

# Detecting strongly-lensed type Ia supernovae with LSST

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## ABSTRACT

Strongly-lensed supernovae are rare and valuable probes of cosmology and astrophysics. Upcoming wide-field time-domain surveys, such as the Vera C. Rubin Observatory’s Legacy Survey of Space and Time (LSST), are expected to discover an order-of-magnitude more lensed supernovae than have previously been observed. In this work, we investigate the cosmological prospects of lensed type Ia supernovae (SNIa) in LSST by quantifying the expected annual number of detections, the impact of stellar microlensing, follow-up feasibility, and how to best separate lensed and unlensed SNIa. We simulate SNIa lensed by galaxies, using the current LSST baseline v3.0 cadence, and find an expected number of 44 lensed SNIa detections per year. Microlensing effects by stars in the lens galaxy are predicted to lower the lensed SNIa detections by  $\sim 8\%$ . The lensed events can be separated from the unlensed ones by jointly considering their colours and peak magnitudes. We define a ‘gold sample’ of  $\sim 10$  lensed SNIa per year with time delay  $> 10$  days,  $> 5$  detections before light-curve peak, and sufficiently bright ( $m_i < 22.5$  mag) for follow-up observations. In three years of LSST operations, such a sample is expected to yield a 1.5% measurement of the Hubble constant.

**Key words:** gravitational lensing: strong – supernovae: general – methods: statistical

## 1 INTRODUCTION

When a supernova (SN) is positioned behind a massive galaxy or cluster, it can be gravitationally lensed to form multiple images. Such an event is a rare phenomenon that can give valuable insights into high-redshift SN physics, substructures in massive galaxies, and the cosmic expansion rate. An absolute distance measurement between the observer, lens and SN can be made using the arrival time delays between the appearance of the multiple images, combined with a model for the gravitational potential of the lens galaxy and line-of-sight structures (Refsdal 1964). This distance measure can be converted into the Hubble constant ( $H_0$ ) – the present-day expansion rate of the Universe. The exact value of the Hubble constant is an unresolved question, with different techniques yielding different results. Measurements from the cosmic microwave background (CMB) radiation (Planck Collaboration et al. 2018) are in  $5\sigma$  tension

with local observations from Cepheids and type Ia supernovae (SNIa) (Riess et al. 2021) and from gravitationally-lensed quasars (Wong et al. 2020). It is worth noting that several other local measurements agree with the CMB results, such as the Tip of the Red Giant Branch (TRGB), as measured by the Carnegie-Chicago Hubble Project (Freedman 2021), and the analysis of seven lensed quasars with less restrictive mass model priors by the TDCOSMO collaboration (Birrer et al. 2020).

Strongly-lensed SNe are promising probes for obtaining a measurement of the Hubble constant that is independent of the distance ladder and early Universe physics (Treu & Marshall 2016; Suyu et al. 2023). To date, seven multiply-imaged lensed SNe have been discovered. The first one, ‘SN Refsdal’ (Kelly et al. 2015), was discovered in galaxy cluster MACS J1149.6+2223 and provided an  $H_0$  measurement of  $66.6_{-3.3}^{+4.1}$   $\text{km s}^{-1}\text{Mpc}^{-1}$  (Kelly et al. 2023), where the preci-

sion was primarily limited by the cluster mass model. Four additional lensed SNe have been discovered in galaxy clusters: ‘SN Requiem’ (Rodney et al. 2021), ‘AT2022riv’ (Kelly et al. 2022), ‘C22’ (Chen et al. 2022), and ‘SN H0pe’ (Frye et al. 2023). Furthermore, two SNIa have been discovered lensed by a single elliptical galaxy: ‘iPTF16geu’ (Goobar et al. 2017) and ‘SN Zwicky’ (Goobar et al. 2023). While SN H0pe is expected to enable a precise  $H_0$  measurement, the other lensed SNe had either insufficient data or too-short time delays to usefully constrain the Hubble constant.

The study of lensed SNe is currently at a turning point, as we will go from a handful of present discoveries to an order-of-magnitude increase with the next generation of telescopes such as the Vera C. Rubin Observatory (Ivezic et al. 2008) and the Nancy Grace Roman Space Telescope (e.g., Pierel et al. 2020). In particular, the Legacy Survey of Space and Time (LSST) to be conducted at the Rubin Observatory is predicted to discover several hundreds of lensed SNe per year according to studies based on limiting magnitude cuts (Wojtak et al. 2019; Goldstein & Nugent 2017; Oguri & Marshall 2010b).

In this work, we take into account the full LSST baseline v3.0 observing strategy to quantify the expected number of lensed SNIa detections per year and investigate the properties of the predicted sample. We focus on lensed SNIa because they are especially promising for cosmology by virtue of their standardizable-candle nature, which makes them easier to identify when gravitationally magnified. Knowledge of their intrinsic brightness also helps to minimise the mass-sheet degeneracy (Falco et al. 1985; Gorenstein et al. 1988; Kolatt & Bartelmann 1998; Saha 2000; Oguri & Kawano 2003; Schneider & Sluse 2013; Foxley-Marrable et al. 2018; Birrer et al. 2021a) – a transformation of the lens potential and source plane coordinates that leaves the lensing observables unchanged. We examine the colours and apparent magnitudes of the simulated lensed SNIa sample and study how to best separate them from unlensed SNIa. Finally, we measure time delays from simulated light curves with only LSST data and show how to construct a ‘gold sample’ which is promising for follow-up observations. Our results include the effects of microlensing due to stars in the lens galaxy. Throughout this work, we assume a standard flat  $\Lambda$ CDM model with  $H_0 = 67.8 \text{ km s}^{-1}\text{Mpc}^{-1}$  and  $\Omega_m = 0.308$  (Planck Collaboration et al. 2016).

We outline our lensed SNIa simulation procedure in Sec. 2, the LSST observing strategy in Sec. 3, and the different aspects of detecting lensed SNIa in Sec. 4. Our results are presented in Sec. 5 and our discussion and conclusions in Sec. 6.

## 2 SIMULATING LENSED SNIA

With the input observing strategy from LSST baseline v3.0, we simulate a sample of lensed SNIa light curves to perform our analysis. Additionally, we simulate a sample of unlensed SNIa as a “background” population. Ancillary catalogue information such as the Einstein radius, SN image positions, time delays between images and magnifications of the lens systems are also saved and used in our work. In this section,

Parameter	Distribution
Hubble constant	$H_0 = 67.8 \text{ km s}^{-1}\text{Mpc}^{-1}$
Lens redshift	$z_{\text{lens}} \sim \mathcal{N}^S(3.88, 0.13, 0.36)$
Lensed source redshift	$z_{\text{src}} \sim \mathcal{N}^S(3.22, 0.53, 0.55)$
Unlensed source rate	$r_v(z) = 2.5 \cdot 10^{-5}(1+z)^{1.5} \text{ Mpc}^{-3}\text{yr}^{-1}$
Source position (doubles)	$x_{\text{src}}, y_{\text{src}} \sim \mathcal{U}(-\theta_E, \theta_E)$
Source position (quads)	$x_{\text{src}}, y_{\text{src}} \sim \mathcal{U}(-0.4\theta_E, 0.4\theta_E)$
<b>Lens galaxy</b>	
Elliptical power-law mass profile	
Lens centre (")	$x_{\text{lens}}, y_{\text{lens}} \equiv (0, 0)$
Einstein radius (")	$\theta_E \sim \mathcal{N}^S(5.45, 0.14, 0.63)$
Power-law slope	$\gamma_{\text{lens}} \sim \mathcal{N}(2.0, 0.2)$
Axis ratio	$q_{\text{lens}} \sim \mathcal{N}(0.7, 0.15)$
Orientation angle (rad)	$\phi_{\text{lens}} \sim \mathcal{U}(-\pi/2, \pi/2)$
<b>Environment</b>	
External shear modulus	$\gamma_{\text{ext}} \sim \mathcal{U}(0, 0.05)$
<b>Light curve</b>	
Stretch	$x_1 \sim \mathcal{N}^S(-8.24, 1.23, 1.67)$
Colour	$c \sim \mathcal{N}^S(2.48, -0.089, 0.12)$
Absolute magnitude	$M_B \sim \mathcal{N}(-19.43, 0.12)$
Milky Way extinction	$E(B-V) \sim \mathcal{U}(0, 0.2)$

**Table 1. Parameter distributions for lensed SNIa.** The distribution of input parameters employed in the simulation pipeline to generate lensed SNIa light curves.  $\mathcal{N}(\mu, \sigma)$  indicates a normal distribution with mean  $\mu$  and standard deviation  $\sigma$ ,  $\mathcal{N}^S(a, \mu, \sigma)$  denotes a skewed normal distribution with skewness parameter  $a$ , while  $\mathcal{U}(x, y)$  represents a uniform distribution with bounds  $x$  and  $y$ . The skewed normal distributions for  $z_{\text{lens}}$ ,  $z_{\text{src}}$  and  $\theta_E$  are 1D representations of the full joint distribution from Wojtak et al. (2019) depicted in Fig. 1.

we describe our assumptions in terms of the lens galaxy mass model, SNIa light curves, and microlensing simulations.

### 2.1 Lens galaxy mass profile assumptions

We employ the multi-purpose lens modelling package Lenstronomy<sup>1</sup> (Birrer & Amara 2018; Birrer et al. 2021b) to generate lens galaxies with a power-law elliptical mass distribution (PEMD) to describe the projected surface mass density, or convergence  $\kappa$ :

$$\kappa(x, y) = \frac{3 - \gamma_{\text{lens}}}{2} \left( \frac{\theta_E}{\sqrt{q_{\text{lens}} x^2 + y^2/q_{\text{lens}}}} \right)^{\gamma_{\text{lens}} - 1}, \quad (1)$$

where  $q_{\text{lens}}$  is the projected axis ratio of the lens,  $\gamma_{\text{lens}}$  corresponds to the logarithmic slope, and  $\theta_E$  denotes the Einstein radius. The coordinates  $(x, y)$  are centred on the position of the lens centre, and rotated by the lens orientation angle

<sup>1</sup> <https://lenstronomy.readthedocs.io/en/latest/>

$\phi_{\text{lens}}$ , such that the  $x$ -axis is aligned with the major axis of the lens. We model the external shear from the line-of-sight structures with a shear modulus  $\gamma_{\text{ext}}$  and a shear angle  $\phi_{\text{ext}}$ , which we assume to be uncorrelated from the lensing galaxy orientation. The adopted parameter distributions are given in Table 1.

105

## 2.2 Redshift distribution

Most of our input parameters are uncorrelated, except for the Einstein radius  $\theta_E$ , lens redshift  $z_{\text{lens}}$  and source redshift  $z_{\text{src}}$ , which we sample from a kernel density estimation probability model fitted to  $(\theta_E, z_{\text{lens}}, z_{\text{src}})$  of gravitationally lensed SNIa generated in Wojtak et al. (2019). The aforementioned simulation assumes a population of lens galaxies with the velocity dispersion function derived from the Sloan Digital Sky Survey observations (Choi et al. 2007) and a model of the volumetric rate of SNIa fitted to measurements of the SNIa rate as a function of redshift (Rodney et al. 2014). The lensed SNIa rate is determined by drawing random realizations of lens galaxies and supernovae in a light cone and counting the events where strong lensing occurs. More details can be found in Wojtak et al. (2019).

