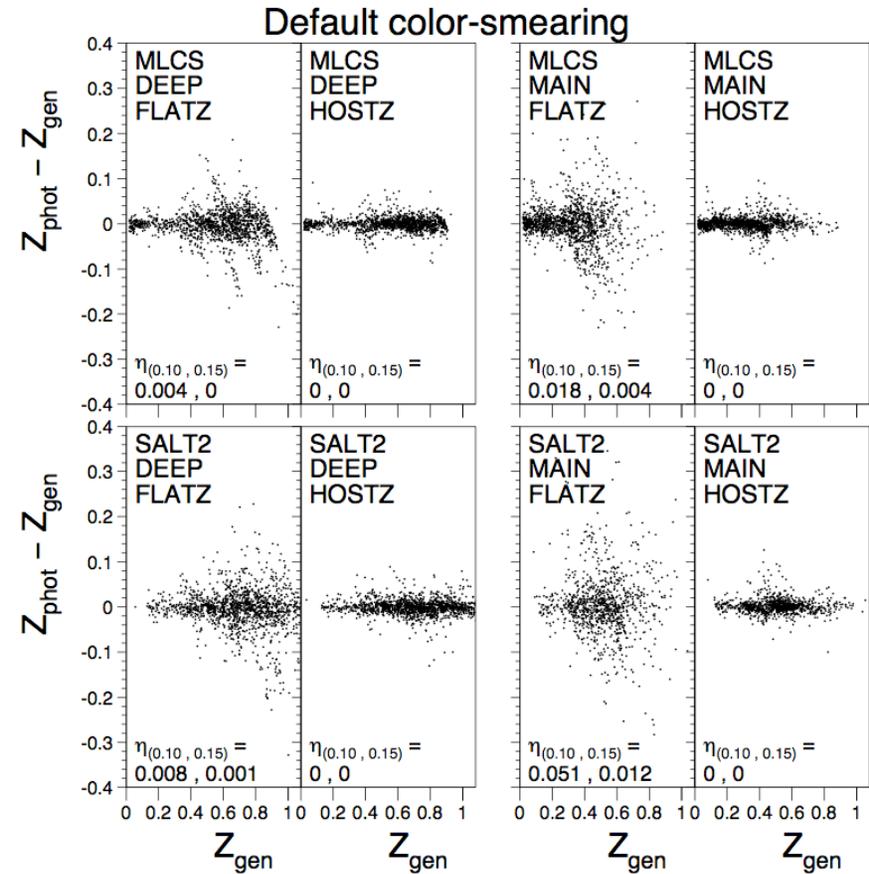
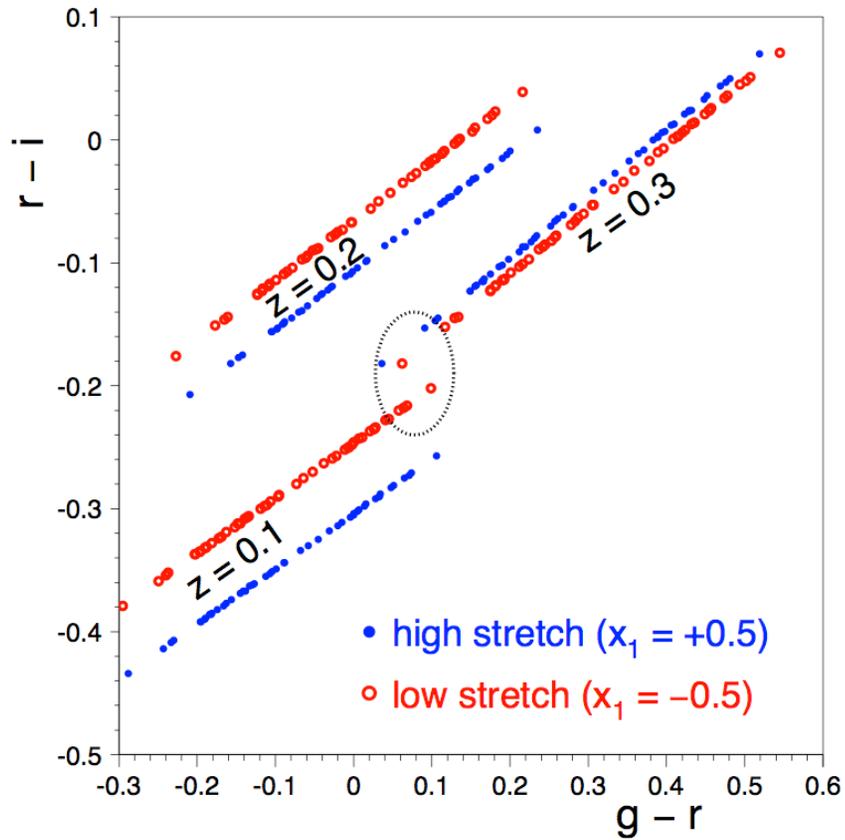
DES will obtain  
host spectroscopic  
redshifts (improves  
typing); photo-z  
cosmology more  
relevant for LSST

Suppressed 0!

