## PHOTOMETRIC SELECTION OF HIGH-REDSHIFT TYPE IA SUPERNOVA CANDIDATES

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# ABSTRACT

We present a method for selecting high-redshift Type Ia supernovae (SNe Ia) located via rolling SN searches. The technique, using both color and magnitude information of events from only two to three epochs of multiband realtime photometry, is able to discriminate between SNe Ia and core-collapse SNe. Furthermore, for SNe Ia the method accurately predicts the redshift, phase, and light-curve parameterization of these events based only on pre-maximumlight data. We demonstrate the effectiveness of the technique on a simulated survey of SNe Ia and core-collapse SNe, where the selection method effectively rejects most core-collapse SNe while retaining SNe Ia. We also apply the selection code to real-time data acquired as part of the Canada-France-Hawaii Telescope Supernova Legacy Survey (SNLS). During the period 2004 May to 2005 January in the SNLS, 440 SN candidates were discovered, of which 70 were confirmed spectroscopically as SNe Ia and 15 as core-collapse events. For this test data set, the selection technique correctly identifies 100% of the identified SNe II as non-SNe Ia with only a 1%-2% false rejection rate. The predicted parameterization of the SNe Ia has a precision of  $|\Delta z|/(1 + z_{spec}) < 0.09$  in redshift and  $\pm 2-3$  rest-frame days in phase, providing invaluable information for planning spectroscopic follow-up observations. We also investigate any bias introduced by this selection method on the ability of surveys such as SNLS to measure cosmological parameters (e.g., w and  $\Omega_M$ ) and find any effect to be negligible.

Key words: distance scale — supernovae: general — surveys

## 1. INTRODUCTION

Recent surveys for high-redshift Type Ia supernovae (SNe Ia) have established their utility as calibrated standard candles suitable for use as cosmological distance indicators. The "first generation" of SN Ia cosmology programs (Perlmutter et al. 1997, 1998, 1999; Garnavich et al. 1998; Riess et al. 1998; Schmidt et al. 1998) developed a systematic approach to high-redshift SN detection and analysis that led to Hubble diagrams ruling out a flat, matter-dominated universe, revealing the presence of an unaccounted for "dark energy" driving cosmic acceleration.

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One of the most pressing questions in cosmology now is: What is the nature of the dark energy? There is a fundamental difference between a cosmological constant and other proposed forms of dark energy, and the distinction can be addressed by measuring the dark energy's average equation of state,  $w \equiv p/\rho$ , where w = -1corresponds to a cosmological constant. Current measurements of this parameter (e.g., Knop et al. 2003; Tonry et al. 2003; Riess et al. 2004b) are consistent with a very wide range of dark energy theories (see Peebles & Ratra 2003 for a comprehensive review). The importance of improving measurements to the point at which w = -1 could be confirmed or excluded has led to a "second generation" of SN cosmology studies: large, multiyear, multiobservatory programs benefiting from major commitments of dedicated time, e.g., the Supernova Legacy Survey (SNLS) at the Canada-France-Hawaii Telescope (CFHT; Astier et al. 2005) and the ESSENCE project at the Cerro Tololo Inter-American Observatory (Krisciunas et al. 2005). These "rolling searches" find and follow all varieties of SNe over many consecutive months of repeated wide-field imaging, with redshifts and SN type classification from coordinated spectroscopy. The success of these large-scale rolling searches directly depends on the degree to which SNe Ia can be selected at early phases in their light curve from many other types of varying sources for further spectroscopic follow-up, and hence have their nature confirmed. With large numbers of candidates being found during each lunation and a finite amount of 8 m class telescope spectroscopic follow-up available, these spectroscopy-limited surveys must have reliable methods for extracting likely SN Ia events from the hundreds of other varying sources discovered.

Previous studies have investigated methods by which SN can be identified from light-curve or host galaxy photometric properties alone. Poznanski et al. (2002) used color-color diagrams and SN spectral templates at various redshifts to delineate regions of

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color-color space in which SNe of different types are usually located; a particular adaptation of this technique is to identify SNe Ib/c (Gal-Yam et al. 2004). Dahlén & Goobar (2002) demonstrated that photometric properties of the host galaxies and SNe can be used to select high-redshift candidates in well-defined redshift intervals for spectroscopic follow-up. Riess et al. (2004a) used color cuts to differentiate SNe Ia at z > 1 from lower redshift SNe II, while Barris et al. (2004) used photometric techniques to attempt to identify high-redshift SN candidates (with complete light curves) as SNe Ia based on spectroscopic redshift. Barris & Tonry (2004) introduced a redshift marginalization technique that allowed SNe Ia to be used without knowledge of a spectroscopic redshift with an impressively small increase in scatter about the z < 0.13 Hubble diagram; however, this technique used full light curves and an already obtained positive identification of the SN type.

Many (although not all) of these techniques are designed to identify SNe either after a host galaxy spectroscopic redshift has been determined or after a full light curve has been obtained. The problem facing rolling searches is different, namely, differentiating SNe Ia from all other variable sources (e.g., SNe II, active galactic nuclei [AGNs], variable stars) based on only two to three epochs of real-time (i.e., perhaps imperfect) photometry and predicting their redshifts, phases, and temporal evolution in magnitude. Redshift estimates allow spectrograph setups to be optimized (in terms of grism or grating central wavelength choice) for the candidate under study to ensure that the characteristic spectral features of SNe Ia are always within the observed wavelength range to allow unambiguous identification. Phase predictions allow spectroscopic follow-up to be optimized by always observing SN candidates within a few days of maximum light, when the SNe have the greatest contrast over their host galaxies and spectral features in different types of SNe are most easily distinguished. Predicting the magnitude of an SN over the course of its light curve is invaluable in ensuring that spectroscopic observations are of sufficient length to obtain a signal-to-noise ratio (S/N) that allows an identification to be obtained.

In this paper we present a new technique designed to select and predict the redshift, phase, and light-curve parameterization of high-redshift SNe Ia. We show how it has been applied to realtime data from the SNLS and used to guide and inform follow-up decisions. A plan of the paper follows. Section 2 gives a brief overview of SN Ia properties and describes the technique used for our photometric selection; § 3 shows the results of our tests of the technique on synthetic data sets of SNe Ia and core-collapse SNe. The technique is applied to candidates from the SNLS in § 4, the results of which are presented, compared with simulations, and discussed in § 5. We summarize in § 6. Throughout this paper all magnitudes are given in the AB photometric system (Oke & Gunn 1983), and we assume a cosmology of  $\Omega_M = 0.30$ ,  $\Omega_{\Lambda} = 0.70$ , and w = -1 where relevant.

## 2. PHOTOMETRIC SELECTION TECHNIQUE

Given flux information about a candidate SN, we require a method that provides a light-curve fit and parameterization of the SN (assuming the candidate is a SN Ia), an estimate of the SN redshift, and some quality factor providing a measure of the likelihood that the candidate under study is indeed a SN Ia.

## 2.1. Parameterizing Type Ia Supernovae Light Curves

Raw observed peak magnitudes of spectroscopically normal SNe Ia have an rms dispersion of  $\sim 0.30$  mag (e.g., Hamuy et al. 1996), but this dispersion can be significantly reduced by using

an empirical relationship between the light-curve shape and the raw observed peak magnitude. Phillips (1993) showed that the absolute magnitudes of SNe Ia are tightly correlated with the initial decline rate of the light curve in the rest-frame *B* band; intrinsically brighter SNe have wider, more slowly declining light curves. Using a linear relationship to correct the observed SN peak magnitudes, parameterized via  $\Delta m_{15}(B)$ , the decline in *B*-band magnitudes 15 days after maximum light, the typical scatter in the rest-frame *B* band of local SNe can be reduced to ~0.17 mag (Hamuy et al. 1995, 1996; Phillips et al. 1999). An alternative technique, the Multicolor Light Curve Shape (MLCS; Riess et al. 1995, 1996, 2004b; Jha 2002), results in a similar smaller dispersion in the final peak magnitudes, particularly if multicolor light curves are used in the fitting procedure.