We impose an additional upper limit on the source redshift of  $z_{\text{src}} < 1.5$  to ensure that the SNe are not redshifted out of the filters. The resulting combinations of  $z_{\text{lens}}$ ,  $z_{\text{src}}$  and  $\theta_E$  values are depicted in Fig. 1 and the projected 1D distributions can be found in Table 1.

For the background population of unlensed SNIa, we assume a volumetric redshift rate of (Dilday et al. 2008)

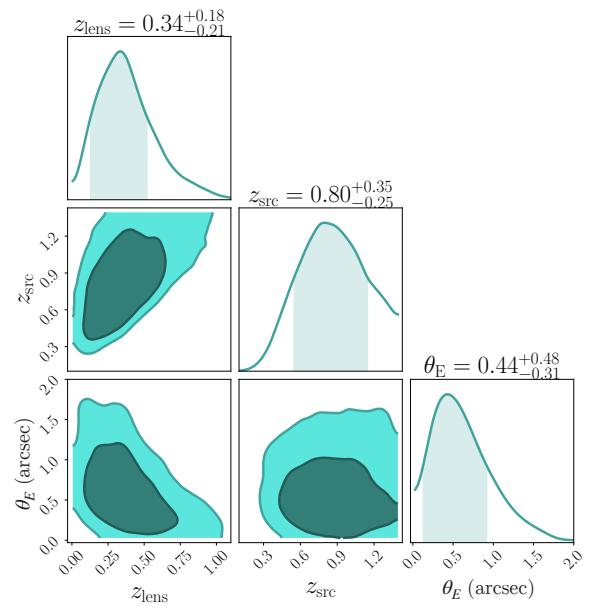
$$r_v(z) = 2.5 \cdot 10^{-5} (1+z)^{1.5} \text{ Mpc}^{-3} \text{ yr}^{-1}. \quad (2)$$

We consider an unlensed SNIa as ‘detected’ when its  $i$ -band magnitude is brighter than the LSST  $i$ -band mean 5-sigma depth (24.0). The detection criteria for lensed SNIa are described in Sec. 4.1. The resulting redshift distributions of detected lensed and unlensed SNIa and lens galaxies in LSST are displayed in Fig. 2. The Rubin Observatory will be able to discover unlensed SNe at redshifts up to  $z \sim 1$ , resulting in a significant overlap in redshift space between lensed and unlensed SNIa.

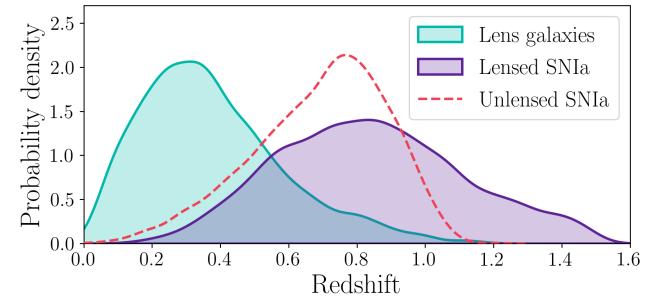
135

## 2.3 SNIa light curves

We model the SNIa as point sources, using synthetic light curves in the observer frame for their variability. The light curves are simulated using SNCosmo<sup>2</sup> (Barbary et al. 2016) and its in-built parametric light curve model SALT3 (Guy et al. 2007; Kenworthy et al. 2021), which takes as input an amplitude parameter  $x_0$ , stretch parameter  $x_1$ , and a colour parameter  $c$ . We sample the  $x_1$  and  $c$  parameters from asymmetric Gaussian distributions that have been derived by Scolnic & Kessler (2016) for the Supernova Legacy Survey (Guy et al. 2010), the Sloan Digital Sky Survey (Sako et al. 2018), Pan-STARRS1 (Rest et al. 2014), and several low-redshift surveys (Hicken et al. 2012; Stritzinger et al.



**Figure 1.** The joint distribution of the lens redshift ( $z_{\text{lens}}$ ), source redshift ( $z_{\text{src}}$ ) and Einstein radius ( $\theta_E$ ) used to simulate the lensed SNIa systems. The  $z_{\text{lens}}$ ,  $z_{\text{src}}$  and  $\theta_E$  combinations correspond to galaxy-source configurations where strong lensing occurs (Wojtak et al. 2019). The sample includes all lensed SNIa at redshift  $z_{\text{src}} < 1.5$ .



**Figure 2.** Normalised redshift distributions of simulated lens galaxies, lensed SNIa and unlensed SNIa that will be detectable with the Rubin Observatory. The Figure shows the observed populations, after the detection criteria described in Sec. 2.1 for unlensed SNIa and in Sec. 4.1 for lensed SNIa have been applied.

2011). We compute the distance modulus  $\mu$  of each SNIa, based on its  $x_1$  and  $c$  parameters:

$$\mu = m + \alpha x_1 - \beta c - \mathcal{N}(M_0, 0.12), \quad (3)$$

Here,  $M_0$  is the expected absolute magnitude of a SNIa with  $x_1 = c = 0$  and  $m$  is the SN flux normalisation in magnitude units. We assume  $M_0 = -19.43$  in the  $B$ -band, corresponding to a universe with Hubble constant  $H_0 = 67.8 \text{ km s}^{-1} \text{ Mpc}^{-1}$ .  $\alpha$  and  $\beta$  are the linear stretch and colour correction coefficients, as first found in Phillips (1993) and Tripp (1998) respectively, which specify the correlation of absolute magnitude with the stretch and colour parameters. We assume  $\alpha = 0.14$  and  $\beta = 3.1$  (Scolnic & Kessler 2016). The resulting absolute magnitude values for each SNIa are used as input for SNCosmo to generate the corresponding unlensed light curves.

<sup>2</sup> <https://sncosmo.readthedocs.io/en/stable/>

The final, lensed light curves are computed in the following way. After drawing  $z_{\text{lens}}$ ,  $z_{\text{src}}$  and  $\theta_E$  from the joint distribution from Wojtak et al. (2019) (Fig. 1), we sample random positions of the source and the remaining lens parameters from the distributions given in Table 1 until we find a system that is detectable by LSST. The criteria for what we consider as a ‘detection’ are described in Sec. 4.1 for lensed SNIa. Using Lenstronomy, we obtain the image positions, time delays and magnifications for each lensed SNIa. The time delays and magnifications are applied to the unlensed SNIa light curve to obtain the final, lensed light curves.

#### 2.4 Microlensing

Stars (and dark matter substructures) in the lens galaxy can give rise to additional gravitational lensing effects on top of the lens’ macro magnification. Such *microlensing* effects from stars are typically able to magnify or demagnify the lensed SN images by approximately one magnitude. Since the resulting microlensing magnifications are not symmetric – some systems will be highly magnified while the majority will be slightly demagnified – their effects can change the number of lensed SNe that will pass our detection thresholds. We included microlensing in our simulations and investigated the resulting impact on the annual lensed SNIa detections.

To calculate microlensed light curves we follow the approach as described by Huber et al. (2019), where synthetic observables from theoretical SNIa models calculated via ARTIS (Kromer & Sim 2009) are combined with microlensing magnification maps. The maps are generated following Chan et al. (2021) and with software from GERLUMPH (Vernardos & Fluke 2014; Vernardos et al. 2014, 2015). As in Huber et al. (2022) we create maps with a Salpeter initial mass function with a mean mass of the microlenses of  $\langle M \rangle = 0.35 M_\odot$ , a resolution of  $20000 \times 20000$  pixels and a total size of  $20 R_E \times 20 R_E$ . Here,  $R_E$  corresponds to the physical Einstein radius of the microlenses at the source redshift and can be calculated via

$$R_E = \sqrt{\frac{4G\langle M \rangle}{c^2} \frac{D_s D_{ls}}{D_1}}, \quad (4)$$

where  $D_1$ ,  $D_s$  and  $D_{ls}$  are the angular diameter distances between the observer and the lens, the observer and the source, and the lens and the source, respectively. Further, we list in Table 2 the convergence  $\kappa$ , the shear  $\gamma$  and the smooth matter fraction  $s$  ( $s = 1 - \kappa_*/\kappa$ , where  $\kappa_*$  is the convergence of the stellar component) for all magnification maps considered in this work. The specific realisations of  $\kappa$ ,  $\gamma$  and  $s$  were chosen because they correspond to the most commonly occurring combinations amongst the simulated lensed SNIa. We normalise the microlensing magnification maps to have the same mean as the theoretical magnification predicted from the map’s  $\kappa$  and  $\gamma$  values:

$$\mu = \frac{1}{(1 - \kappa^2) - \gamma^2}. \quad (5)$$

For each map we have 40000 microlensed spectra coming from 10000 random positions in the map and four theoretical SN models, the same as used by Suyu et al. (2020); Huber

et al. (2021) and Huber et al. (2022). For all the maps listed in Table 2 we assumed a source redshift of 0.77 and a lens redshift of 0.32, which corresponds to the median values of the OM10 catalog (Oguri & Marshall 2010a) and defines the total size of the map  $R_E$ . For our lensed SNe we are interested in  $z_{\text{src}}$  between 0.0 and 1.4. To reduce the computational effort we grid the  $z_{\text{src}}$  space in steps of 0.05. Given that the calculation of 10000 microlensed spectra for a single magnification map with a certain  $R_E$  is on the order of a week, we approximate the microlensing contributions, as we now describe. For any source redshift of interest  $z_{\text{src}}$  we use the microlensed spectra calculated for the source redshift of 0.77. We then rescale the spectra such that they correspond to  $z_{\text{src}}$  in terms of absolute flux, wavelength and time after explosion. From the corrected spectra we can then calculate the exact light curves for  $z_{\text{src}}$  following Huber et al. (2019), with the approximation that the total size of the microlensing map is the same as for the source redshift of 0.77. Using the same total size can slightly overestimate or underestimate the impact of microlensing, but Huber et al. (2021) tested different  $R_E$  values, where no significant dependence between the strength of microlensing and  $R_E$  was found.

