Survey Strategy and Cadence Choices For the Vera C. Rubin Observatory Legacy Survey of Space and Time (LSST)

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ABSTRACT

A summary of survey strategy and cadence choices, simulated and evaluated by the Vera C. Rubin Observatory Legacy Survey of Space and Time (LSST) Scheduler Team, prepared for the Survey Cadence and Optimization Committee (SCOC).

The initial idea of a large telescope survey, covering the entire visible sky repeatedly every few days in multiple bandpasses over the course of ten years, is the core idea of the LSST. A large area (about 20,000 square degrees) observed under a wide range of conditions to deep coadded limiting magnitudes in bandpasses ugrizy enables cosmological studies with unprecedented precision; the same survey, when cadenced well, can serve to open new windows into our understanding of transient and variable stars, and extend our knowledge of small bodies throughout the Solar System by orders of magnitude. The outlines of these goals and some basic necessary requirements for those goals are outlined in the LSST Science Requirements Document (SRD)^{a)}. Finding options for the observing strategy to meet more detailed needs of an even wider range of science goals, as well as building the LSST Scheduler and Metrics Analysis Framework, has been the work of the LSST Scheduler Team with support and input from the astronomical community, including the COSEP ^{b)}, the Call for White Papers^{c)}, and innumerable metrics, and guidance from the LSST Science Advisory Committee in their Recommendations for Operations Simulator Experiments^{d)}.

a) ls.st/srd

b) https://github.com/LSSTScienceCollaborations/ObservingStrategy

c) Document-28382

d) Document-32816

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1. INTRODUCTION

Vera C. Rubin Observatory (Rubin) will carry out the Legacy Survey of Space and Time (LSST) over the first ten years of its lifetime. The LSST is intended to meet four core science goals:

- constraining dark energy and dark matter
- taking an inventory of the Solar System
- exploring the transient optical sky, and
- mapping the Milky Way.

The basic requirements for these goals are described in the LSST Science Requirements Document (SRD¹). In practice, the SRD intentionally places minimal quantitative constraints on the observing strategy, primarily requiring:

- A footprint for the 'main survey' of at least 18,000 deg², which must be uniformly covered to a median of 825 30-second visits per 9.6 deg² field, summed over all six filters, ugrizy (see SRD Tables 22 and 23). This places a minimum constraint on the time required to complete the main survey. Simulated surveys indicate that the main survey typically requires 80–90% of the available time (10 years) to reach this benchmark; even with scheduling improvements, it is unlikely that the goals of the main survey could be met with a time allocation significantly below 80%.
- Parallax and proper motion 1σ accuracies of 3 mas and 1 mas/yr per coordinate at r=24, respectively, in the main survey (see SRD Table 26), which places a weak constraint on how visits are distributed throughout the lifetime of the survey and throughout a season.
- Rapid revisits (40 seconds to 30 minutes) must be acquired over an area of at least 2000 deg² (see SRD table 25) for very fast transient discovery; this requirement can usually be satisfied via simple field overlaps when surveying contiguous areas of sky.

This leaves significant flexibility in the detailed cadence of observations within the main survey footprint, including the distribution of visits within a year (or between seasons), the distribution between filters and the definition of a 'visit' itself. Furthermore, these constraints apply to the main survey; the use of the remaining time (i.e., in mini surveys) is not constrained by the SRD.

In order to maximize the overall science impact of the LSST, in 2018 the project issued a call for white papers requesting survey strategy input². The 46 submitted white papers represent a wide swath of the astronomical community, and work

¹ The LSST Science Requirements Document (SRD) is available at http://ls.st/srd

² The call for white papers is available at http://ls.st/doc-28382

together with the Community Observing Strategy Evaluation Paper (COSEP)³ to shape the next stage of the survey strategy evaluation. The contents of these white papers were distilled into several areas for investigation by the LSST Science Advisory Council (SAC) in their advisory response to the project⁴.

This survey strategy optimization work is starting from an existing candidate baseline strategy, driven by the basic science goals. A brief introduction to the baseline survey strategy, expanded background of the primary LSST science goals, and concise descriptions of how these goals drive the basic survey strategy and data processing requirements are provided in the LSST Overview paper⁵. A reference survey simulation (baseline2018a), generated by an earlier version of the LSST survey simulation tools (see Section 2), provided an implemented example of this strategy. This starting point for the survey strategy can be described extremely briefly as follows:

- The main "wide-fast-deep" (WFD) survey, which covers ~18,000 deg² of sky within the equatorial declination range $-62^{\circ} < \delta < +2^{\circ}$, and excluding the central portion of the Galactic plane. Within the main survey, two visits⁶ per 9.6 deg² field (in either the same or different filters) are acquired in each night, to allow identification of moving objects and rapidly varying transients, and to improve the reliability of the alert stream. These pairs of visits are repeated every three to four nights throughout the period the field is visible in each year (other nights are used to maximize the sky coverage). Each field in the main survey receives about 825 visits throughout the ten years of the LSST, spread over the six LSST filters ugrizy. The quantitative SRD constraints on area coverage, number of visits, parallax and proper motion errors, and rapid-revisit rate (40 seconds 30 minutes) apply to visits obtained in the main survey.
- The set of five **Deep Drilling Field candidate mini surveys**, consisting of five specific field pointings for a total of $\sim 50 \text{ deg}^2$, which are observed with a much denser sampling rate. These mini surveys use a similar sequence of visits; the fields are observed every three to four days, but in a sequence of multiple grizy exposures during gray and bright time, and then multiple sequential u band exposures during dark time. The current deep drilling mini survey fields are aimed at extragalactic science, providing a 'gold sample' to calibrate the main survey, and to discover Type Ia supernovae.
- The Galactic Plane candidate mini survey covers the central portion of the Galactic plane that is not included in the main survey, centered around $|l| = 0^{\circ}$ and covering $\sim 1860 \text{ deg}^2$. It is observed at a much reduced rate compared to the main survey, and with a smaller total number of observations

³ The github repository containing the living source for the COSEP is https://github.com/LSSTScienceCollaborations/ObservingStrategy

⁴ The SAC white paper report is available at http://ls.st/doc-32816

⁵ The LSST Overview paper is a living document available at http://ls.st/lop.

 $^{^6}$ A 'visit' here is an LSST default visit, which consists of two back-to-back 15 sec exposures, for a total of 30 sec of on-sky exposure time. These back-to-back exposures are always in the same filter, separated only by the 2 second readout time.

per field (30 visits per field and per filter, in ugrizy), so as to provide astrometry and photometry of stars toward the Galactic center but without reaching the confusion limit in the coadded images. There is no requirement for pairs of visits in each night in this area.

- The North Ecliptic Spur candidate mini survey covers the area north of $\delta = +2^{\circ}$ to 10° north of the Ecliptic plane and is intended to observe the entire Ecliptic plane for the purpose of inventorying the minor bodies in the Solar System. This area ($\sim 4160~\rm deg^2$) is observed on a schedule similar to the main survey, although with a smaller total number of visits per field and only in filters griz.
- The South Celestial Pole candidate mini survey covers the region south of the main survey, to the South Celestial Pole, ~ 2315 deg², including the Magellanic Clouds. This mini survey is observed with a strategy similar to the Galactic Plane mini survey, with 30 visits per field per filter in ugrizy, and without requiring pairs of visits. This provides coverage of the Magellanic clouds, but without committing extensive time as these fields are at high airmasses from the LSST site.

This report covers the LSST Survey Strategy team's experiments with the LSST scheduler to address the optimization questions raised by the SAC. These questions include:

- How should the WFD footprint be defined?
- What should the cadence of visits within the WFD look like? This includes both the intra-night cadence and the inter-night cadence throughout the season.
- What is the impact of varying the footprint for mini-surveys?
- Can we leverage twilight observing?
- How should the Deep Drilling fields be distributed and what cadence should be used for their observations?
- What are the impact of ToO proposals, particularly gravitational wave followup?

These questions are aimed at ensuring the best possible science return from the LSST.

2. SURVEY SIMULATOR OVERVIEW

In operations, the LSST needs an automated scheduler to appropriately plan and execute the ≈ 1000 visits per night. Prior to operations, we have a need to use the same scheduler to understand the range of possible survey strategies and their science potential; even in operations it is useful to run the scheduler in a 'simulation'

Parameter	Value
Min altitude	$20 \deg$
Max altitude	$86.5 \deg$
Camera readout	$2 { m sec}$
Shutter time	$1 \mathrm{sec}$
Filter change time	$120 \sec$
Number filters mounted	5
Azimuth slew settle time	$1 \mathrm{sec}$
Closed Optics Loop Delay	$36 \sec (\text{when} > 9 \deg \text{altitude change})$
Approximate azimuth slew time	$t_{slew Az} = 0.66 \sec/\deg * \delta Az(\deg) + C^{Az}$; min = 3 sec
Approximate altitude slew time	$t_{slewAlt} = 0.57 \sec/\deg * \delta Alt(\deg) + C^{Alt}$

Table 1. A subset of ts_observatory_model parameters and slew time approximations.

mode in order to evaluate the future impact of changes in observatory hardware or changes to the observing strategy. As such, we need a robust scheduler, together with high-fidelity model inputs for the telescope operations and observing telemetry.

Probably need some reference to what survey scheduler was used / how it was set up for various runs, how the runs were performed, and what the input weather and telescope models were like.

2.1. The Model Observatory 2.1.1. Telescope Model

The physical telescope operations are modeled using the LSST software package ts_observatory_model. This package includes a kinematic model of the telescope, with appropriate acceleration/deceleration and maximum velocity limits, including requirements for sequencing (changing the filter before slewing, for example). It also enforces requirements needed before image acquisition, such as the settle time after slewing and the active optics open- and closed-loop acquisition times. Other important considerations are the extent of cable wrap due to azimuth slews or camera rotation. The parameters for the telescope model are configurable, coming from the Telescope and Site and Camera teams. These parameters are largely unchanged from Delgado et al. (2014); a subset of these parameters are described in Table 1.

2.1.2. Cloud Model

The cloud model is based on historical cloud sky coverage data from Cerro-Tololo Inter-American Observatory (CTIO), from the ten year period 1996 to 2005.

The SOAR telescope reports losing 15.3-33.4% (mean=22.9%) of science time to weather from 2014-2018⁷. This is consistent with the weather downtime reported by Gemini South (private communication).

If we model the observatory as closed when the sky is 30% cloudy or cloudier, we reach a weather downtime of 29.8%. While we expect some observations will

⁷ http://www.ctio.noao.edu/soar/content/soar-observing-statistics

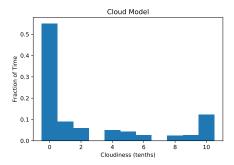


Figure 1. The distribution of cloudiness as measured at CTIO. We model the observatory as closed for cloud levels above 3/10.

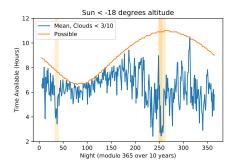


Figure 2. The total amount of possible time per night and the average amount of time after removing weather downtime. Shaded regions show scheduled downtime. Our modeled unscheduled downtime is not included in the plot.

be possible in 30% cloudy skies, this cutoff also accounts for other weather related closures (humidity, wind, dust, etc).

2.1.3. Seeing Model

Simulations completed starting in 2020 use a revised database for the atmospheric seeing. The revised database, like its predecessor, is based on seeing measurements from the Geminin South DIMM, located at the same site as Rubin Observatory. We derived predicted delivered imager FWHM from the reported DIMM measurements using the approximation of the von Kármán turbulance model given in Tokovinin (2002) and an outer scale of 30 meters, and validated this relationship between DIMM measurements and seeing by comparing these derived values to the image quality measured from the Gemini South GMOS instrument. We also tested the DIMM data by deriving a seeing using the Kolmogorov relationship and comparing the result to the seeing measured by the DECam imager on the Blanco telescope at CTIO, a few miles away.

For most time samples in the simulation database, we generated seeing data by resampling seeing derived from the DIMM into 5 minute intervals, and shifting it ahead 4748 days (13.000 tropical years). For example, the seeing for 2022-01-01 in the simulation database is taken from the DIMM seeing on 2009-01-01. Thus, most of the ten simulated years use seeing values that replay ten historical years.

There is, however, significant time for which no DIMM data is available, for example due to clouds or equipment failure. We used a model of $log(r_0)$ (where r_0 is the Fried parameter) derived from the DIMM data to generate artificial seeing values for these times. This model has several components:

- a yearly sinusoidal variation in $log(r_0)$ to include seasonal variation,
- a smooth (years timescale) fit to the residuals with respect to the seasonal variation to represent multi-year trends in seeing,
- a 1st-order autoregressive series (damped random walk) to represent variations in the nightly seeing, and
- another 1st-order AR series to represent variations on a 5-minute timescale within a night.

Artificial data generated according to this model therefore maintains the night to night and short term distributions and correlations present in the DIMM data, and follows seasonal variations and longer term trends in the DIMM data surrounding it.

2.1.4. Skybrightness Model

The observatory model includes a model for the sky brightness. The model is built mostly from the ESO sky brightness model which includes upper and lower atmosphere emission lines, airglow continuum, scattered lunar light, and zodiacal light. In addition, we have added a twilight model fit from all-sky camera observations at the site. The sky brightness model does not include human generated light pollution. While the ESO model does include the ability to scale the airglow component with solar activity, we use the default mean solar activity throughout. Compared to all sky camera observations, the skybrightness model has RMS deviations of ~ 0.2 -0.3 magnitudes per square arcsecond (Yoachim et al. 2016).

With so many independent components, the sky brightness is potentially the most computationally expensive aspects of the simulations. We pre-compute sky brightness maps in all six Rubin filters in 5-15 minute time steps which can then be rapidly interpolated to exact times.

2.1.5. Maintenance Downtime Model

The observatory model includes both scheduled and unscheduled downtime. Figure 3 shows we simulate approximately 10% of time lost to maintenance. The scheduled downtime allowance is currently about 22 weeks over the full 10 year survey. This is taken in either two one week periods twice a year, or a single two week period in alternating years. The unscheduled downtime allowance is approximately 28 weeks, in variable amounts of time, often as short as a single night. The scheduled downtime is planned during the same periods that are most likely to be bad weather, when possible. In the future, scheduled downtime may be shifted within a month to better align with the full moon.