The approach used in this paper is to parameterize the SN light-curve timescale via a simple stretch factor, *s*, which linearly stretches or contracts the time axis of a template SN light curve around the time of maximum light to best fit the observed light curve of the SN being fitted (Perlmutter et al. 1997, 1999; Goldhaber et al. 2001). A SN's "corrected" peak magnitude  $(m_B^{corr})$  is then related to its raw peak magnitude  $(m_B^{raw})$  via

$$m_B^{\rm corr} = m_B^{\rm raw} + \alpha(s-1), \tag{1}$$

where s is the stretch of the light-curve timescale and  $\alpha$  relates s to the size of the magnitude correction. Sophisticated versions of this technique incorporating color corrections (e.g., Guy et al. 2005) lead to rms dispersions of  $\simeq 0.15$  mag in local SNe.

## 2.2. SN Model

The apparent observed flux f of a SN Ia at redshift z through a filter with total system response  $T(\lambda)$  is given by

$$f_T = \frac{1}{1+z} \int_0^\infty T(\lambda) S\left(\frac{\lambda}{1+z}, t, s, E_{B-V}^{\text{mw}}, E_{B-V}^{\text{host}}\right) d\lambda, \quad (2)$$

where  $S(\lambda, t, s, E_{B-V}^{mw}, E_{B-V}^{host})$ , hereafter *S*, is the rest-frame flux distribution of the SN (in ergs s<sup>-1</sup> cm<sup>-2</sup> Å<sup>-1</sup>), which depends on the phase of the SN relative to maximum light (*t*, measured in rest-frame days), the SN stretch (*s*), the color excess due to the Milky Way along the line of sight to the SN ( $E_{B-V}^{mw}$ ), and the color excess of the SN host galaxy ( $E_{B-V}^{host}$ ). The parameter *S* is normalized so that its intrinsic, unextincted, *B*-band magnitude at maximum light (t = 0)  $m_B^{raw}$  is given by

$$m_B^{\text{raw}} = \mathcal{M}_B + 5 \log \mathcal{D}_{\mathcal{L}}(z; \ \Omega_M, \ \Omega_\Lambda) - \alpha(s-1), \quad (3)$$

where  $\mathcal{D}_{\mathcal{L}} \equiv H_0 d_L$  is the "Hubble constant-free" luminosity distance and  $\mathcal{M}_B \equiv M_B - 5 \log H_0 + 25$  is the "Hubble constantfree" *B*-band absolute peak magnitude of a SN Ia with s = 1(e.g., Goobar & Perlmutter 1995; Perlmutter et al. 1999). In this model we set  $\alpha = 1.47$  and  $\mathcal{M}_B = -3.48$  from the primary fit of Knop et al. (2003). (This formalism can of course be generalized to any SN type by removing the dependence on the stretch, *s*.)

Model spectra and light curves for the SNe are also required. The basic, normal SN Ia spectral templates we use are updated versions of those given in Nugent et al. (2002), which provide spectral coverage from 1000 to 25000 Å in wavelength and from t = -19 to +70 rest-frame days in the SN light curve. The light-curve templates for calculating rest-frame *B*-band fluxes relative to maximum light (before any stretch-color correction) are the rest-frame light-curve templates of Goldhaber et al. (2001)

TABLE 1 CFHT-LS DEEP FIELD LOCATIONS

Field	R.A. (J2000.0)	Decl. (J2000.0)	Other Data <sup>a</sup>
D1	02 26 00.00	-04 30 00.0	XMM, VIMOS, SWIRE, GALEX, VLA
D2	10 00 28.60	+02 12 21.0	COSMOS/ACS, VIMOS, Spitzer, GALEX, VLA
D3	14 19 28.01	+52 40 41.0	(Groth strip): DEEP-2, Spitzer, GALEX
D4	22 15 31.67	-17 44 05.7	XMM, GALEX

<sup>a</sup> Data from *XMM*; Visible Multi-Object Spectrograph (VIMOS); *Spitzer* Wide-Area Infrared Extragalactic (SWIRE) survey; *Galaxy Evolution Explorer* (*GALEX*); Very Large Array (VLA); the COSMOS collaboration; the *Spitzer Space Telescope*; and Phase 2 of the Deep Extragalactic Evolutionary Probe (DEEP-2).

and Knop et al. (2003), linearly interpolating between days as required. Light-curve information is provided for t = -19 to +330 rest-frame days; for epochs before t = -19 days, the SN flux is assumed to be zero.

We also incorporate the observed relationship between stretch and color from Knop et al. (2003), which describes the variation in SN rest-frame U - B, B - V, V - R, and R - I colors as a function of stretch. For a given epoch, the spectral template is adjusted to have the colors for a given stretch using a spline that smoothly scales the spectrum as a function of wavelength. Extinction is applied to the altered template using the reddening law of Cardelli et al. (1989) updated in the near-UV by O'Donnell (1994), with  $R_V = 3.1$ , first on the rest-frame spectrum with  $E_{B-V}^{\text{host}}$  and then on the redshifted spectrum with  $E_{B-V}^{\text{mw}}$ . We use the filter responses of Bessell (1990) and the  $\alpha$ -Lyrae spectra energy distribution of Bohlin & Gilliland (2004) to perform a conversion to the AB system when required.

## 2.3. Fitting Technique

For each SN candidate, we need to perform a fit to the *n* observed flux values *O* with uncertainty  $O_{err}$  that depend on the filter *T* used for the observation and the time of the observation  $t_i$ . We calculate how well a given model matches the observed data using the  $\chi^2$  statistic, i.e.,

$$\chi^{2} = \sum_{i=1}^{n} \left\{ \frac{\left[O_{i} - f_{T}\left(T_{i}; z, t_{i} - t_{\max}, s, E_{B-V}^{\max}, E_{B-V}^{\text{host}}\right)\right]}{O_{i}^{\text{err}}} \right\}^{2},$$
(4)

where  $f_T$  is defined in equation (2). Our task is to derive the model parameters *z*, *s*,  $t_{max}$ , and  $E_{B-V}^{host}$  that best fit the data, i.e., that minimize  $\chi^2$ . While a grid search in  $\chi^2$  space is possible, in practice, with the number of free parameters in the model and typically a large number of potential SNe to fit, such a procedure becomes too time consuming for "real-time" operation.

Instead, the best-fitting model templates are located using MPFIT,<sup>14</sup> a robust nonlinear least-squares fitting program written in the IDL programming language translated from the MINPACK-1 FORTRAN package (Moré et al. 1980). The parameter  $E_{B-V}^{mw}$  is taken from the dust maps of Schlegel et al. (1998) and held fixed in the model. The outputs from this procedure are the best-fitting parameters of redshift, stretch, and epoch, and optionally  $E_{B-V}^{host}$ . An additional parameter, termed a "dispersion magnitude" (dm), which is added to or subtracted from the effective *B*-band magnitude of a model SN, is also fitted. Physically, this accounts for the dispersion in light-curve-shape-corrected peak magnitudes

seen in local SN samples of ~0.17 mag; in our fits, this value is allowed to vary from -0.2 to 0.2 mag but is not used further in the analysis. The other fit parameters are allowed to vary over the following ranges: 0.6 < s < 1.4, 0.05 < z < 1.4, and  $-0.10 < E_{B-V}^{\text{host}} < 0.30$ , representing the typical parameter range of SNe Ia found in rolling searches.

Once a first fit has been performed, the observed data are trimmed to only include data lying in the rest frame to +30 days, the epoch to which stretch is most effective (Goldhaber et al. 2001). Once a first redshift estimate is made, data in an observed filter that corresponds to rest-frame *R* or redder (where the current stretch technique is known to have limitations) are excluded from future iterations. For the Sloan Digital Sky Survey (SDSS) filter system, this implies that if the predicted redshift is less than 0.50, z' data are excluded from the second-iteration fit.