For each simulated lensed SN, we compute the convergence, shear and smooth matter fraction at the position of the SN images and draw a random microlensing realisation from the magnification map with the closest  $\kappa$ ,  $\gamma$  and  $s$  values. The local convergence and shear are calculated from the lens galaxy’s mass model and the smooth matter fraction is obtained by approximating the stellar convergence  $\kappa_*$  at the image positions, for which we assume a spherical de Vaucouleurs profile (Dobler & Keeton 2006):

$$\kappa_*(r) = Ae^{-k(r/R_{\text{eff}})^{1/4}}, \quad (6)$$

where  $k = 7.67$ ,  $r$  is the radius of the SN image position to the lens centre,  $R_{\text{eff}}$  is the effective radius of the lens and  $A$  is a normalisation constant that is calibrated for each lens system such that the maximum  $s$  value is 1. The effective radius  $R_{\text{eff}}$  of the lens is determined through a scaling relation between the radius in kpc  $h^{-1}$  and velocity dispersion  $\sigma$  in km s $^{-1}$  of elliptical galaxies (Hyde & Bernardi 2009):

$$\log_{10}(R_{\text{eff}}) = 2.46 - 2.79 \cdot \log_{10}(\sigma) + 0.84 \cdot \log_{10}(\sigma)^2 \quad (7)$$

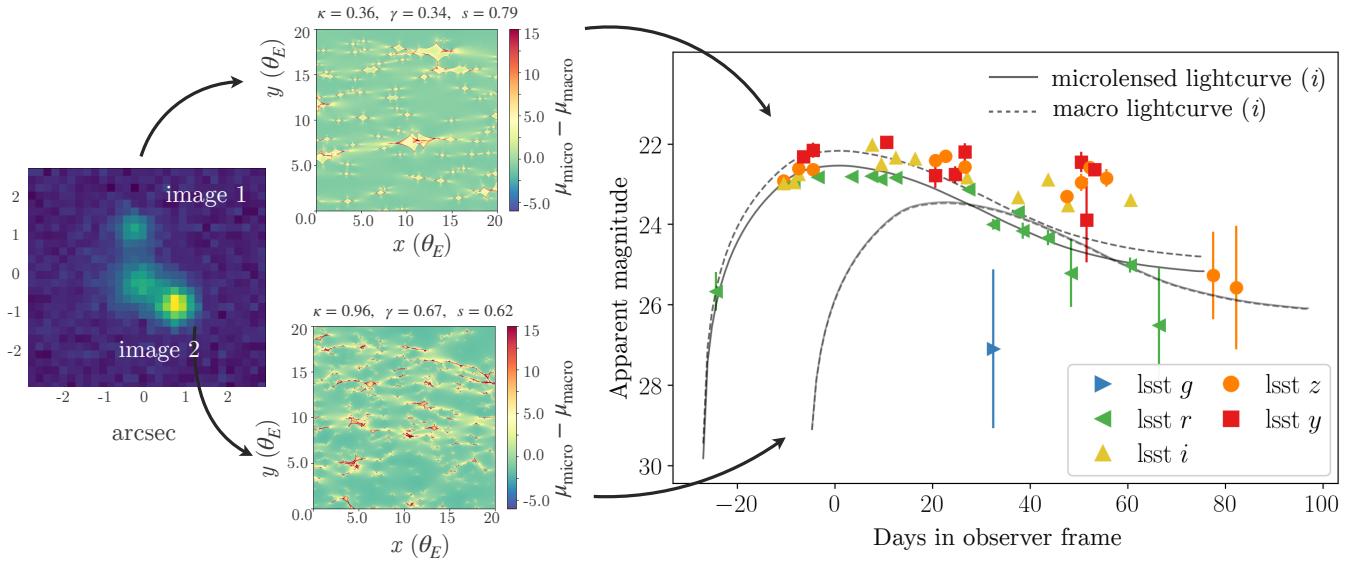
$$\text{with } \sigma^2 = \frac{c^2 \theta_E D_s}{4\pi D_{ls}}, \quad (8)$$

The above relations also assume spherical symmetry of the lens galaxy, but are only used to determine which  $\kappa$ ,  $\gamma$  and  $s$  values are the best approximations for the image positions.

Finally, the microlensing contributions are obtained by drawing a random position in the chosen magnification map for each lensed SN image. Since the SN explosion models comprise different sizes at different wavelengths, the chromatic microlensing contributions are computed for each LSST filter and added to the simulated lensed SN light curves, as illustrated in Fig. 3.

### 3 THE VERA C. RUBIN OBSERVATORY

The Vera C. Rubin Observatory is a survey facility currently under construction on Cerro Pachón in Chile. It will host the



**Figure 3.** Simulated observations of a doubly imaged SNIa in LSST. For each lensed SN image, the figure shows the microlensing magnifications maps and the corresponding  $i$ -band light curves in the observer frame (dashed curves without microlensing and solid curves with microlensing). The coloured markers correspond to LSST observations in the active region of the WFD survey with the baseline v3.0 cadence. The properties of this simulated lensed SN system are  $z_{\text{lens}} = 0.1$ ,  $z_{\text{src}} = 0.52$ ,  $\theta_E = 1.26''$ ,  $\Delta t = 22$  days.

Convergence ( $\kappa$ )	Shear ( $\gamma$ )	Smooth matter fraction ( $s$ )
0.362	0.342	0.443
0.655	0.669	0.443
0.655	0.952	0.443
0.956	0.669	0.443
0.956	0.952	0.443
0.362	0.342	0.616
0.655	0.669	0.616
0.655	0.952	0.616
0.956	0.669	0.616
0.956	0.952	0.616
0.362	0.342	0.790
0.655	0.669	0.790
0.655	0.952	0.790
0.956	0.669	0.790
0.956	0.952	0.790
0.362	0.280	0.910

**Table 2.** Combinations of the convergence ( $\kappa$ ), shear ( $\gamma$ ), and smooth matter fraction ( $s$ ) used to simulate the microlensing contributions to the lensed SN light curves.

### 3.1 LSST observing strategy

LSST will operate several survey modes. The main programme, comprising  $\sim 90\%$  of observing time, will be the Wide-Fast-Deep (WFD) survey, consisting of an area of 18,000 square degrees. The other major survey programmes include the Galactic plane, polar regions and the Deep Drilling Fields (DDFs); the latter will be observed with deeper coverage and higher cadence. Following the latest recommendations from the Survey Cadence Optimization Committee<sup>3</sup>, the WFD survey is expected to proceed using a *rolling cadence*, in which certain areas of the WFD footprint will be assigned more frequent visits, with the focus of increased visits “rolling” over time. This improves the light curve sampling of the objects discovered in those high-cadence areas, the *active* regions. The drawback is that since the sky coverage is not homogeneous in any given period, there is a greater chance of missing rare events if they occur in an under-sampled area, the so-called *background* region. For unlensed SNe, it has been shown by Alves et al. (2022) that the active region yields a 25% improvement in type classification performance relative to the background region. One of the goals of this work is to determine the impact of the rolling cadence on lensed SNIa. Huber et al. (2019) investigated the effects of several LSST observing strategies on lensed SNIa discoveries, but this previous work considered earlier versions of the observing strategy that differed significantly from the current implementation of the rolling cadence.

We implement the baseline v3.0 observing strategy, which adopts a half-sky rolling cadence with a  $\sim 0.9$  rolling weight (corresponding to the background regions receiving only 10% of the standard number of visits, and the active

<sup>212</sup> Legacy Survey of Space and Time (LSST), a wide-field astronomical survey scheduled to start operations around 2025.  
<sup>213</sup> The survey will take multi-colour  $ugriz$  images and cover  
<sup>214</sup>  $\sim 20,000$  square degrees of the sky in a ten-year period. Due  
<sup>215</sup> to its depth and sky coverage, LSST is the most promising  
<sup>216</sup> transient survey for observing gravitationally lensed SNe,  
<sup>217</sup> with initial predicted numbers of several hundred discoveries  
<sup>218</sup> a year (Goldstein & Nugent 2017; Goldstein et al. 2019;  
<sup>219</sup> Wojtak et al. 2019; Oguri & Marshall 2010b).

<sup>3</sup> <https://pstn-055.lsst.io/>

regions the rest). While the baseline v3.3 cadence was recently released, we do not expect it to significantly alter our results. The biggest change with respect to v3.0 is an updated mirror coating which results in decreased *u*-band sensitivity and increased sensitivity in the *grizy* bands. Since lensed SNIa are red and our analysis does not consider *u*-band detections, the change from v3.0 to v3.3 is minimal, and only expected to result in slightly more lensed SNIa detections. A sky map with the observations corresponding to the baseline v3.0 strategy is depicted in Fig. 4. The rolling cadence begins roughly 1.5 years after the start of the survey, to first allow for a complete season of uniform observations. This gives us an ideal opportunity to compare the effects of the rolling cadence on the discovery of lensed SNIa. For the annual lensed SN detections computed in this work, we only consider observations in the WFD and the DDFs, since those do not suffer from severe dust extinction found e.g. in the Galactic plane regions. An example of a lensed SNIa with baseline v3.0 WFD cadence observations is depicted in Fig. 3.

### 3.2 Simulating LSST observations

In order to simulate observations of lensed SNe at the catalogue level with sufficient information to define useful metrics, we need to find the set of times at which SNe at particular locations are observed, along with the observational metadata required to estimate the uncertainty with which the SN flux will be measured. This information can be accessed through the Rubin Operations Simulator (`OpSim`), which simulates the field selection and image acquisition process of LSST over the 10-year duration of the planned survey (Delgado & Reuter 2016; Delgado et al. 2014; Naghib et al. 2019). Detailed information about each simulated pointing of the telescope is stored in an output data product in the form of a ‘sqlite’ database, where each pointing forms a row in the database. Using `OpSimSummary` (Biswas et al. 2020), we find all the observations (and associated metadata) that include the position of a given SN within the field of view of the telescope.

In order to separate the Galactic plane region and the WFD and DDF surveys, we use a threshold based on the number of visits a sky location has received after 10 years of LSST observations. This serves as a proxy for `OpSim`’s distinction between the Galactic plane and WFD regions. We assume that regions with  $N_{\text{visits},10\text{yr}} < 400$  belong to the Galactic plane and polar regions,  $N_{\text{visits},10\text{yr}} > 1000$  are the DDFs, and all remaining sky locations are assigned to the WFD. Within the WFD, we distinguish between observations taken during the non-rolling phase (year 0–1.5; MJD  $< 60768$ ) and the first rolling period (year 1.5–3; 60768  $<$  MJD  $< 61325$ ).

From the `OpSim` database, we obtain the observing times, filters, mean 5-sigma depth ( $m_5$ ), and point-spread functions (psf). We compute the  $1\sigma$  noise on the SN flux (which contains contributions from the sky brightness, the airmass, the atmosphere, and the psf) from the 5-sigma depth in the following way:

$$\sigma_{f_{\text{SN}}} = \frac{10^{(\text{ZP}-m_5)/2.5}}{5}, \quad (9)$$

where ZP corresponds to the instrument zero-point for a given band: 28.38, 28.16, 27.85, 27.46, 26.68, respectively for the *g, r, i, z, y* bands<sup>4</sup>. The SN flux for each image is perturbed by drawing a new flux value from a normal distribution with mean of the model flux and width equal to the sky noise. Then, the new flux values  $f_{\text{SN}}$  are combined with the SN flux noise to calculate the error on the observed magnitude:

$$\left| \frac{-2.5 \cdot \sigma_{f_{\text{SN}}}}{f_{\text{SN}} \cdot \ln(10)} \right|. \quad (10)$$

## 4 DETECTING LENSED SNIa

In this section, we describe our methods for calculating the number of lensed SNIa detections and the properties of the detected sample. We examine the simulated lensed SNIa based on their colours, magnitudes, time-delay measurements, and prospects for follow-up.

