



# Global detrending

Current status

**James McCormac - University of Warwick - PLATO Data Centre (Richard West)**

Getting ready for PLATO meeting - Thursday 14th Sept 2023



# Summary

1. Position in the L1 pipeline
2. Summary of detrending methods
3. Existing simulated datasets (PIS/PSLS + PlatoSim)
4. Performance analysis
5. New Docker wrapper for PlatoSim + L1

**James McCormac - University of Warwick - PLATO Data Centre (Richard West)**

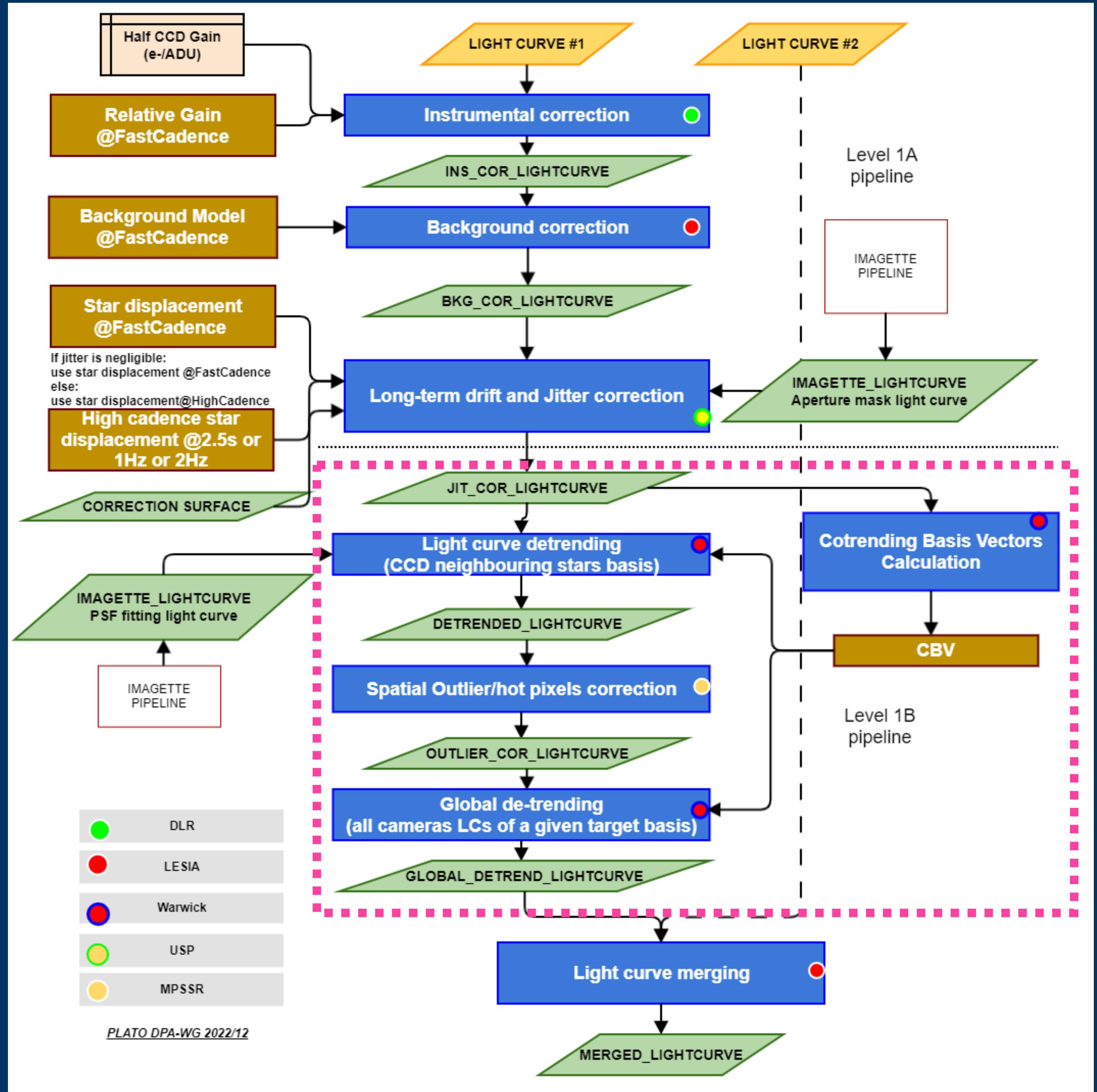
Getting ready for PLATO meeting - Thursday 14th Sept 2023

# Position in the L1 Pipeline

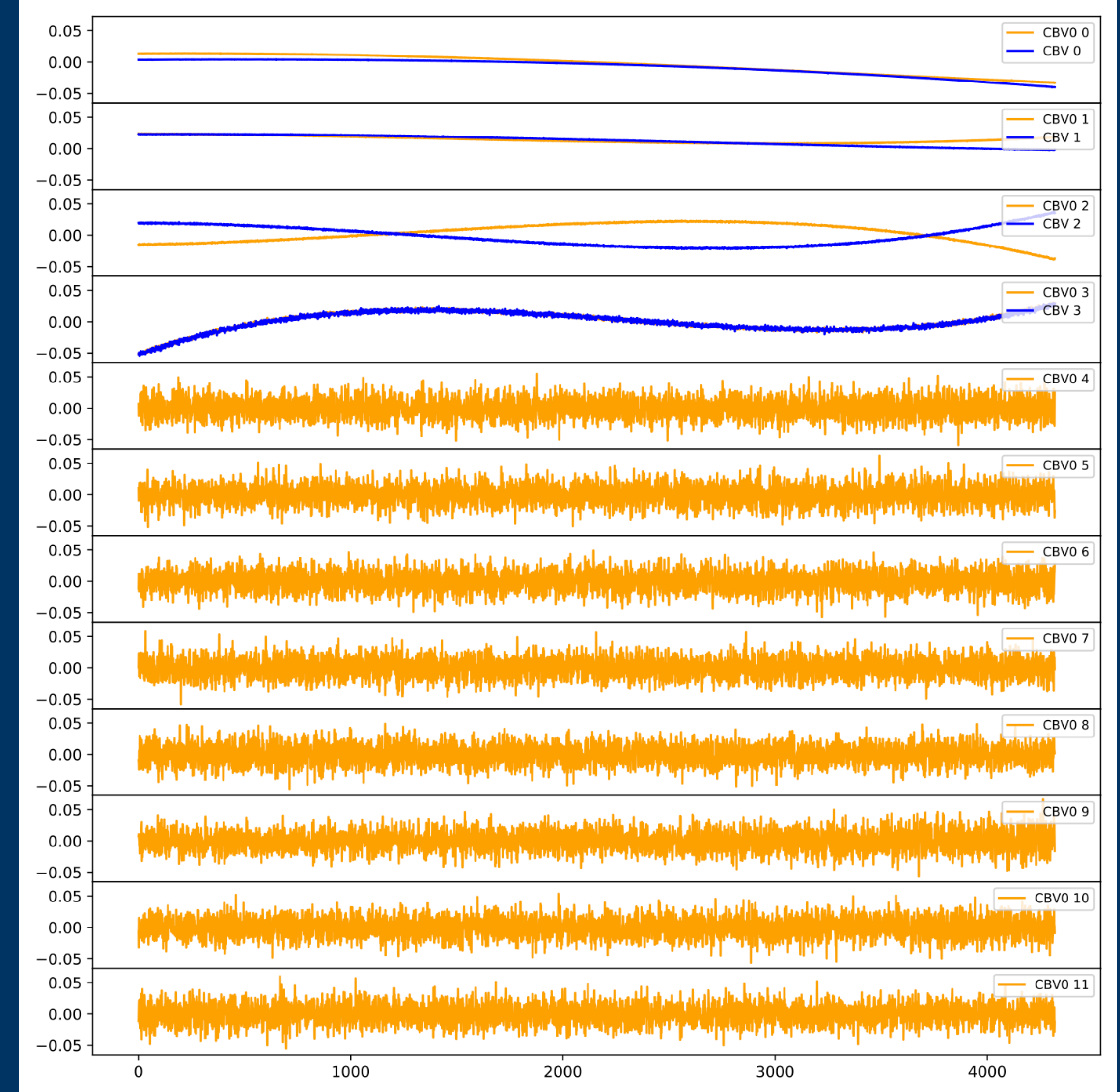
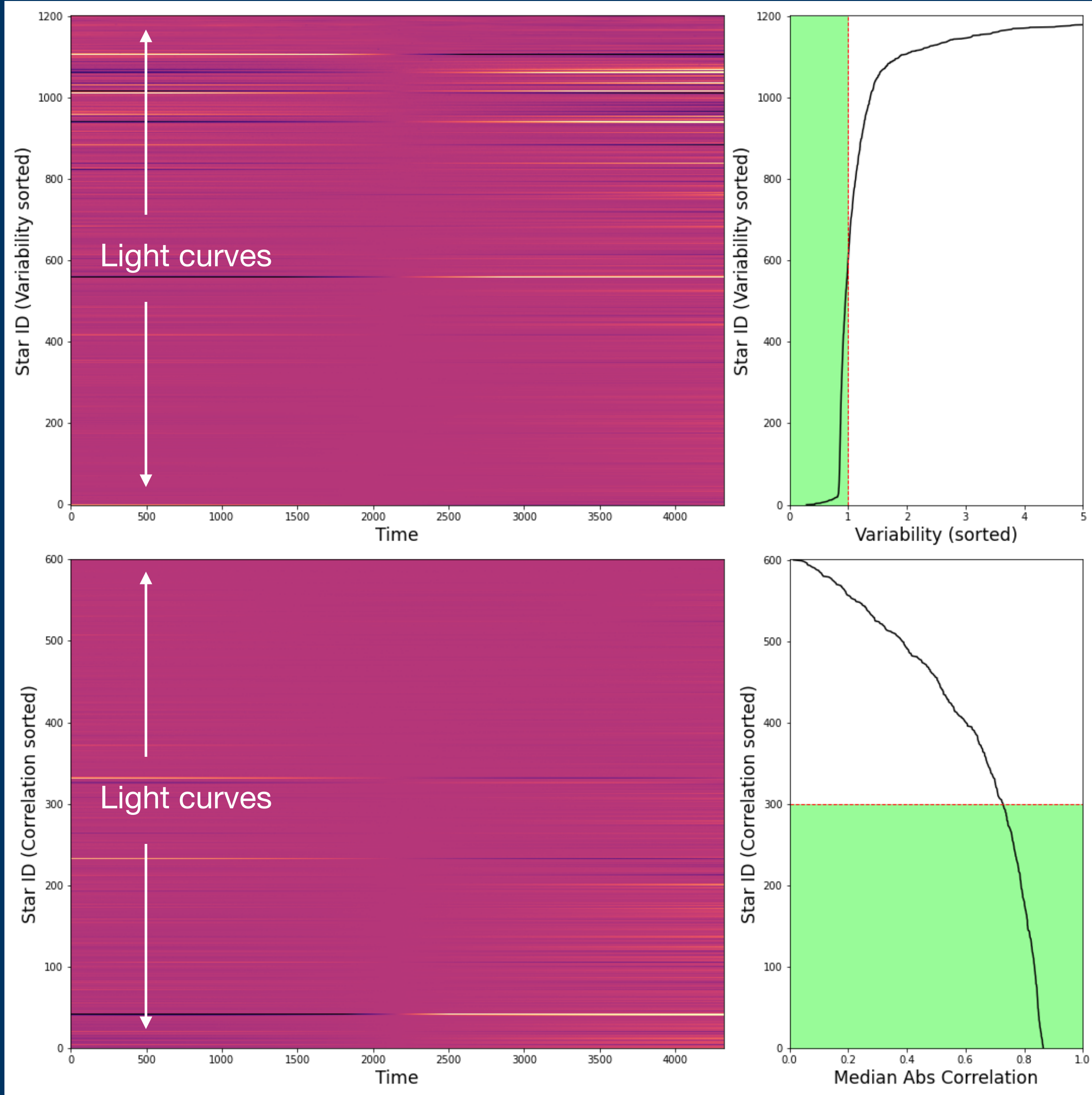
Second last step in L1  
 After 'long-term drift + jitter correction'  
 Before 'light curve merging'