### 3. TESTING ON SIMULATED SURVEY DATA

We now test the performance of the SN selection technique described above on simulated data sets as a consistency check that our technique can successfully recover the input parameters of fake SNe Ia and determine their properties without any bias and that a basic discrimination between SNe Ia and core-collapse SNe can be made. We generate both SNe Ia and core-collapse SNe in this simulation according to the design of the SNLS.

#### 3.1. SNLS Survey Design

The CFHT Legacy Survey (CFHT-LS) began in 2003 June using the queue-scheduled wide-field imager MegaCam on the CFHT on Mauna Kea. MegaCam consists of 36 2048 × 4612 pixel CCDs covering a  $1^{\circ} \times 1^{\circ}$  field of view. CFHT-LS comprises three separate surveys (deep, wide, and very wide), with the SNLS exploiting data from the deep component. This component of the survey conducts repeat observations of four lowextinction fields distributed in right ascension (Table 1).

In a typical month, each available field is imaged on five epochs in a combination of g'r'i'z' filters that closely match those used for the photometric calibration of the SDSS. Observations in r'i'are always taken, and g'z' observations are arranged according to the lunar phase. The typical breakdown in exposure times for each field is given in Table 2; in general, each of the epochs are spaced 4–5 days apart ( $\sim$ 3 days in a typical SN rest frame; u'data of the fields are also taken but are not time sequenced, as they are not used for the SN light curves). Each field is typically observed for 4–5 continuous months, plus a final month (with fewer epochs) to complete light curves, resulting in around 20 "field-months" in a calendar year. The queue-scheduled nature of the observations provides a powerful protection against inclement weather, with the result that very few epochs are totally lost; most months have received the full allocation of five observation epochs per field. Consequently, high-quality, multifilter,

<sup>&</sup>lt;sup>14</sup> See http://cow.physics.wisc.edu/~craigm/idl/idl.html.

 TABLE 2

 Exposure Times and Epochs for a Typical Month in the SNLS

	Exposure Times (s)					
Filter	Epoch 1	Epoch 2	Epoch 3	Epoch 4	Epoch 5	
g' <sup>a</sup> r' i' z'	$5 \times 225$ $5 \times 300$ $7 \times 520$ $10 \times 360$	5 × 300 5 × 360	$5 \times 225$ $5 \times 300$ $7 \times 520$ $10 \times 360$	$5 \times 225$ $5 \times 300$ $5 \times 360$ 	$5 \times 300 \\ 7 \times 520 \\ 10 \times 360$	

Notes.—The approximate days with respect to the new moon for each epoch are -8 for epoch 1, -1 for epoch 2, 0 for epoch 3, +4 for epoch 4, and +8 for epoch 5.

<sup>a</sup> For the g' filter, epochs 1 and 2 and 4 and 5 can be exchanged depending on moon position. From 2005 August, four g' epochs have been obtained.

continuous light curves for each SN candidate lasting many months are routinely obtained.

#### 3.2. Simulating the SNLS

We generate synthetic data sets as follows. For SNe Ia, events are drawn randomly from a population with truncated Gaussian distributions in redshift ( $\overline{z} = 0.6$ ,  $\sigma = 0.4$ ,  $z_{\min} = 0.15$ , and  $z_{\max} = 1.05$ ), stretch ( $\overline{s} = 1$ ,  $\sigma = 0.25$ ,  $s_{\min} = 0.6$ , and  $s_{\max} =$ 1.4), dispersion in peak magnitude ( $\overline{dm} = 0$  and  $\sigma = 0.17$ ), and host galaxy extinction ( $\overline{E_{\text{host}}^{\text{host}} = 0$ ,  $\sigma = 0.2$ , and  $E_{R_{\text{out}}}^{\text{host}} > -0.1$ ).

host galaxy extinction ( $\overline{E_{B-V}^{\text{host}}} = 0$ ,  $\sigma = 0.2$ , and  $\overline{E_{B-V}^{\text{host}}} > -0.1$ ). In contrast to SNe Ia, core-collapse SNe are quite heterogeneous events, with a large variation in their light curves, spectra, colors, and peak magnitudes; currently, there is no well-established unifying scheme [cf. stretch or  $\Delta m_{15}(B)$  for SN Ia] for the spectral and light-curve observations (although hints of a relationship between light-curve shape and luminosity have been observed for SNe Ic; Stanek et al. 2005). Nonetheless, we attempt to simulate them here using what little data are currently available in the literature, with the caveat that our simulations may not represent the full range of core-collapse SNe that could be observed.

We generate four subtypes of core-collapse SNe, all based on spectral templates constructed by one of us (P. E. N.). For SN Ib/c, we use the spectral templates<sup>15</sup> described in Levan et al. (2005), and our spectral templates for SN IIL and SN IIP are similar to those used in Gilliland et al. (1999). We also created a SN IIn template based on SN 1999el (Di Carlo et al. 2002). The peak absolute magnitudes and dispersions for the core-collapse SNe are taken from Richardson et al. (2002); Gaussian distributions are again assumed. The other parameters defining the core-collapse population are truncated Gaussians: redshift ( $\overline{z} = 0.5$ ,  $\sigma = 0.3$ ,  $z_{\min} = 0.05$ , and  $z_{\max} = 0.6$ ) and host galaxy extinction ( $\overline{E}_{B-V}^{host} = 0$ ,  $\sigma = 0.3$ , and  $E_{B-V}^{host} > -0.2$ ). These values differ from those used for the SNe Ia and reflect their intrinsic faintness when compared to SNe Ia and the likely increased dust extinction on these events (due to their association with recent star formation).

The simulations use an observational cadence similar to that of the SNLS, i.e., five observation epochs spread over 16 daylong observing periods centered around new moon (Table 2). Any given epoch has a 15% chance of being totally lost due to external factors, such as long periods of adverse weather. For each of these epochs, the rest-frame template SN spectrum is adjusted for the stretch-color relationship (for SNe Ia only) and

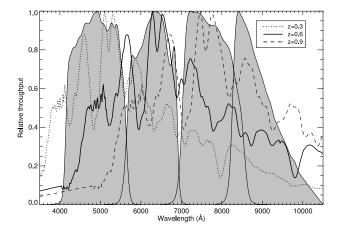


Fig. 1.—Mean effective responses of the  $g'_i$   $r'_i$   $i'_i$  and z' filters used in CFHT-LS, shown shaded left to right in the figure. The filter responses are those measured by CFHT, additionally multiplied by the reflectivity of the primary mirror, the throughput of the wide-field corrector optics, and the typical MegaCam CCD quantum efficiency. Plotted underneath is a maximum-light s = 1 SN Ia spectrum at redshifts of 0.3 (*dotted line*), 0.6 (*solid line*), and 0.9 (*dashed line*), spanning the range of SNe Ia followed by the SNLS. The SN template is a revised version from Nugent et al. (2002).

additional dispersions in SN color are added, accounting for the natural variation in SN properties. For SNe Ia, the  $\sigma$ -values of the dispersions used are 0.08 mag for U - B and 0.03 mag for B - V, V - R, and R - I. These dispersions are those intrinsic to SNe Ia after stretch-color relations have been applied. The increased dispersion in U - B over the other colors reflects the increasing sensitivity of the bluer passbands to chemical abundances (e.g., Höflich et al. 1998, 2000; Lentz et al. 2000) and represents the broad range of observed values found in the literature (Nobili et al. 2003; Knop et al. 2003; Jha et al. 2005). For core-collapse SNe, the dispersions we use are 0.20 mag for U - B and 0.15 mag for B - V, V - R, and R - I. The increased values are deliberately conservative and represent our relatively poor knowledge of core-collapse SNe.

The SN spectrum is then scaled to the expected effective *B*-band magnitude for that phase (assuming an  $\Omega_M = 0.30$ ,  $\Omega_{\Lambda} = 0.70$  cosmology), the stretch-luminosity relationship and the dispersion in peak magnitude from *dm* are applied, host extinction is applied. The spectrum is redshifted, and finally Milky Way extinction is applied. The spectrum is then integrated through the SNLS filters to generate an apparent magnitude in each filter and the MegaCam zero points used to calculate the counts in that filter given the exposure times listed in Table 2. The MegaCam filter responses are those measured and provided by CFHT and are additionally multiplied by the reflectivity of the CFHT primary mirror, the throughput of the wide-field corrector plus optics and the average MegaCam CCD quantum efficiency. These effective filter responses can be seen in Figure 1, together with a typical SN Ia spectrum at a range of redshifts typical of SNLS candidates.