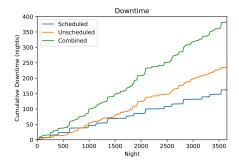


Figure 3. The simulated scheduled and unscheduled downtimes over 10 years.

2.2. The Scheduler

Optimally scheduling telescopic observations is a traditionally difficult problem. Most observatories have typically scheduled observations by hand. The LCO and ZTF have implemented integer linear programming techniques to optimize their scheduling (Lampoudi et al. 2015; Bellm et al. 2019). Integer programming is difficult to use for Rubin because we have multiple science goals which are intended to be serviced simultaneously. Thus, there is no well-defined value which can be maximized when scheduling Rubin. Rothchild et al. (2019) simulated Rubin observations with a very fast deterministic scheduler, essentially repeating a fixed raster pattern mostly along the meridian. This algorithm showed great promise, but had several downsides (such as occasionally pointing at the moon). For the Rubin scheduler, we follow the example in Naghib et al. (2019) and use a Markov Decision Process to select most of the observations.

The Rubin scheduler is designed to provide real-time decisions on where and how to observe. Because we expect there to be weather interruptions, we need a system that can recover quickly. Unlike other traditional telescope schedulers, we do not try to optimize a large number of observations in advance, but rather use a decision tree along with a modified Markov Decision Process. The scheduler behavior is set by a small number of free parameters that can be tuned.

Our baseline scheduler uses a three tier decision tree when deciding what observations to attempt.

2.2.1. Tier 1: Deep Drilling Fields

The first tier of the decision tree is to check if there are any deep drilling fields that should be executed. We typically have five DDFs in a simulation.

For a DDF to be eligible to send a sequence to the observing queue, it must

- Not currently be twilight
- Have enough time to finish a sequence before twilight begins
- Be in it's target hour angle range
- The moon must be down

Name	RA	Dec
	(Deg)	(Deg)
ELAISS1	9.450	-44.000
XMM-LSS	35.708	-4.750
ECDFS	53.125	-28.100
COSMOS	150.100	2.182
EDFS	58.970	-49.280
EDFS	63.600	-47.600

Table 2. The location of the deep drilling fields used in our simulations.

• The DDF must not have exceeded it's limit of observations (typically $\sim 1\%$ of the total number of visits)

If the DDF has not fallen behind, it will space sequences by at least 1.5 days. There is also a check to see if the DDF will be feasible and better observed later in the night, in which case no observations are requested.

If the above conditions are met, the DDF sends it's sequence of observations to the queue to be executed. There are currently no attempts at recovery if a sequence is interrupted.

The spatial position of the DDF is dithered nightly up to 0.7 degrees. The camera rotator is also varied nightly to be between -75 and 75 degrees with respect to the telescope.

2.2.2. Tier 2: The Blobs

If there are no DDFs requesting observations, the decision tree moves to the second tier. This tier is the survey workhorse, executing $\sim 80\%$ of the simulation visits. This tier will only request observations if it is not currently twilight, and there is at least 30 minutes before twilight begins.

A modified Markov Decision Process (MDP) is used to decide what sky region and filter combination to observe given the current conditions and observation history. Briefly, the MDP balances the desire to observe areas 1) that are closest to the optimal possible in terms of 5-sigma depth, 2) which have fallen behind the specified desired survey footprint, 3) are near the current telescope pointing and 4) in the currently loaded filter to minimize filter changes. In addition to these core components, the MDP includes a mask around zenith, a 30 degree mask around the moon, and small masks around the bright planets (Venus, Mars, Jupiter). The end product of the MDP is a reward function that ranks the desirability of every point in the sky. Because this tier does not execute in twilight, we assume the reward function is relatively stable on 40 minute timescales.

A sky area around the reward function maximum that will take \sim 22 minutes to observe (\sim 35 pointings) is then selected. If possible, the area is selected to be be contiguous. The exact position of the telescope pointings are determined by the sky

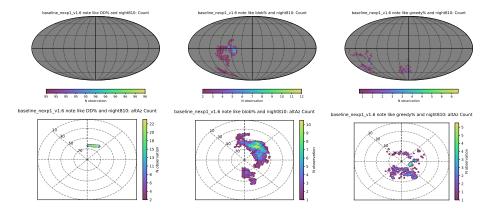


Figure 4. Examples of how the three scheduler tiers execute during a single night. Left panels show how a DDF sequence was observed during the night. Middle panels show observations taken as part of blob pairs. Right panels show the greedy observations taken in twilight time. The panels from left to right show the different decision tiers the scheduler uses, with the DDFs as the top tier and the greedy algorithm as the bottom tier.

tessellation, which is randomly oriented for each night. The camera rotator angle (relative to the telescope) is also randomized between ± 80 degrees each night.

A traveling salesman algorithm is used to put the pointings in an order that minimizes the slew time. The list of pointings are then repeated, usually in a different filter, ensuring moving objects can be detected. One of seven possible filter combinations is used: u+g, u+r, g+r, r+i, i+z, z+y, or y+y. We use 30 second visits for the majority of simulations. The official baseline uses visits comprised of two 15 second snaps.

2.2.3. *Tier 3: Greedy*

If it is during morning or evening twilight, or close to morning twilight, the DDFs and Blob surveys will pass and the decision tree goes to the third and final tier, the greedy surveys.

The greedy surveys use a similar Markov Decision Process as in Tier 2, but rather than selecting large areas of sky to observe, the survey selects a single pointing at a time. No attempt is made to observe greedy scheduled observations in pairs. Since this tier is primarily used in twilight time, it only schedules observations in the redder filters r, i, z, and y.

As with the Blob tier, the sky tessellation orientation is randomized each night so the final survey is spatially dithered.

2.3. Filter Mounting Schedule

In addition to the observations scheduler, we have a separate scheduler that decides which five filters should be loaded for the start of each night. By default, we mount redder filters (grizy) when the moon is more than 40% illuminated and bluer filters (ugriy) closer to new moon. (See Section 4.1 for more information on the choice of when to swap the filter.)

3. METRICS

There are many, many options for evaluating the output of the survey strategy experiments. One of the primary goals for the LSST Metrics Analysis Framework (MAF) package was to make it easier for both the project and community members to write metrics to evaluate these outputs. This effort has had some significant successes; SRD-level metrics have been written that cover the primary requirements for the SRD, the DESC working groups have made good progress in writing metrics for their evaluation of the simulations, and the Solar System collaboration has contributed substantial metrics. In other areas, it has been more difficult for the community to engage and contribute directly to MAF; for some of these areas, we have been able to help get metrics running, but clearly there are areas which are lacking definitive metrics. Many of the areas which are lacking relate directly to time domain studies, a critical area for the LSST. We acknowledge this problem and encourage further work by the community, particularly over the next year.

Here we make a brief summary of some of the top-level science-related metrics. There are thousands of metrics which are run as part of standard MAF analysis; for broad comparisons between simulations we pick a very limited subset of these metrics intended to discover or highlight differences between the simulation survey strategies or to cover major areas of science.

3.1. SRD Metrics

The SRD metrics are designed to cover the primary science requirements laid out in the SRD; the most relevant of these relate to the number of visits per pointing across the WFD region, the area of the WFD region, the parallax and proper motion errors and the number of rapid revisits (on timescales between a few to 40 seconds) per point on the sky. While we check all of these metrics for all runs, the most sensitive to changes in the survey strategy is the number of visits across the WFD, tracked in the fO metric, since we are often attempting to distribute visits into other parts of the sky for other science.

The fO metric calculates the total number of visits per point on the sky, then calculates how much area is covered with how many visits. This can be summarized across a two axes; the amount of area that receives at least 825 visits per pointing ('fO Area') or the median (or minimum) number of visits that the most frequently visits 18,000 square degrees receives ('fONv MedianNvisits' or 'fONv MinNvisits'). The first version, fO Area, tends to be somewhat unstable; the survey hardly ever observes more than 18k sq deg to at least 825 visits, because we don't program in larger WFD areas, but if the number of visits across the WFD area falls below 825, the resulting fO Area value will fall rapidly (because we cover the sky uniformly). While fO Area is useful to check, a more useful number is fONv MedianNvisits or MinNvisits. The value of fONv MedianNvisits tells us how many visits the typical field in the top 18k sq degrees receives; fONv MinimumNvisits tells us the fewest number

of visits any of those top 18k sq deg received. Typically we see fONv MedianNvisits scales more smoothly with the fraction of visits devoted to WFD and likely represents science metrics that depend on having a reasonably large amount of visits over the entire WFD well.

The radar plots use fONv MedianNvisits, the Median Parallax Error, and the Median Proper Motion Error. The astrometry metrics both assume an r=20 magnitude star with a flat SED. When plotted in radar plots, we compare the reciprical of the astrometry uncertainties so that larger values on the radar plot can always be interpreted as "better".

3.2. Solar System Science Metrics

Solar System science metrics include discovery metrics (with various discovery criteria, such as detections in 3 nights with pairs of visits within a 15 night window) and characterization metrics (ie. how many colors for objects can we measure, and can we determine a light curve or even shape measurement from the lightcurve), contributed by both project and science collaboration. The most important metric for solar system objects is discovery; finding the objects is the first priority. Characterization metrics are secondary metrics. For each of these metrics, we generate input observations using an appropriate solar system population: Potentially Hazardous Asteroids (PHAs) and Near Earth Objects (NEOs) based on a model by Granvik et al. (2018), Main Belt Asteroids (MBAs) and Jovian Trojans based on the S3M model from Grav et al. (2011), and TransNeptunian Objects (TNOs) based on the L7 model from the Canda France Ecliptic Plane Survey (CFEPS) (Kavelaars et al. 2009; Petit et al. 2011). These populations move at varying rates and cover varying amounts of the sky. NEOs move over much of the sky during the lifetime of the survey, so are less sensitive to footprint variations, but tend to have much more strongly varying brightnesses, thus are sensitive to the number and timing of visits (must be observed when they are bright). TNOs move very slowly, not more than a few fields of view over the lifetime of the survey, so are quite sensitive to footprint, however they are relatively consistent in their brightness; thus they are less sensitive to the overall number of visits at a particular point in the sky, once a threshold has been met.

For each of these populations, we calculate the population completeness due to discovery with the LSST at the end of 10 years (not including previous surveys) with the currently Moving Object Pipeline baseline criteria; 3 nights with pairs of visits within 15 nights at a range of absolute magnitude H (approximately the size of the object) and then take the completeness at an H value near peak completeness and an H value that is relatively close to 50% completeness in the baseline; these completeness values are the summary metrics we track across various runs to compare them here.

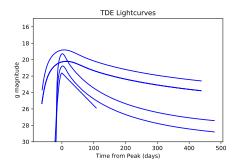


Figure 5. Simulated TDE lightcurve shapes.

The radar plots use the completeness for bright (H=16) NEOs, faint (H=22) NEOs, and bright (H=4) TNOs.

3.3. Number of Stars

We use a simulated MW stellar catalog from galfast along with the survey coadded depth to estimate the number of stars that would be detected at the 5σ level in i. Comparison with the TRILEGAL galaxy model gives similar results.

The number of stars is primarily sensitive to the footprint definition, and decreases dramatically (by about half) when there is no coverage of the galactic plane. An extended survey footprint (such as increased coverage toward the north) also increases the number of stars. Because we are only computing the metric in the i filter, the metric is also sensitive to the depth in i, and thus we can see some variation if, e.g., a simulation pushes more i observations to twilight time.

The radar plots use the total number of stars over the entire footprint down to the coadded limiting magnitude. We do not include a crowding correction.

3.4. Tidal Disruption Events (TDE)

We use TDE lightcurves from the community to generate a sample of TDE events distributed uniformly on the sky and uniformly over the 10 year survey. Figure 5 shows the lightcurve shapes. When analyzing a detected light curve, we test three crtiera

- If it is detected twice pre-peak in any filters
- If there is one detection pre-peak and at least 3 filters within 10 days of peak
- If there is one detection pre-peak, one detection in u and any other band near peak, and u plus any other filter post-peak.

When requiring both a color in any filter and u band measurements during the TDE event, this metric is exceedingly sensitive to the number and cadence of u band visits, with the number of detected TDEs scaling linearly with the number of u band visits and preferring visits spread more uniformly over time. In other configurations, when requiring observations pre-peak or just a color in any filters, it is primarily sensitive

to the frequency of observations and whether pairs are obtained in the same or mixed filters.

The radar plot uses the TDE some color plus u band metric output.

3.5. Fast Microlensing

We use microlensing light curves contributed from the community. For all the events, we assume an r=22 magnitude star with a flat SED is being magnified.

We calculate both a Fast (crossing times of 1-10 days) and Slow (crossing times 100-1,500 days) microlensing metric. They are distributed on the sky proportionally to stellar density squared as measured from TRILEGAL galaxy model. Due to this spatial distribution, both the Slow and Fast microlensing metrics are primarily sensitive to survey footprint. Footprints without galactic plane coverage cut the number of detected microlenses by approximately 75% while footprints with heavy galactic plane coverage can increase the number of microlenses by a factor of 2 or more. The Fast microlensing metric is also sensitive to the number and cadence of u band visits, preferring u band visits spread more uniformly over time.

The radar plot uses the Fast microlensing metric. We find the slow microlensing events are so slow they are detected at a very high rate regardless of survey strategy.

3.6. Number of Galaxies

The estimated expected number of galaxies, across the entire survey footprint, is calculated using GalaxyCountsMetric_extended, from sims_maf_contrib. The number of galaxies is estimated based on the coadded depth using redshift-bin-specific powerlaws, based on mock catalogs from Padilla & Baugh (2003). The overall number of galaxies tends to increase with increased depth, and more so when more of the survey footprint is distributed in lower dust extinction areas. The number of galaxies also increases when the survey filter distribution is redder, rather than bluer.

The radar plots use the total number of galaxies down to the coadded limiting magnitude over the entire survey footprint.

3.7. DESC WFD Metrics

The DESC has contributed several metrics evaluating the performance of the WFD for various areas of relevant science. Many of these metrics are built on calculating a subset of the survey footprint that meets the requirements of coverage in all 6 filters, less than a specified level of dust extinction (E(B-V) < 0.2) and greater than a specified coadded depth in i band (i > 25.9 at 10 years), calculated using ExgalM5 with cuts. This represents the extragalactic science footprint.

3.7.1. Static Science

Over this extragalactic footprint the following metrics are calculated for general 'static science'.

