

Image Calibration and Instrument Signal Removal for the First Year of Rubin LSSTCam

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ABSTRACT

The Vera C. Rubin Observatory Legacy Survey of Space and Time (LSST) requires calibration products that provide uniform, stable, and accurate photometric and astrometric performance across the 3.2 gigapixel focal plane and throughout the 10-year survey. This paper details the algorithms and workflows used to produce instrument calibrations and remove instrumental artifacts for Data Preview 2 (DP2)—the first end-to-end processing demonstration using on-sky data with the LSST Camera (LSSTCam). We describe the verification, acceptance, and certification framework used to assess calibration quality and quantify residual systematics. We show baseline metrics on calibrated science images to evaluate the robustness of the calibration and instrument signature removal (ISR) data processing pipelines for DP2. Finally, we summarize the known limitations observed in DP2 production and outline expected algorithmic improvements for the first public LSST data release.

1. INTRODUCTION

The Vera C. Rubin Observatory will conduct the 10-year Legacy Survey of Space and Time (LSST; [Ivezić et al. 2019](#)), imaging roughly 18,000 deg² of the southern sky in six broadband, optical–NIR filters (*ugrizy*). Achieving the LSST science goals requires calibrating the instrument with high precision and uniformity so that raw detector readouts can be transformed into science-ready images and catalogs. Errors or non-uniformities in image calibration can introduce survey-scale photometric and astrometric systematics that propagate into downstream measurements and may be degenerate with astrophysical or cosmological signals ([J. H. Esteves et al. 2023](#)). Key challenges to delivering this level of calibration include:

1. **Instrument complexity:** The LSST Camera (LSSTCam) is the largest digital camera built for astronomy. Its 3.2-gigapixel focal plane consists of 205 fully depleted, backside-illuminated CCDs from two vendors (Teledyne e2v and International Technologies Laboratory, hereafter E2V and ITL). Detector-to-detector and amplifier-level variations require calibration and processing algorithms robust to heterogeneous sensor behavior.

2. **Data volume and cadence:** LSSTCam typically acquires 30 s exposures with ≤ 3 s read-

out, yielding about 1000 exposures per night and nightly data rates of approximately 10 TB.

3. **Calibration illumination and optics:** The calibration system (dome flats, LEDs, monochromator, and the Collimated Beam Projector or CBP) must provide uniform and repeatable illumination over a large focal plane through a fast ($f/1.2$) optical system.
4. **Coupled instrumental effects:** Instrument artifacts must be corrected in the reverse chronological order from their origin in the photon transfer chain, yet the calibration data to model those artifacts are often obtained and combined in a forward (chronological) way. Many effects are partially degenerate, requiring iterative or “bootstrapped” approaches to create self-consistent calibration products.
5. **Evolving conditions and cadence:** Changing environmental conditions, multi-epoch calibration datasets, and evolving observing strategies require calibration production to be robust to non-uniform operations. The calibrations for DP2 used datasets collected before the dome was completed, before installation of thermal regulation systems, and before finalization of the precise detector operating mode.

6. **Verification, provenance, and operational reproducibility:** Calibration products must be accompanied by quantitative diagnostics for rapid data quality assessment, cross-time and cross-version comparisons, and clear acceptance and certification decisions for downstream processing. Products must be reproducible, versioned, and continuously validated as instruments and algorithms evolve.

The LSST Data Management Science Pipelines ([NSF-DOE Vera C. Rubin Observatory 2025](#)) implement this functionality using production pipelines and supporting tools to generate, verify, and publish calibration products for routine processing. The design benefits from lessons learned in LSST Data Preview 1 (DP1) ([NSF-DOE Vera C. Rubin Observatory Team et al. 2025](#)) and precursor surveys, including the Hyper Suprime-Cam Subaru Strategic Program ([S. Miyazaki et al. 2012](#); [H. Aihara et al. 2022](#); [J. Bosch et al. 2017](#)) and the Dark Energy Survey ([T. D. E. S. Collaboration 2005](#); [T. Diehl & F. T. D. E. S. Collaboration 2012](#); [E. Morganson et al. 2018](#)).

The first end-to-end demonstration of Rubin data processing on a substantial, internally consistent LSSTCam dataset is *Data Preview 2* (DP2). DP2 covers about $2,500 \text{ deg}^2$ in all six filters and includes commissioning and pre-survey operations data. This paper describes the calibration-production algorithms and the operational approach used to generate DP2 calibration products.