Poisson noise, a filter-dependent sky noise (measured from real data in dark and gray sky conditions), and a filter-dependent systematic "flat-field error" noise are added to the predicted counts, and the counts converted back into fluxes using the original zero point but with an additional zero-point uncertainty ( $\sigma = 0.05$  mag) applied, typical of that present in *real-time* SNLS data (the zero-point uncertainty for the final photometry is 0.02 mag or less; see Astier et al. 2005). Additional systematic noise is added to the z' (and a smaller amount in i') data to account for the imperfect fringe correction in real-time data. The result is a set of observations that should closely match real SNLS

<sup>&</sup>lt;sup>15</sup> The templates can be obtained at http://supernova.lbl.gov/~nugent/nugent\_ templates.html.

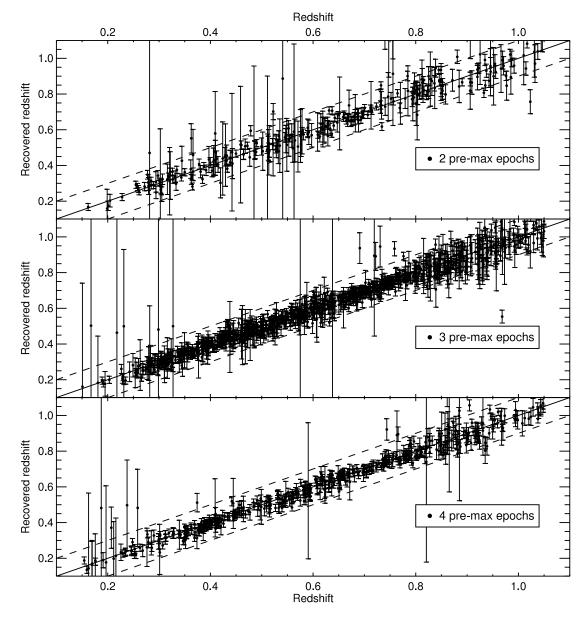


Fig. 2.—Results of the SN selection code run on a synthetic data set of 2000 SNe Ia generated with observational parameters similar to those found in the SNLS (see § 3.2 for simulation details). This figure shows the comparison of actual and recovered redshift and how this varies depending on the number of pre-maximum-lightcurve epochs used in the fit, excluding pre-SN explosion epochs, from two (*top*) to four epochs (*bottom*). Only pre-maximum-light data (including epochs of nondetections) are used when recovering the redshift. On each epoch, three filters are observed, either q'r'i' or r'i'z'.

data. These synthetic SN observations are then passed to the SN selection code, and the code is run to locate the best-fitting SN parameters. This experiment was repeated for 2000 synthetic SNe. The final population of SNe has the following percentage composition: 50% SNe Ia, 25% SN Ib/c, 8% SN IIL, 8% SN IIP, and 8% SN IIn.

#### 3.3. Simulation Results for SNe Ia

We now examine the results of the fits to the simulated SN Ia photometry (the core-collapse SNe are discussed in § 5). In Figures 2 and 3 we compare the results of the input and recovered SN Ia parameters. This figure shows the comparison of actual versus recovered redshift and the difference in the recovered stretch and *dm* parameters. We also show how the accuracy of the recovered parameters depends on the number of data epochs in the SN light curve that are available at the time of fitting (i.e., two, three, or four pre-maximum-light epochs). The mean and standard deviations of these distributions are shown in Table 3. Fits made to the entire light curve were also run (i.e., including post-maximum-light data); the results were very similar to Figure 2, with the exception that the distributions in stretch and dm are significantly tighter (see Table 3), as would be expected when there is more information available to constrain these parameters.

For these synthetic, normal SNe Ia, the SN selection code appears capable of recovering their parameters without any apparent bias, even when only considering pre-maximum-light data and when unknown zero-point uncertainties and dispersions in the SN properties are included. Furthermore, the estimates of redshift are good to  $\leq 0.1$  even when only two pre-maximum-light-curve epochs are used in the fits.

However, these SN Ia simulations do not address three important questions. First, do our synthetic SNe Ia successfully represent normal observed SNe Ia? Is the code capable

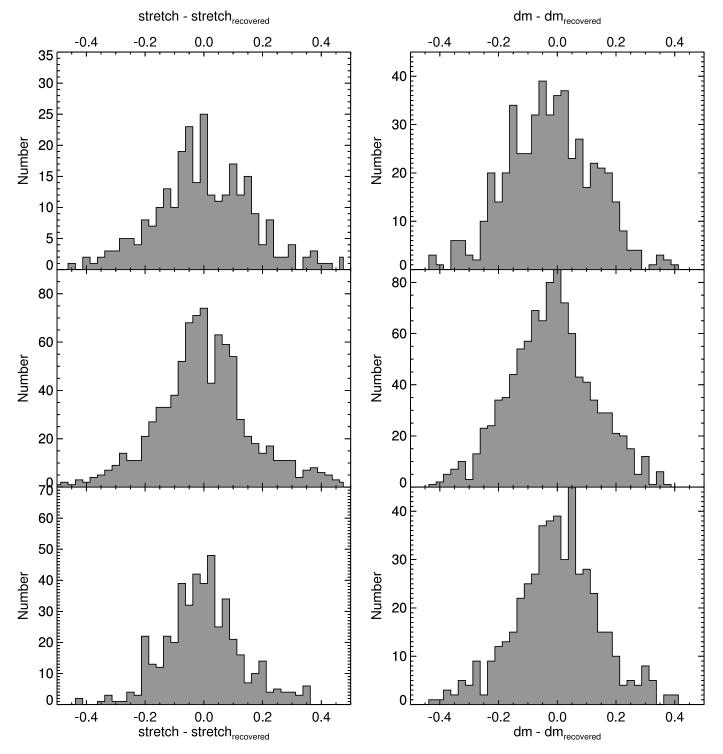


Fig. 3.—Same as Fig. 2, but showing the distributions of actual minus recovered stretch (left) and actual minus recovered dm (right).

of recovering all types of SNe Ia without any bias against certain parts of SN Ia parameter space? Although our simulations generate SNe Ia that should encompass the full observed range of low-redshift SN Ia properties, the possibility that some characteristics of SNe Ia are not represented, or that the code may reject them as SNe Ia, cannot be ignored. Second, is our selection technique capable of distinguishing non-SN Ia events (e.g., core-collapse SNe) from true SN Ia events based on earlytime data (of great importance in a rolling search)? Third, does the choice of the cosmology used in the light-curve fit (eq. [3]) bias the SNe Ia that are selected for spectroscopic follow-up? We address these questions in  $\S\S$  4 and 5 using both the simulations described above and empirical data on spectroscopically confirmed SN events discovered via the SNLS. In  $\S$  4 we describe the relevant aspects of the SNLS, and we discuss the results of the application of the SN selection code to the SNLS in  $\S$  5.

## 4. APPLICATION TO THE SNLS

In this section we describe the application of the SN selection code to real-time data obtained as part of the SNLS. The results

 TABLE 3

 Actual Minus Recovered SN Parameters for the 2000 Synthetic SNe Ia

	Simple		OUTLIER RESISTANT	
PARAMETER	Mean	σ	Mean	$\sigma$
Pre-Ma	ximum-Light-C	Curve Epochs	Only	
$z - z_{\text{recovered}}$	0.098	0.240	0.007	0.025
$s - s_{\text{recovered}}$	0.204	0.423	0.015	0.131
$dm - dm_{\rm recovered}$	-0.004	0.144	-0.004	0.140
	Entire Ligh	nt Curve		
$z - z_{\text{recovered}}$	0.006	0.041	0.007	0.022
s-s <sub>recovered</sub>	0.041	0.099	0.021	0.044
$dm - dm_{\rm recovered}$	0.010	0.142	0.012	0.132

of the analysis, and a comparison with the simulations of  $\S$  3, are then described in  $\S$  5.