• Median coadded depth in i band

- Standard deviation of the coadded depth in i band
- The area of the selected footprint
- A 3x2 point Figure of Merit emulator

. These metrics are very sensitive to footprint coverage and depth, as well as desiring evenness in the coadded depth to minimize corrections during later analysis. The radar plot uses the 3x2point FoM.

3.7.2. Weak Lensing

The same footprint is used to calculate the number of visits per point in the footprint (WeakLensingNvisits); this is used as an approximate metric evaluating weak lensing systematics. This metric is sensitive to footprint coverage and depth. The radar plot uses the mean number of visits across the extragalactic footprint.

3.7.3. Large Scale Structure

The number of galaxies within this same footprint is used to as a metric to approximate large scale structure results (DepthLimitedNumGalaxies), using the same GalaxyCountsMetric_extended as above, but limiting the result to the selected footprint.

We use SNe Ia light curves from the PLAsTiCC challenge. SNe are distributed uniformly on the sky.

For each SNe, we check:

- 1. Is the SNe detected in any filter?
- 2. Is there a color detected (detected in 2 filters within 0.5 days)?
- 3. Is it possible to measure the rise slope (detect an increase of 0.3 mags in a filter pre-peak)?
- 4. Is the light curve "well sampled" (if the light curve duration is divided into tenths, are there detections in 5 unique bins)?

There are several versions of this metric, using different criteria for observations. We call the SNe "Detected" if it meets criteria 1, it is "Pre-peak" if it meets criteria 2 and 3, and is "Well-sampled" if it meets criteria 4. The simple Detected metric is sensitive to a combination of survey footprint and number of visits, preferring more area as long as a minimum number of visits spaced uniformly over time are available. The Pre-peak metric, which may be more useful for detections before follow-up, is most sensitive to requiring visits to be obtained with mixed filter pairs, with a lesser preference for visits being spaced more evenly over time (such as in non-rolling cadences). The Well-sampled metric is primarily sensitive to the cadence of visits, preferring visits to be spaced evenly over time.

The radar plot uses the metric which demands criteria 2 and 3 from above. Thus, we are mostly measuring how well we are producing SNe alerts that can act as triggers for others to follow up. The DESC group has developed metrics for measuring how well SNe are observed by Rubin alone, and we will be incorporating these into MAF soon.

3.8. Radar Plots

To help compare multiple science and SRD metrics across runs, we make use of radar plots. In each radar plot, we typically normalize values to a baseline run and plot the fractional change in metric values in the radial direction. For metrics that are measured over the entire sky (e.g., Parallax, Proper Motion, Weak Lensing), we use the median. For the parallax and proper motion metrics, the inverse of the errors are compared. When there are particularly large changes in metrics, we will generate a pair of radar plots with different radial ranges to make comparisons easier.

In some cases we make radar plots of the median coadded depth in each filter. For coadded depth, we plot magnitude difference in the radial direction, with larger values indicating deeper depths.

Not all changes shown in the radar plot are necessarily statistically significant. Our baseline runs tend to detect ~ 200 TDE events (out of the 10,000 simulated), while also detecting 12 million galaxies in i. Thus we should expect $\sim 7\%$ run-to-run variation with the TDE metric, even if the runs are statistically identical.

4. SURVEY STRATEGY EXPERIMENTS

The SAC report raised a series of questions and identified suggested simulation experiments to run. This can be categorized as follows:

- Experiments with the WFD footprint (survey footprint variations)
- Experiments with the WFD cadence (note that unless specifically required, we use the same general cadence for the entire sky);
 - Compare individual visits of 2x15s exposure and 1x30s exposure
 - Compare pairs in the same filter vs. different filters, and the effect of triplets of visits
 - Add short (1 or 5 second) visits; test 60 second u band visits.
 - Variable exposure times for uniform depth
- Experiments with rolling cadence, with 2, 3 and 6 declination bands
- Experiments with mini-surveys to the North, South and through the Galactic Plane (essentially, survey footprint variations)
- Experiments with twilight observing
- Experiments with Deep Drilling field cadences

• Tests of Target of Opportunity (ToO) observing

We have explored these areas, along with a few other questions that have arisen over the course of this work, using 'families' of simulations. In these families, we vary a particular parameter of the survey strategy to look for the impact on science. Sometimes the experiments requested by the SAC cross multiple families of these simulations – the general 'WFD cadence' question is addressed with several families investigating different options for cadence variation – and sometimes the impacts to given science goals come from multiple families – the most common being a combination of survey footprint and cadence. Often the impacts are minimal; the baseline LSST survey strategy covers most of the requirements, and these variations are relatively small. Occasionally there are impacts that are much larger, and these are important to note.

The starting point was the existing baseline survey strategy, baseline2018a, consisting of the Wide-Fast-Deep (WFD) survey, five Deep Drilling Fields (DDFs,) and Galactic Plane (GP), North Ecliptic Spur (NES) and Southern Celestial Pole (SCP) minisurveys. The existing baseline used 2x15s exposures per visit, and most visits were in the same filter (although this was not enforced). Standard observing started and ended at 12 degree twilight. The general strategy from this simulation was ported to the new scheduler code and (approximately) recreated as the baseline survey strategy.

In the course of working through these simulation experiments, we have issued several releases – sets of simulations which explored parts of the SAC questions using a particular version of the scheduler and simulator code. With each release, we found some improvements or updates to the scheduler or simulation code and also added new simulations investigating new questions. With each release, we typically re-ran the previous set of experiments, although sometimes families of simulations were dropped or modified due to what we learned from the previous release. Release notes can be found on community.lsst.org⁸.

The families of simulations relevant for this report come primarily from Feature Based Scheduler (FBS) release 1.5, 1.4 and 1.6. The FBS 1.5 families are the primary set; there is one family of experiments in 1.4 that were used as the basis for default values in FBS 1.5 that should be discussed; and FBS 1.6 contains some extensions of simulation families as well as a series of candidate potential baseline survey strategies. The candidate new baselines in FBS 1.6 are generally unlikely to be acceptable as-is, however they can serve as examples of more extreme optimizations.

As one of the FBS 1.4 families were used to set some of the default parameters about u band visit pairing and u band filter load/un-load times, we describe this first. Then we describe the FBS 1.5 families of runs, which explore most of the other

investigation topics. Finally we describe the FBS 1.6 experiment families. In the next section we will discuss the FBS 1.6 candidate baselines.

4.1. FBS 1.4 u_pairs: u Filter Pairing and Filter Load/Unload Time

One of the early concerns from the SAC was about the u band filter load/un-load time. As the camera can only hold 5 filters at a time, one filter must always be unavailable. We currently swap u band with y band, depending on the phase of the moon. The SAC initially suggested keeping the u band filter in the camera for a very limited time, only a few days around new moon. The driving concern here was to restrict u band usage to the darkest period of the month (increasing the depth in u band) and to allow more consistent sequences of grizy for DDFs, as the previous version of the scheduler code would only trigger these sequences when all of the filters were available (and thus would not trigger when u band was in the camera).

As an opposing tension, there was some concern that limiting u band availability could cause problems for classification of transient sources; u band brightness is an important distinguishing feature for many of these objects, particularly Tidal Disruption Events (TDEs). Part of the requirement here is obtaining u band photometry in close proximity to g or r band photometry.

To evaluate all of these issues, we created the u_pairs family of simulations. In this family, we only take u band observations paired (~ 22 minutes later) with g or with r. We vary the timing of when the u band filter is loaded into the camera from 15% to 60% lunar illumination; see Figure 6 for a translation between lunar illumination and days from new moon. We specifically add a variation in the number of u band visits per pointing (the weight of the u band footprint) over 1, 2 or 4 times the baseline footprint, in order to more fully explore the impact on transients.

We find that it is necessary to keep the u band in the camera until about 40% lunar illumination to meet SRD requirements without increasing the u band number of visits. A shorter period of time is long enough to take enough u band visits over the sky if the time available is distributed as evenly as the footprint over which those u band visits are required; however, there are seasonal night length and weather variations which make the resulting sky coverage patchy if the number of nights available with u band are too few. See Figure 8.

These simulations also showed that, even if the u band was available outside of full moon, the basis functions which drive scheduling inside the FBS are able to limit visits in u band to only when the sky brightness in u is low (as long as the total number of u band visits can fit within the darkest time periods). Thus, expanding the period of time the filter is available does not result in lower five sigma limiting depths. See Figure 7.

And finally, we addressed the issue of the grizy sequences by adding code that let the DD sequences be more flexible, using whichever filters were available. In all newer simulations, u band is part of the DD sequences instead of separate, and the

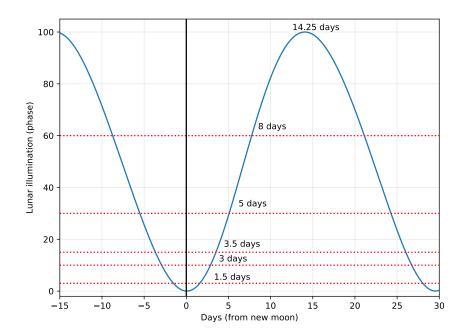


Figure 6. Relationship between lunar illumination (used as the constraint for when to change the available filters) and days from new moon.

sequences range over whatever ugrizy filters are available at any given time; this has the positive effect of reducing the large gaps between sequential visits in the same filter that were previously a function of lunar phase.

The resulting science trades can be visualized in the radar plots; see Figure 9. The largest change is in the TDE metric, which represents some portion of transient science; more u band visits and longer availability results in an increase in the TDE metric results, at a slight cost to the other science cases that don't benefit from additional u band coverage. A closer look at the full TDE metric results show some simple scaling with the total number of u band visits (see Figure 10). One notable point is that the metric results were improved even with a fairly simple change in how the u band visits were acquired; instead of requesting u band visits in singletons, these runs requested u paired with g or r. This improves transient science, although it does increase the amount of time that u band must be available in the camera.

Based on the minor costs to other science, especially after the adjustments made to the scheduler code regarding the DD fields, this family of simulations led us to adjust the baseline survey strategy defaults for all FBS 1.5 runs. For all further runs, we load and unload the u band filter at 40% lunar illumination and pair u band visits with g or r band. We maintain the survey footprint filter ratios at standard.

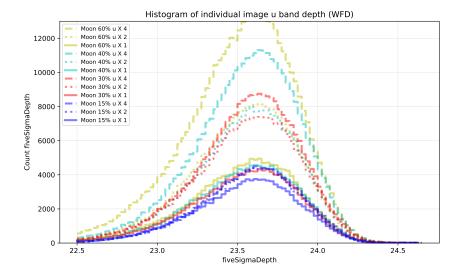


Figure 7. The five sigma depth in u band visits in each simulation in this family. Regardless of the time of the u band filter swap (15, 30, 45 or 60% lunar illumination), when the number of visits fits into the dark time available, the five sigma depths remain comparable. Only when the total number of u band visits rises does the width of the five sigma depth distribution increase.

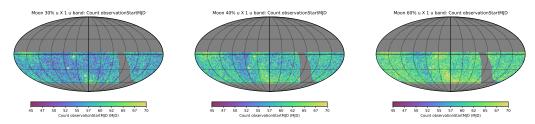


Figure 8. The number of visits in u band, with the filter load/unload at 30, 40 and 60% lunar illumination. This is with the u band survey footprint set to the standard weight; ideally the number of visits per pointing would be about 56. With a shorter period of time available for u band visits, the sky coverage is patchier. A filter swap at 40% lunar illumination does a reasonable job of achieving the required number of visits fairly uniformly across the sky.

We use the baseline simulation as the touchpoint for the other simulations; the baseline serves as the reference for metrics and also sets a variety of default parameters carried into the other simulations.

This baseline survey is configured with 1x30s exposures per visit, with most visits ('blob visits') obtained in pairs separated by about 22 minutes (combinations of u+g, u+r, g+r, r+i, i+z, z+y, y+y in any order for the pair). The footprint for the survey is the standard WFD plus minisurveys in the GP, NES and SCP, with five DD fields (located at the positions in Table 2). The ratios in the survey footprint between the various filters closely matches the desired distribution of visits over filters given in the SRD (u=6%, g=9%, r=22%, i=22%, z=20%, y=21% compared to an example

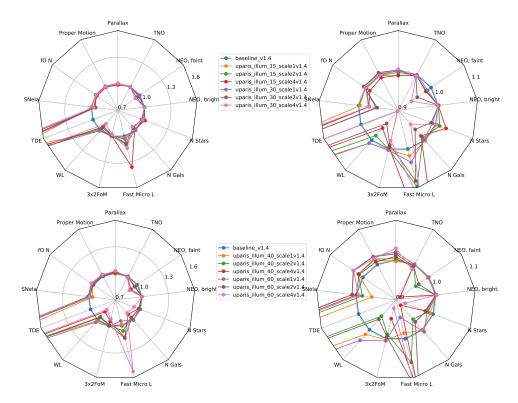


Figure 9. Varying the u filter load/unload time as well as the weight in the u band of the survey footprint. The right-most panels are zoomed in (around the baseline) versions of the panels on the left. 1

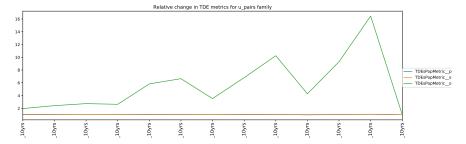


Figure 10. The relative change in TDE metric results across the family of u_pairs runs, compared to the baseline for FBS 1.4 (the FBS 1.4 baseline did not have u band paired with g or r; in baseline_v1.4_10yrs the u band was taken in single visits). There are multiple versions of this metric, corresponding to simple detection pre-peak, detection in any color, and detection in a color that includes u band; the final criteria is the most variable and the hardest to meet. Increased availability of the u band helps (up to 4x), and increasing the u band number of visits boosts the metric result as well (roughly linearly with the number of u band visits).

SRD distribution of u=7%, g=10%, r=22%, i=22%, z=19%, y=19%). The DDFs The u band filter was loaded in and out of the camera at 40% lunar illumination.

We also ran a comparison baseline simulation using 2x15s exposures per visit, instead of 1x30s. The overheads of taking 1x30s exposure per visit instead of 2x15s exposures per visit represent about a 9% decrease: 31 seconds per visit compared

to 34 seconds per visit (with a single 1s shutter open/close, instead of 2s readout and 2x1s of shutter time, assuming the final readout occurs during the slew to the next field). This is reflected in the total number of visits acquired in each of these runs; there are about 8% more visits in baseline_v1.5_10yrs compared to baseline_2snaps_v1.5_10yrs It is worth noting that not all metrics scale directly with the number of visits; however, many do. Unfortunately, we cannot assume that 2x15s visits will not be necessary until the camera is on the telescope and the impact of cosmic rays and other artifacts are evaluated. Therefore, the correction between 2x15s visits and 1x30s visits should be kept in mind throughout the remainder of this work, even though all other simulations use 1x30s visits to evaluate the 'most likely' scenario.