Investigating two methods of detrending:  
 Kepler PDC-MAP (**single camera**)  
 PLATO Republic (**multi camera**)

Both techniques depend on Cotrending  
 Basis Vectors (CBVs)  
 CBV calculation split into a preliminary step



# Extracting Cotrending Basis Vectors (per camera/CCD)



1. Flux / median(Flux)  
Keep low variability objects

2. Correlate non-variables with each other.  
Rank by correlation, keep top 50%

3. Entropy cleaning  
SVD on remaining stars

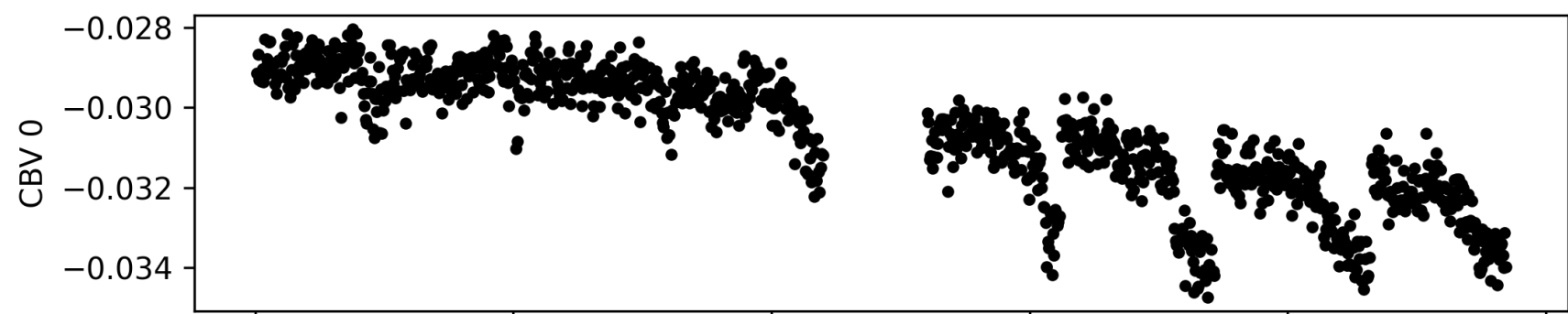
4. Check CBV's SNRs  
Keep those > 5dB