## 4.1. SNLS Real-Time Data Reduction

A real-time reduction of the data is automatically performed by the CFHT-developed Elixir data reduction system (Magnier & Cuillandre 2004),<sup>16</sup> which performs basic detrending of the images, including bias-subtraction, flat-fielding, and a basic fringe subtraction in the i' and z' filters. This real-time analysis is somewhat different from that of the final Elixir reductions released through the Canadian Astronomy Data Centre.<sup>17</sup> Final processed data are able to use all data taken during a given queue run to construct master flat fields and fringe frames, which is not possible in real time when library versions of these calibration frames from the previous queue run are used. In particular, flatfielding and, in the case of z' data, fringe subtraction are both inferior in real-time data.

The Elixir-reduced data are then processed through two independent search pipelines, written by members of the SNLS collaboration in Canada and France, from which combined candidate lists are generated. The two pipelines typically produce candidate lists that agree at the 90% level down to  $i' \simeq 24.0$ . In this paper we refer exclusively to the Canadian pipeline, although the details of the French pipeline are similar in most respects. Full details of these reductions will be presented in forthcoming papers; here we present a brief overview. We perform a photometric alignment to secondary standards within each field using a multiplicative scaling factor and astrometrically align the data in different filters using custom-built astrometric reference catalogs. Finally, the frames are resampled to a common pixel coordinate system, and a median stack in each filter is generated, rejecting cosmic-ray events and other chip defects.

The point-spread functions (PSFs) of the image stack and the deep reference image constructed from observations from the previous year are matched using a variable kernel technique, and a subtraction image generated containing only sources that have varied since the reference epoch. This subtraction image is searched for SN candidates using automated techniques, with all likely candidates screened by a human eye to ensure that obviously nonstellar sources are not included on the potential candidate follow-up list. PSF-fitted and aperture photometry for all new and previously detected sources is measured, and the flux information stored in a publicly available database of all SN candidates.<sup>18</sup> New candidates are automatically cross-correlated with the database of existing variable sources (to identify previously known AGNs and variable stars) and back-tracked through previous epochs in order to construct as much information as possibleabout their nature. In addition, each candidate is given a provisional category of either likely SN, likely AGN (if the detection is precisely centered and appears intermittently over long periods of time), likely variable star (if the candidate host appears stellar and PSF-like), or likely moving object (if the candidate moves between epochs). Where any reasonable doubt exists, the SN classification is retained. The result is a database of flux information for every variable candidate detected in the SNLS.

Spectroscopic follow-up for the SNLS is currently provided by dedicated follow-up programs on the European Southern Observatory Very Large Telescope (VLT; 60 hr period<sup>-1</sup>) and the Gemini North and South (60 hr semester<sup>-1</sup>) and Keck I and II telescopes (four nights in the "A" semester of each year), as well as other programs at Keck I making detailed studies of select SNe (four to eight nights a year). During the time frame covered by this paper, the VLT observed 61 candidates (S. Basa et al. 2006 in preparation), Gemini observed 40 candidates (Howell et al. 2005), and Keck observed 21 candidates, 7 as part of routine follow-up and 14 for a detailed study program (R. Ellis et al. 2006 in preparation) Some candidates were observed on more than one occasion. Full details of the reductions and SN-typing methods employed can be found in the papers referenced above. Typically, redshifts are determined from host galaxy spectral emission or absorption features or via a  $\chi^2$  template matching technique to a large library of local SN spectra of all types (Howell et al. 2005).

#### 4.2. Analysis

The photometry and candidates that we use in this analysis are taken from the Canadian real-time analysis corresponding to the period 2004 May to 2005 January, or approximately three "field seasons." Over this period, the SN selection code was used to assist in the selection of spectroscopic follow-up candidates. We located 440 potential SN candidates with our real-time analysis software (excluding likely AGNs and variable stars), of which 121 were followed spectroscopically. Of these, 70 have since been identified as SNe Ia or probable SNe Ia (hereafter denoted SNe Ia\*), six as being consistent with an SN I, 11 as SNe II, and four as SN Ib/c. Thirty candidates remain unidentified or are non-SN events. During this period, in order to test the SN selection code, in some months we deliberately followed events that were predicted *not* to be SNe Ia to ensure that we were not biasing against particular classes of SN Ia events.

For this analysis, we run the SN selection code on all SN candidates discovered during this period (fixing  $E_{B-V}^{mw}$  as appropriate for each candidate), first fitting on the entire real-time light curve and second fitting just the data that were available at the time the follow-up decision was made. This exact date was not accurately recorded or easily reconstructed for all events; we approximate this by cutting off the real-time light curves at 2 days before maximum light in the SN rest frame. Clearly, this cut restricts us to only consider candidates with at least two epochs prior to 2 days before maximum light, ~95% of the total SN Ia sample; furthermore, the approximation may lead to some fits

<sup>&</sup>lt;sup>16</sup> See http://www.cfht.hawaii.edu/Instruments/Elixir/.

<sup>&</sup>lt;sup>17</sup> See http://cadcwww.dao.nrc.ca/.

<sup>&</sup>lt;sup>18</sup> See http://legacy.astro.utoronto.ca/.

using more data (and some less) than were actually used at the time the follow-up decision was made.

## 5. RESULTS

## 5.1. Discriminating Core-Collapse SNe from SNe Ia

We first examine the non-SN Ia events located by the SNLS. One important requirement of the SN selection technique is to not only return the most likely parameters describing an SN based on fitting the real-time light curve to a normal SN Ia model but also to return some indication of the likelihood that the target is indeed a normal SN Ia. As fits to non-SNe Ia should be of lower quality, we examine the  $\chi^2$  of the light-curve fits to examine whether it can be used as a reliable indicator.

The most common form of contamination in our sample comes from core-collapse SNe. While AGNs and variable stars are obviously present, they are usually easily screened out, as they show significant variation on the timescale of a year and are usually already present in our database of variable objects. Core-collapse SNe—the various subclasses of SNe II and SNe Ib/c—are heterogeneous; the range in peak magnitudes (Richardson et al. 2002), spectra (Matheson et al. 2001), and colors can be considerable. The general trend, however, is that for a core-collapse SN and a SN Ia located at the same redshift, the core-collapse SN will be fainter than the SN Ia. Typical SNe II are 1-2.5 mag fainter at peak than SNe Ia, and typical SNe Ib/c around 1.5 mag fainter (see Table 1 in Richardson et al. 2002), although there are examples of more luminous or peculiar events in the literature (e.g., Germany et al. 2000; Turatto et al. 2000).

Our SN Ia selection technique uses both this peak magnitude information and the color of the observed light curve, fitting a given candidate for redshift, phase, stretch, extinction, and dispersion in the peak magnitude under the assumption that the object is an SN Ia in an assumed cosmology. This places a constraint on the redshift that can be fitted (as SNe Ia are calibrated candles and have similar intrinsic luminosities) and hence restricts the range of observed colors that are consistent with an SN Ia as a function of SN brightness. We demonstrate this in Figure 4, in which we show the redshift evolution in the color of an SN Ia and two example models for an SN II (in this case an SN IIP and

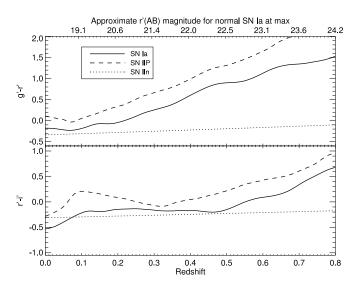


FIG. 4.—Observed g' - r' and r' - i' colors of SNe Ia compared to some SNe II models as a function of redshift. As SNe Ia typically appear 1–2 mag brighter than SNe II located at the same redshift, the strong evolution in SN Ia g' - r' color with redshift provides a strong discriminant against core-collapse SNe, which appear too blue for a redshift based on a SN Ia fit.