The baseline simulation uses filters in mixed pairs; we did run a similar baseline-style simulation with 1x30s visits where the pairs were in the same filter (baseline_samefilt_v1.5_10yrs. This provides an efficiency boost due to fewer filter changes during the night, allowing on the order of 4% more visits over the lifetime of the survey. Observing in the same filter is beneficial for detecting solar system objects (since the limiting magnitudes of the pair of visits improves the likelihood of having detections for moving object linking), but is generally detrimental for measuring colors for transients and variables; for transients and variables, however, obtaining a third visit in the same night can be even more beneficial. A wider discussion of the intra-night cadence is covered in Section 6.2.

4.3. FBS 1.5 third obs: Third Observation

For early identification of transients, it can be helpful to have more than two observations in a night. Having two visits in the same filter, with a third in another filter, provides both a delta magnitude over a short period of time and a color; this aids in classification. In this family of simulations, we dedicate between 15 and 120 minutes at the end of the night to attempting to revisit areas of sky that already have been observed with a pair, in order to obtain a third visit. The greater the amount of time dedicated to this third observation, the less area of sky is covered in a given night. In general, the science impact of adding third observations seems to be fairly minimal or negative, see Figure 11. This is likely because the metrics we're currently tracking aren't that sensitive to the presence of a third visit in a night (the TDE and SNIa metrics have negative impacts due to the lesser area covered per night, as they do not require three visits in a night), and highlights a need for a metric sensitive to this effect and appropriately tuned to highlight transient and variable classification and characterization requirements. A wider discussion of the intra-night cadence is covered in Section 6.2.

4.4. FBS 1.5 wfd depth: WFD Weight

This family of runs was primarily executed to confirm how the fO SRD metric scales with the footprint emphasis on the WFD. The survey footprint varies the fraction of

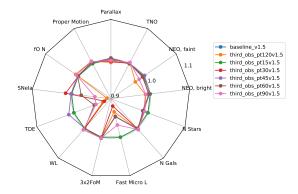


Figure 11. The science impact of dedicating the end of the night to gathering observations of areas that already have pairs. Note the scale - this radar plot covers 10% changes.

observing time dedicated to the WFD area from 60% to 99%, with and without the standard DDF survey. For simplicity, here we look at the metric outputs run on the versions without the standard DDF fields; the numbers of visits per pointing that result are shown in Figure 12.

From these runs, we find that varying the fraction of time devoted to the WFD impacts various science metrics (see Figure 13), but even more importantly, it is likely that the SRD metric evaluating the minimum number of visits per pointing over the best 18k square degrees (fONv Minimum Nvisits) cannot be met unless at least 70% of the survey time (in the footprint, which translates to more like 73% of actual visits due to dithering over the edges of the WFD region) is dedicated to the WFD. In these simulations, 73% of visits is approximately 1.65M visits out of the total 2.22M; in the case of bad weather, this would mean more visits would have to be redirected to the WFD.

In the remainder of our simulations, the amount of time dedicated to WFD varies, depending on the details of the survey footprint and minisurvey requirements. In general, it ranges from 66% to 94%, with most simulations falling around 83%.

4.5. FBS 1.5 footprint: WFD Footprints

The location of the WFD region (and its filter distribution) are important questions for the LSST; the bulk of science from the LSST is expected to be facilitated by the WFD. The WFD must be at least 18,000 square degrees to meet SRD requirements, however the location of those 18k sq deg is not specified. The standard baseline WFD includes regions which have dust extinction with E(B-V)> 0.2. This amount of dust extinction is problematic for extragalactic science for two reasons – it reduces the effective coadded five sigma depth, and the total amount and wavelength dependence of dust extinction is not necessarily well characterized, so the effect on the background galaxies is hard to calibrate. An alternate 'big sky' WFD footprint extending further north and south, but avoiding the galactic plane by a larger amount (either limited by dust extinction or by galactic latitude), can provide an 18k sq deg suitable for extragalactic science and moves parts of the NES and SCP into the WFD, but leaves

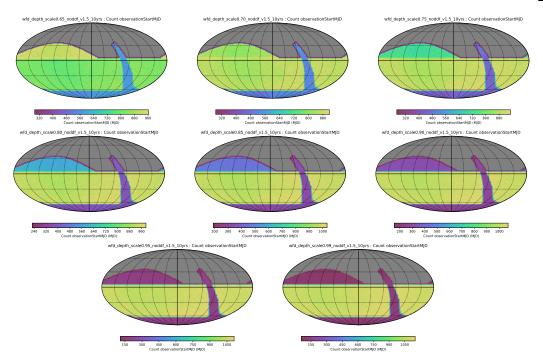


Figure 12. Varying the amount of time dedicated to the WFD region between 65% and 99% of the visits.

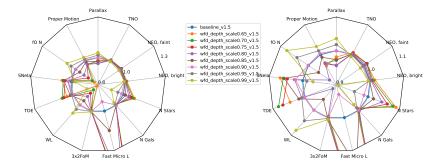


Figure 13. The science impact of varying the WFD depth. The right panel is a zoom-in on the left panel.

larger amounts of sky to be covered toward the galactic plane in a separate minisurvey. See Figure 15 for more details. We ran several experiments with various survey footprints, some of which are more practical than others. The footprints in this section which leave no coverage of the galactic plane will be extremely detrimental to science which requires the galactic plane, for example; the newA footprint requires too many visits to cover the entire sky and so fails the requirements of 825 visits per pointing within the WFD. Many science metrics are extremely sensitive to the footprint; other families, such as the filter distribution family (Section 4.7) and the bulge coverage family (Section 4.6) are also important to consider as part of the overall footprint evaluation. A basic summary of the footprints in this section is shown in Figure 16; a wider discussion of the survey footprint is covered in Section 6.3.

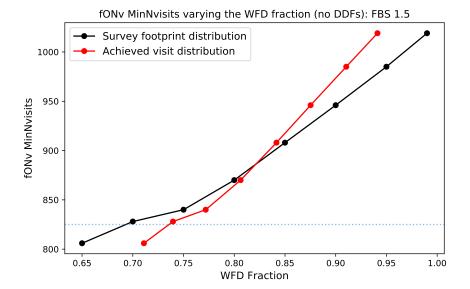


Figure 14. The minimum number of visits per pointing over the 'best' 18K square degrees (the WFD footprint), fONv MinVisits. When looking at the effect of scaling the WFD number of visits with a consistent footprint, this metric is perhaps more useful here than our standard version, the median number of visits per pointing over the WFD (fONv MedNvisits) as it will also capture 'patchiness' of visits.

4.6. FBS 1.5 bulges: Galactic plane coverage

The survey strategy for the galactic plane is an important question for science dealing with populations within the Milky Way, especially transients and variables that are most populous in the plane and toward the Magellanic Clouds. The SAC made a series of recommendations for survey strategy in the galactic plane, which were implemented in this family of simulations. The background WFD footprint for this family is the 'big sky' style footprint introduced in the previous section.

We use three footprints for bulge coverage:

- light coverage of the bulge and entire galactic plane (bulges bs),
- the galactic bulge as deep as WFD (bulges_bulge_wfd),
- the galactic bulge covered similarly to WFD, but with more observations in *i* (bulges_i_heavy.

See Figure 17 for more details on the location of the increased plane coverage. For each of these strategies, we run a version with natural cadence and one where we boost the priority of the bulge if it has not been observed in 2.5 days (to ensure a more rapid cadence).

Covering the bulge understandably increases the overall number of stars expected from the simulation, as well as the fast microlensing events (which are primarily concentrated toward the bulge). Because this requires more visits away from the

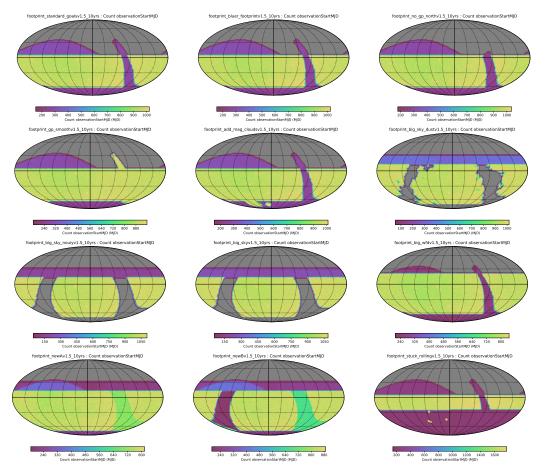


Figure 15. The total number of visits in each of the different survey footprints simulated. Some of these look similar, but feature a varying filter distribution (which does not show up in a total number of visits plot). From top left to right and then down: the description of these survey footprints is (a) standard (previous) baseline survey footprint (footprint standard goals), (b) the same footprint but with a bluer filter distribution (footprint_bluer_footprint), (c) the standard footprint but removing the northern tip of the galactic plane minisurvey (footprint no gp north), (d) the standard footprint, but continuing the WFD-cadence of visits through the galactic plane (footprint gp smooth), (e) the standard footprint but adding a magellanic clouds extension at WFD-cadence (footprint_add_mag_clouds), (f) an extended N/S footprint (going about 10 degrees further north and south) nicknamed 'big sky', with the galactic plane boundaries delineated by dust extinction, a small northern extension but no SCP or GP coverage footprint_big_sky_dust), (g) the same footprint, but without any coverage in u, i or y band (footprint_big_sky_nouiy), (h) an extended WFD region, going further north in the sky (even further than big sky) although not as far south, includes SCP and GP coverage with a small extension for the NES (footprint_bigwfd) (i) an extended N/S WFD footprint (in the 'big sky' style) but with the galactic plane defined by galactic latitude (l=20), with GP covered to just slightly less than WFD depth, and minisurveys for the SCP and NES (footprint newA) (j) similar to the newA footprint, however the galactic anti-center is covered with fewer visits, to allow more visits over the WFD region (footprint_newB) (k) this survey footprint is primarily a test case to find wide area metrics that were not properly sensitive to area; here the WFD is purposefully not covered appropriately but rather the northern half of the standard WFD received almost all of the visits from the WFD while the southern half receives a small fraction (footprint stuck rolling).

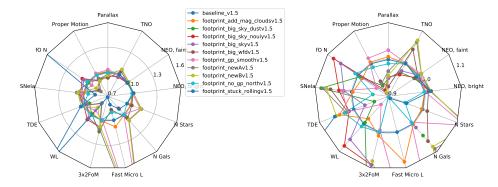


Figure 16. Science impact of varying the WFD survey footprint. The number of stars and galaxies is obviously very sensitive to the footprint, as are the number of discovered TNOs (as these objects move very slowly). The Fast Microlensing also varies strongly, as this metric depends on galactic plane coverage. The right panel is a zoom-in of the left panel.

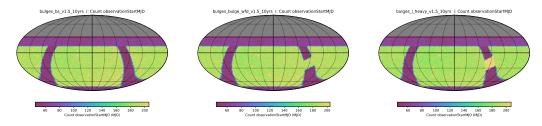


Figure 17. Series of simulations trying different bulge observing strategies; these vary from simple light coverage of the galactic bulge and plane to heavier coverage of the bulge (while maintaining light coverage of the rest of the galactic plane).

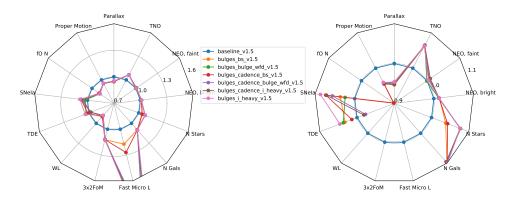


Figure 18. Science impact of the different bulge strategy simulations. The right panel is a zoom in of the left.

larger 'big sky' region of WFD, there is a slight decrease in the SRD metrics. See Figure 18.

4.7. FBS 1.5 filter dist: Filter Distribution

The filter distribution for the standard baseline simulation follows the suggested distribution in the SRD, however this family varies the weights between different filters significantly. This family should serve as a useful testbed for photometric redshift

Name	u	g	r	i	z	y
Uniform	1.00	1.00	1	1.00	1.00	1.00
Baseline	0.31	0.44	1	1.00	0.90	0.90
g heavy	0.31	1.00	1	1.00	0.90	0.90
u heavy	0.90	0.44	1	1.00	0.90	0.90
z and y heavy	0.31	0.44	1	1.00	1.50	1.50
i heavy	0.31	0.44	1	1.50	0.90	0.90
Bluer	0.50	0.60	1	1.00	0.90	0.90
Redder	0.31	0.44	1	1.10	1.10	1.10

Table 3. Variations of the filter distribution simulated.

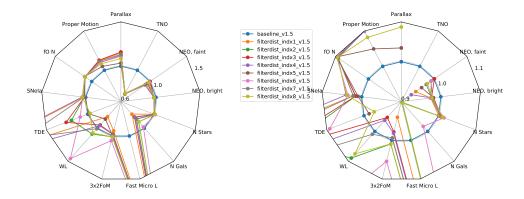


Figure 19. Science impact of varying the filter distribution

evaluations, but we do not currently have a photometric redshift metric available. However, this family does also illustrate other tensions between SNe and solar system science, for example, with SNe benefiting from more visits in bluer filters while solar system discovery (because these objects are red) prefer more visits in redder bands. This family is also useful when evaluating the overall survey footprint, as it is a simple WFD-only survey footprint, with no SCP or (significantly for solar system objects) NES. The filter distributions simulated are listed in Table 3, and the radar plot of high level metrics is Figure 19.