Our goals are to (1) make the DP2 calibration products interpretable to science users, (2) quantify our confidence in the quality of released data products, (3) provide a reference for future cross-survey synergies and science analyses, (4) make the processing reproducible for pipeline developers and operators, and (5) provide a reference point for expected improvements on the path to the first LSST public data release.

This paper is organized as follows. §2 introduces the observatory hardware and instrumentation that supplied the inputs for DP2 calibrations. §3 presents the physical detector model and the calibration and instrument signature removal (ISR) pipeline, including algorithms and data products used in production. §4 discusses calibration-epoch differences and residual systematics relevant to DP2. §5 describes how calibration products are verified, accepted, certified, and deployed. §6 summarizes the DP2 calibration quality and outlines expected improvements toward Data Release 1 (DR1).

2. DATA

Summarize the DP2 context relevant to calibrations: instrument, filters, observing period/epochs, detector layout, available exposure types (bias/dark/flat/science), and definitions of calibration epochs. Optionally add science context.

2.1. The LSST Camera (*LSSTCam*)

Describe LSSTCam, including detector layout, the electronic readout board (REB), and the filters.

2.2. Calibration System (*CalSys*)

Provide descriptions of auxiliary telescope/CBP/flat field illuminator/LEDs/monochromator and any instrumentation used for input datasets. Describe any system-level constraints that influenced calibration strategy.

Describe the LSST Camera and any technical limitations (bad detectors/amps). Introduce and define the sequencer.

2.3. Data Selection

Describe the data selection process for the DP2 dataset.

3. DATA PROCESSING OVERVIEW

The calibration and instrument signature removal (ISR) pipeline removes instrumental effects from science data. For each effect observed in LSSTCam, the Rubin Science Pipelines define a calibration-generation task that produces the corresponding data product, and a correction task that applies that product during ISR.

3.1. Detector Model

Calibration and ISR tasks are organized as a pipeline based on our current model of the detector physics. The calibration production tasks are run in chronological order with respect to the photon transfer and data-acquisition chain, and ISR correction tasks are applied in the opposite order to the sequence in which effects accumulate along the signal path.

The algorithms and processing steps required for LSSTCam calibration and ISR were developed from measurements and analysis during electro-optical testing on the laboratory test stand at SLAC National Accelerator Laboratory, at the summit, and on the telescope in-dome during commissioning. [A. J. Roodman et al. \(2024\)](#) gives a detailed account of system characterization work and results from these campaigns. Figure 1 summarizes the instrumental effects identified in the photon transfer chain and their order.

... describe the detector physics ...