# MAP application of CBVs - TESS FFI data - Sector 05\_1-1

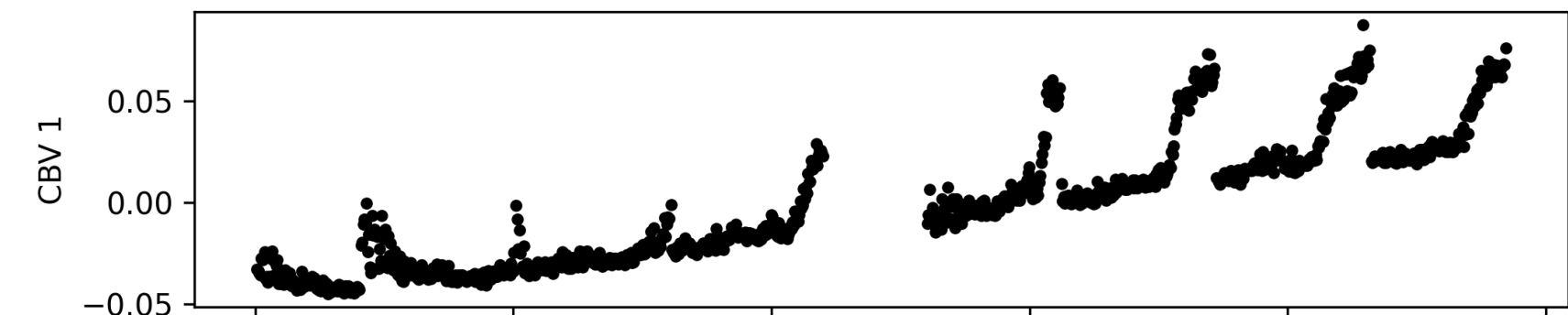
Variable object = more prior weight

Quiet object = less/no prior weight

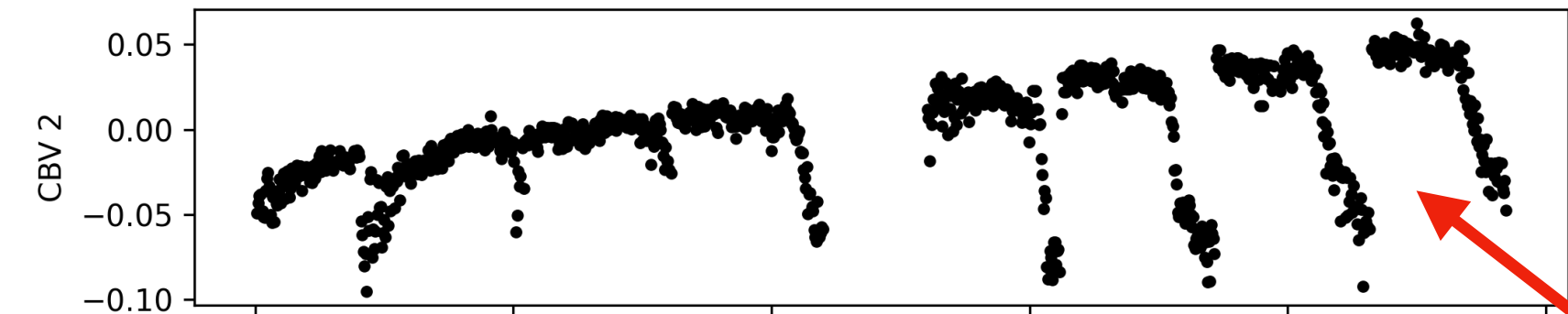
$\phi_0$



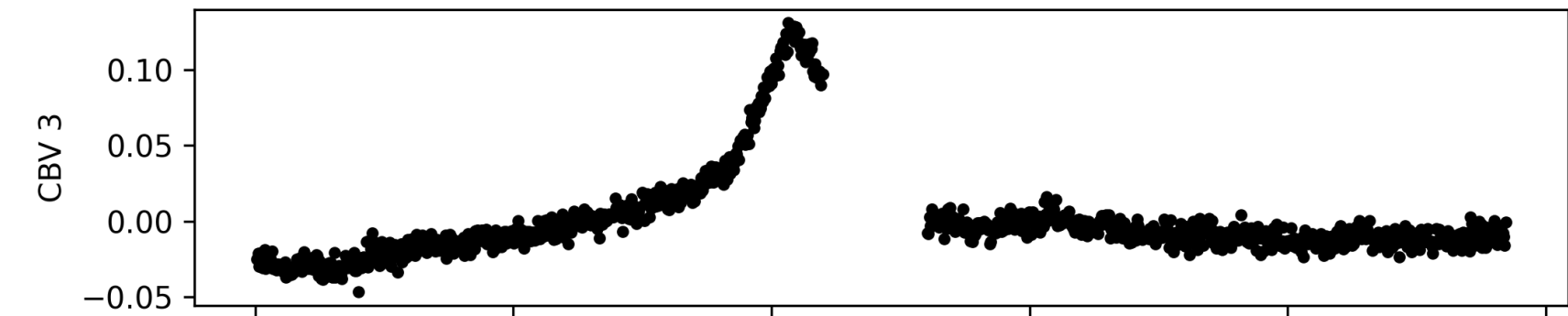
$\phi_1$



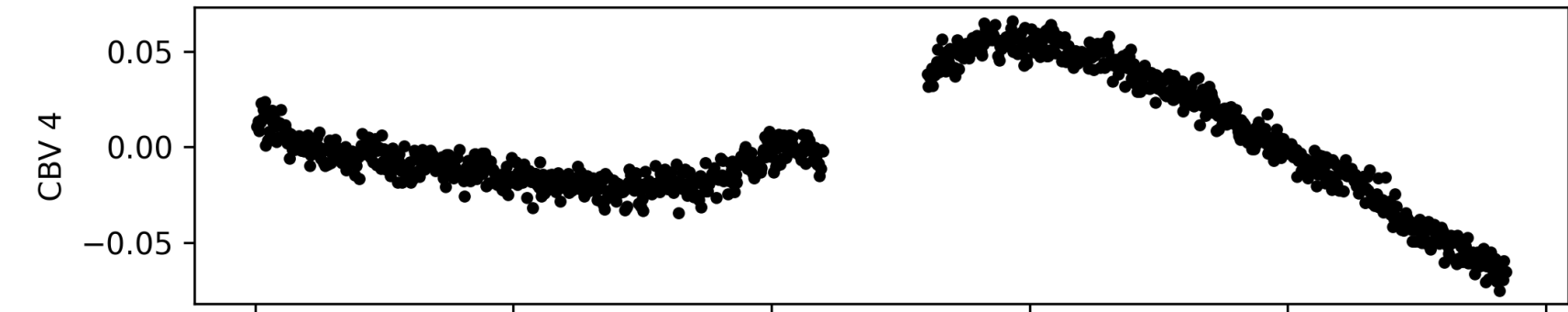
$\phi_2$



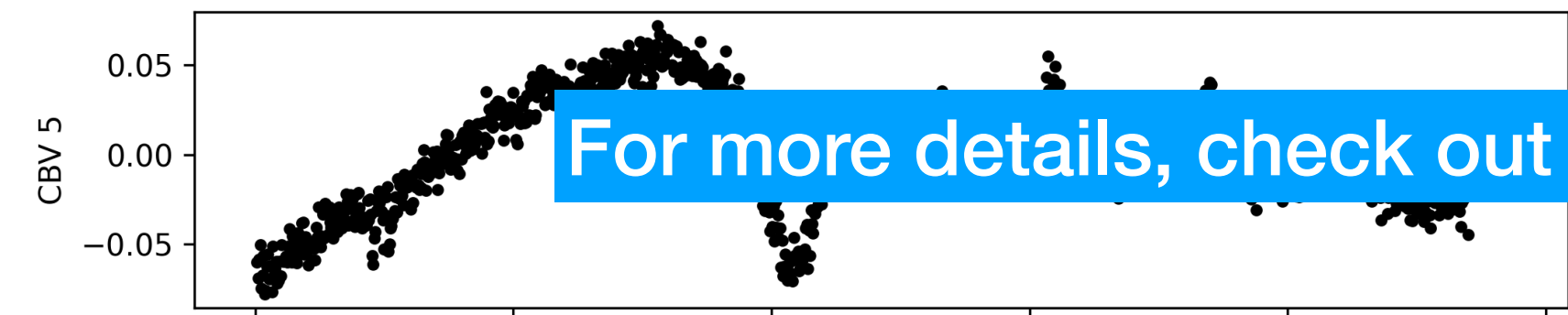
$\phi_3$



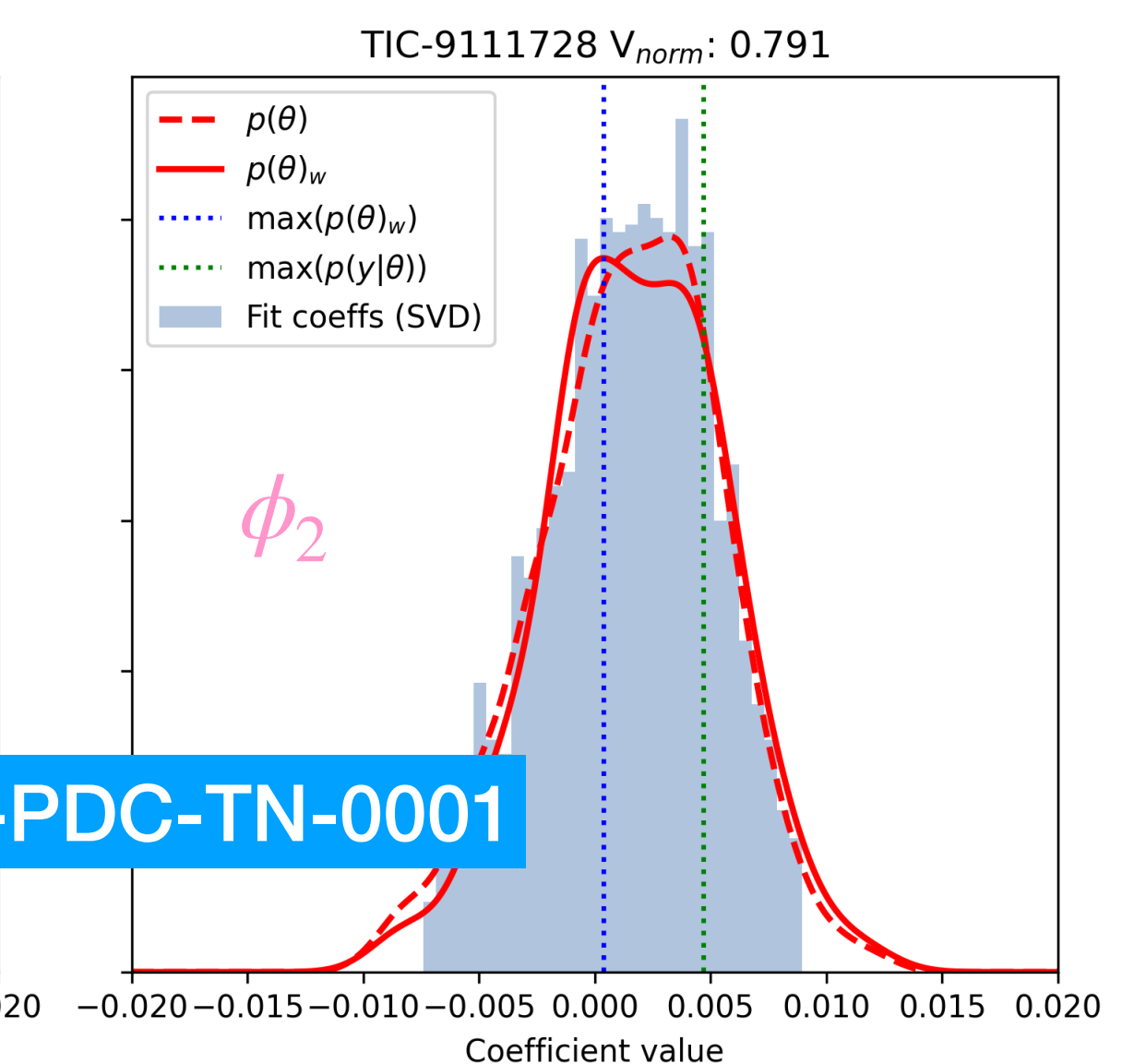
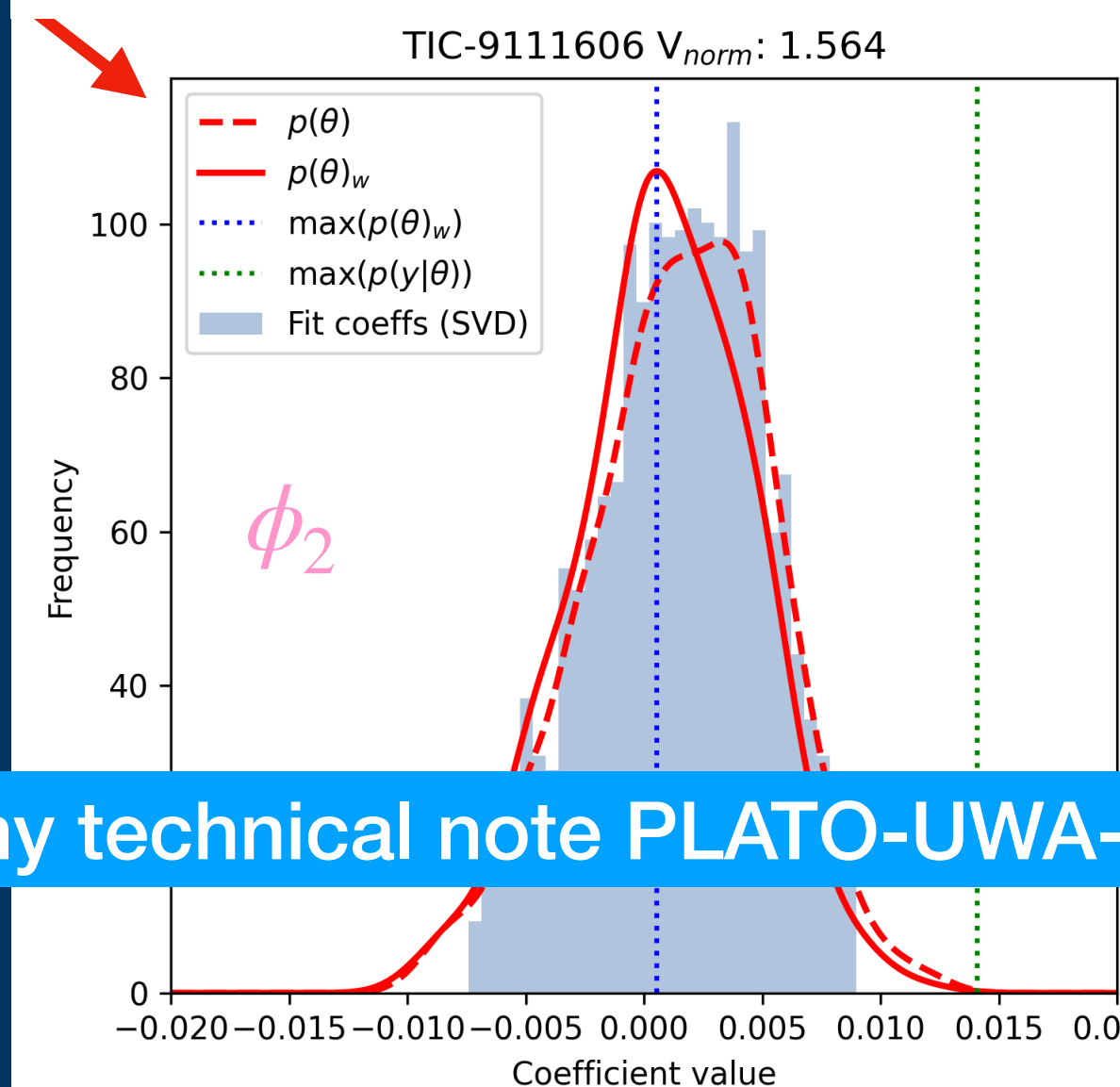
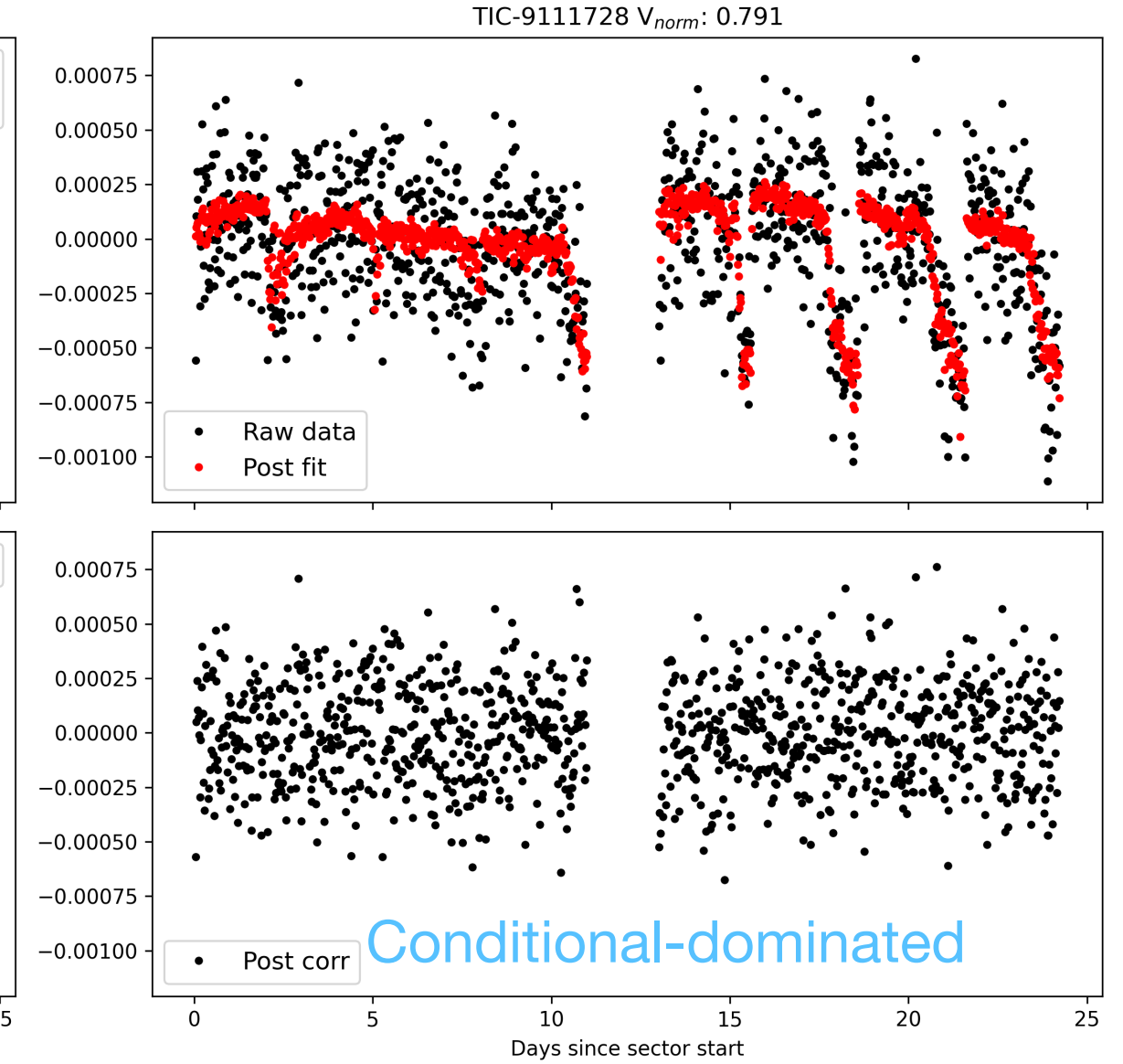
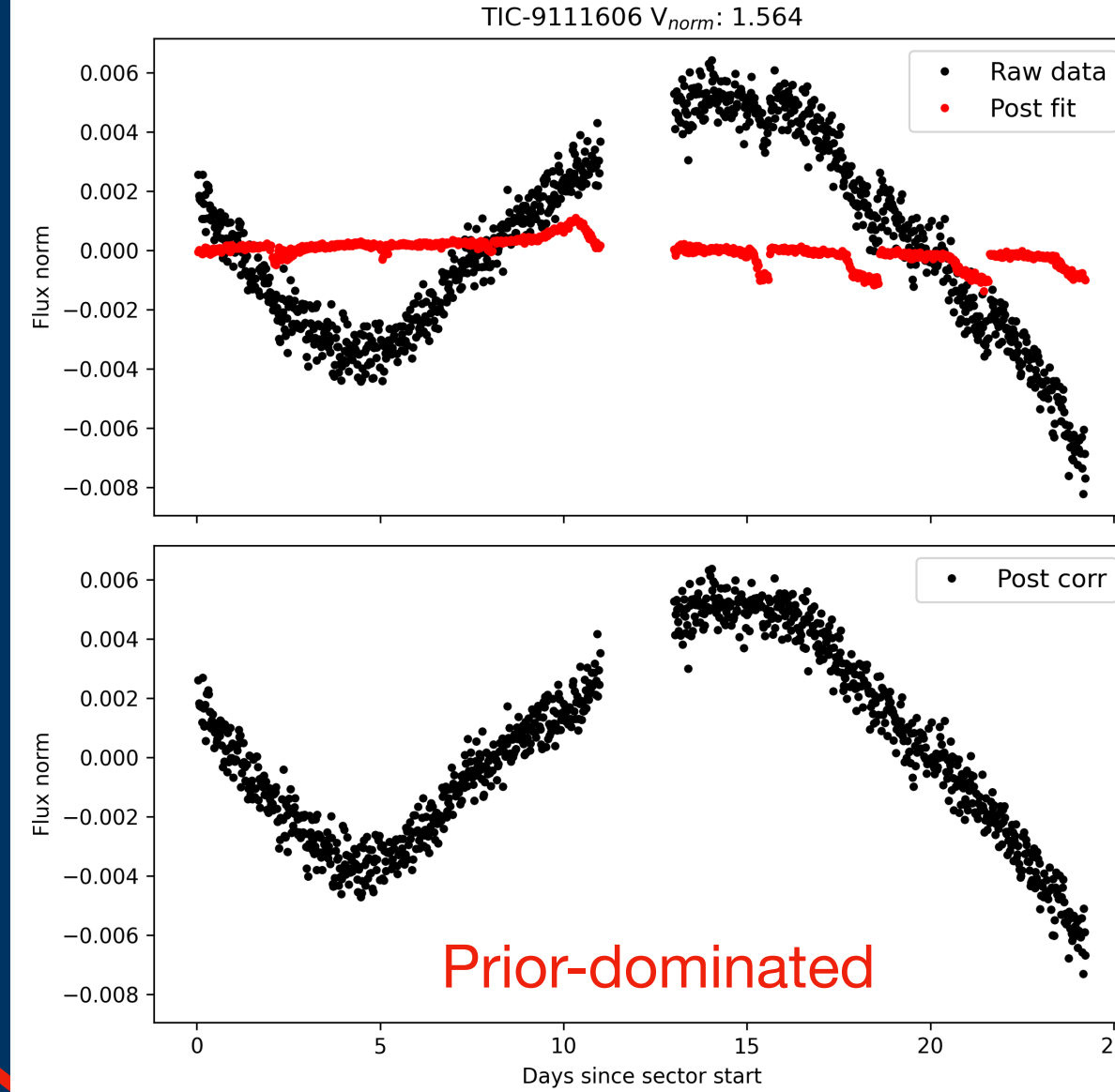
$\phi_4$