4.8. FBS 1.5 alt roll dust: Nighty N/S alternating observing

This family of simulations pulls in a feature from the altSched simulations (Rothchild et al. 2019), where visits alternate between northern fields and southern fields on a nightly basis. It uses the big sky dust-extinction limited footprint, and adds a basis function to encourage the scheduler to alternate between the north and south nightly. This can help keep light curve sampling optimally spaced, but does induce (at least) a night-long gap between revisits to a field (See Figure 21). As this basis function is not as strict as the scheduling in the altSched simulations, the telescope avoids pointing too close to the moon. One of these simulations simply alternates N/S on alternate nights; the other adds a modified 2-dec-band rolling ca-

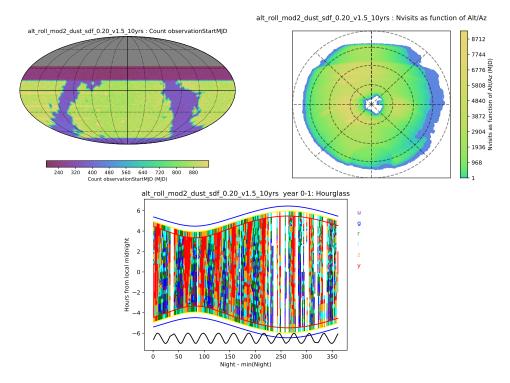


Figure 20. The alt_roll_dust simulation uses a footprint to avoid high dust extinction and tries to drive an every-other-day cadence.

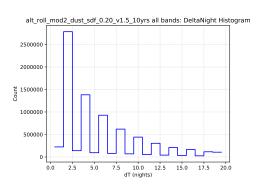
dence, where the alternating N/S visits are maintained within the rolling declination bands.

There is no additional NES, however there is a strip in the north observed in g, r, i, and z. The survey footprint focuses on low dust extinction regions and includes the galactic bulge; it covers more area than the standard baseline, so observes more stars and galaxies. The coverage of the LMC and bulge increases the number of fast microlensing events.

The science impact of this strategy is fairly minimal. By avoiding extinction regions, we have more stars and galaxies. The coverage of the LMC also increases the number of fast microlensing events. The SRD metrics are are lower than baseline, due to a lower fraction of visits being focused in the WFD, but these still meet requirements. See Figure 22.

4.9. FBS 1.6 rolling_fpo: Rolling Cadences

Rolling cadence is the term we have given to executing the survey in a non-uniform manner, emphasizing some region of sky one year, then deemphasizing it the next. Because the SRD includes requirements on stellar proper motion measurements, we are constrained to cover the sky uniformly in at least year 1 and year 10. We experiment with using rolling cadences where the WFD region is divided in 2, 3, and 6 declination bands (see Figure 23). We also scale the rolling weight to be 80, 90, and 99%; a larger weight results in more visits in the emphasized declination band and fewer outside the band. It may be reasonable to expect some visits over the entire



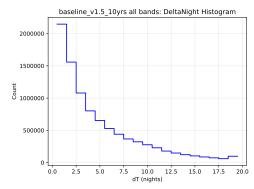


Figure 21. Histograms of the inter-night revisit intervals for the alt_roll_mod2_dust simulation (left), with alternating N/S visits on alternating nights, compared to the same histogram for the baseline_v1.5 simulation (right).

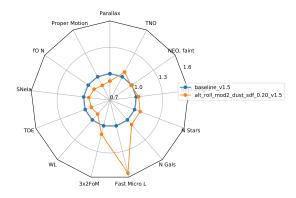


Figure 22. The science impact for alt_roll_dust.

sky in each year, if templates for image subtraction require these visits (and if ToO programs require updated templates), and there may be additional benefits for other science requiring long-term photometric monitoring.

These simulations were created using the FBS 1.6 code; this version of the scheduler uses an improved method for determining the length of time a field may have been available for observation when calculating the reward for the footprint map. The result of this upgrade is smoother, more even rolling cadences. The survey footprint, aside from rolling, was the standard baseline footprint.

Figure 24 shows the science impact of the different rolling cadence simulations. In general, the rolling cadence is fairly neutral for these metrics, at the 2 or 3 declination band level. The 6-declination-band rolling cadence can have negative effects on several of the science metrics, which seems likely to be linked to the limited amount of area covered within each band – the increased cadence is more frequent than required, but the amount of sky covered has dropped, so most metrics sensitive to both area and cadence will have a negative response.

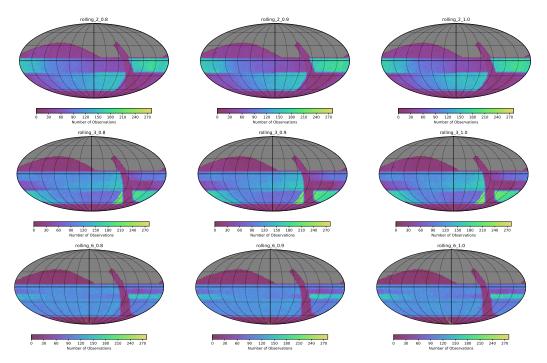


Figure 23. Rolling cadence simulations with 2 (top), 3 (middle), and 6 (bottom) rolling stripes. Here we show the observations taken from 3.5-4.5 years in the survey, excluding the DDF observations.

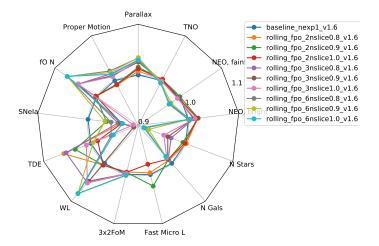


Figure 24. Science impact of different rolling simulations. The 6-band rolling cadence has some negative science impacts, while the 2 or 3 band cases tend to be fairly neutral. It seems likely that more metrics focusing on transients and variables will be useful here.

The locations for four of the Deep Drilling Fields has been determined for some time; the location of the fifth field is now planned to overlap with the Euclid South field (two LSST pointings are required to actually match the full Euclid South field; we are currently simply alternating between two field centers in this location). The locations of the DDFs used in these simulations are listed in Table 2. and can be easily seen in the overall survey footprint map in Figure 25. The cadence of visits,

as well as coadded depths of these DDFs, still needs to be finalized; the cadence has implications for the overall amount of time required for the DDFs.

The DDF families of simulations test different cadences for the DDFs, with a standard baseline survey footprint and strategy for the rest of the sky. The DDFs are somewhat decoupled from much of the remainder of the survey strategy; once given a fixed fraction of total observing time, the scheduler will keep DDF visits within the allocated fraction at all times, and the start or end of DDF visits don't interfere with other observations (the scheduler waits until a blob is finished before starting a DDF sequence).

Within these bounds, we ran a variety of DDF strategies, based on requested cadences in the white papers and some test extensions:

- AGN: This strategy takes shorter DDF sequences more often. Only $\sim 2.5\%$ of visits are spent on DDFs, making the final coadded depths much shallower than other strategies.
- DESC: a strategy that split the blue and red filters to different days, emphasizing a 3-day cadence. The overall time request is about 5%.
- Baseline: Our baseline strategy where 5% of observations are allocated to DDF observations. Sequences include whichever filters are available out of ugrizy and then take ux8, gx20, rx10, ix20, zx26, and/or yx20 visits per band, all with 30s exposures
- Daily: Similar to the baseline, but includes shorter DDF sequences that can execute daily so there are no long gaps between observations. Total DDF fraction is 5%.

Figure 27 shows the same observing season of the DDF ELIASS1 with these different strategies.

Figure 26 shows the different coadded depths (left) and science impact (right) of the variations on the DDF strategies we have tried. If the DDFs are kept to a consistent fraction of time, the overall science impact tends to be consistent.

4.11. FBS 1.5 good seeing: Good Seeing Images

In order to obtain good IQ images for difference imaging templates and to improve a host of other image processing issues such as deblending, it may be desirable to ensure that the entire WFD area is imaged in 'good seeing' conditions every hear. We defined 'good seeing' as FWHM of 0.7 arcseconds or better, then set up simulations where we required one good seeing image in various bandpasses each year.

The science impact of adding this relatively simple constraint to the observing strategy seem minimal and generally positive (see Figure 28). We do not currently have a metric tied directly to seeing, although of course image depth is important to many metrics and this depends on seeing.

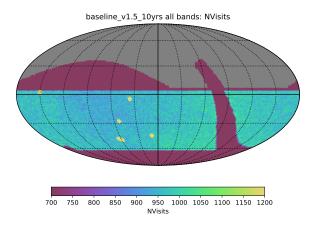


Figure 25. Number of visits per pointing on the sky, in all filters, for baseline_v1.5_10yrs; the locations of the five DDFs (with the double-pointing for Euclid South) are easy to pick out. The locations of these DDFs remains the same in all simulations.

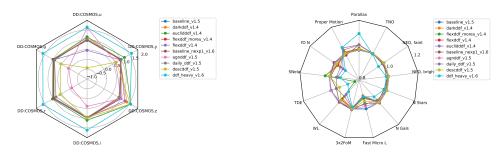


Figure 26. On the left, we show the coadded depth in each filter for a representative Deep Drilling Field. Larger values mean deeper coadded depth. On the right we show the standard science metrics.

There is no obvious additional overhead to observing, although this may be slightly more challenging to implement in operations in terms of generating and passing a queue from the FBS to the telescope. While the FBS can simulate an entire night and then pass this to the observing queue, if seeing conditions are highly variable the queue may need to be regenerated more frequently. This is likely an issue to address with additional telemetry from the site.

4.12. FBS 1.5 twilight neo: Twilight NEO Survey

At the time of the call for white papers, we were using a more optimistic weather cutoff and so had more time available for observing; using twilight time for non-WFD purposes seemed an ideal option. With the more conservative weather cut we are currently using, and the number of minisurveys and DDFs running concurrent with the WFD, we need to use at least some of the twilight time for WFD visits. Twilight observing starts at 12 degree twilight.

The Seaman et al. white paper suggested a twilight survey for PHAs and NEOs, looking at low elevations (high airmass) near the sun. These can be highly productive options for many surveys, covering the NEO 'sweet spots' and are the only kinds of

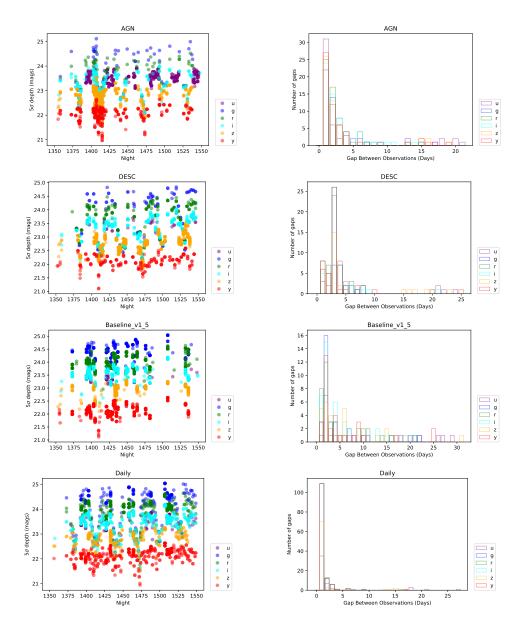


Figure 27. One observing season of the DDF ELIASS1 under different DDF strategies.

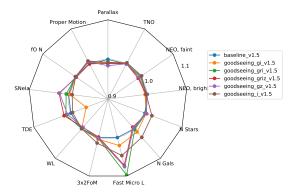


Figure 28. The science impact of making sure the sky has template images in good seeing conditions.

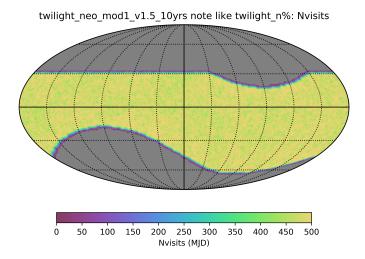


Figure 29. Sky coverage of the NEO twilight survey, at the end of 10 years. These visits are in r, i and z band, with 1 second duration.

visits that have the capability to detect Vatiras, asteroids with orbits interior to Venus (Note: the solar system metrics do NOT include a population of Vatiras currently).

The twilight survey, as implemented, adds a set of visits consisting of 1 second exposures in r, i or z bands (depending on the filter previously in the camera, so tied loosely to lunar phase). Observations are attempted in morning and evening twilight on the nights where the twilight survey is active, typically about 440 1s visits per night. Visits are acquired in triplets, to identify fast moving objects within a single night. The fields chosen for the NEO survey are within 40 degrees of the ecliptic, at high airmasses toward the Sun. In this family of simulations, the twilight survey is activated for varying fractions of time: either every night, every other night, every third night or every fourth night (roughly .. weather or downtime can interfere). The final sky coverage for the twilight_neo survey, if activated every available night, is shown in Figure 29.

We find that running the twilight survey every available night causes the main survey to fail to meet SRD requirements in the baseline survey configuration (the time is needed for WFD and other minisurveys). Running the twilight neo survey less often has less of a negative impact, but it also has less of a positive impact on the completeness of the large PHAs and NEOs. The smaller PHAs and NEOs have a lower overall population completeness when the twilight neo survey uses more time; these objects are likely too faint to be discovered in the short exposures of the twilight survey, thus need to be discovered in the standard survey. Discovery for fainter solar system objects is dependent on the number of visits available (for a given footprint), so it is consistent that the final completeness for the smaller objects drops. See Figure 31.

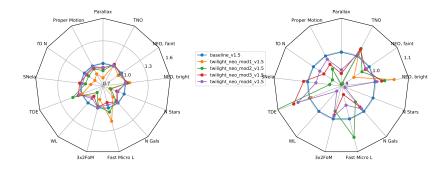


Figure 30. The science impact of using some or all of twilight time for a NEO survey.

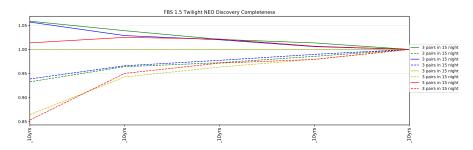


Figure 31. More detailed solar system metric results for large (solid lines) and smaller (dashed lines) members of the moving object populations. Large PHAs and NEOs benefit from twilight neo survey, and more time spent on the twilight survey boosts their completeness higher. Smaller objects, which are also fainter, have lowered completeness. This is likely because the smaller objects are not visible in the short, 1s exposures, yet the larger number of those short exposures lowers the total number of visits in the standard survey making these smaller objects hard to find.

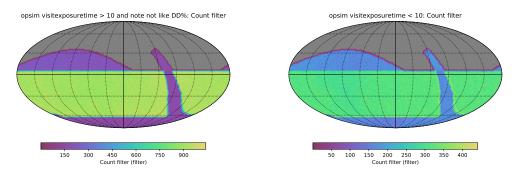


Figure 32. Results from including 5s exposures (up to 5 per year). The left shows the number of regular 30s visits (excluding DDF observations) and the right shows the number of 5s visits.