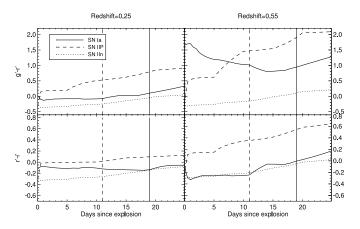


FIG. 5.—Observed g' - r' and r' - i' colors of SNe Ia compared to some SNe II models as a function of rest-frame phase of the SN. Two redshifts are shown; z = 0.25 and 0.55. Note that SNe II and SNe Ia peak at different times after explosion; these are indicated with different vertical lines in the figure.

an SN IIn), and Figure 5, in which we show the evolution of SN colors as a function of phase. The SN Ia template is that discussed in § 2.2, and the core-collapse templates are described in § 3.2.

Consider a SN IIP at maximum light located at z = 0.25 with  $g' - r' \sim 0$  and  $r' \sim 23$ . Although the color is also consistent with a maximum-light SN Ia at the same redshift (Fig. 4), the peak magnitude of the SN IIP is around 2 mag fainter than an SN Ia would be  $(r' \sim 21)$ . This  $r' \sim 23$  peak magnitude *is* consistent with an SN Ia at  $z \simeq 0.55$ ; however, at this redshift the g' - r' color of a normal SN Ia is  $\sim 1$  mag redder. Hence, SNe II (and other core-collapse events) can potentially be screened out by searching for objects that appear too blue in g' - r' for the fitted redshift when compared to the SN Ia model, or more precisely, by rejecting objects that have a large  $\chi^2$  per degree of freedom (dof) in the g' band from the SN Ia fit. A measurement of color at exactly maximum light is not required; the same trend is apparent up to about 20 days after explosion (Fig. 5).

The distributions of  $\chi^2$  in the g' band from our pre-maximumlight fits to the simulated and real SNLS candidates are shown in Figure 6. Example light-curve fits to both real SNe Ia and real core-collapse SNe are shown in Figure 7. As expected, the SNe Ia and core-collapse SNe have quite different distributions, both for the simulated survey data and for the real survey data. SNe Ia typically have a small  $\chi^2$ ; the median value is 0.85 (1.01 for the simulated data), and 90% of SNe Ia have  $\chi^2 < 2.80$ ( $\chi^2 < 2.91$  in the simulations). Only 1% (0.9% in simulated data) have  $\chi^2 > 5$ .

The  $\chi^2$  for core-collapse SNe is typically larger, with 10 of 11 events having  $\chi^2 > 5$ ; all SNe II have  $\chi^2 > 5$ . The numbers for the fits to the simulated SNe are similar; 80% of simulated core-collapse SNe have  $\chi^2 > 5$ . Thus, the  $\chi^2$  in the observed g' filter seems an efficient discriminant with which to remove the majority of core-collapse SNe from spectroscopic follow-up samples.

#### 5.2. Redshift and Phase Precision

The accuracy to which redshift and phase can be estimated are important quantities; the first allows an optimal spectrograph setting to be used, and the second ensures that SNe are observed at a phase at which the different subtypes show the most diversity and have the greatest contrast over their host galaxy. Here we investigate how well the predicted redshifts and phases of the SNe Ia agree with actual values.

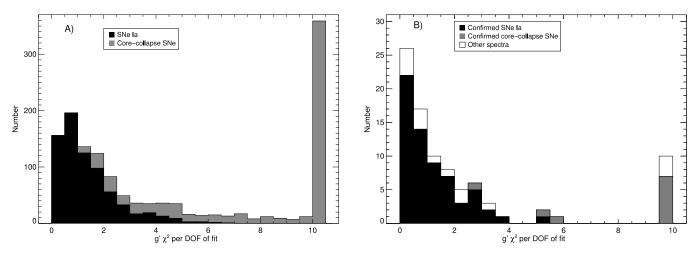


FIG. 6.—Distribution of  $g' \chi^2 \text{ dof}^{-1}$  for (*a*) the fits of all SN candidates for the simulations (§ 3) and (*b*) for real SNe discovered by SNLS. In (*a*) "core-collapse SNe" represent all the various subtypes of core-collapse SNe as described in the text. In (*b*), "confirmed SNe Ia" are those SNe identified as either Ia or Ia\* from their spectra, "confirmed core-collapse SNe" are those identified as any variant of a SN II, and "other spectra" includes any other object observed spectroscopically regardless of the type of object.

The photometric redshift  $(z_{phot})$  versus spectroscopic redshift  $(z_{spec})$  comparison for all spectroscopically observed objects for which  $z_{spec}$  could be determined is shown in Figure 8. The plot is based on fits to just the data that were available at the time the follow-up decision was made (taken as pre-maximum-light data).

The agreement between  $z_{\text{phot}}$  and  $z_{\text{spec}}$  for SNe Ia is remarkably good. The median  $|\Delta z|/(1 + z_{\text{spec}})$  is 0.031, with 90% of the SNe Ia having  $|\Delta z|/(1 + z_{\text{spec}}) < 0.08$ . The agreement for other SN types is, as expected, much poorer, as the differing colors, light-curve shapes, and brightnesses of these SNe lead to an incorrect redshift estimate. However, most of these corecollapse candidates are rejected by the code as being SNe Ia due to the  $\chi^2$  of the fits; such rejected SNe are marked on Figure 8.

As a comparison, Figure 9 shows  $z_{phot}$  versus  $z_{spec}$  for fits based on the entire SN light curve; here the median  $|\Delta z|/(1 + z_{spec})$  is 0.025. Note that the apparent high accuracy of this technique does not mean that spectroscopic redshifts are not needed for cosmological analysis; clearly, as a cosmology is assumed in order to derive the fitted redshift, this redshift could not then be used to rederive cosmological constraints. Furthermore, as the nature of the events are not known to be SNe Ia a priori and the assumed cosmology is a very useful prior when identifying the core-collapse SNe, the technique could not be used to derive cosmological constraints (as can be done in some lowredshift SN Ia samples; e.g., Barris & Tonry 2004) without a significant improvement in our knowledge of the color evolution and light-curve morphology of core-collapse SNe.

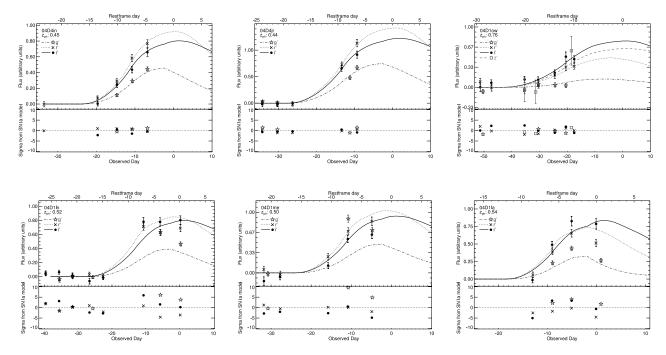


FIG. 7.—Example light-curve fits to early real-time photometry. In all cases the light curves are fitted to an SN Ia model, with the phase, redshift, and stretch free parameters in the fit as described in the text. The top panels show fits to known SNe Ia; from left to right, these are 04D4in (z = 0.52), 04D4jr (z = 0.48), and 04D1ow (z = 0.92). The bottom panels show fits to known core-collapse SNe; from left to right, these are 04D1ln (SN IIP; z = 0.21), 04D1me (SN IIP; z = 0.30), and 04D1la (SN Ib/c; z = 0.32). In all cases, the deviations from the SN Ia model are significantly larger for the core-collapse SNe, allowing an efficient identification of such objects based on the  $g' \chi^2$ .