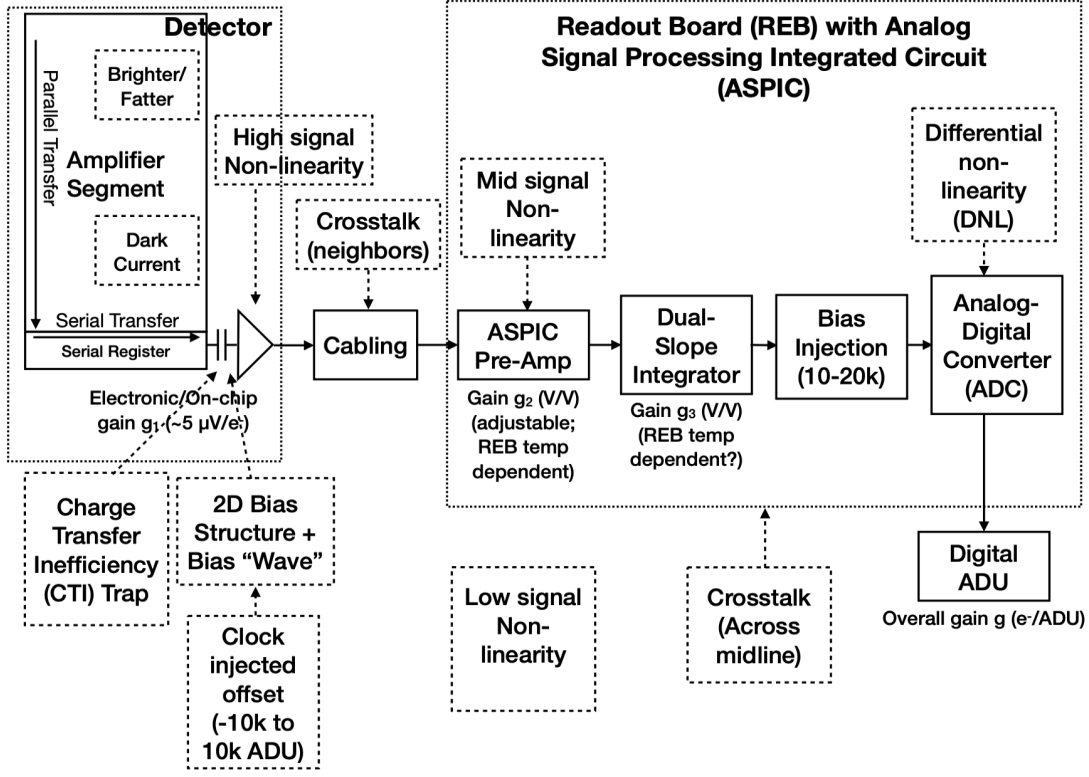


Figure 1. Photon transfer and data-acquisition model for the LSSTCam detectors and electronic readout board (REB). Instrumental effects seen in images are shown as dashed boxes; arrows indicate where each effect enters the chain. Low-signal nonlinearities in LSSTCam’s detector response have been observed, but their origin is not yet established; that contribution appears as a disconnected box.

3.2. Calibration & ISR Pipeline

Each subsection will describe the calibration product, its construction algorithm, and the corresponding ISR correction task. We may also include a table of the data product and the name of the associated calibration task.

3.2.1. Curated Calibrations

3.2.2. Auxiliary Data Products

3.2.3. Crosstalk

Describe how the crosstalk matrices are constructed.

3.2.4. Photon Transfer Curve (PTC)

The photon transfer curve (PTC) characterizes how pixels respond to varying signal levels in a given wavelength band by measuring covariances between pixels in flat field exposures across a range of illumination levels. This dataset provides critical calibration information including amplifier-level read noise and gain for variance plane estimation, saturation thresholds for masking, and parameters needed to correct for non-linearity, charge transfer inefficiency (CTI), and the brighter-fatter effect. All of these parameters can differ at the amplifier level.

The photon transfer curve used to calibrate LSSTCam for DP2 is measured from 543×2 flat field exposures at evenly spaced illumination levels as low 100 ADU and reaching at least 10% beyond saturation. At each illumination level, a pair of flats was acquired by varying both LED output and exposure time to achieve the target signal. We measure the covariance between pixels on the difference image of the two exposures to remove variations sourced by static, fixed-pattern artifacts.

Let F_1 and F_2 denote the two flats at a given illumination level, and let $\mu = \text{avg}(F_1, F_2)$ denote the mean signal level (in ADU) over the image and away from the detector edges. The covariance between a pixel $\mathbf{x} = (0, 0)$ and a neighbor at pixel $\mathbf{x}' = (i, j)$ is:

$$C_{ij} = \frac{1}{2} \text{Cov}(F_1(\mathbf{x}) - F_2(\mathbf{x}), F_1(\mathbf{x}') - F_2(\mathbf{x}')). \quad (1)$$

Pre-model fit—Preliminarily, we fit only the variance to an approximate exponential relation derived in [P. Astier et al. \(2019\)](#) (their Eq. 16).

$$C_{00}^{\text{exp. approx}}(\mu) = \frac{1}{2g^2 a_{00}} [\exp(2a_{00}\mu g) - 1] + \frac{n_{00}}{g^2}. \quad (2)$$

In this expression, covariances are contributed by a gain g (electrons/ADU), noise pedestal n_{00} (electrons²),