We try taking additional short exposures (1s or 5s) twice or five times per year. Taking shorter exposures is a less efficient observing mode, but it seems to have little impact on the overall open shutter fraction. Similar to taking exposures in good seeing conditions, including short exposures each year has only a few percent impact on our science metrics.

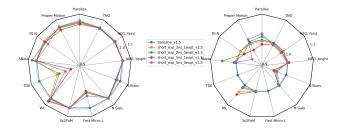


Figure 33. Science impact of covering the sky in short exposures.

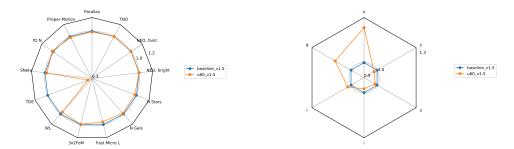


Figure 34. Increasing the u exposure time to 60s. As expected, this results in a substantial gain in u coadded depth.

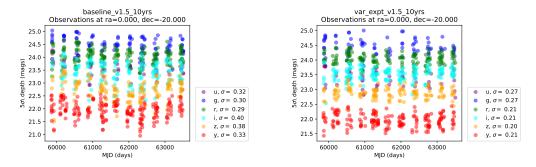


Figure 35. Comparison of a sample WFD point in the baseline and when we vary the exposure time. The individual observations depths become more uniform, especially in the redder filters that can be observed in bright time and twilight.

The u-band observations are often expected be readnoise limited. We test doubling the u-band exposure time and cutting the number of exposures in half. This results in the u-band final coadded depth reaching ~ 0.20 mags deeper. The g-band is also 0.10 mags deeper, with the rest of the filters essentially unchanged in final depth. The g depth increases because 60s u exposures decrease the overhead time, freeing up more dark time for g observations.

Note, we assume that 1x60s visit counts as 2 30s visits for the purpose of meeting the SRD value of 825 visits in the WFD area. Adopting longer exposures in u seems like a good idea, but the SRD will probably need to be modified to ensure it is not ambiguous.

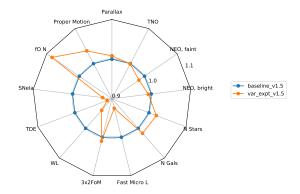


Figure 36. Science impact of using variable exposure times.

We vary the exposure time based on the current conditions so individual exposures have similar depths. There is an argument that taking a full 30s visit in ideal dark time conditions results in "wasted depth", as more objects and transients will be detected, but then it will be impossible to identify them as later visits are unlikely to be as deep. Similarly, taking a 30s visit in poor conditions will result in a shallow image which will be of limited use. In good conditions, the exposure time is allowed to shrink to 20s, and in poor conditions it can extend to 100s.

As with doing 60s u band exposures, this may require modifying the detailed specifics of the SRD as longer exposures may need to count as multiple visits.

Having variable exposure time introduces at least 8 new free parameters to the scheduler (the target individual depth for each filter), as well as the shortest and longest acceptable exposure times. As with 4.11, this would be more complicated to run in operations as the scheduler would need current conditions to calculate the modified exposure times, although the predicted sky brightness may be accurate enough.

Figure 36 shows the science impact of varying the exposure time is fairly minimal.

4.16. DCR

The LSST will not have an atmospheric chromatic corrector, thus difference imaging can be complicated by differential chromatic refraction (DCR). There is also potential science opportunities by being able to measure the chromatic shift in objects with sharp features in their SEDs (e.g., AGN with large emission lines).

These experiments look at how we could intentionally schedule a subset of images to be at high airmass so a DCR model could be built up. We test various combinations of filters to demand DCR observations (u+g, u+g+r, and u+g+r+i), and the number of observations to take at high airmass per year (1 or 2).

Even with 2 high airmass observations per year, we would still expect some area of the sky to fall in chip and raft gaps. It is also worth noting that in our baseline simulation, we observe a spot on the sky in u typically 60 times, or 6 times per year.

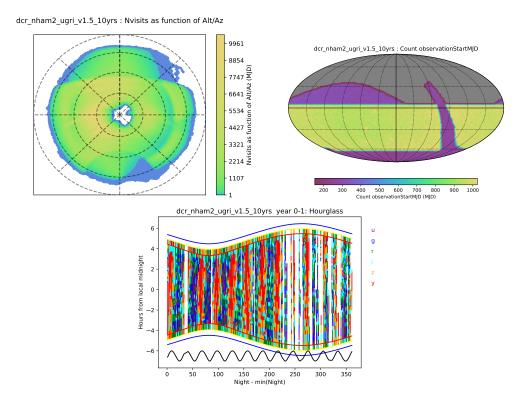


Figure 37. Intentionally taking observations at higher airmass to measure DCR.

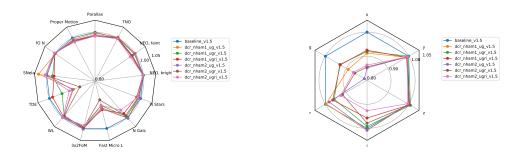


Figure 38. Science impact of including observations at high airmass for DCR. As expected, pushing observations to high airmass lowers the coadded depths (right) and has as slight negative impact on most science metrics (left).

Taking 2 high airmass observations per year in u decreases the final coadded depth by 0.15 mags.

Figure 38 shows the science impact is fairly minimal, but we tend to lose $\sim 0.1-0.2$ magnitudes of final coadded depth.

4.17. Even Filters

The baseline simulation is fairly aggressive in switching to redder filters in bright time. This can create long gaps in light curves with no bluer observations. We have run a simulation where only the u, and g filters avoid bright time, and a simulation where only u avoids bright time. Figure 4.17 shows the resulting filter distributions

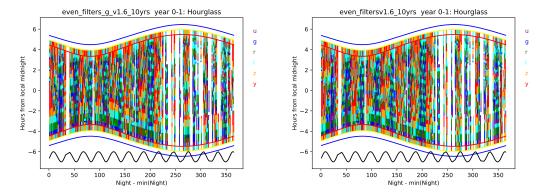


Figure 39. The filter distribution for the even filter simulations. Unlike the baseline simulations, bluer filters are observed in bright time.

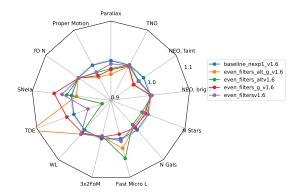


Figure 40. Science performance for the Even Filters runs. Taking bluer filters in bright time can improve SNe performance and fast transients, but is detrimental to Solar System science. The loss of depth shows up in most of the other metrics as well.

in year one. Unlike the baseline simulations, there are no longer sections of several days where only y is observed.

While the goal of these simulations was to improve SNe Ia lightcurves, the gains appear to be minimal over the baseline strategy.

4.18. Ecliptic Pairs

This simulation prohibits the twilight greedy algorithm from observing near the ecliptic, thus ensuring that all observations near the ecliptic are taken in pairs. This results in modest gains for NEO detection.

4.19. Aliasing

There was concern that if observations were too uniformly placed on the meridian, periodic sources would be aliased. Figure 4.19 shows the FFT of observations at a sample WFD point in the baseline simulation. There is some aliasing at ~ 1 day which is inevitable for any ground-based telescope. The aliasing is much lower than the minion_1016 simulation that was analyzed in the Bell et al. cadence white paper.

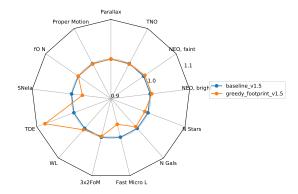


Figure 41. Science impact of not permitting greedy observations near the ecliptic.

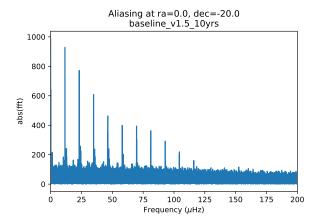


Figure 42. Aliasing at a sample position in a baseline simulation. There are peaks at harmonics of 24 hours, but this is inevitable with a ground-based telescope. The aliasing seems much lower than earlier version of OpSim where harmonic peaks could be seen past $200~\mu{\rm Hz}$.

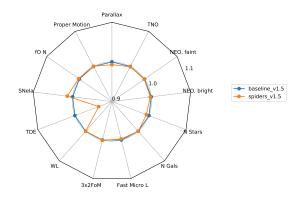


Figure 43. Science impact of keeping diffraction spikes aligned along rows and columns.

We look at keeping diffraction spikes aligned along CCD rows and columns. This may result in the camera rotator angle being much less randomized than our baseline rotational dithering strategy. There is little impact on our science metrics, but we note we do not currently have a metric the measures weak lensing systematics.

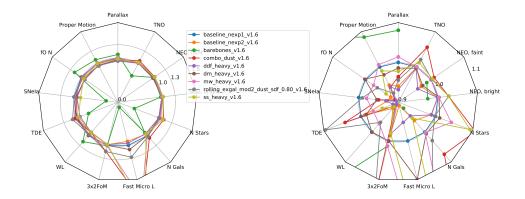


Figure 44. The science impact for the different version 1.6 simulations.

4.21. Target of Opportunity

We performed simulations with earlier versions of the scheduler to look at the potential for following up ToO events, namely looking for the optical counterpart to gravitational wave detections. We could detect $\sim 55\%$ of the simulated events, however, that often required pushing observations to high airmass or observing regions outside the WFD area.

5. FBS RELEASE V1.6: CANDIDATE RELEASE RUNS

Here we describe the runs done as part of the 'candidate baselines' in the FBS 1.6 release. This set of simulations is unlike the previous experiments, in that instead of varying a particular survey strategy option across a family, we have attempted to set up a limited number of simulations that attempt to strongly boost particular goals. They are examples of more extreme choices for survey strategies; many of these options have serious drawbacks when considering an overview of science. Calling these 'candidate baselines' in no way implies they are better than some of the survey strategies explored in the FBS 1.5 release, nor that all of these would be suitable choices for an initial survey strategy; they are just intended to be exploratory examples.

5.1. FBS 1.6 Baseline

For the baseline strategy, we set the footprint to have 18,000 square degrees dedicated the WFD survey. The WFD has a filter distribution of u:g:r:i:z:y of 0.31:0.44:1.0:1.0:0.9:0.9. We include coverage of the Galactic Plane (GP) and South Celestial Pole (SCP). These areas are set to have 20% the number of counts of the WFD (if a spot in the WFD has 900 visits, points in the GP and SCP will have 180 visits). The GP and SCP are set to have equal number of visits in all filters. The North Ecliptic Spur (NES) is observed with only the g, r, i, and z filters. The NES area is set to have one-third the number of visits of the WFD. The filter distribution in the NES is set to g:r:i:z of 0.2:0.46:0.46:0.4.

The total breakdown of target observing time is 85% for WFD, 6% for the NES, 6% for the GP and NES, and 5% for DDFs.

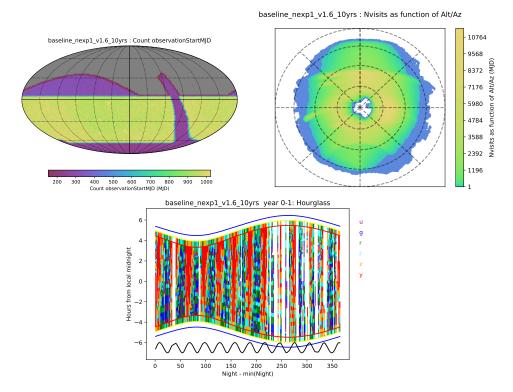


Figure 45. The baseline v1.6 simulation. The top panels show the distribution of visits (all filters) in RA/dec and Alt/Az. The bottom panel shows the first year of observations color-coded by what filter was loaded. White regions represent scheduled and unscheduled downtime as well as weather downtime. The black curve on the bottom shows the moon phase.

While the different survey areas are covered to different depths, the baseline scheduler treats them identically and only tries to maintain the proper ratios of area coverage. This means blocks of observations can be scheduled that cover the different regions seamlessly. It also means we have no additional constraints on how the regions are observed. For example, we currently do not reserve "good seeing" time for the WFD area.

The baseline survey includes the 4 announced Deep Drilling Fields as well as a pair of fields that overlap the Euclid Deep Field South. Each individual DDF is set to take a maximum of 1% of the total visits (the Euclid pair of fields are set to a maximum of 1% combined). The standard DDF sequence is ux8, gx20, rx10, ix20, zx26, and yx20, all with 30s exposures. For any given sequence, only the five filters loaded in the camera are executed. By default, we remove the u filter when the moon is more than 40% illuminated at the start of the night.

We run 2 baseline simulations, one with 1x30s visits and one with 2x15s visits. The main difference is the additional readout time in the 2x15s version drops the open shutter fraction from 77% to 72%. This puts the 2x15s simulation close to failing the SRD FO metric, with some parts of the WFD region only reaching 824 observations (the median is still 892).

For the rest of the simulations in v1.6 we use 1x30s visits. If 2x15s visits are required there will be a significant drop in the number of visits, and areas outside of the WFD may need to be scaled back to still meet SRD requirements.

When it is non-twilight time and we are not observing DDFs, we use a Markov Decision Process to dynamically build a queue of observations. Observations are planned in 44 minute blocks (22 minutes for an initial area, 22 minutes to repeat the area). The size of the blocks can scale slightly to try and fill time before twilight (e.g., it will expand to a pair gap of 25 minutes if there are 50 minutes until morning twilight begins). All observations are taken in pairs, with potential combinations of u + g, u + r, g + r, r + i, i + z, z + y, or y + y. The ordering of the filter pairs can change depending on what filter is currently loaded (e.g., if the scheduler decides to observe a g + r sequence, the r observations will be taken first to eliminate a filter change if possible.)

The camera rotator angle (relative to the telescope) is randomly set each night between -80 and 80 degrees. The angle is set when the block is scheduled, so there can be a few degrees of drift between when the rotator angle is computed and when the observation is actually taken.

The MDP uses basis functions based on

- The 5-sigma depth (for both filters in the pair being taken)
- The footprint uniformity (again, in both filters)
- The slewtime
- Staying in the current filter
- Rewards taking 3 observations per year per filter over the entire survey footprint

The MDP also includes basis functions that are simple masks

- Zenith is masked (to avoid long azimuth slews)
- 30 degrees around the moon is masked
- The bright planets (Venus, Mars, and Jupiter) are masked with a 3.5 degree radius

If the sun is higher than -18 degrees altitude, or there is not enough time remaining to take observations in pairs, the scheduler reverts to a greedy algorithm and selects observations one at a time. We use a similar MDP for these greedy twilight observation decisions.