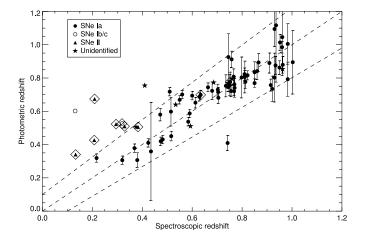


FIG. 8.—Comparison between  $z_{\text{phot}}$  and  $z_{\text{spec}}$  for the candidates followed as part of the SNLS. The photometric redshifts are from the SNe and are based on pre-maximum-light data only. The SNe are coded according to the type of the event, and those events that would have been removed from our follow-up sample based *purely* on the  $g' \chi^2 (\text{dof}^{-1})$  from the SN Ia fit are boxed with a diamond. The two rejected SNe Ia have only poor-quality pre-maximum-light data; in reality, more data were utilized for these candidates before a follow-up decision was made. The  $z_{\text{phot}}$  errors are those reported by the least-squares minimizer. The overplotted dashed lines show a 1:1 correspondence between  $z_{\text{phot}}$  and  $z_{\text{spec}}$ , as well as  $\pm 10\%$  in (1 + z). The assumed cosmology is  $\Omega_M = 0.25$ ,  $\Omega_{\Lambda} = 0.75$ , and the SNe Ia include both Ia and Ia<sup>\*</sup> events.

The distribution of the predicted date of maximum light versus the date of maximum light based on the entire light curve is shown in Figure 10 (as before, predicted values are only based on candidate light curves up to 2 rest-frame days before maximum light). The agreement is good, with 50% of the predicted times of maximum light lying within  $\pm 1.75$  rest-frame days of the actual date of maximum light and 90% lying within  $\pm \sim 4$  days.

#### 5.3. Effect of Assumed Cosmology

In this section we investigate any possible bias in the population of objects that would be selected for spectroscopic follow-up based on the "assumed" cosmology used in the light-curve fit. We repeat the SN selection fits on the real survey data using a different cosmological model and compare the identity of the rejected candidates with those rejected when using the standard cosmology.

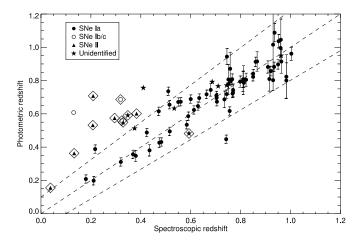


FIG. 9.—Same as Fig. 8, but using the entire light curve in the fit rather than just the pre-maximum-light data. Note that more SNe appear on this plot than on Fig. 8, as this plot includes SNe for which there are no pre-maximum-light data.

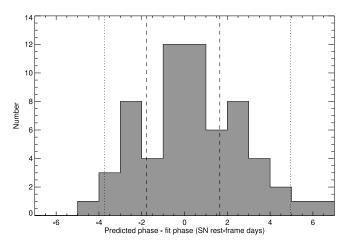


FIG. 10.—Distribution of the predicted time of maximum light minus the actual time of maximum light in the SN rest frame. The predicted time of maximum light is based only on pre-maximum-light-curve data, i.e., the data available at the time of spectroscopic follow-up. The actual time of maximum light is based on the entire SN light curve. The vertical lines denote the region containing 50% (*dashed line*) and 90% (*dotted line*) of all candidates. Only confirmed SNe Ia (or SNe Ia\*) with spectroscopic redshifts are shown. The uncertainty on the time of maximum light from fits based on the entire light curve is  $\sim 0.5-1.0$  days.

Subtle changes in the cosmology, for example, varying the value of the equation-of-state parameter w, have no effect on the nature of the candidates that are rejected. For example, the candidates that are rejected (or selected) with w = -1 are also rejected (or selected) with w = 0.8 or w = -1.2, as the differences in the apparent magnitude/redshift relation are very small. A more drastic test is to compare to a cosmology that makes very different predictions of the apparent magnitude of an object as a function of redshift. We compare to an Einstein-de Sitter (EdS) cosmology ( $\Omega_M = 1.0$ ,  $\Omega_{\Lambda} = 0.0$ ); the apparent magnitude of a SN Ia differs by  $\simeq 0.5$  mag at z = 0.6. Any bias in the objects that are selected for follow-up by assuming an accelerating universe cosmology should be evident after these fits.

In Figure 11 we show the same  $z_{phot}$  versus  $z_{spec}$  comparison as in Figure 8, but for the EdS universe. There is a clear offset apparent in these plots; in an EdS universe,  $z_{phot}$  is found to be systematically larger than  $z_{spec}$ , and the size of this effect increases at higher redshift. This is simple to understand; in an EdS universe, objects appear brighter than in a  $\Lambda$ -cosmology at the same

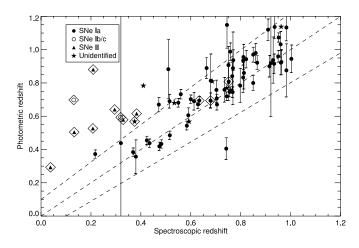


FIG. 11.—Same as Fig. 8, but assuming an  $\Omega_M = 1.0$ ,  $\Omega_{\Lambda} = 0.0$  cosmology. Changing the assumed cosmology does not alter the SNe that are rejected as being SNe Ia by the fitting code, although the agreement between  $z_{\text{spec}}$  and  $z_{\text{phot}}$ is poorer.

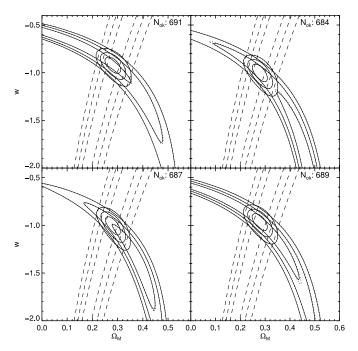


Fig. 12.—Cosmological fits in w and  $\Omega_M$  to four simulated SNLS-like SN samples with and without the few SNe Ia formally rejected by the SN selection code. Each panel represents a different SNLS-like survey; the differing positions of the contours are expected and arise from random variation from simulation to simulation. In each panel, the solid contours indicate the full sample of 700 SNLS SNe plus 300 low-redshift SNe, and the dotted lines show the same sample minus those high-redshift SNe rejected by the SN selection code. In each case, the confidence contours with and without the baryon acoustic oscillations constraint (*dashed line*; Eisenstein et al. 2005) are shown. The number in each panel indicates the number of high-redshift SNe not rejected by the selection code.

redshift. If we live in a  $\Lambda$ -dominated universe, the SN selection code will overestimate the redshift (i.e., will try to make the objects fainter) if it assumes an EdS cosmology.

The objects that are rejected based on the  $g' \chi^2$  are the same when assuming an EdS universe as when assuming a  $\Lambda$ -cosmology, i.e., the assumed cosmology does not place a strong constraint on the objects that are selected for spectroscopic follow-up. However, assuming a  $\Lambda$ -cosmology does improve our estimates of candidate redshifts and hence stretches and observer-frame ages, which is essential to ensure that candidates are observed at the optimal time (Howell et al. 2005). The assumed cosmology does not provide the key discriminant in rejecting non-SN Ia events but does enable a more efficient follow-up observation to be performed.

#### 5.4. Implications for Cosmological Measurements

We now examine the SNe Ia that are rejected in any cosmology, i.e., SNe Ia that have sufficiently discrepant stretches, luminosities, or colors when compared to the standard template used in the fits, or SNe for which the selection code simply fails to find the correct solution. If similar subtypes of SNe Ia were consistently rejected, this could introduce a bias in the types of SNe Ia that were sent for follow-up, with a possible consequent bias on the cosmological results that would be derived from the resulting spectroscopic sample. Alternatively, if the occasional rejections of a SN Ia were random and related to the phasing of the observations or the poor quality of a given epoch of real-time data, then the impact on the derived cosmological parameters would be very small.