$\phi_5$



For more details, check out my technical note [PLATO-UWA-PDC-TN-0001](#)



# Republic v1

linear combination  
CBVs\*fit\_coeffs per camera

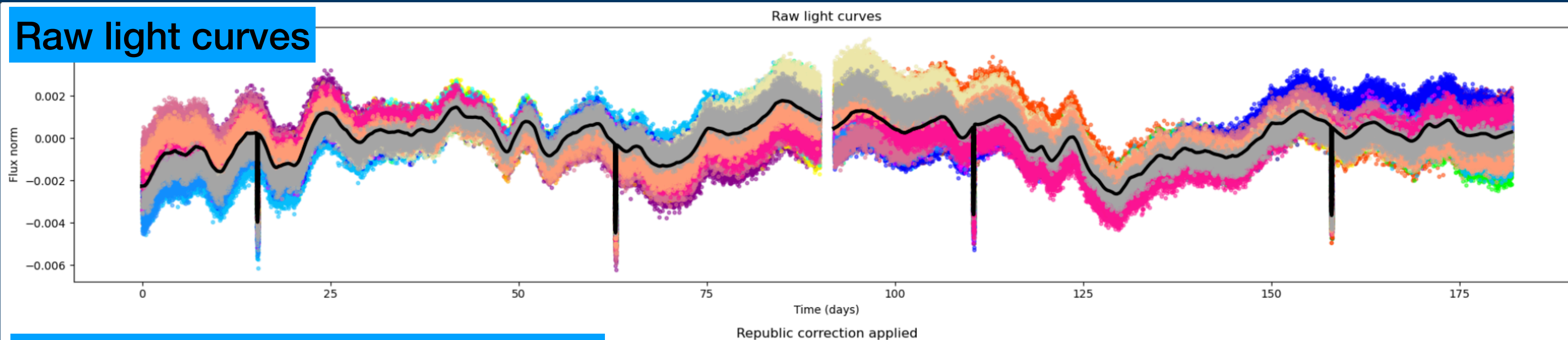
Observed flux (per-camera) = Intrinsic Stellar Signal + Systematics Model + Random Noise

Common across cameras

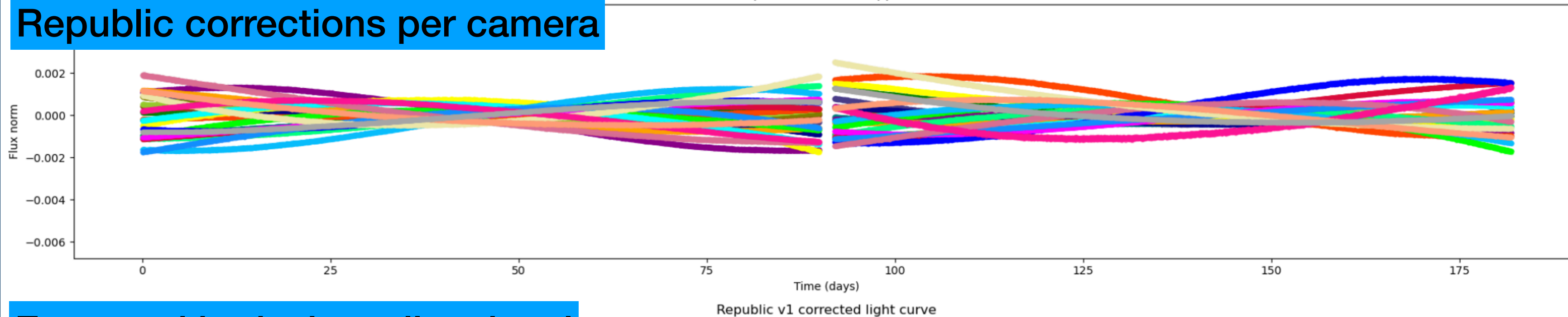


Considers **single** star light curves and CBVs from all cameras

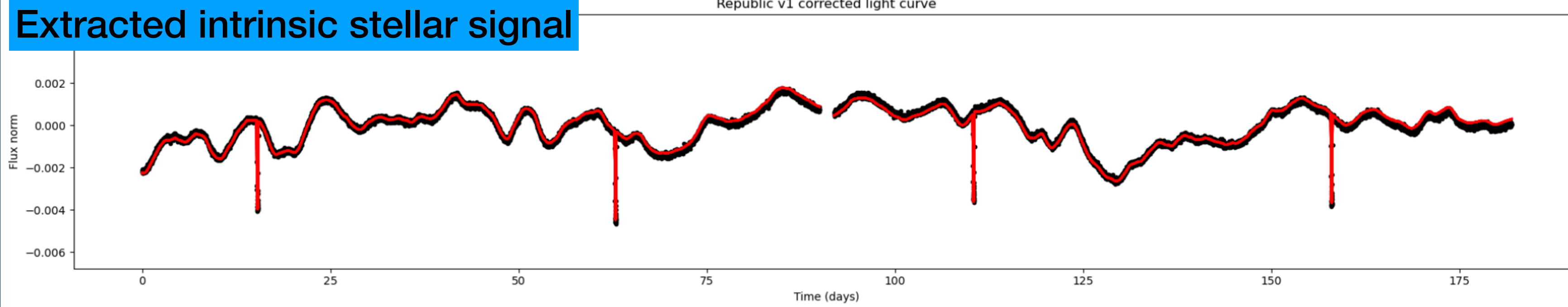
## Raw light curves



## Republic corrections per camera



## Extracted intrinsic stellar signal



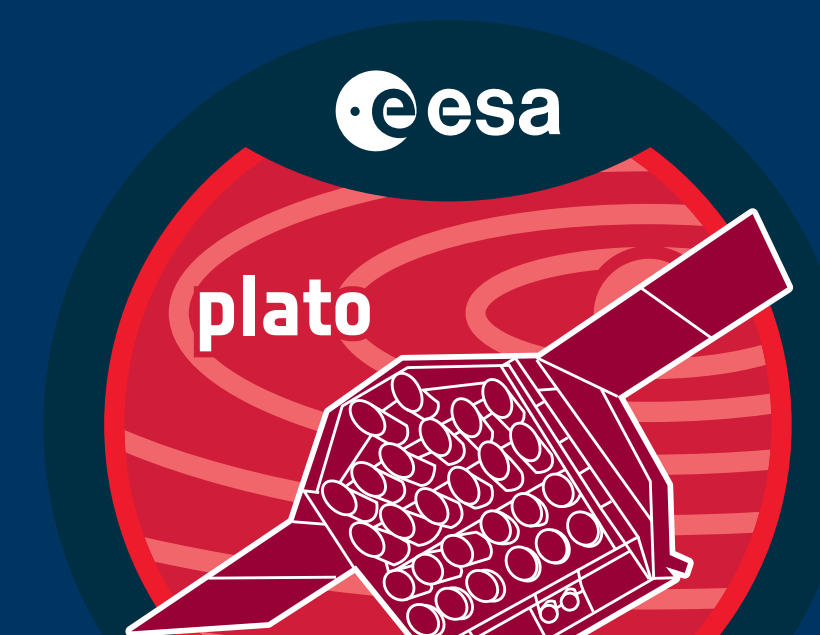
Fits intrinsic stellar signal as free parameter at each time step and simultaneously determines all CBV fit coefficients