### 4.1 Annual lensed SNIa detections

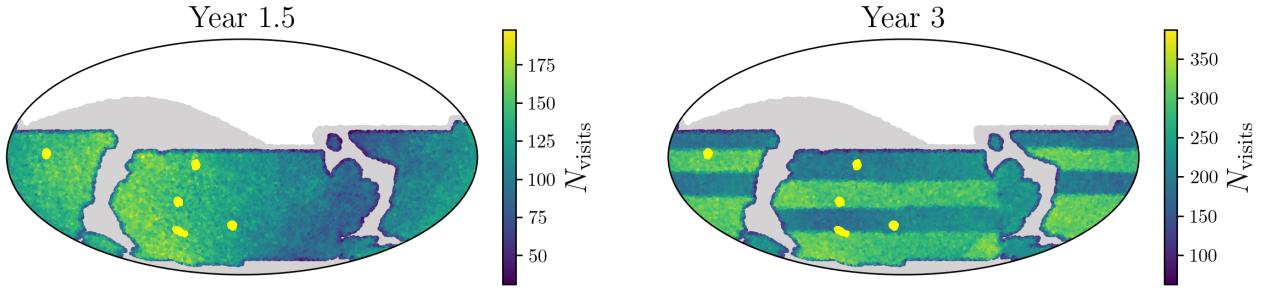
Studies that predict the number of lensed SN discoveries generally take into account two distinct detection methods. The first is the *image multiplicity method*, which looks for multiple resolved images of the lensed SN (Oguri & Marshall 2010b), and the second is the *magnification method*, which looks for objects that appear significantly brighter than a typical SN at the redshift of the lens galaxy (which acts as the apparent host galaxy) (Goldstein & Nugent 2017). For the latter method, the lensed SN images do not need to be resolved. We build our estimates of the lensed SN discoveries upon the results from Wojtak et al. (2019). They combine the image multiplicity and the magnification method and predict that LSST will discover around 89 lensed SNIa per year, assuming a 0.2 mag buffer above  $5\sigma$  average limiting magnitudes. For comparison, the predicted rate of unlensed SNe Ia, after quality cuts for cosmological utility, is 104000 for the ten-year sample. (The LSST Dark Energy Science Collaboration et al. 2018)

The number of lensed SN detections from Wojtak et al. (2019) considers whether a lensed SN passes the image multiplicity and magnification cuts based on its full light curve information. There is no observation cadence information included in the predictions, which would alter the results if a lensed SNe will occur between observing seasons or when sufficient observations are missing around the peak. Here, we update the annual lensed SNIa detections taking into account the cadence from the baseline v3.0 observing strategy. For each simulated lensed SN, we draw a random observation sequence and assess whether the object still passes the detection cuts for the magnification and image multiplicity method.

The criteria for being “detected” with both methods are the following:

*Image multiplicity method*

<sup>4</sup> <https://smtn-002.lsst.io/#change-record>



**Figure 4.** LSST survey footprint in equatorial coordinates showing the number of visits ( $N_{\text{visits}}$ ) conducted per sky location. The light gray area corresponds to the full LSST footprint, including the Galactic plane and polar regions. The coloured region represents the WFD area ( $\sim 18,000$  sq. deg.) and the light yellow patches are the DDFs. In the first 1.5 years of the survey (left panel) the sky coverage will be homogeneous, after which the rolling cadence will start (right panel). Rolling results in background regions with lower  $N_{\text{visits}}$  and active regions with higher  $N_{\text{visits}}$ .

- The maximum image separation  $\theta_{\text{max}}$  is larger than  $0.5''$  and smaller than  $4''$ ;
- For doubles: the flux ratio between the images (measured at peak) is between 0.1 and 10;
- At least three or two images are detected (signal-to-noise ratio  $> 5$ ) for quads (systems with four images) and doubles (systems with two images), respectively.

#### 358 *Magnification method*

- The apparent magnitude of the unresolved lensed SN images should be brighter than a typical SNIa at the *lens* redshift at peak:

$$m_X(t) < \langle M_X \rangle(t_{\text{peak}}) + \mu(z_{\text{lens}}) + K_{XX}(z_{\text{lens}}, t_{\text{peak}}) + \Delta m, \quad (11)$$

359 with  $m_X(t)$  the apparent magnitude of the transient in band  
 360  $X$  at time  $t$ ,  $\langle M_X \rangle(t_{\text{peak}})$  the absolute magnitude of a stan-  
 361 dard SNIa in band  $X$  at peak,  $\mu$  the distance modulus,  $K_{XX}$   
 362 the K-correction, and  $\Delta m$  the magnitude gap (adopted here  
 363 to be  $-0.7$  for consistency with Wojtak et al. (2019) and  
 364 Goldstein & Nugent (2017));

- The combined flux of the unresolved data points should be above the detection threshold (signal-to-noise ratio  $> 5$ ).

## 367 4.2 Colours and magnitudes of lensed SNIa

368 SNe affected by strong gravitational lensing are expected  
 369 to look different from unlensed SNe in several ways. Fig. 2  
 370 shows that in general, lensed SNe will be found at higher  
 371 redshifts than unlensed ones and hence, they will be ob-  
 372 served as redder and more slowly evolving. Additionally, for  
 373 lensed and unlensed SNIa at the same redshifts, the lensed  
 374 SNIa will appear brighter because of the gravitational lens-  
 375 ing magnification.

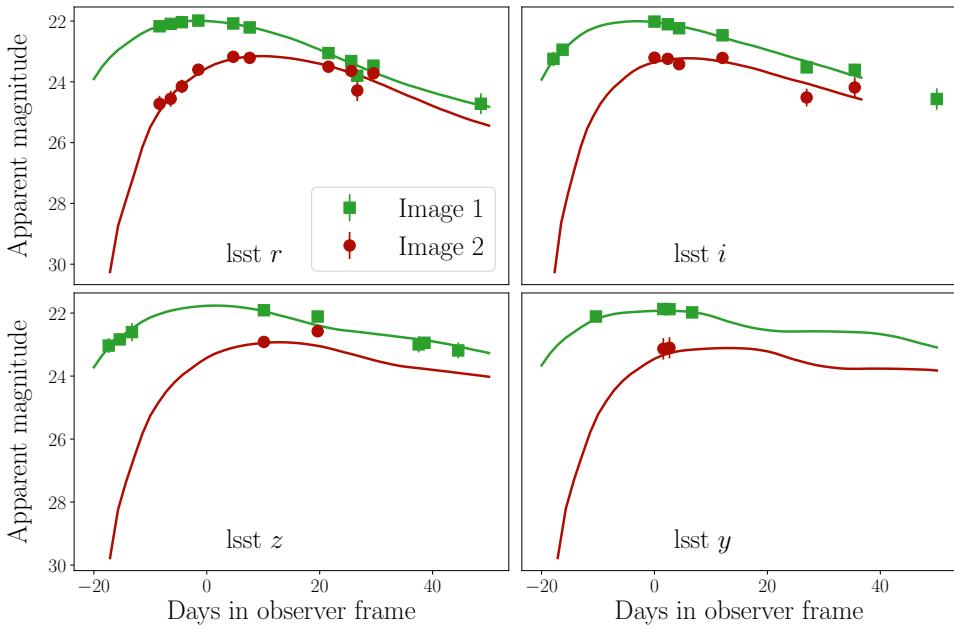
376 In this analysis, we investigate which observables are  
 377 best suited to separate the populations of lensed and un-  
 378 lensed SNIa in LSST data. We aim to investigate optimal se-  
 379 lection criteria based on the brightness and colours of lensed  
 380 SN candidates. We measure light curve properties in the  
 381 observer frame from the simulated sample of lensed and un-  
 382 lensed SNIa as observed with LSST. The resulting observ-  
 383 ables are apparent magnitudes for each LSST filter ( $g, r, i, z, y$ )  
 384 and all colour combinations ( $g-r, g-i, g-z, g-y, r-i, r-z,$   
 385  $r-y, i-z, i-y$  and  $z-y$ ), at different epochs at the light curve

386 peak, which is determined in the following way. A poly-  
 387 nomial fit is performed on every light curve of the sample to  
 388 find the peak time from the filters with the best detection  
 389 cadence, which mostly corresponds to the  $r$  or  $i$  bands. We  
 390 use the same polynomial fits to obtain the expected appar-  
 391 ent magnitudes at the given epochs to compute the colours.  
 392 Error bars from the detections are considered in the fits and  
 393 propagated into uncertainties on the measured magnitudes  
 394 and colours.

395 The redshift distributions for unlensed and lensed SNIa  
 396 observed with LSST are largely overlapping, as shown in  
 397 Fig. 2. Due to this, using the apparent magnitude and  
 398 colours alone will not serve as good metrics to separate  
 399 lensed from unlensed SNIa, as is also illustrated in Fig. A1  
 400 and A2. Therefore, we chose to investigate cuts based on  
 401 all combinations of colours versus apparent magnitudes. In  
 402 Quimby et al. (2014), such a colour-magnitude cut in the  $r$   
 403 and  $i$ -band is shown to be very promising for distinguishing  
 404 lensed SNIa. We aim to devise linear cuts in colour-  
 405 magnitude space for all LSST bands that exclude most of  
 406 the unlensed events while preserving the lensed ones. Our  
 407 method consists of obtaining the 90% contour for the un-  
 408 lensed SNe in each colour-magnitude space and fitting a lin-  
 409 ear function to this contour to extract a simple linear cut.

## 410 4.3 Time-delay measurements

411 For a fraction of the lensed SN discoveries, LSST will be  
 412 able to resolve the individual images. Here, we compute the  
 413 fraction of those systems for which we will be able to in-  
 414 fer the time delay precisely using LSST data only. Even for  
 415 events that are on the cusp of being resolvable and with  
 416 variable seeing, a single epoch with sufficient seeing to re-  
 417 solve the images will enable the extraction of the full light  
 418 curves using forced photometry. To find the objects with  
 419 the best time-delay measurements, we limit ourselves to sys-  
 420 tems with an angular separation of  $\theta_E > 0.5''$ . We use the  
 421 most commonly implemented model for the SED of an SNIa,  
 422 SALT3 (Guy et al. 2010; Betoule et al. 2014; Kenworthy et al.  
 423 2021) as implemented in SNCosmo (Barbary et al. 2016) and  
 424 fit each light curve with a common stretch and colour pa-  
 425 rameter. Since our aim is to infer what fraction of objects  
 426 have an accurately estimated time delay, we do not use a  
 427 simultaneous inference for extinction and magnification like



**Figure 5.** Example of a lensed SNIa with a robust time-delay inference from LSST data only. The markers correspond to LSST observations taken in the  $r$ ,  $i$ ,  $z$ ,  $y$  bands and the solid curves show the SALT3 fits used to infer the time delay. This object is at  $z_{\text{src}} = 0.464$ , lensed by a deflector galaxy at  $z_{\text{lens}} = 0.142$ , an input time delay of 11.14 days and a recovered time-delay estimate of 12.23 days. The Einstein radius of the system is  $\theta_E = 0.63$  so the images are treated as resolved.

for iPTF16geu (Dhawan et al. 2020) or SN Zwicky (Goobar et al. 2023). We assume the SN redshift will be known from spectroscopic follow-up observations, which can be carried out after the SN has faded away. The difference in returned  $t_0$  values provides the time delays between the images. We classify a system as having a “good” time delay when the measurement has an accuracy of  $< 5\%$ . An example case is shown in Fig. 5. We only use LSST data for  $\Delta t$  measurements and hence our results are a conservative estimate which will improve further with follow-up observations, especially if the follow-up also resolves the individual images.