We investigate this effect using a simulated data set similar to that in § 3. We generate 700 high-redshift (0.15 < z < 0.9)

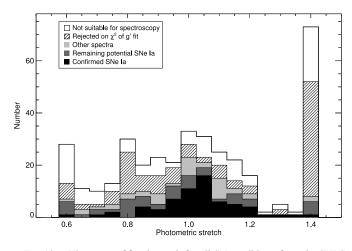


Fig. 13.—Histogram of fitted stretch for all SN candidates from the SNLS during the time period covered by this paper. "Confirmed SNe Ia" are those SNe identified as either Ia or Ia\* from their spectra, "other spectra" includes any other object observed spectroscopically that was not identified as a SN Ia, regardless of the type of object, "rejected on  $\chi^2$  of g' fit" includes all remaining objects that are rejected by the SN selection code based on the fit to the g'-band light curve, "not suitable for spectroscopy" includes all remaining objects that at maximum light either are too faint or have too low a percentage increase for a likely successful spectroscopic observation, and "remaining potential SNe" includes all remaining objects that are potentially SNe Ia not observed spectroscopically. The photometric parameters are based on photometric-redshift fits to the entire candidate light curve. The peaks at s = 0.6 and 1.4 reflect the range over which stretch is allowed to vary in the fits (0.6 < s < 1.4).

SNe Ia (the SNLS end-of-survey goal) and combine with 300 local SNe Ia (0.01 < z < 0.12), a sample size equivalent to that likely to be available at the end of the SNLS from projects such as the Carnegie Supernova Project (Freedman 2005) and the Nearby Supernova Factory (Aldering et al. 2002). The 700 highredshift SNe are fitted using the SN selection code and the premaximum-light data fit, and those SNe that are formally rejected are noted. Typically 1%-2% are formally rejected by the code, usually because of a lack of data before maximum light (due to weather in our simulations) rather than an intrinsic property of the SN. We then perform a full cosmological fit of w and  $\Omega_M$ , first on the full 700 + 300 SN Ia sample and then on the same sample less the few high-redshift SNe that were rejected by the SN selection code based on the pre-maximum-light fits. The cosmological fits follow a method similar to that used in Astier et al. (2005) and produce confidence contours in w and  $\Omega_M$ . In all cases the input cosmological values were  $\Omega_M = 0.3$  and w = -1, and a flat universe was assumed.

As each survey simulation generates different SNe, we repeat the full simulation four times; the confidence contours for the recovered cosmological parameters in  $\Omega_M$  and w are shown in Figure 12. Constraints from the baryon acoustic oscillations (BAOs) are also included (Eisenstein et al. 2005). The differences between the cosmological fits for the different samples are very small. In all cases, the difference in the derived value of w is less than 0.001 (~0.02  $\sigma$ ) when including the BAO constraints and less than 0.015 (~0.05  $\sigma$ ) when the BAO constraints are not used. We therefore conclude that the SN selection method adds no significant bias to the eventual cosmological results of the SNLS.

# 5.5. Potential SN Ia Targets Not Followed Spectroscopically

An alternative, more empirical method of how successful the SN selection code is at locating candidates for follow-up in real time is to examine the fraction of good SN Ia candidates rejected

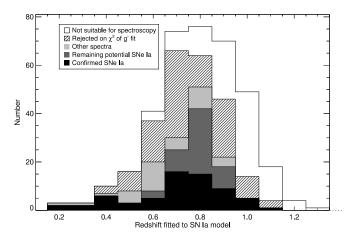


Fig. 14.—Histogram of SN Ia photometric redshifts for all candidates from the SNLS during the time period covered by this paper. The categories of objects are the same as in Fig. 13. The photometric redshift is based on fits to the entire candidate light curve under the assumption that the object is a SN Ia; clearly, for non-SNe Ia the  $z_{phot}$  value will be inaccurate. The figure shows that there are few good candidates lying at  $z_{phot} < 0.65$  that were rejected by the selection code in the real-time analysis. Note that the redshift distribution of the candidates "rejected on  $\chi^2$  of g' fit" is not representative of the true redshift distribution of these events, as these candidates are unlikely to be SNe Ia.

by the code. The impact of these SNe on the determination of the cosmological parameters was shown to be negligible in  $\S$  5.4; however, this is also important for future studies of SNe Ia that rely on near-complete spectroscopic samples of SNe Ia being available (e.g., SN rates). We assess this by examining the distribution of the fitted SN stretches of our candidates once their light curves are complete. Virtually all normal SN Ia stretches lie in the range 0.7–1.3 (e.g., Perlmutter et al. 1999; Astier et al. 2005). SNe Ia with very different stretches have been discovered locally, for example, the broad s = 1.6 light curves of very rare SN 2001ay-like SNe (Howell & Nugent 2004) or the faint, fast-declining SN 1991bg-like objects (e.g., Filippenko et al. 1992; Garnavich et al. 2004). Although SNe such as SN 1991bg have been shown to be calibrateable as standardized candles and have been used in determinations of the Hubble constant (Garnavich et al. 2004), these classes of peculiar SNe are unlikely to be useful for cosmological studies at high-redshift; they may not follow the light-curve shape-luminosity relationship (in the case of SN 2001ay) and may be naturally selected against at high redshift due to their faintness (in the case of SN 1991bglike SNe, which are around 2 mag underluminous). In "distancelimited" surveys, which likely provide a census of all types of SNe Ia, around 65% of SNe Ia appear spectroscopically "normal" (Li et al. 2001), a number that is probably a lower limit on the number of cosmologically useful SNe, as it excludes SN 1991Tlike events that may still be calibrateable candles. This fraction will only rise in high-redshift searches, as the fainter SN 1991bglike SNe are selected against. Hence, candidates with fitted stretches outside of the range 0.7–1.3 are either unlikely to be SNe Ia or unlikely to be cosmologically useful SNe Ia, while those with 0.7 < s < 1.3 are likely to be useful SNe Ia.

Figure 13 shows the distribution of fitted stretch for all candidates (even if the spectroscopic redshift is known, redshift is not fixed in these fits). As expected, the stretches for the spectroscopically confirmed SNe Ia lie in the expected range 0.7– 1.3. Furthermore, of the candidates not selected by the code for spectroscopic follow-up, few appear to be good candidates for normal SNe Ia once objects for which a spectroscopic observation would be too challenging have been removed. Objects that were not possible to observe spectroscopically are defined as those for which the peak *i'* magnitude is >24.25, or for which the peak *i'* percentage increase over the host galaxy is <30%. (SNe that do not meet these cuts are rarely positively identified; see Howell et al. 2005.) Figure 14 shows the same objects broken down into the same categories, but the histogram is of the fitted redshift rather than the stretch. As would be expected, objects defined as too difficult to attempt spectroscopically are only found at z > 0.65, where the contrast over the host galaxy is typically smaller, as the hosts have a smaller apparent size on the sky; the angular separation between SN and host is smaller, and the SN light becomes more mixed with the galaxy light. At z < 0.65, of all the total SN candidates that were consistent with a SN Ia, only ~5% were not followed spectroscopically where an observation would have been possible.

## 6. SUMMARY

In this paper we have presented a selection technique for highredshift supernovae searches that can be used to identify SNe Ia after only two to three epochs of multiband photometry. Using both simulated SN data and the SNLS real-time data as a test case, we have shown that the technique is able to discriminate between SNe Ia and core-collapse SNe (SNe II and SNe Ib/c) based on the quality of the fit in the g' filter. For SNe Ia, the technique accurately predicts the redshift, phase, and light-curve parameterization of these events to a precision of  $|\Delta z|/(1 + z_{spec}) < 0.09$  in redshift and  $\pm 2-3$  rest-frame days in phase, and there is no apparent bias on cosmological parameters derived using SNe Ia selected in using this method.

The technique is now routinely used within the SNLS to help select priority candidates for spectroscopic follow-up and confirmation as SNe Ia for use as standard candles in the derivation of cosmological parameters (Astier et al. 2005); the improvement in spectroscopic success the method brings is discussed elsewhere (Howell et al. 2005). These techniques will be used in other current and future surveys, which are likely to be "spectroscopically starved," with many more candidates than can be followed up.

The obvious extension to this method will be when "final" data (vs. the real-time data used here) become available for SNLS. With many of the real-time uncertainties removed and a highquality fringe subtraction capable of removing systematics, this SN selection technique will provide a logical method for determining the types and redshifts for the many hundreds of SNe that it is not possible to observe spectroscopically, particularly when combined with photometric redshifts for the host galaxies that will be routinely available for the CFHT-LS deep fields. Such a combination of data would allow a calculation of the rates of all SN types out to z = 1.

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