Large set of simultaneous equations solved via matrix inversion

Assumes systematics independent between cameras

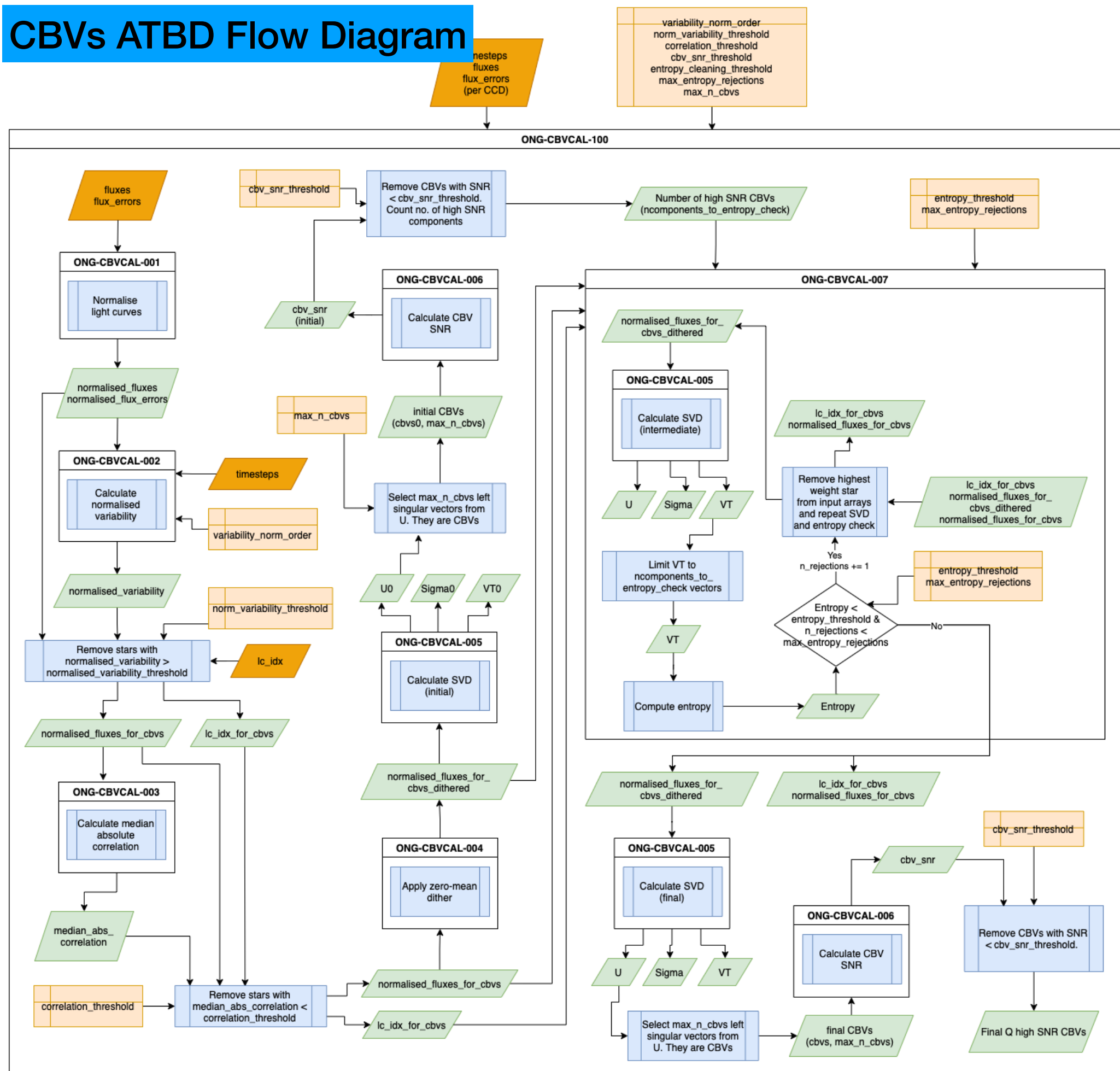
Preserves signals common across cameras regardless of origin

# PLATO Algorithm Theoretical Baseline Documents (WP32)

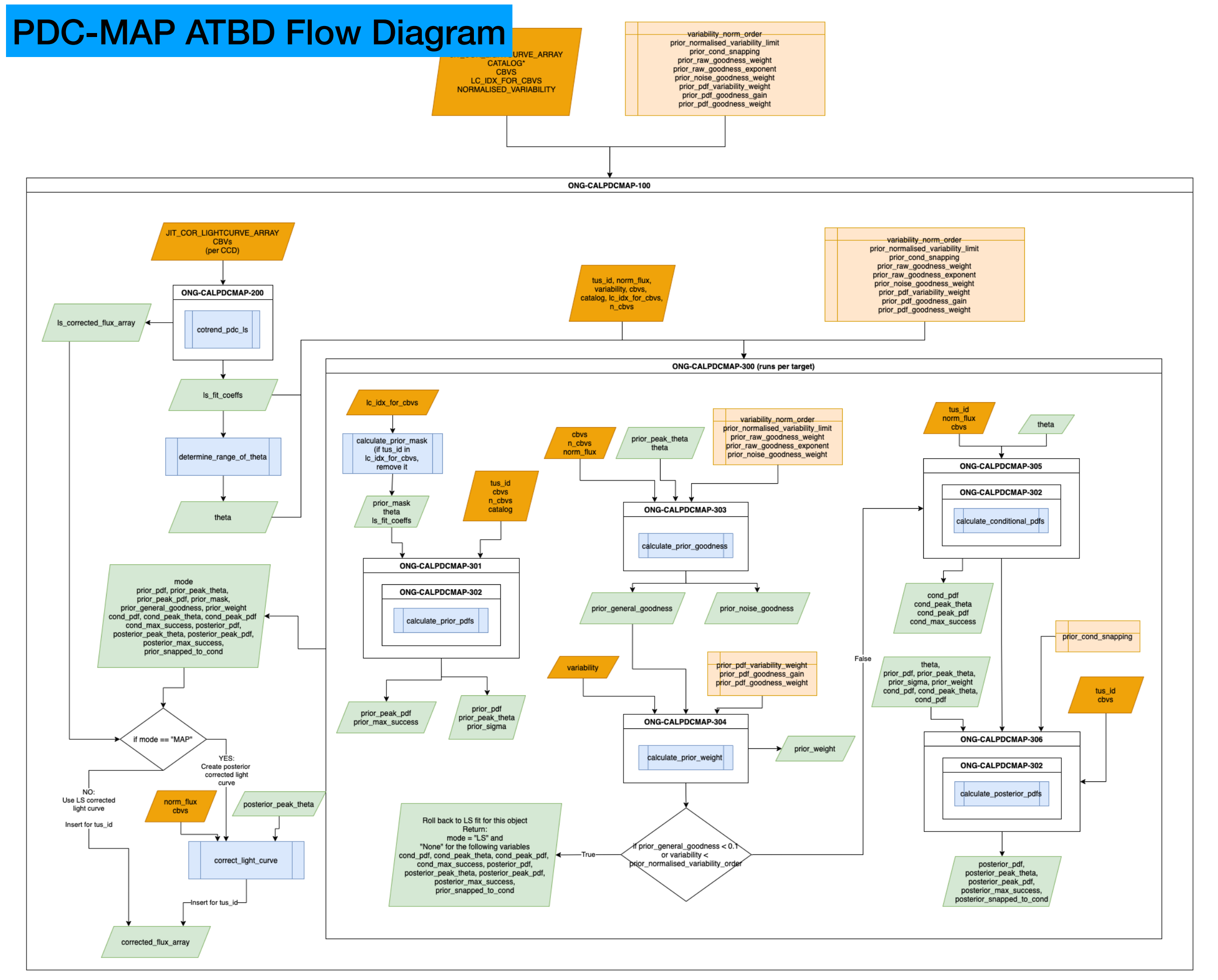


1. Calculation of Cotrending Basis Vectors (PLATO-UWA-PDC-DD-0001)
2. Cotrending using Kepler PDC-MAP (PLATO-UWA-PDC-DD-0002)
3. Cotrending using Republic algorithm (PLATO-UWA-PDC-DD-0003)

## CBVs ATBD Flow Diagram



## PDC-MAP ATBD Flow Diagram



# Summary of PIS/PSLS simulations



PLATO Image Simulator (PIS)

PLATO Solar-like Lightcurve Simulator (PSLS)

Early simulator used prior to PlatoSim

Simulation	N cams	N qrt	N stars	Cadence	Mask	LCs	Stel	MAP	Rep1	Comments
BOL4_2k_bm	24	8*	2300	10 min	—	Y	Y	Y	Y	MAP p/q; Rep1 multi-q
BOL4_2k_ubm	24	8*	1800	10 min	2w	Y	Y	Y	Y	MAP p/s; Rep1 multi-q
BOL4_2k_psf	24	8*	1700	10 min	—	Y	Y	Y	Y	MAP p/q; Rep1 multi-q

Large set of simulations:

- 24 cameras
- 8 quarters
- ~2k stars each
- 10 mins cadence

- **BM**: binary mask photometry
- **UBM**: updating binary mask photometry (**P5**)
- **PSF**: PSF photometry (**P1**)
- Systematics simulated by series of polynomials
- **Stellar signals simulated by S. Aigrain (Oxford)**

\*Multiple quarters simulated by cycling systematics from camera to camera (1->2, 2->3, etc at each quarter boundary)