Spectroscopic redshifts  
below this cutoff.  
Photometric above.

# Supernova Photo-z's

Include redshift as a light-curve fit parameter



Kessler, et al 2010

LSST Simulation

# Development of Photometric SN Classification Techniques

Blind SN Classification Challenge:

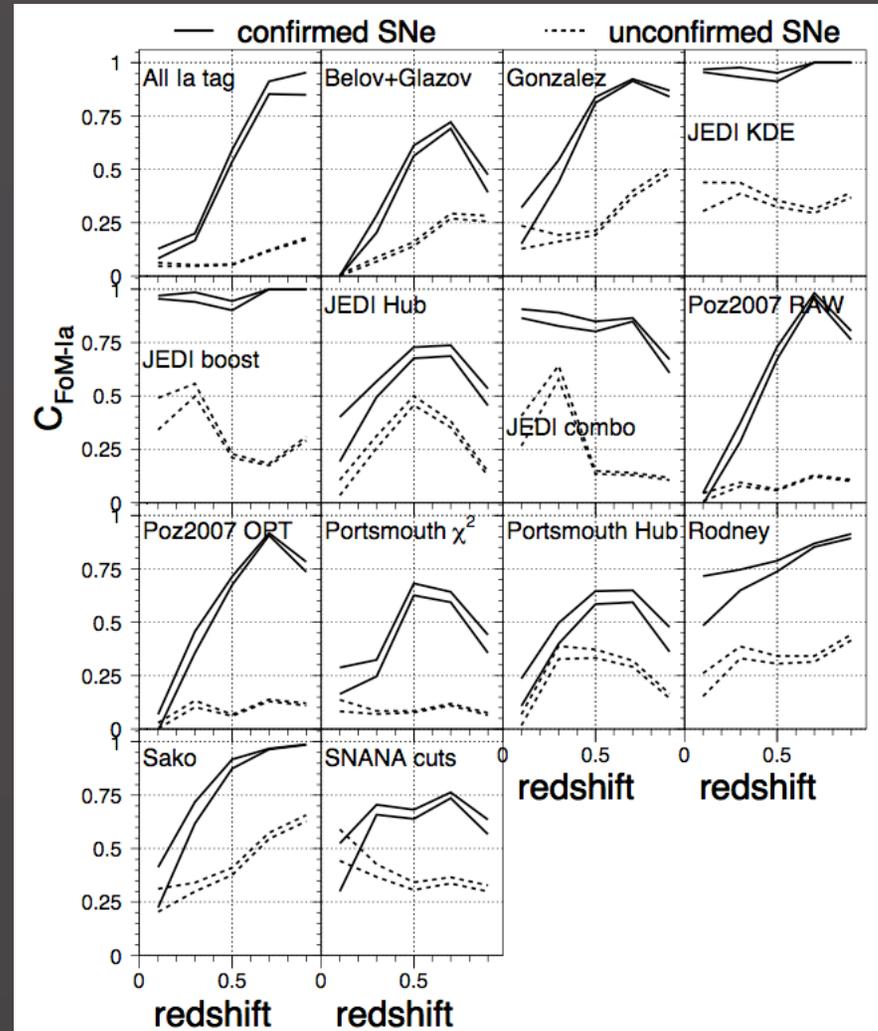
Simulated DES light curves of different SN types

Host photo-z's

Spectroscopically confirmed subsample for training

Cuts: purity vs completeness

Kessler et al 10



# Cosmology for Photometric SN samples

Cosmology fits generalized to include probability that a given event is a SN Ia, based on some photometric classification technique.

Will improve results from current SN surveys by including their larger photometric SN Ia datasets

Will be necessary for future surveys, for which spectroscopic classification will be available for only a small fraction of events

Places a premium on characterizing non-Ia populations

Hlozek et al 2010