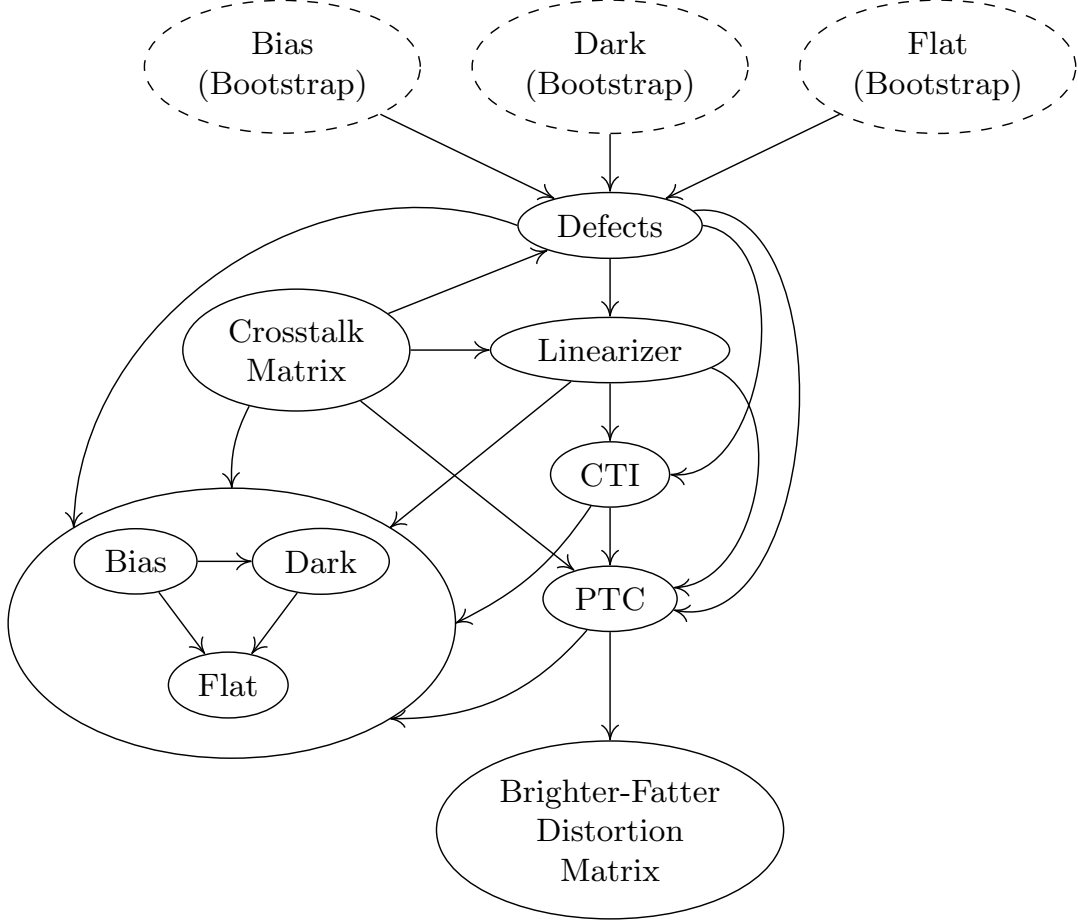


Figure 2. Calibration production dependency graph. Arrows indicate data or dependency flow ("x $\rightarrow$ y" means "y depends on x"). Solid outlined boxes represent datasets that are deployed/released with data products while dashed boxes represent internal or intermediate datasets that are not formally released to users.

and a single brighter-fatter coefficient a_{00} (1/electrons) which has the effect of decreasing the image variance.

Near saturation, the variance deviates from this functional form, exhibiting a gradual rollover rather than a sharp cutoff due to electrostatic effects that are difficult to model analytically. On top of the exponential approximation, we introduce an empirical saturation term:

$$C_{00}^{\text{sat}}(\mu) = \begin{cases} -e^{-(\mu-\mu_0)/\tau} & \mu \geq \mu_0 \\ 0 & \mu < \mu_0 \end{cases}, \quad (3)$$

where μ_0 marks the onset of the saturation effects and τ controls the saturation rollover. The total preliminary fit model is $C_{00}^{\text{pre. lim.}}(\mu) = C_{00}^{\text{exp. approx}}(\mu) + C_{00}^{\text{sat}}(\mu)$ to the unweighted points, and fit with additional 3 sigma clipping until convergence. The PTC turnoff becomes the signal level of the last unmasked point following the exponential approximation fit, typically corresponding to the maximum of the variance curve and generally higher than the roll-off threshold. The PTC rolloff is the

signal level where $C_{00}^{\text{pre. lim.}}(\mu)$ and $C_{00}^{\text{exp. approx}}$ deviate by more than 1%.