# PIS/PSLS

## Power Spectrum Analysis

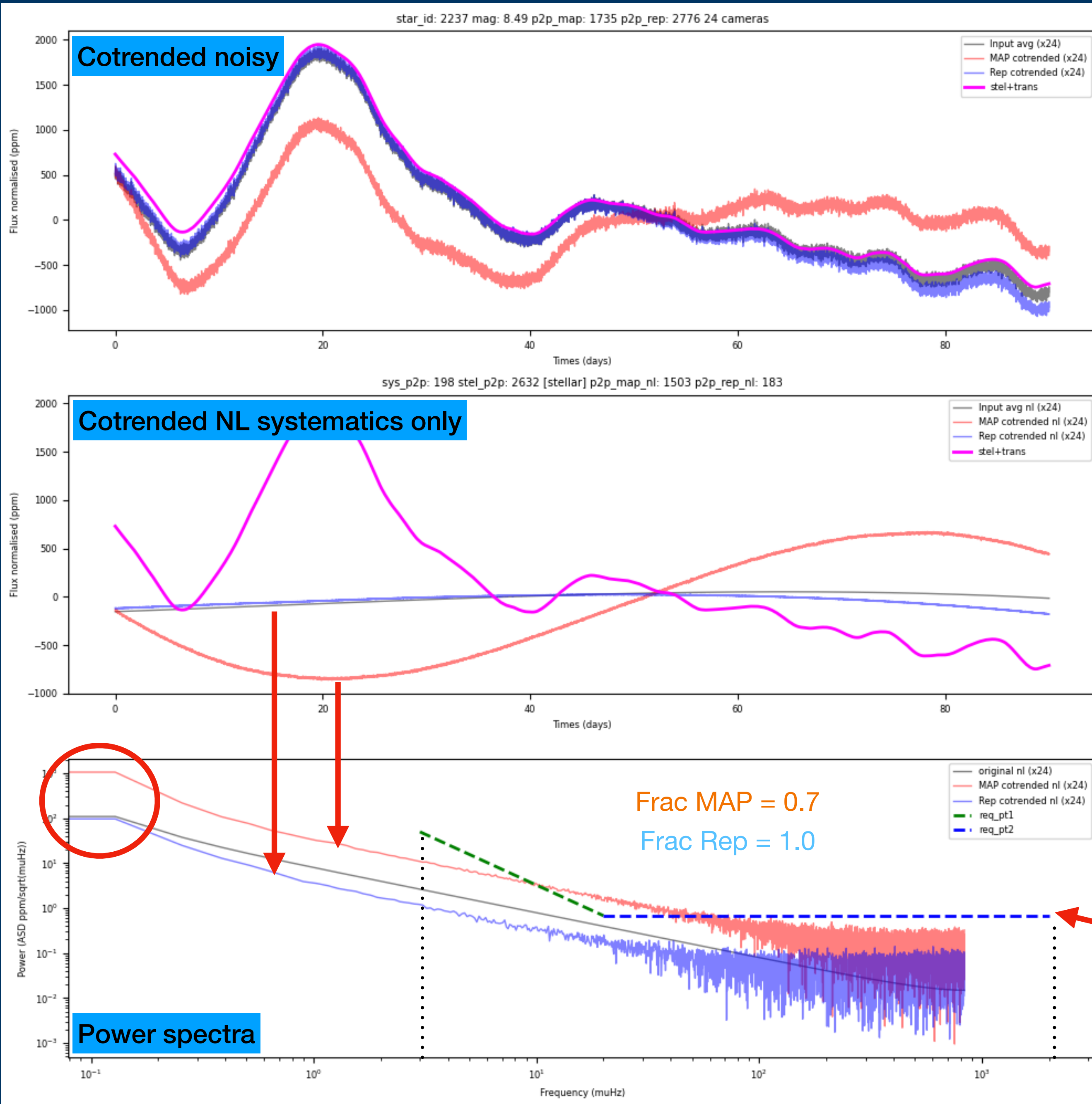
Calculate per-camera CBVs  
 Calculate per-target/camera fit coeffs (MAP | Republic)

Cotrend noiseless (NL) light curves using  $\wedge$   
 Create 24 camera average

Calculate power spectrum of NL  
 MAP | Rep corrected lcs (24 cam avg)  
 Calculate fraction (Frac) of PS frequencies  
 meeting requirements

Input lc (24cam avg)  
 MAP corrected lc (24 cam avg)  
 Rep corrected lc (24 cam avg)  
 Injected stellar signal

75% stars have  
 Frac > 0.9 (MAP | Rep)



SOC-NF-GDP-GL1-1956

Amplitude of the Spectral Density of the mean residual errors in the L1 pipeline

Assuming the performance of the pipeline specified in the Payload User Requirements and a payload performance as given by parameters in the Payload Parameters for Performance Studies (PLATO-DLR-MIS-L1-0002), the ground data processing pipelines (including algorithms and calibration) shall be such that the (double-sided) Amplitude Spectral Density of the mean residual errors in the L1 lightcurves for stars of magnitude  $m_v = 11$  in stellar sample 1, after on-board and ground processing, are:

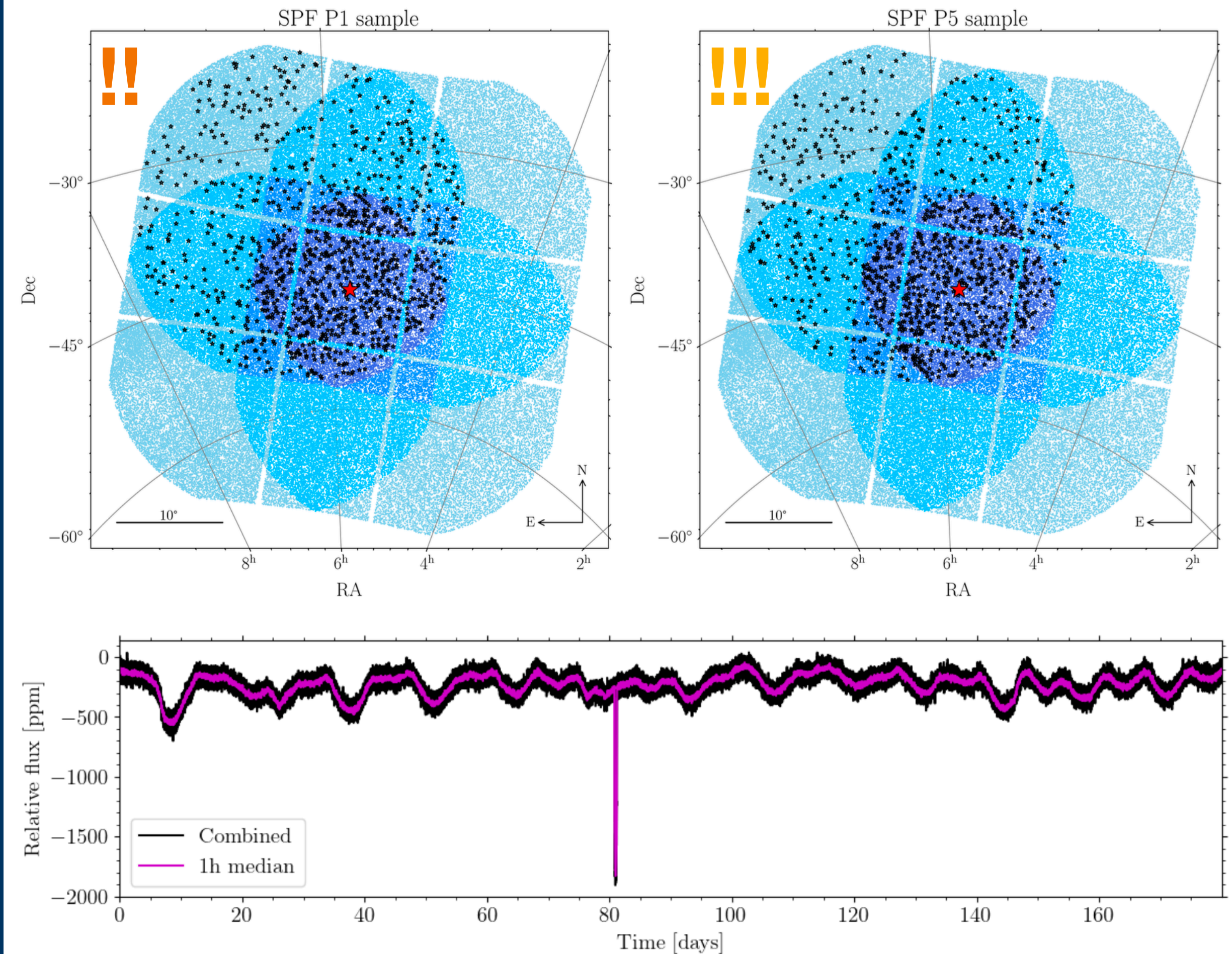
- lower than the monotonic rise from  $0.68 \text{ ppm}/\sqrt{\mu\text{Hz}}$  at  $20 \mu\text{Hz}$  to  $50 \text{ ppm}/\sqrt{\mu\text{Hz}}$  at  $3 \mu\text{Hz}$ , at frequencies below  $20 \mu\text{Hz}$ ;
- lower than  $0.68 \text{ ppm}/\sqrt{\mu\text{Hz}}$  at frequencies between  $20 \mu\text{Hz}$  and  $40 \text{ mHz}$

Non-functional on-ground data processing L1 requirement

# PlatoSim Simulations

- First large scale PlatoSim + L1 run
- PLATO-KUL-PL-TN-0020 (N. Janssen)
- 1000 P1 & 1000 P5 stars
- Distributed across multiple cameras
- 2 quarters (23 & 24, EOL)
- Best estimates for spacecraft parameters
- Worst case assumed for DKA + TED
- Stellar activity, transits, photometric standards (S. Aigrain et al)
- P1 PSF photometry with L1 (LESIA)\*\*
- P5 aperture photometry with L1 (LESIA)\*\*\*