Compared to many of the other FBS 1.6 candidate baseline simulations, the baseline spends a lot of time observing the WFD, with a median of 948 visits. The higher number of visits means a faster cadence and better sampled lightcurves for objects with durations comparable to a season length. Our baseline simulation also has very light coverage of the Galactic bulge, resulting in fewer fast microlensing events than other potential footprints.

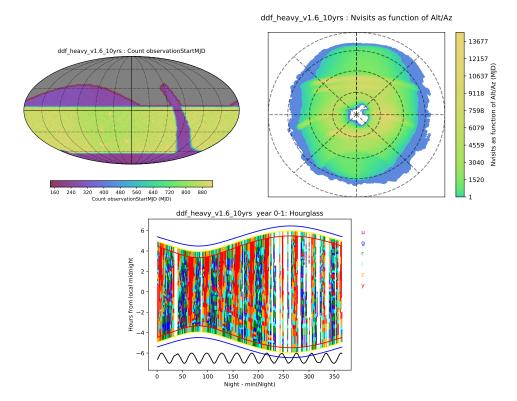


Figure 46. DDF Heavy simulation. Nearly identical to the baseline, but giving as much time as possible to DDF observations.

5.2. DDF Heavy

This run is nearly identical to the baseline, but gives a large fraction of time to the deep drilling fields. Each of the five DDFs takes between 2.4 and 2.9% of the survey, with 13.4% of all visits being used for DDF observations. The baseline has 4.6% of visits used for DDFs. This is enough time that the WFD area near the DDFs fails to reach 825 visits over 10 years, but the SRD requirement is formally still met because the median WFD point is observed 875 times.

As expected, the majority of non-DDF science cases suffer if we dedicate such a large fraction of time to the DDFs. It is worth noting that most metrics within MAF are not tailored for DDF purposes; this is an area that is missing science metrics.

5.3. Barebones

The barebones simulation is not a viable survey strategy, but provides an extreme example where we focus exclusively on meeting the SRD requirements, with little optimization for science.

The survey footprint is restricted to the baseline 18,000 square degree WFD area only. Deep drilling fields are included, but capped at $\sim 2.5\%$ of the total visits. Visits in u and y are unpaired, while the rest of the filters are paired in the same filter. This results in very few filter changes in a night.

There are a wide number of reasons why this would be a terrible survey strategy – detected transients would have no color information, photometric uber-calibration

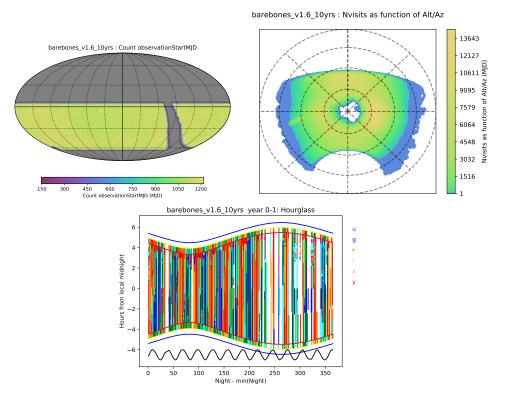


Figure 47. The barebones simulation covering just the WFD area as efficiently and deeply as possible.

could be difficult with the galactic plane gap, a lack of solar system object because the NES is not included, etc. The main purpose is to show the scheduler can run very near the theoretical maximum for open shutter fraction, with this run reaching 80%. Also, we can note the fONv metric reaches 1.148 which is 40% higher than the SRD requirement of 825. This also implies that we can observe a maximum of ~ 115 WFD visits per year in the event we want to adjust the scheduler to attempt to catch up on the WFD progress.

The total lack of bulge coverage means the barebones simulation contains virtually no fast microlensing events. Taking pairs in the same filter also radically reduces the number of SNe Ia that are well measured.

5.4. Data Management Heavy

This simulation is similar to the baseline, but includes various modifications that may be helpful for Data Management purposes. Across the WFD region, u, g, and r a few images per year are taken at high airmass so that DCR correction models can be made. The camera rotator angle is set so that diffraction spikes fall along CCD rows and columns. This helps with difference imaging so the maximum possible area can be used, but may result in weak lensing systematics. Each year, the scheduler prioritizes taking g, r, and i images of the whole sky in good seeing conditions (defined as 0.7"effective FWHM or better). The DDF fields use larger dithers, up to 1.5 degrees, compared to the default 0.7 degree maximum.

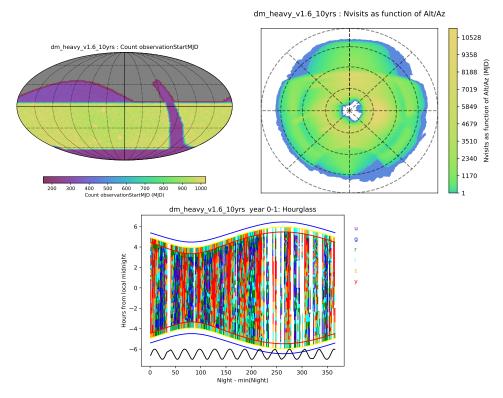


Figure 48. The DM heavy simulation. Similar to the baseline, but the alt/az plot shows how some observations are being taken at high airmass to support DCR modeling.

The addition of images taken at high airmass has a small negative impact on most science cases.

5.5. Rolling Extragalactic

The rolling extragalactic is motivated by cosmological drivers. The footprint is modified so the 18,000 square degrees of the WFD are placed in low-extinction regions. The simulation also executes a half-sky rolling scheme, which should result in better sampled lightcurves for extragalactic transients.

This simulation divides the sky into quarters, and has one northern stripe and one southerns stripe with a rolling emphasis at a time. This could be preferable to a simple two-band rolling scheme, because with the quarters a region of emphasis will always be available to northern telescopes. If we rolled with an emphasis purely on the southern half of the WFD region, $\sim 80\%$ of the Rubin alert stream would become unavailable to northern hemisphere observatories for that season.

As expected, avoiding high extinction regions increases the number of galaxies. We expect the addition of rolling will show improvements in more sophisticated SNe Ia metrics from the community. The footprint covers some of the Magellanic Clouds, boosting the fast microlensing events. The science gains come at the expense of some of the SRD metrics.

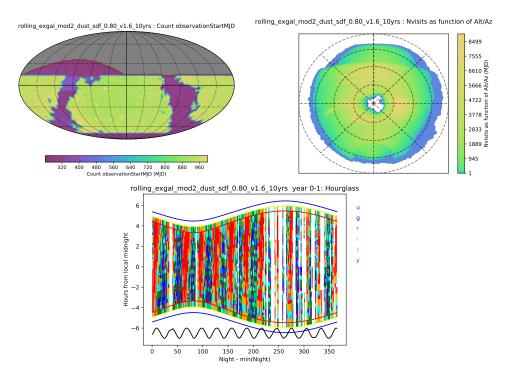


Figure 49. The Rolling Exgal simulation. The WFD area is set to be 18,000 square degrees of low extinction area.

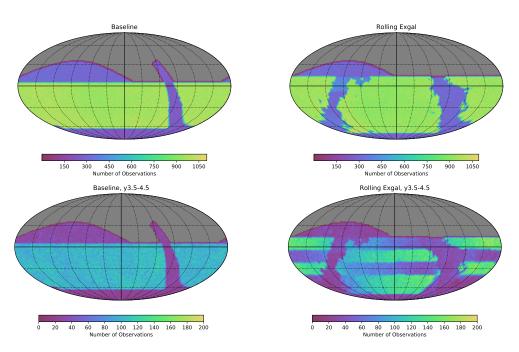


Figure 50. Illustration of rolling cadence. The top panels show the number of observations after 10 years (all filters) for the Baseline and Rolling Exgal simulations (excluding DDF observations). Both simulations have very smooth WFD coverage, with ~ 900 observations. The lower panels show the number of observations taken between 3.5 and 4.5 years. The baseline WFD remains smooth, while the Rolling Exgal simulation has declination stripes of high and low counts.

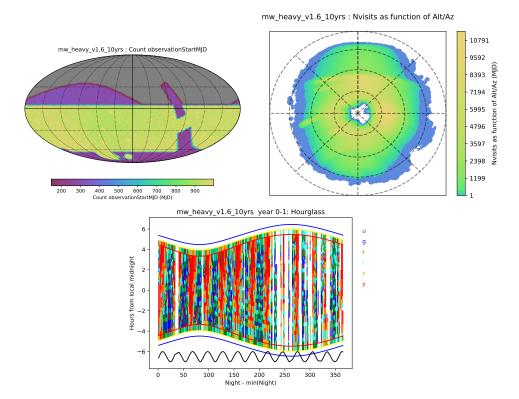


Figure 51. The Milky Way heavy simulation. Similar to the Baseline, but the bulge and Magellanic Clouds are added to the WFD area.

The Milky Way heavy simulation covers the Galactic bulge, LMC, and SMC as part of the WFD area.

There is very little change in the overall median coadded depths compared with the baseline since the extra WFD area is added to a region of the sky that is undersubscribed in the baseline. In the baseline simulation, there are an excess of observations in the WFD on either side the galactic plane, so covering the bulge is "free", in the sense that it uses these excess pointings to cover the bulge.

There is a large boost in microlensing events and number of stars, with little impact on the other metrics. We would benefit from other metrics for bulge-specific science cases to explore using a different filter distribution for the bulge region.

5.7. Solar System Heavy

For the Solar System Heavy simulation, the baseline survey footprint is modified to include ecliptic plane coverage through the galactic plane.

A fraction of twilight time is used for a NEO survey in r band. The NEO survey uses very short (1 second) exposures at high airmass (toward the sun in evening or morning twilight). Note, a NEO survey taking short exposures will drastically increase the data throughput of the system. DM needs to check if this mode of observing would be feasible.

This simulation only uses i, z, y in twilight time, making sure we observe more r-band in non-twilight and in pairs. It also includes r + r pairs in non-twilight time.

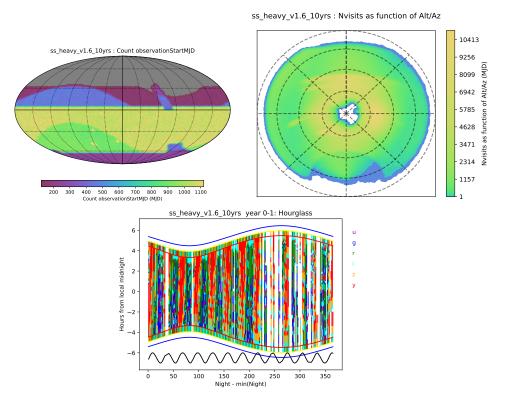


Figure 52. The Solar System heavy simulation. The high airmass observations are twilight NEO observations.

For regular 1x30s visit twilight observations, we avoid observing the ecliptic, thereby ensuring they are always taken in pairs in non-twilight time.

The simulation shows a slight improvement in the discovery of bright NEOs and TNOs, with a slight decrease in discovery of faint objects of all populations, while significantly impacting SNe Ia discovery due to the addition of pairs in the same filter. Solar system metrics, particularly for bright objects, are most sensitive to footprint (they tend to get enough visits to discover objects, so need to explore more area of sky) so a larger footprint (such as the big sky style with galactic plane and extended northern sky coverage) works better. For fainter objects, visits in redder filters and in the same filter are ideal; beyond that, more visits are important as the timing of discovery is more critical. The Solar System Heavy simulation adds enough twilight visits that the overall number of long exposure (> 1s) visits in the traditional WFD footprint is reduced by about 6%; this has an impact on the detection of faint objects. Further optimization toward solar system objects would likely produce a slightly different simulation to this, however this is a reasonable example of the trades with other science.

5.8. Combo Dust

This simulation attempts to improve several science cases compared to the baseline simultaneously. The footprint used here starts with defining the WFD area as 18,000 square degrees with low extinction. Then an additional 2,000 square degrees are

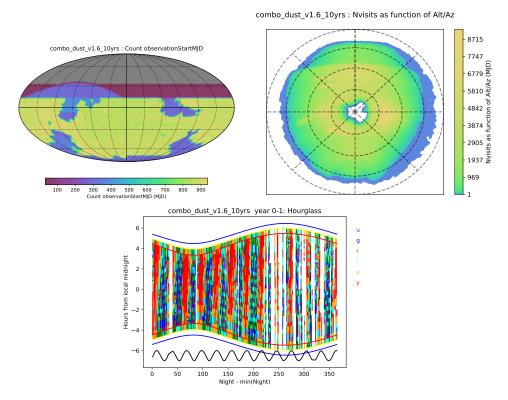


Figure 53. The Combo Dust simulation. Similar to the Rolling Exgal simulation, but the WFD is expanded to include the bulge and ecliptic, Magellanic Clouds, and an anti-center bridge.

added to WFD to cover the bulge, the ecliptic through the galactic plane, the LMC and SMC, and an outer Galactic plane region. Dusty areas of the sky and the South Celestial Pole are covered at about one-quarter the WFD depth. The NES is covered in g, r, i, and z. The footprint also includes very light coverage to the northern limit of the telescope in g, r, and i so there can be templates for ToO events on the entire accessible sky. This simulation includes the same half-footprint rolling scheme as Rolling Extragalactic.

The footprint has 35 free parameters for setting the various region locations and filter ratios. Many of these have been set by eye or use historical values; it is quite likely these parameters could be improved.

This simulation manages to boost nearly all the science metrics at the expense of reducing margin in the SRD metrics. When we run the *combo_dust* with 2x15s visits, the fO metric drops below the SRD requirement of 825 visits to 817 visits. The footprint can be adjusted to meet the SRD requirement, but it does imply there will be very little contingency if we use 2-snap visits. The 1x30s visit *combo_dust* has a median of 885 visits in the WFD region, meeting SRD requirements.