#### 4.4 Gold sample for follow-up observations

In order to conduct timely follow-up observations of the lensed SNe, we should find them early on in their evolution. After the initial detection of a lensed SN candidate in LSST, spectroscopic follow-up observations are needed to verify its lensed nature. A spectrum will reveal the SN type and its redshift, which for SNIa will identify the objects that are magnified by strong gravitational lensing. From simulated detected lensed SNe, we construct a ‘gold’ sample that satisfies the following criteria:

- $N_{\text{premax}} > 5$  in at least two filters;
- $m_i < 22.5$  mag;
- $\Delta t > 10$  days,

with  $N_{\text{premax}}$  the number of detections before the SN peak and  $m_i$  the apparent  $i$ -band magnitude at peak.

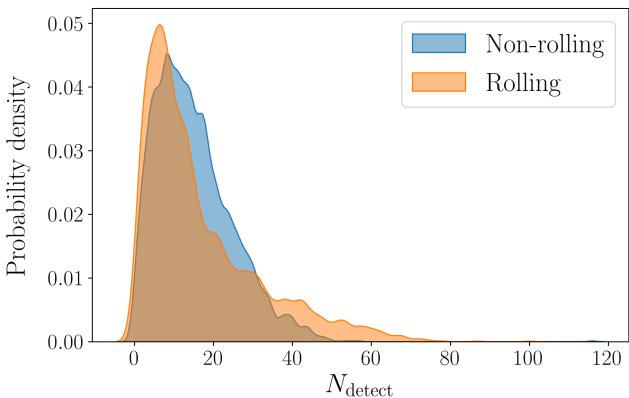
We use SALT3, as implemented in SNCosmo (Barbary

et al. 2016) to fit the light curves of the simulated lensed SNIa and infer the time of peak. To trigger spectroscopic follow-up observations we require that the object is detected in at least two filters and has a minimum of five observations before the inferred time of maximum. This is because it allows for spectroscopic follow-up when the lensed SN is close to its brightest, while still having ample time for scheduling high-resolution follow-up. In addition, we apply the constraint that the lensed SNe should be bright enough to get a classification spectrum with a 4-m class telescope, e.g. 4MOST (Swann et al. 2019) or e.g. the New Technology Telescope (Snodgrass et al. 2008) with exposure times  $\lesssim 1\text{hr}$ , corresponding to a brightness of  $m_i < 22.5$  mag. Alternatively, with shorter exposure times, the spectra can be obtained with instruments on 8m class telescopes, e.g. the Gemini Multi-Object Spectrographs (GMOS; Crampton et al. 2000).

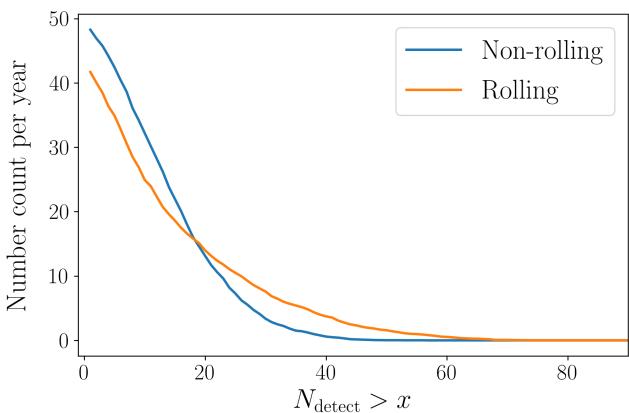
## 5 RESULTS

### 5.1 Annual lensed SNIa detections

We simulate a set of 5,000 doubly imaged lensed SNe and 5,000 quadruply imaged SNe that pass either the image multiplicity or the magnification method as described in Sec. 4.1, where the size of the sample is chosen such that it is large enough for our statistical analysis. These numbers are subsequently scaled with the predicted lensed SNIa rates from Wojtak et al. (2019): 64 doubles and 25 quads per year. We then compute what fraction of the simulated lensed SNIa



**Figure 6.** Number of detections ( $N_{\text{detect}}$ ) per lensed SNIa for the non-rolling cadence (first 1.5 years of the survey) compared to the rolling cadence (years 1.5 - 3 of the survey). The distributions show that compared to the non-rolling cadence, the rolling cadence produces both more systems with small  $N_{\text{detect}}$  and with large  $N_{\text{detect}}$ . The mean number of observations is 15 (17) for a non-rolling (rolling) cadence.



**Figure 7.** Annual expected number of lensed SNIa with  $N_{\text{detect}}$  above a certain threshold, for observing strategies without a rolling cadence (blue line) and with rolling cadence (orange line). The figure shows that although non-rolling cadences are expected to discover a larger overall number of lensed SNe, rolling cadences will provide more lensed SNe with a high number of detections.

remains detectable when the baseline v3.0 observing strategy is applied. We find that 46% of doubles and 70% of quads remain from the full simulated sample. We also assess the impact of the rolling cadence on the annual lensed SNIa detections, by separating the sample into objects that are detected in the first 1.5 years of the survey ( $\text{MJD} < 60768$ ) and objects discovered in years 1.5 to 3 ( $60768 < \text{MJD} < 61325$ ).

Fig. 6 shows the number of detections with signal-to-noise ratio  $> 5$  ( $N_{\text{detect}}$ ) per lensed SN system for the rolling and non-rolling cadence. The distribution for a non-rolling baseline v3.0 cadence peaks around 20 detections per lensed SN, while the rolling cadence has a large tail towards systems with higher numbers of detections. The background regions (corresponding to the dark areas in Fig. 4) acquire a lower number of detections, while the active regions (light areas in Fig. 4) receive a higher  $N_{\text{detect}}$ . As a result, the non-

Doubles	Non-rolling	Rolling
Detected without microlensing	36	31
Detected	32	27
with $\Delta t > 10$ days	22	18
Pass colour-mag cut	13	11
Gold sample	8	6

Quads	Non-rolling	Rolling
Detected without microlensing	18	17
Detected	17	16
with $\Delta t > 10$ days	8	8
Pass colour-mag cut	7	7
Gold sample	5	4

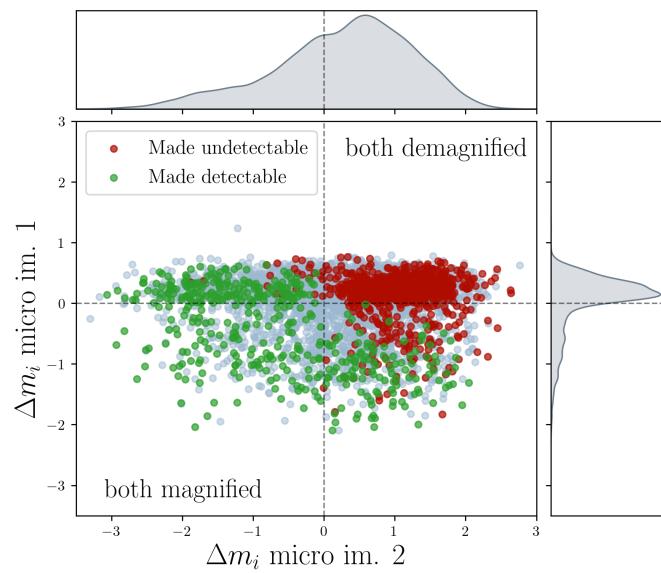
  

Total	Non-rolling	Rolling
Detected without microlensing	54	48
<b>Detected</b>	<b>50</b>	<b>44</b>
with $\Delta t > 10$	30	26
Pass colour-mag cut	22	19
Gold sample	13	10

**Table 3.** The annual expected number of discovered lensed SNIa (doubles, quads, and the total number) in the baseline v3.0 observing strategy, with separate predictions for the non-rolling and rolling cadence. The rows list the predicted numbers of lensed SNIa that are detected without and with microlensing (see 5.2), have time delays larger than 10 days, pass the colour-magnitude cut (described in 5.3), and are in the gold sample for follow-up (5.5).

rolling cadence scans a larger area of the sky with a medium cadence and therefore discovers more lensed SNe, while the rolling-cadence provides more detections for the systems it discovers. This effect is illustrated in Fig. 7, which shows the expected number of lensed SNIa per year with  $N_{\text{detect}}$  above a certain threshold. The non-rolling cadence will discover more lensed SNe up to  $N_{\text{detect}} < 20$ , while the rolling cadence will find a larger sample with well-sampled light curves ( $N_{\text{detect}} > 20$ ). Nevertheless, we note that the differences are relatively small. We also compute the number of lensed SNIa that fall in the Deep Drilling Fields (DDFs) in our simulation, since those objects will be observed with a much higher cadence and better depth. However, we find that only  $\sim 0.2$  lensed SNIa per year are expected to be in the DDFs, which is not surprising given the small area covered relative to WFD.

Our findings are summarised in Table 3, which contains the predicted annual number of lensed SNIa detections for a non-rolling versus a rolling cadence. Our results are consistent with a recent study by Sainz de Murieta et al. (2023), which predicts the number of lensed SNIa detected with the magnification method for an approximate LSST survey strategy.

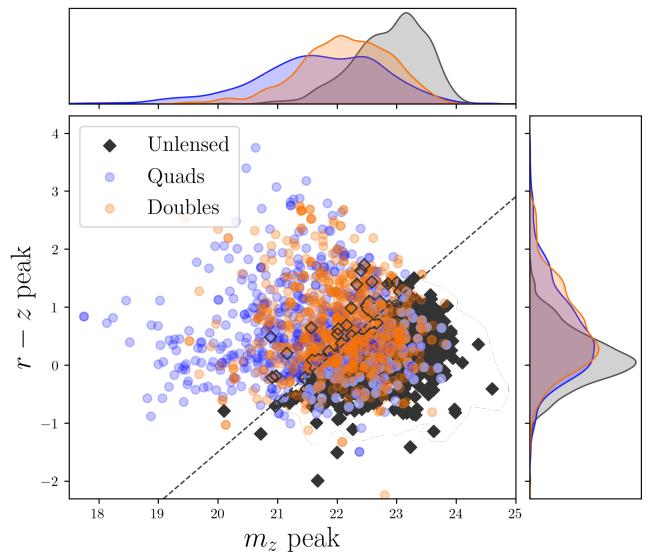


**Figure 8.** Impact of microlensing on the lensed SNIa detections. The scatterplot shows the difference in apparent peak  $i$ -band magnitude ( $\Delta m_i$ ) due to microlensing for image one (first occurring) and two of the 5,000 simulated doubly-imaged SNe. The gray points correspond to lensed SNe whose detection is not impacted by microlensing, the red points are the systems that have become undetectable by microlensing, and the green ones have become detectable by a microlensing magnification boost. The projected 1D distributions show the microlensing effect on the apparent magnitude per lensed SN image.