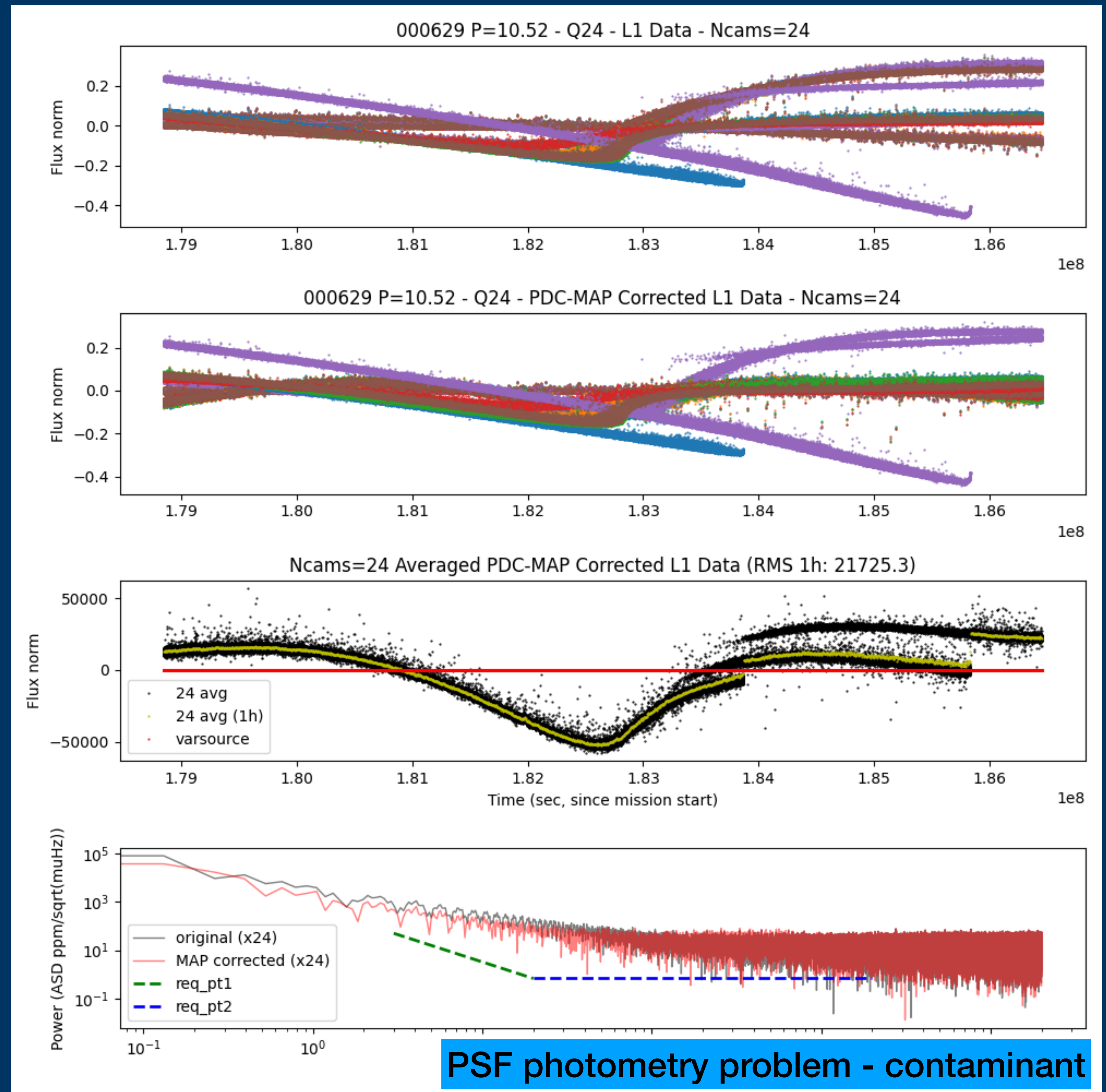
Input signals	No.
Standards: "Constant"	3
Standards: roAp	7
Granulation, oscillations	100
Granulation, oscillations, activity	445
Granulation, oscillations, activity, exoplanet	445



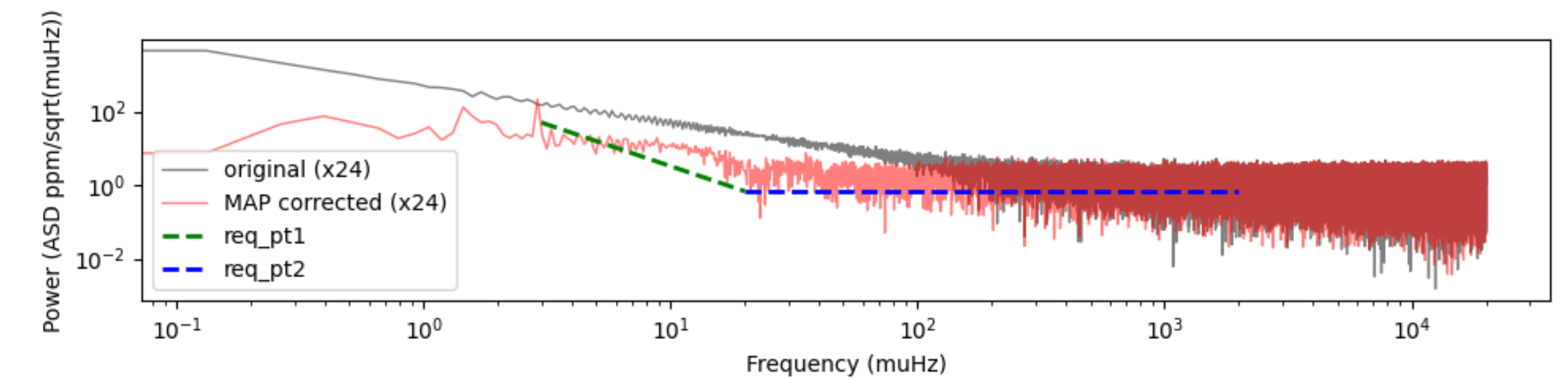
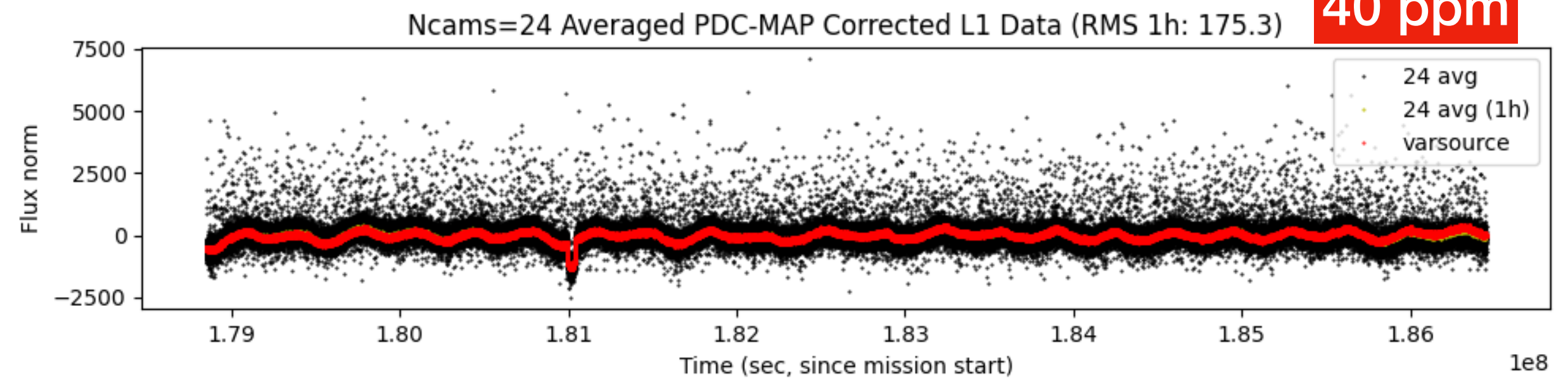
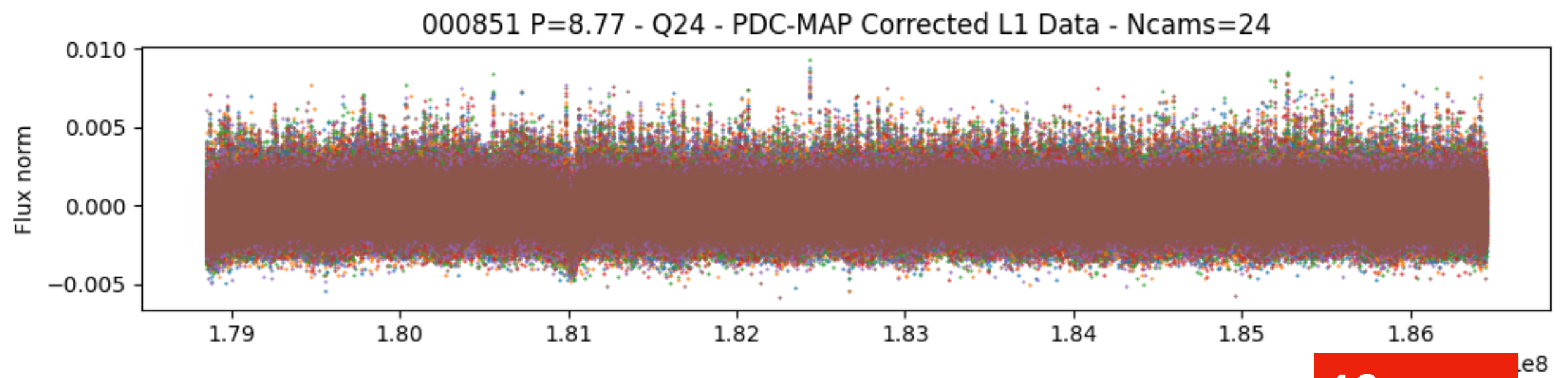
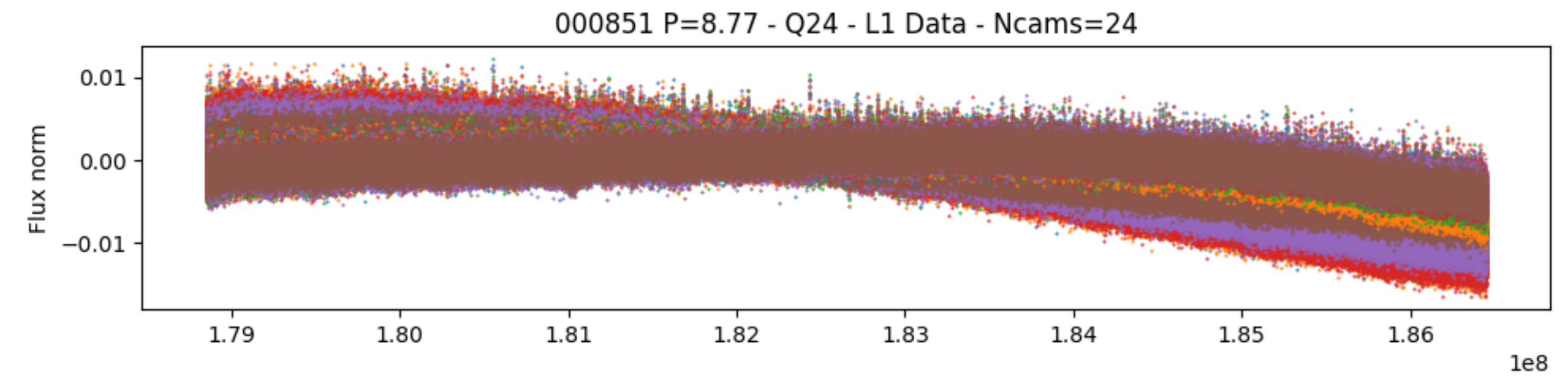
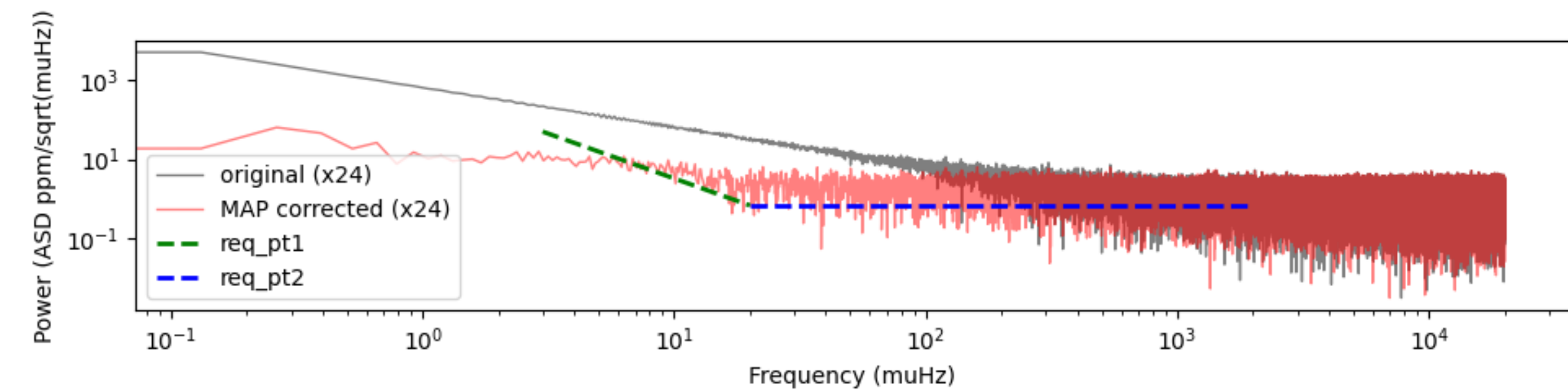
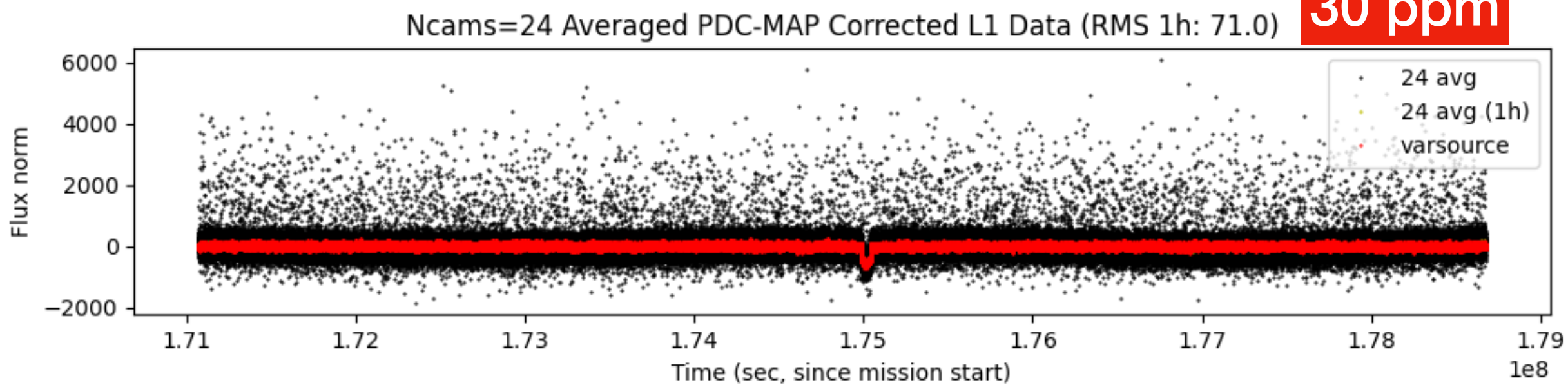
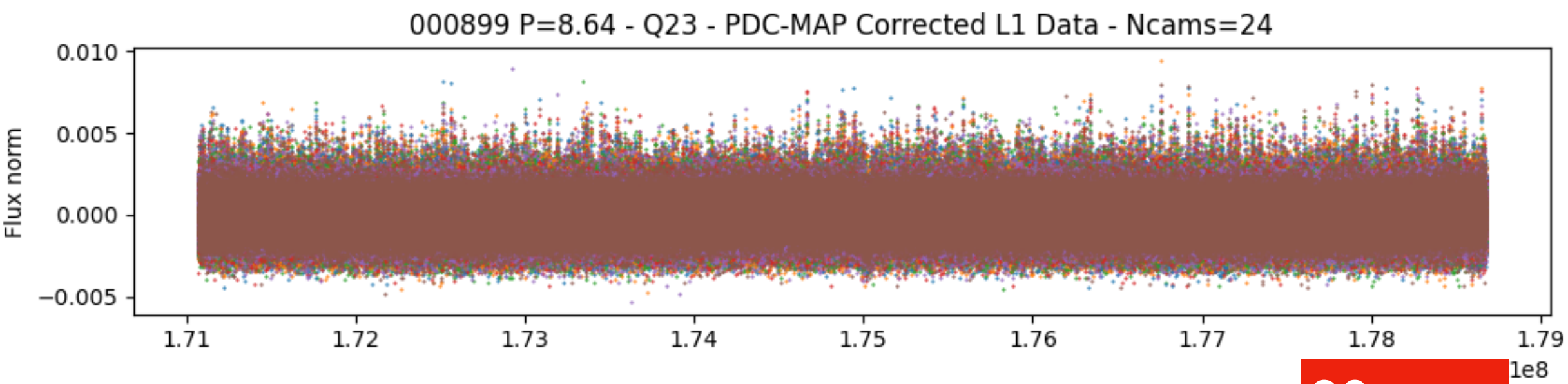
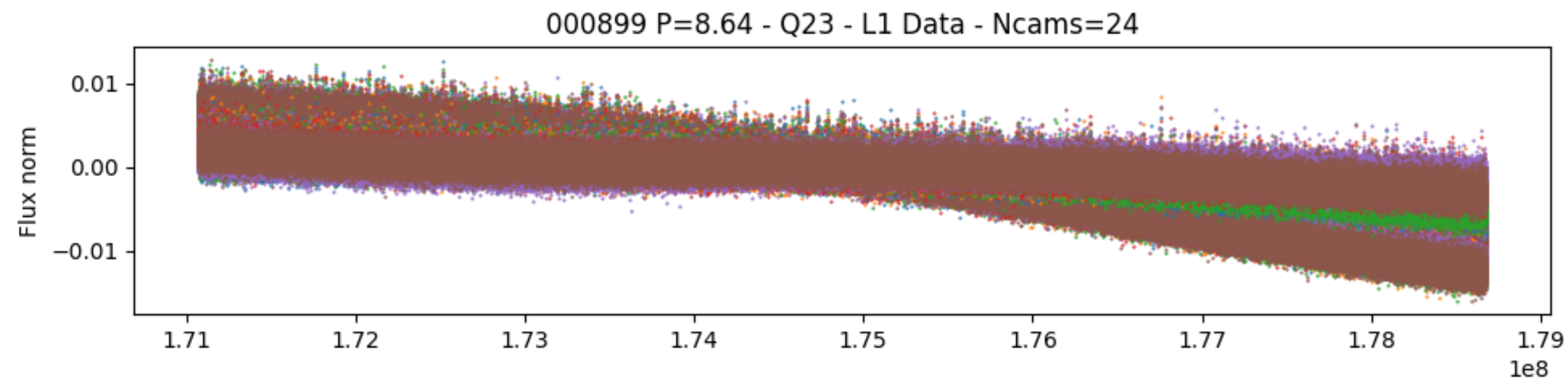
N-Cams	<i>P1 sample</i>		<i>P5 sample</i>	
	Targets	Time series	Targets	Time series
6	100	600	100	600
12	200	2400	200	2400
18	100	1800	100	1800
24	600	14400	600	14400
Sum	1000	19200	1000	19200