Final model fit—With the remaining points below the PTC rolloff, we fit the complete covariance expansion from P. Astier et al. (2019) (their Eq. 20):

$$C_{ij}(\mu) = \frac{\mu}{g} \left[\delta_{i0}\delta_{j0} + a_{ij}\mu g + \frac{2}{3}[\mathbf{a} \otimes \mathbf{a} + \mathbf{a}\mathbf{b}]_{ij}(\mu g)^2 + \frac{1}{6}[2\mathbf{a} \otimes \mathbf{a} \otimes \mathbf{a} + 5\mathbf{a} \otimes \mathbf{a}\mathbf{b}]_{ij}(\mu g)^3 + \mathcal{O}[(\mu g)^4] \right] + \frac{n_{ij}}{g^2} \quad (4)$$

where a_{ij} (electrons) $^{-1}$ represents the fractional change in pixel area per stored charge due to boundary motion from the brighter-fatter effect, b_{ij} (electrons) $^{-1}$ captures weaker time-dependent corrections (discussed in § TBD), g is the gain (electrons/ADU), and n_{ij} is the constant noise contribution (electrons) 2 (e.g., $n_{00} \sim (5.7 \text{ electrons})^2$ on the diagonal, with off-diagonal terms determined by read electronics and overscan). The symbol $\mathbf{a}\mathbf{b}$ denotes element-wise matrix multiplication, and $\otimes$ represents discrete convolution. In practice, b_{ij} pa-

parameter is inferred to be just noise around a value of zero.

The PTC calibration products are applied during instrument signature removal of science images in three ways. First, the gain converts pixel values from ADU to electrons. Second, the gain and read noise inform variance plane estimation. Third, the saturated pixel mask flag (denoted “SAT”) is set for all pixels with values greater than or equal to the PTC turnoff threshold.

3.2.5. Defects

We describe how defect masks are generated (bad pixels/columns, saturation trails, and other artifacts), the thresholds used, and how masks are combined across exposures.

3.2.6. Linearity

We describe the linearity characterization procedure and the model used to correct detector response as a function of signal level. We specify the valid range and how extrapolation (if any) is treated.

3.2.7. Charge Transfer Inefficiency (CTI)

We describe how CTI is measured (e.g., using overscan/EPER or dedicated sequences), the chosen parameterization, and how uncertainties propagate to corrected images.

3.2.8. Brighter-Fatter (BF) Distortion Matrix

We describe the measurement of the brighter-fatter effect, how correlations are estimated, and how the resulting kernel/matrix is stored and validated.

3.2.9. Bias

We describe how master biases are constructed (overscan handling, trimming, combination statistic, masking) and the metrics used to monitor time stability.

3.2.10. Dark

We describe how master darks are produced (scaling by exposure time, cosmic-ray rejection, hot pixel treatment) and how residual structures are assessed.

3.2.11. Flats

We describe how flat-field calibrations are created (illumination correction strategy, normalization conventions, handling fringing/stray light) and how uniformity is quantified.

4. DISCUSSION

Describe how calibrations have changed across different calibration epochs (sequencer changes).

List the set of criteria that prompt a new round of calibrations.

5. VERIFICATION, ACCEPTANCE, AND CERTIFICATION

This section defines the quality metrics for calibration products and ISR outputs. Here we define the criteria used to promote products to “accepted” and “certified”.

5.1. Data products, Distribution, and User Access

Describe the output schema, distribution process (exporting/importing, rucio, TAXICAB tracking), and user access.

We enumerate the primary data products (calibration frames, ISR outputs, masks, and metadata tables), describe naming/versioning conventions, and summarize the provenance tracked for each product (inputs, software versions, and configuration).

Briefly describe how users discover and retrieve products (e.g., via a data butler/repository interface) and recommended query patterns.

5.2. Verification

We list (possibly in a table) the automated verification tests for each data product (sanity checks, analysis plots, detailed plots, distributional checks, and science test images) and the thresholds that determine acceptance/rejection of different calibration data products.

5.3. Acceptance

This section will describe the calibration acceptance process (TAXICAB).

Describe how verified products are compared against earlier baselines to reveal regressions or deviations, and how acceptance decisions are documented.

5.4. Certification

Describe the final certification step in the context of the data “butler” and file system storage.

5.5. Data Monitoring

Discuss how we monitor incoming streams of new data for quality (e.g. rubinTV, plot navigator, trend monitoring with chronograph).

5.6. Limitations

Summarize known limitations for DP2 (instrumental systematics not fully corrected, edge cases, missing calibrations, validity constraints) and near-term roadmap items.

6. CONCLUSION

We summarize the workflow and the key validation steps that ensure stable, reproducible calibration production and ISR. We also outline planned improvements

(algorithmic updates, expanded diagnostics, and operational automation) and the expected impact on data quality.

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Facility: Rubin

Software: LSST Science Pipelines

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