## 522 5.2 Microlensing impact

523 While all results presented so far included the effects of microlensing, we also generate each lensed SN light curve both  
 524 with and without microlensing in order to clearly quantify  
 525 the microlensing impact for each system. We distinguish  
 526 three scenarios, in which microlensing effects  
 527 (i) do not change the detectability of the lensed SN;  
 528 (ii) make a detected lensed SN undetectable;  
 529 (iii) make an undetected lensed SN detectable.

531 Fig. 8 investigates these three scenarios. It shows the  
 532 difference in apparent peak  $i$ -band magnitude for the 5,000  
 533 simulated doubly-imaged SNe. The red dots are the systems  
 534 that become undetectable because of microlensing, while the  
 535 green dots are the ones that have become detectable due to  
 536 the microlensing magnifications. The sum of these effects is  
 537 that we detect a handful fewer lensed SNe; Table 3 presents  
 538 that we go from a total annual number of 48 (54) without  
 539 microlensing to 44 (50) with microlensing for a rolling (non-  
 540 rolling) cadence. For the events with longer time delays than  
 541 10 days, we predict to find 29 (31) without microlensing and  
 542 26 (30) with microlensing for a rolling (non-rolling) cadence.  
 543 This weak effect of detecting fewer objects when microlens-  
 544 ing is included in the simulations can be understood when  
 545 looking at the projected 1D distributions of Fig. 8, which  
 546 shows that the majority of events will be slightly demag-  
 547 nified due to microlensing, while a rare few will be highly  
 548 magnified. We would also like to point out the asymmetry in  
 549 the distributions; the first image arrives further away from  
 550 the lens galaxy's centre and hence will be less severely influ-  
 551 enced by microlensing magnifications from stars.



**Figure 9.** Peak colours and magnitudes of the detected lensed SNIa (doubles and quads) and unlensed SNIa. The  $r - z$  colours and  $z$ -band magnitudes are able to separate the populations because lensed SNe are brighter than unlensed ones at similar redshifts. The dashed black line shows a simple linear separation cut of  $r - z > 0.88 m_z - 19.1$ .

## 552 5.3 Colour and magnitudes of lensed and 553 unlensed SNIa

554 For each of the simulated lensed and unlensed SNIa, we  
 555 calculate the apparent magnitudes at peak in every band,  
 556 following the procedure outlined in Sec. 4.2. The best sep-  
 557 aration between lensed and unlensed SNIa is achieved with  
 558 the  $r - z$  peak colour versus observed apparent  $z$ -band peak  
 559 magnitude, which is shown in Fig. 9. Other colour and mag-  
 560 nitude combinations are included in Appendix A. Due to  
 561 their higher redshift distributions, lensed SNe are expected  
 562 to appear redder than unlensed ones. However, since LSST  
 563 will also detect unlensed SNe at high redshifts (see Fig. 2),  
 564 this difference is less pronounced in LSST than in precur-  
 565 sor surveys such as ZTF. The overlap in redshift consti-  
 566 tutes a potential difficulty when it comes to distinguishing  
 567 lensed SNe from unlensed ones in LSST. Nevertheless, Fig. 9  
 568 demonstrates that we can achieve a better separation by  
 569 combining colours with apparent magnitudes, since lensed  
 570 SNe (especially the quads) are magnified and hence brighter  
 571 than unlensed ones at the same redshifts. We also see a few  
 572 very red lensed SNe at high redshifts where unlensed SNe  
 573 are not visible anymore with Rubin (redshifts  $\gtrsim 1$ ).

574 We investigate each colour and magnitude combination  
 575 at multiple epochs and obtain the following linear cuts using  
 576 the method described in Sec. 4.2:

$$\begin{aligned}
g - r &> 0.84m_r - 16.9 \\
g - i &> 0.69m_i - 13.5 \\
g - z &> 1.41m_z - 29.4 \\
g - y &> 1.14m_y - 23.6 \\
r - i &> 0.44m_i - 9.3 \\
r - z &> 0.88m_z - 19.1 \\
r - y &> 1.0m_y - 21.7 \\
i - z &> 0.58m_z - 12.6 \\
i - y &> 0.82m_y - 17.9 \\
z - y &> 0.15m_y - 2.9.
\end{aligned}$$

We calculate the percentage of the lensed SNIa and the percentage of background contaminants from the simulated unlensed population that pass the colour-magnitude cuts. We find that 41% (43%) of the lensed doubles (quads) pass at least one of the mentioned colour magnitude cuts. 2-3% of the unlensed SNIa would also pass this colour-magnitude cut. We find that the parameters combination that best separates lensed from unlensed SN for LSST is  $r - z$  peak colour versus observed apparent  $z$ -band peak magnitude, which keeps 23% (26%) of the doubles (quads) with only 0.7% of the unlensed sample. 28% (32%) of the lensed doubles (quads) would pass  $r - i$  peak colour versus observed apparent  $i$ -band peak magnitude, but with a almost 2% of the unlensed events. Since unlensed SNe outnumber lensed ones by a factor of  $\sim 10^3$  we want to keep the false-positive rate low. The combination with the lowest contaminants is  $r - y$  peak colour versus observed apparent  $y$ -band peak magnitude, with only 0.1% unlensed events, but due to the poorer cadence and depth for the  $y$ -filter, requiring detections in  $y$  means we only preserve 15% (20%) of doubles (quads).

As detailed in Table 3, this corresponds to around 20 lensed SNIa a year that pass one of the colour-magnitude cuts. This analysis shows that colour and magnitude cuts can be a useful tool to inform us about lensed SNIa candidates in LSST.

#### 5.4 Time-delay measurements from LSST-only data

For a small fraction of the simulated lensed SNIa, we find that we can extract a useful time-delay measurement using only LSST data. An example of such an object is shown in Fig. 5. However, for most cases the light curve has a sparse sampling such that a SALT3 fit with constrained  $x_1$  and  $c$  is unsuccessful. Less than 2% of our detected lensed SNIa sample allows for a  $\Delta t$  measurement with  $> 5\%$  accuracy, and hence, we emphasise the importance of follow-up observations to improve the quality of the time-delay measurements, in line with the conclusions from Huber et al. (2019). The number of lensed SNIa a year that qualifies for accurate  $\Delta t$  measurements with follow-up observations is discussed in Sec. 5.5.

#### 5.5 Gold sample and cosmological prospects

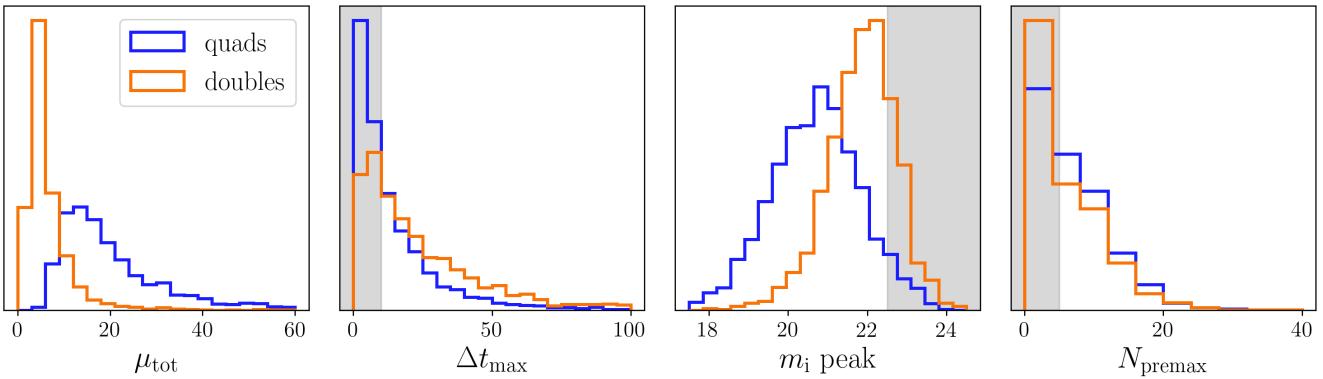
Fig. 10 shows the early detections, peak magnitude, and time delay distributions of the detected sample. When ap-

plying the cuts described in Sec. 4.4, we find that 25% of the detected lensed SNIa belong to the ‘gold’ sample. This corresponds to roughly 10 systems per year, as outlined in Table 3, for which high-quality follow-up observations and precision cosmology measurements are expected to be feasible.

To estimate the cosmological prospects of such a gold sample, we assume the availability, for each system in the sample, of ground-based follow-up observations to sample the light curve well, and high-resolution imaging and spatially-resolved spectroscopy to constrain both the time delays and the lens mass model. We expect that the uncertainty in the inferred time delay, with high-resolution follow-up, will be  $\sim 0.1$ –0.5 days, as inferred from local SN Ia samples (e.g., Johansson et al. 2021) corresponding to a conservative upper limit on the time-delay error of 5%. For the lens mass model, we assume an uncertainty of 7%. Since SNe are explosive transients, we can obtain post-explosion images to cross-check the lens model (Ding et al. 2021), and hence, reduce the uncertainty in the final lens mass model estimate. Observations with Integral Field Units (IFUs) can measure the stellar kinematics and help to further break the mass sheet degeneracy (Birrer & Treu 2021). We note, furthermore, that systems which do not have very precisely measured time delays (e.g., iPTF16geu, SN Zwicky Dhawan et al. 2020; Goobar et al. 2023) can still be important for reducing uncertainties on the mass modelling, via a precisely measured model independent estimate of the lensing magnification (Birrer et al. 2021a). Combining the uncertainties from the time-delay measurement and the mass modelling, we obtain a precision of 8.6% in  $H_0$  for each system in the ‘gold’ sample. Consequently, we would need 30 lensed SNIa to reduce the uncertainty to 1.5% in  $H_0$ , corresponding to  $\sim 3$  years of LSST observations. Furthermore, we note that lensed SNe with shorter time delays (e.g.  $5 < \Delta t < 10$  days) will also contribute to improving the precision, even though the individual uncertainties per system would be greater than 8.6%. In that case, we could reach the expected precision in a shorter duration of the LSST survey.

## 6 DISCUSSION AND CONCLUSIONS

In this work, we studied the detectability of lensed SNIa in LSST. We have investigated the impact of the LSST baseline v3.0 observing strategy and of microlensing on the predicted annual lensed SNIa detections. The LSST observing strategy is expected to proceed using a rolling cadence, in which certain areas of the WFD footprint will be assigned more frequent visits than others. The expected yearly number of lensed SNIa is higher for a non-rolling cadence (50 events) than for a rolling cadence (44 events), but the difference does not appear to be detrimental to the lensed SNe science case. Microlensing effects from stars in the lens galaxy result in a handful fewer detected lensed SNe per year. We found that  $\sim 40\%$  of lensed SNIa detected in LSST will stand out from unlensed SNIa with simple linear cuts in colour and peak magnitude. Using only LSST data, a time delay within 5% of the truth value is expected to be measured for only a small fraction,  $\sim 2\%$  of the systems. Hence it is important



**Figure 10.** Normalised distributions showing the properties of doubles and quads from the detected lensed SNIa sample. From left to right, the panels show the total magnification ( $\mu_{\text{tot}}$ ), maximum time delay between the images ( $\Delta t_{\text{max}}$ ), apparent  $i$ -band magnitude at peak ( $m_i$ ), and the number of detections before peak ( $N_{\text{premax}}$ ). The non-shaded regions indicate the objects that satisfy the conditions for the ‘gold’ sample.

to assess the feasibility of time-delay and  $H_0$  measurements from follow-up observations.