6. FURTHER SCIENCE IMPACTS

The broad categories of experiments covered in the FBS 1.4, 1.5 and 1.6 releases address different aspects of survey strategy. While each family of simulations main-

filter	Baseline	Baseline	Barebones	DDF	DM	MW	Rolling	SS	Combo
		2 snaps		Heavy	Heavy	Heavy	Exgal	Heavy	Dust
	(mags)	$m_{ m Baseline}-m_{ m Sim}$							
u	25.86	0.24	-0.13	0.08	0.11	0.02	0.11	-0.02	0.12
g	26.97	0.11	-0.15	0.09	0.12	0.01	0.10	0.07	0.14
r	26.95	0.08	-0.12	0.08	0.07	0.01	0.10	0.05	0.14
i	26.40	0.07	-0.17	0.11	-0.01	0.01	0.11	0.11	0.15
${f z}$	25.67	0.06	-0.12	0.08	-0.01	0.01	0.11	0.02	0.11
\mathbf{y}	24.90	0.06	-0.14	0.06	0.04	0.01	0.09	0.03	0.09

Table 4. Difference in median coadded five sigma depths compared to Baseline for v1.6 simulations. Negative values indicate deeper depths.

tained the approach of varying a single kind of parameter (such as the amount of time devoted to triplets of visits in the 'third_visit' runs or the footprint coverage in the 'footprint' runs), the underlying science optimization questions can cover multiple families. In addition, when looking at individual science cases, there can be effects that cover multiple families but have the same underlying cause – preferring more visits in the WFD or needing more visits in u band, for example .. which can be the result of variations in survey strategy in multiple different families (i.e. we get to the same place via different means).

6.1. Individual Visit Length

What to do - 1x30s vs. 2x15s? 1x30s much more efficient (show rough calculation of overhead) than 2x15s, but may have drawbacks due to cosmic ray rejection and potential to miss very rapid transients (or WD detection .. ref white paper). Subtle drawback that 2x15s gives the same "midpoint exposure time" across FOV, 1x30s does not.

Show difference in 1x30s vs. 2x15s in whatever is our 'standard baseline' at this point.

There has been thought of using a variety of exposure times if we use two snaps (e.g., 5s + 25s). Because there are not plans to release catalogs from individual snaps, it's not clear if this would enable much new science.

Show effect of 7% loss in efficiency when attempting to combine minisurveys in various configurations (assume we will find some combinations possible with single exposure visits that are impossible with two snaps).

Also possible to use variable exposure time depending on seeing and sky brightness conditions. Shorter exposures in good conditions keeps us from observing "wasted" depth, letting us take longer exposures in poor conditions. This does introduce a host of new free parameters (an ideal target depth for each filter and minimum and maximum exposure times). This would might require rewording the SRD to ensure, e.g., that 20s visits in good conditions count for the number of visit requirement.

Other questions related to exposure time

- Should we change the u-band to default to 60 second exposures to ensure they are not readnoise dominated? This might require decreasing the SRD 825 visit value. This choice would also severely limit u band time domain science (e.g., TDE early detection)
- Should we include some very short exposure time exposures. That would let us have better tie-in with other surveys (e.g., Gaia). It is relatively little exposure time, but the readout time means it is a low-efficiency way to operate the telescope.
- Should we decrease the exposure time in twilight to keep the saturation level reasonable?
- Should we use variable exposure times so individual exposures have more uniform depth? In poor observing conditions, we would have fewer exposures that were londer and in good conditions we would have more observations that are shorter.

6.2. Intra-night Cadence

What to do for visit sequence within a night? White paper support for multiple filters within a night (except TNOs maybe?). Potential drawbacks - less efficient (show effect on efficiency). This applies to WFD primarily, but we've applied to any survey that did not have their own specifications (so, everywhere).

Extension of pairs to u band and y band (show effect).

Relevant metrics: inter-night visit gaps and SN discovery, SSO discovery/characterization, transient and variable discovery (??), number of visits

6.3. Survey Footprint

What to do for WFD footprint? SRD not specific, DESC want low-extinction sky (and depth), but WFD is generally the area of sky that receives the most visits, so generally other science will also benefit from more visits to their relevant areas (particularly galactic plane .. for time-domain studies primarily, not depth)

Relevant metrics: area of sky with 825 visits (under particular restrictions, like total coadded depth and individual image seeing and dust extinction), number of galaxies, number of resolved galaxies, SSO discovery, transient and variable star discovery, astrometry in the galactic plane (?)

- How should we cover the Galactic plane?
- How should we observe the Galactic bulge?
- Should we avoid areas of high dust extinction for the WFD area?
- What is the ideal filter distribution to use? It would be nice to have a photo-z metric to help make this decision.

- What is the ideal filter distribution in the GP and SCP?
- Should we cover the LMC and SMC as part of the WFD survey? As their own DDF-like survey? We have few metrics that touch on LMC/SMC science directly.
- Should we add area in the north to overlap with Euclid, WFIRST, and/or DESI?

6.3.1. Northern minisurveys

Add extension to cover Euclid/DESI with various numbers of visits

Observing NES

Effect of adding or removing these minisurveys

Relevant metrics: SSO discovery and characterization (particularly active asteroids), depth and number of visits through remainder of North

6.3.2. Southern minisurveys

Add extension over south celestial pole, LMC/SMC with various numbers of visits Effect of adding or removing these minisurveys

Relevant metrics: number of visits and coadded depth over SCP, discovery of variables in LMC/SMC (see Olsen white paper for metrics?)

6.3.3. Low Galactic Latitudes

Discussion of definitions from SAC and recommendations for visits

Effect of adding or removing these minisurveys

Relevant metrics: number of visits, astrometry in bulge, discovery of variables/transients/microlensing in bulge (?)

6.4. Rolling cadence

Motivation for a rolling cadence (more frequent visits in some years)

Different options for rolling and explanation of how implemented

Should really include discussion of recovery from bad weather years and simulation of same

Relevant metrics: Maintain astrometry requirements, SN discovery, SSO discovery and characterization, Transient and variable discovery, uniformity of coadded depth / number of visits,

6.5. Twilight Observing

Discuss need for twilight observing to meet SRD goals (weather, total amount of time available)

Add NEO twilight survey, add DCR white paper (season extension visits?)

Effect of adding or removing these minisurveys

Our baseline simulation uses twilight time to fill in WFD observations in redder filters (rizy). We can use some of the time to conduct a NEO survey. We can also vary

which filters get used in twilight time. The baseline greedy algorithm used in twilight is known to be rather unstable, so we could also try running more contiguous blocks in twilight. We could also emphasize targeting areas that have already been observed 4 or more times in the night, potentially gathering important color information for a small number of transients.

Relevant metrics: NEO discovery, number of visits and coadded depth (and uniformity) in WFD, measurement of DCR, season length

6.6. Deep Drilling Fields

Discuss purpose and how these are scheduled (very different from other fields)

Discuss potential cadences (AGN/ DESC) and how these differ, and our combination of the two

Discuss timing issues with oversubscription (and how much of a problem this could be, what if worse weather?) – include location of fifth DD field

Effect of adding or removing these minisurveys

We have run a variety of Deep Drilling strategies. The DDF strategy is largely separable from the rest of the survey design, and we have a number of proposals for DDFs that we have yet to explore (e.g., rolling DDFs where a single DDF is completed in one observing season). We have started experimenting with pre-scheduling DDF observations.

- What fraction of the survey should be dedicated to the DDFs?
- Should DDFs be preferentially executed in dark time, or is it more important to maintain cadence?
- Where should the DDFs be placed (can we finalize the 5th DDF as a Euclid double-pointing)?
- What is the preferred dithering strategy (spatially and rotationally) for the DDFs? There is tension in that DM generally prefers larger dithers for calibration and co-addition purposes, while science cases prefer smaller dithers to preserve the area that reaches the deepest levels.
- Should we try "rolling" the DDFs, completing DDF observations in a field in only a few years?

Relevant metrics: number of visits and coadded depth for DD, SN detection in DDFs, AGN detection in DDFs *[solar system minisurvey DDF?]

6.7. Rotational Dithering

By default, we select a random camera rotation angle (wrt the telescope) nightly. This creates minimal additional slewtime, and seems to provide adequate angular randomization. We currently have no science metrics that depend on the angular

distribution, and this should be something very important to weak lensing science (although we do not have a metric to measure this).

We have also experimented with setting the camera rotation angle to ensure stellar diffraction spikes fall preferentially along rows and columns.

• How should we rotationally dither visits?

6.8. Spatial Dithering

For the wide area regions we have had excellent results randomizing the tessellation orientation nightly. This does result in a small percent of time being spent observing outside the desired survey footprint. The alternative would be to limit the amount one dithers out of the footprint, but then one risks imprinting systematics on objects near the footprint border (e.g., an object is never observed in the center of the focal plane, only by outer rafts).

6.9. ToO modes

Discuss impact of ToO, and how we could implement ToOs in scheduler (various modes: straight to queue by hand or set up known program and supply trigger, etc. – that we're evaluating the second?)

Any ToO survey should also take into account that chip and raft gaps mean full sky coverage will require multiple images with spatial dithering.

Discuss how we can have a low coverage region to the north to maintain templates for all possible ToOs, or we could decide of only search for ToOs that are likely to be in the WFD area.

Currently, the only expected ToO use of Rubin observatory is follow up of gravitational wave detections.

- When should Rubin interrupt observations to look for GW optical counterparts?
- Do we look for GW events in the WFD area, or anywhere on the sky?
- Should we expand the survey footprint so we have image differencing templates over the entire accessible sky, in at least a few filters?
- Should Rubin plan on observing the entire light curve of ToO events, or make observations primarily for detection/classification and leave detailed follow up to other observatories?
- What filter combination and dither strategy (filling chip and raft gaps) should be used for observing ToO triggers?

Relevant metrics: frequency of achieving ToO observations, number of visits and coadded depth in other surveys (WFD or other minisurveys that may be in particular contention)

6.10. Image Differencing Templates, DCR

Do we need to do anything special to ensure we have adequate image templates? A certain number of observations per year? A certain fraction of images taken in good seeing conditions?

If we need to start considering image quality, that makes it more difficult to simulate a night ahead of time and maintain the list of upcoming observations.

Should we intentionally extend to high airmass to facilitate DCR modeling? Note that in the baseline, we only image a location in the WFD region ~ 9 times per year in g and ~ 6 times in u. Also, we have chip and raft gaps, so if we want to build a DCR model for the entire sky in g, we might be dedicating 1/3 of the g observations in a year to DCR. If we switch to 60s u band exposures, there would be no observations beyond building the DCR model.

There have been claims that measuring DCR can be used for science. We do not have any metrics that demonstrate any gains, and the loss of depth is noticeable. In theory, we could combine the DCR measurements to extend the season length of observations as well (e.g., only take DCR template images near twilight in the direction of the sun).

6.11. Number of visits in WFD

Overall survey number of visits vs. number of visits in WFD (see twilight survey, DCRham surveys, variable exposure, shortexp surveys)

6.12. Survey Contingency

How much contingency should we aim for when designing the survey strategy? Currently, with what we believe is a conservative weather closure policy, we can meet SRD requirements with 2x15s visits, but can cover a larger footprint and do more science cases with 1x30s snaps.

6.13. Satellite Megaconstellations

Starlink is poised to launch thousands of LEO satellites. Observations so far imply that final-orbit Starlink satellites should not saturate Rubin exposures, and thus can be masked fairly easily in the image reduction pipeline.

Do we need any further satellite mitigations? Will NEO twilight surveys still be viable in the presence of megaconstellations, or should we use twilight strategies that avoid the horizon?

Figure 6.13 shows how illuminated megaconstellations in LEO would leave numerous streaks on Rubin images.

6.14. Aliasing

• Are we taking observations at a large enough hour angle range that we do not need to implement further efforts to prevent aliasing of periodic sources?

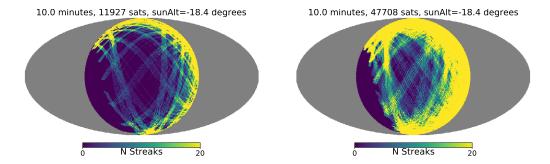


Figure 54. Alt/az projection of simulated satellite megaconstellations as seen from the Rubin Observatory site after twilight has ended.

7. CONCLUSIONS

Hopefully here we pare down the evaluation of 100s of runs (like promised) to a set of between 10 to 20 (if this is possible, after combining along different axes). The results should come with some basic comments about what's particularly good or bad in each of these areas and how we arrived at these general options.

Metrics we know we need to get from the community:

- Photometric redshift performance, especially as it relates to filter distribution
- Weak Lensing systematics, especially as related to camera rotator angle
- Deep Drilling Field metrics beyond coadded depth (e.g., AGN performance)
- Deep Drilling metrics that are sensitive to the spatial dither strategy
- Transient early classification metric
- More populations in the Galactic plane beyond the simple number of stars.

8. ACRONYMS

Acronym	Description			
AGN	Active Galactic Nuclei			
В	Byte (8 bit)			
CCD	Charge-Coupled Device			
COSEP	Community Observing Strategy Evaluation Paper			
CTIO	Cerro Tololo Inter-American Observatory			
DCR	Differential Chromatic Refraction			
DDF	Deep Drilling Fields			
DESC	Dark Energy Science Collaboration			
DESI	Dark Energy Spectroscopic Instrument			
DIMM	Differential Image Motion Monitor			
DM	Data Management			
ESO	European Southern Observatory			
FFT	Fast Fourier Transform			
FOV	Field of View (LSST FOV is 3.5 sq deg)			

FWHM	Full Width at Half-Maximum					
FoM	Figure of Merit					
GP	Galactic Plane (galactic plane modification to survey footprint)					
GW	Gravitational Wave					
LCO	Las Cumbres Observatories					
LMC	Large Magellanic Cloud					
LSST	Legacy Survey of Space and Time (formerly Large Synoptic Survey Telescope)					
MAF	Metrics Analysis Framework					
NEO	Near-Earth Object					
NES	North Ecliptic Spur (northern extension in ecliptic plane to survey footprint)					
OpSim	Operations Simulation					
RA	Right Ascension					
RMS	Root-Mean-Square					
SAC	Science Advisory Committee					
SCOC	Survey Cadence Optimization Committee					
SCP	Southern Celestial Pole (southern extension to survey footprint)					
SED	Spectral Energy Distribution					
SMC	Small Magellanic Cloud					
SN	Supernova					
SOAR	Southern Astrophysical Research Telescope					
SRD	LSST Science Requirements; LPM-17					
SS	Subsystem Scientist					
SSO	Solar System Object					
TDE	Tidal Disruption Event					
WD	White Dwarf					
WFD	Wide Fast Deep (standard 'universal' footprint)					
XMM	X-ray Multi-mirror Mission (ESA; officially known as XMM-Newton)					
ZTF	Zwicky Transient Facility					
arcsec	arcsecond second of arc (unit of angle)					
deg	degree; unit of angle					

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