We have determined a set of detectability criteria that will allow for timely follow-up and cosmological inference. Our results predict  $\sim 10$  lensed SNIa per year that will have sufficient early detections and will be sufficiently bright for follow-up observations, while also having time delays larger than 10 days to enable time delay cosmography. Assuming uncertainties of 8.6% in  $H_0$  per object, this sample is expected to enable a Hubble constant measurement of 1.5% precision in three years of LSST observations.

Our results only focus on SNIa; the expected number of lensed core-collapse SNe is likely even higher (Wojtak et al. 2019; Goldstein & Nugent 2017; Oguri & Marshall 2010b). Future work is needed to investigate the cosmological prospects of strongly-lensed core-collapse SNe, which display more intrinsic variation than type Ias but could be used efficiently for spectroscopic time-delay measurements (see e.g. Bayer et al. (2021) for type IIP SNe). Additionally, in this work we have not investigated other sources of background contamination than unlensed SNIa. Other future studies include testing the resolvable separation by injecting lensed SNe in the LSST difference imaging analysis (DIA) pipeline (e.g. Liu et al., in prep.) and testing the pixel-to-cosmology performance for lensed SNe in an analysis similar to Sánchez et al. (2022).

We have shown that lensed SNIa discovered with LSST will be excellent precision probes of cosmology. Crucial to the success of this programme is the availability and co-ordination of follow-up resources, both monitoring of light curves to measure time delays, and high-resolution imaging data and spatially resolved kinematics to constrain the lens mass model. With the selection cuts applied, our work shows that the sample will be sufficiently bright to measure the present-day expansion rate of the Universe with high precision.

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Author contributions are listed below.

NA: conceptualization, methodology, software (lensed SN simulations), formal analysis, writing (original draft; review & editing), visualization;  
 SD: methodology, software, validation, formal analysis (time-delay measurements and gold sample), writing (original draft), visualization;  
 ASC: methodology, software, validation, formal analysis (colour-magnitude diagrams), writing (original draft), visualization;  
 HVP: conceptualization, validation, writing (review & editing), supervision, funding acquisition;  
 AG: validation, writing (review), funding acquisition;  
 RW: software, validation, writing (review);  
 CA: validation;  
 RB: software (OpSim Summary), writing (original draft);  
 SH: software (microlensing simulations), writing (original draft);  
 SB: writing (collaboration internal review)

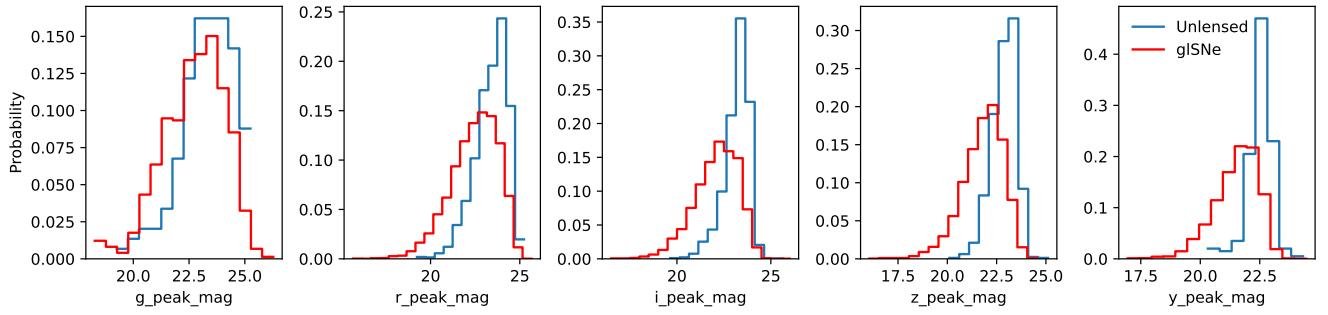
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- Software:* Astropy (Astropy Collaboration et al. 2013, 2018, 2022), Jupyter (Kluyver et al. 2016), Matplotlib (Hunter 2007; Caswell et al. 2020), NumPy (Harris et al. 2020), Pandas (Wes McKinney 2010; Team 2023), Pickle (Van Rossum 2020), SciPy (Virtanen et al. 2020), Seaborn (Waskom et al. 2020), SQLite (Hipp 2020), ChainConsumer (Hinton 2016), Lenstronomy (Birrer & Amara 2018; Birrer et al. 2021b), SNcosmo (Barbary et al. 2016), SALT3 (Guy et al. 2007; Kenworthy et al. 2021), OpSimSummary (Biswas et al. 2020).

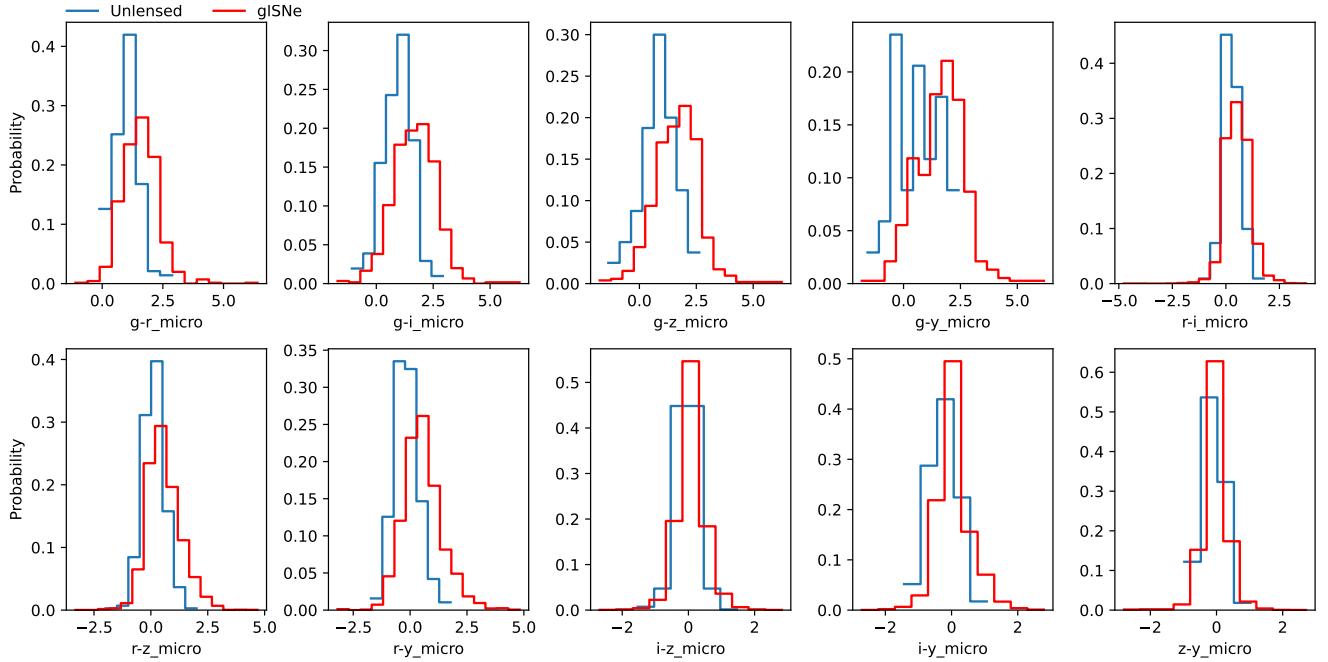
## REFERENCES

- Alves C. S., Peiris H. V., Lochner M., McEwen J. D., Richard K., LSST Dark Energy Science Collaboration 2022
- Astropy Collaboration et al., 2013, *A&A*, **558**, A33
- Astropy Collaboration et al., 2018, *AJ*, **156**, 123
- Astropy Collaboration et al., 2022, *ApJ*, **935**, 167
- Barbary K., et al., 2016, SNcosmo: Python library for supernova cosmology (ascl:1611.017)
- Bayer J., Huber S., Vogl C., Suyu S. H., Taubenberger S., Sluse D., Chan J. H. H., Kerzendorf W. E., 2021, *A&A*, **653**, A29
- Betoule M., et al., 2014, *A&A*, **568**, A22
- Birrer S., Amara A., 2018, *darkU*, **22**, 189
- Birrer S., Treu T., 2021, *A&A*, **649**, A61
- Birrer S., et al., 2020, *A&A*, **643**, A165
- Birrer S., Dhawan S., Shajib A. J., 2021a, arXiv e-prints, p. arXiv:2107.12385
- Birrer S., et al., 2021b, *The Journal of Open Source Software*, **6**, 3283
- Biswas R., Daniel S. F., Hložek R., Kim A. G., Yoachim P., LSST Dark Energy Science Collaboration 2020, *ApJS*, **247**, 60
- Caswell T. A., et al., 2020, matplotlib/matplotlib: REL: v3.3.2
- Chan J. H. H., Rojas K., Millon M., Courbin F., Bonvin V., Jaufret G., 2021, *A&A*, **647**, A115
- Chen W., et al., 2022, *Nature*, **611**, 256
- Choi Y.-Y., Park C., Vogeley M. S., 2007, *ApJ*, **658**, 884
- Crampton D., et al., 2000, in Iye M., Moorwood A. F., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 4008, Optical and IR Telescope Instrumentation and Detectors. pp 114–122, doi:10.1117/12.395420
- Delgado F., Reuter M. A., 2016, in Peck A. B., Seaman R. L., Benn C. R., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 9910, Observatory Operations: Strategies, Processes, and Systems VI. p. 991013, doi:10.1117/12.2233630
- Delgado F., Saha A., Chandrasekharan S., Cook K., Petry C., Ridgway S., 2014, in Angeli G. Z., Dierickx P., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 9150, Modeling, Systems Engineering, and Project Management for Astronomy VI. p. 915015, doi:10.1117/12.2056898
- Dhawan S., et al., 2020, *MNRAS*, **491**, 2639
- Dilday B., et al., 2008, *ApJ*, **682**, 262
- Ding X., Liao K., Birrer S., Shajib A. J., Treu T., Yang L., 2021, preprint, (arXiv:2103.08609)
- Dobler G., Keeton C. R., 2006, *ApJ*, **653**, 1391
- Falco E. E., Gorenstein M. V., Shapiro I. I., 1985, *ApJ*, **289**, L1
- Foxley-Marrable M., Collett T. E., Vernardos G., Goldstein D. A., Bacon D., 2018, *MNRAS*, **478**, 5081
- Freedman W. L., 2021, arXiv e-prints, p. arXiv:2106.15656
- Frye B., et al., 2023, Transient Name Server AstroNote, **96**, 1
- Goldstein D. A., Nugent P. E., 2017, *ApJ*, **834**, L5
- Goldstein D. A., Nugent P. E., Goobar A., 2019, *ApJS*, **243**, 6
- Goobar A., et al., 2017, *Science*, **356**, 291
- Goobar A., et al., 2023, *Nature Astronomy*,
- Gorenstein M. V., Falco E. E., Shapiro I. I., 1988, *ApJ*, **327**, 693
- Guy J., et al., 2007, *A&A*, **466**, 11
- Guy J., et al., 2010, *A&A*, **523**, A7
- Harris C. R., et al., 2020, *Nature*, **585**, 357
- Hicken M., et al., 2012, *ApJS*, **200**, 12
- Hinton S. R., 2016, *The Journal of Open Source Software*, **1**, 00045
- Hipp R. D., 2020, SQLite, <https://www.sqlite.org/index.html>
- Huber S., et al., 2019, *A&A*, **631**, A161
- Huber S., Suyu S. H., Noebauer U. M., Chan J. H. H., Kromer M., Sim S. A., Sluse D., Taubenberger S., 2021, *A&A*, **646**, A110
- Huber S., et al., 2022, *A&A*, **658**, A157
- Hunter J. D., 2007, *Computing in Science & Engineering*, **9**, 90
- Hyde J. B., Bernardi M., 2009, *MNRAS*, **394**, 1978
- Ivezic Z., et al., 2008, preprint, (arXiv:0805.2366)
- Johansson J., et al., 2021, *ApJ*, **923**, 237
- Kelly P. L., et al., 2015, *Science*, **347**, 1123
- Kelly P., et al., 2022, Transient Name Server AstroNote, **169**, 1
- Kelly P. L., et al., 2023, *Science*, **380**, abh1322
- Kenworthy W. D., et al., 2021, *ApJ*, **923**, 265
- Kluyver T., et al., 2016, in , IOS Press. pp 87–90, doi:10.3233/978-1-61499-649-1-87
- Kolatt T. S., Bartelmann M., 1998, *MNRAS*, **296**, 763
- Kromer M., Sim 2009, *MNRAS*, **398**, 1809
- Naghib E., Yoachim P., Vanderbei R. J., Connolly A. J., Jones R. L., 2019, *AJ*, **157**, 151
- Oguri M., Kawano Y., 2003, *MNRAS*, **338**, L25
- Oguri M., Marshall P. J., 2010a, *MNRAS*, **405**, 2579
- Oguri M., Marshall P. J., 2010b, *MNRAS*, **405**, 2579
- Phillips M. M., 1993, *ApJ*, **413**, L105
- Pierel J. D. R., Rodney S., Vernardos G., Oguri M., Kessler R., Anguita T., 2020, arXiv e-prints, p. arXiv:2010.12399
- Planck Collaboration et al., 2016, *A&A*, **594**, A13
- Planck Collaboration et al., 2018, preprint, (arXiv:1807.06209)
- Quimby R. M., et al., 2014, *Science*, **344**, 396
- Refsdal S., 1964, *MNRAS*, **128**, 307
- Rest A., et al., 2014, *ApJ*, **795**, 44
- Riess A. G., Casertano S., Yuan W., Bowers J. B., Macri L., Zinn J. C., Scolnic D., 2021, *ApJ*, **908**, L6
- Rodney S. A., et al., 2014, *AJ*, **148**, 13
- Rodney S. A., Brammer G. B., Pierel J. D. R., Richard J., Toft S., O’Connor K. F., Akhshik M., Whitaker K. E., 2021, *Nature Astronomy*, **5**, 1118
- Saha P., 2000, *AJ*, **120**, 1654
- Sainz de Murieta A., Collett T. E., Magee M. R., Weisenbach L., Krawczyk C. M., Enzi W., 2023, *MNRAS*, **526**, 4296
- Sako M., et al., 2018, *PASP*, **130**, 064002
- Sánchez B. O., et al., 2022, *ApJ*, **934**, 96

- 883 Schneider P., Sluse D., 2013, [A&A](#), **559**, A37  
 884 Scolnic D., Kessler R., 2016, [ApJ](#), **822**, L35  
 885 Snodgrass C., Saviane I., Monaco L., Sinclair P., 2008, The Mes-  
   886 senger, **132**, 18  
 887 Stritzinger M. D., et al., 2011, [AJ](#), **142**, 156  
 888 Suyu S. H., et al., 2020, [A&A](#), **644**, A162  
 889 Suyu S. H., Goobar A., Collett T., More A., Vernardos G., 2023,  
   890 [arXiv e-prints](#), p. [arXiv:2301.07729](#)  
 891 Swann E., et al., 2019, The Messenger, **175**, 58  
 892 Team T. P. D., 2023, pandas-dev/pandas: Pandas, Zenodo,  
   893 [doi:10.5281/zenodo.3509134](#)  
 894 The LSST Dark Energy Science Collaboration et al., 2018, [arXiv](#)  
   895 [e-prints](#), p. [arXiv:1809.01669](#)  
 896 Treu T., Marshall P. J., 2016, [A&ARv](#), **24**, 11  
 897 Tripp R., 1998, [A&A](#), **331**, 815  
 898 Van Rossum G., 2020, The Python Library Reference, release  
   899 3.8.2. Python Software Foundation  
 900 Vernardos G., Fluke C. J., 2014, [Astron. Comput.](#), **6**, 1  
 901 Vernardos G., Fluke C. J., Bate N. F., Croton D., 2014, [ApJ](#)  
   902 [Suppl.](#), **211**, 16  
 903 Vernardos G., Fluke C. J., Bate N. F., Croton D., Vohl D., 2015,  
   904 [ApJ Suppl.](#), **217**, 23  
 905 Virtanen P., et al., 2020, [Nature Methods](#), **17**, 261  
 906 Waskom M., et al., 2020, mwaskom/seaborn: v0.11.0 (Sepetmber  
   907 2020)  
 908 Wes McKinney 2010, in Stéfan van der Walt Jarrod Millman eds,  
   909 Proceedings of the 9th Python in Science Conference. pp 56  
   – 61, [doi:10.25080/Majora-92bf1922-00a](#)  
 911 Wojtak R., Hjorth J., Gall C., 2019, [MNRAS](#), **487**, 3342  
 912 Wong K. C., et al., 2020, [MNRAS](#), **498**, 1420



**Figure A1.** Peak apparent magnitudes in the  $g, r, i, z, y$ -bands for simulated lensed and unlensed SNIa.

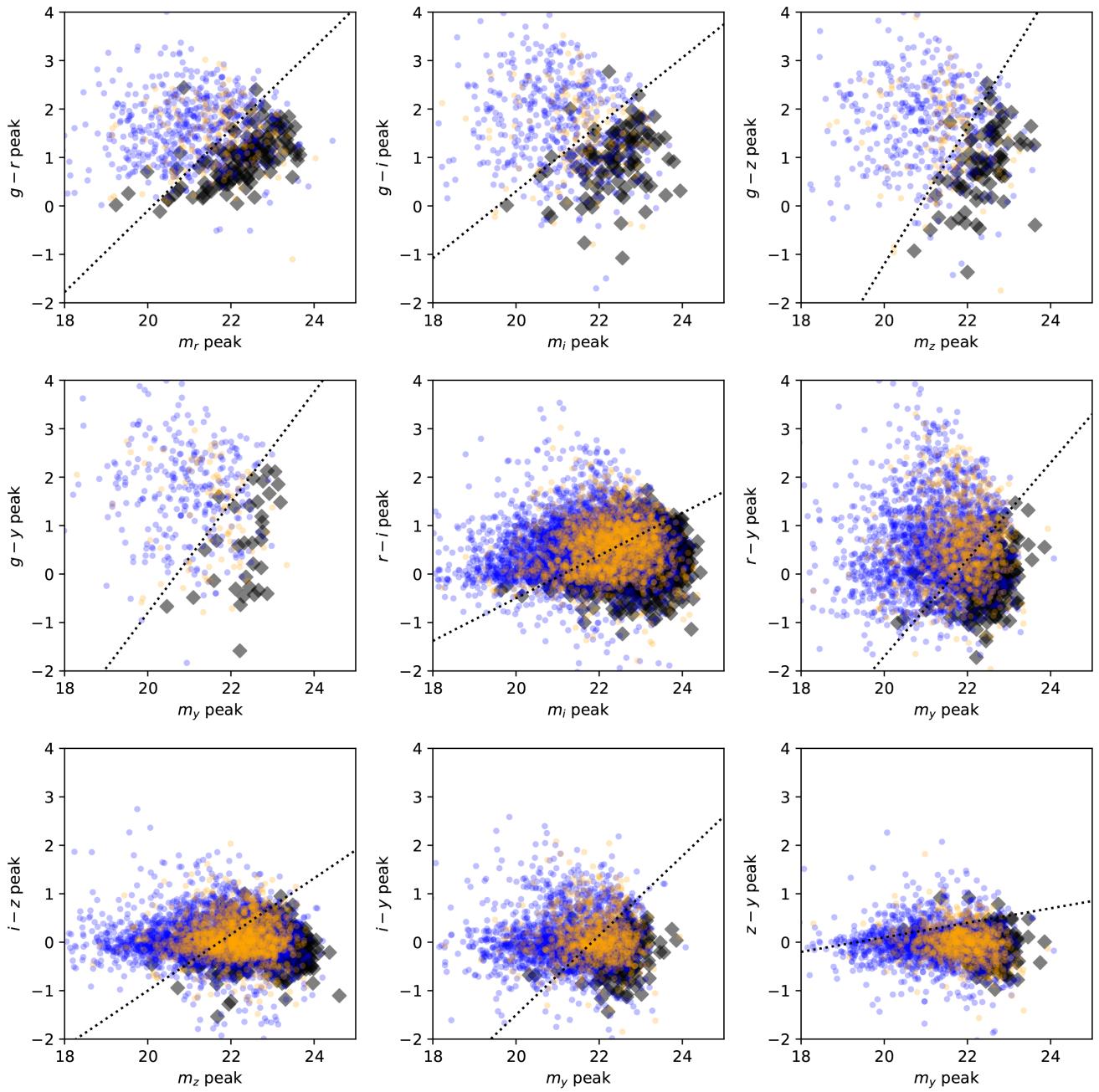


**Figure A2.** Colours ( $g-r$ ,  $g-i$ ,  $g-z$ ,  $g-y$ ,  $r-i$ ,  $r-z$ ,  $r-y$ ,  $i-z$ ,  $i-y$  and  $z-y$ ) for simulated lensed and unlensed SNIa.

## APPENDIX A: COLOUR AND MAGNITUDE CUTS

Here, we provide all results from the colour-magnitude investigation of simulated lensed and unlensed SNIa as described in Sec. 4.2. Fig. A1 shows the 1D distributions of peak apparent magnitudes in the  $g, r, i, z$ -bands and Fig. A2 the colours at peak. The joint colour-magnitude diagrams are displayed in Fig. A3. Our results predict that the colour-magnitude combination with the strongest separation between lensed and unlensed SNIa is  $r - z$  colours versus  $z$ -band magnitudes, but we combine all colour-magnitude combinations for the best result.

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**Figure A3.** Colour-magnitude cuts described in Sec. 5.3 used (together with  $r - z$  versus  $z$  shown in Fig. 9) to calculate the total number of lensed events that are distinguishable from unlensed SNIa.