# Teething Problems with PlatoSim + L1 simulations

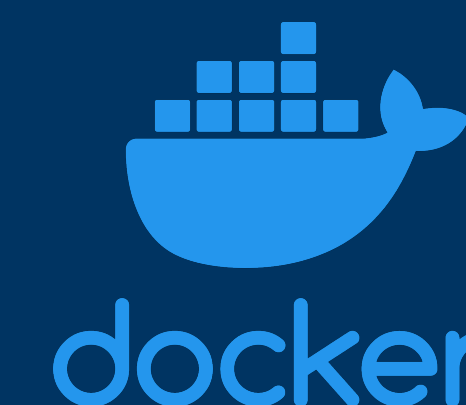
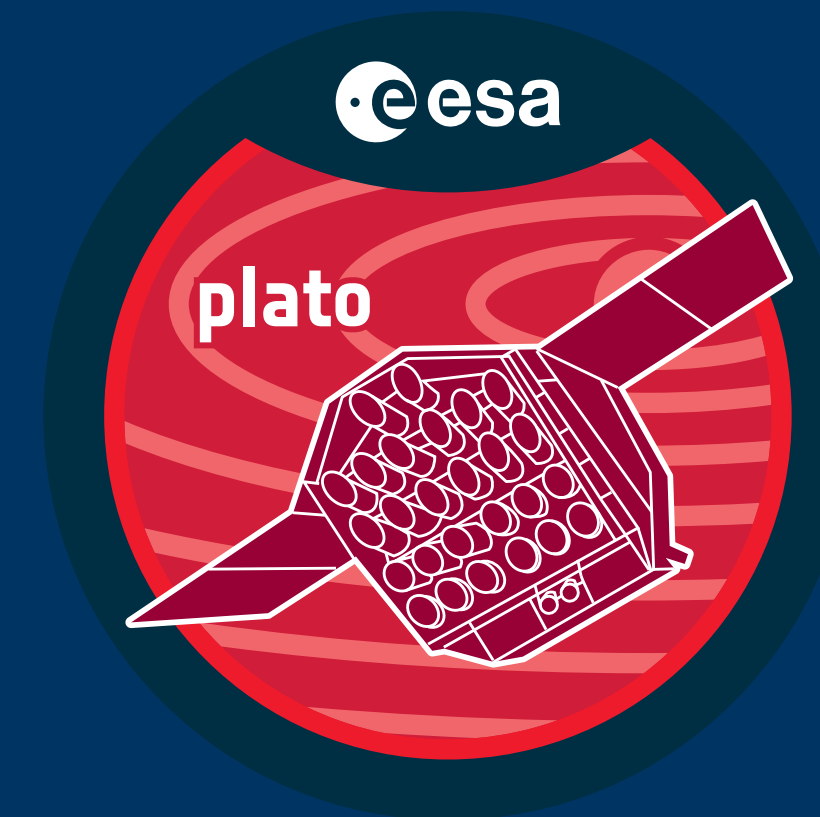
1. Outlier rejection not applied
  1. Detected but not addressed
2. ~50% of 24 camera P1 data missing
  1. Multiprocessing issue on KU Leuven cluster
3. CBVs extracted at 25s cadence didn't capture low amplitude trends
  1. Binned to 600s, extracted CBVs and then interpolated CBVs to 25s
4. P5 data mask updates not applied
  1. Redoing P5 sims
5. PlatoSim & L1 pipeline still under development
  1. Adding features, fixing bugs etc



# PlatoSim Power Spectrum Analysis - P1 sample



# Docker Wrapper for PlatoSim + L1 Pipeline

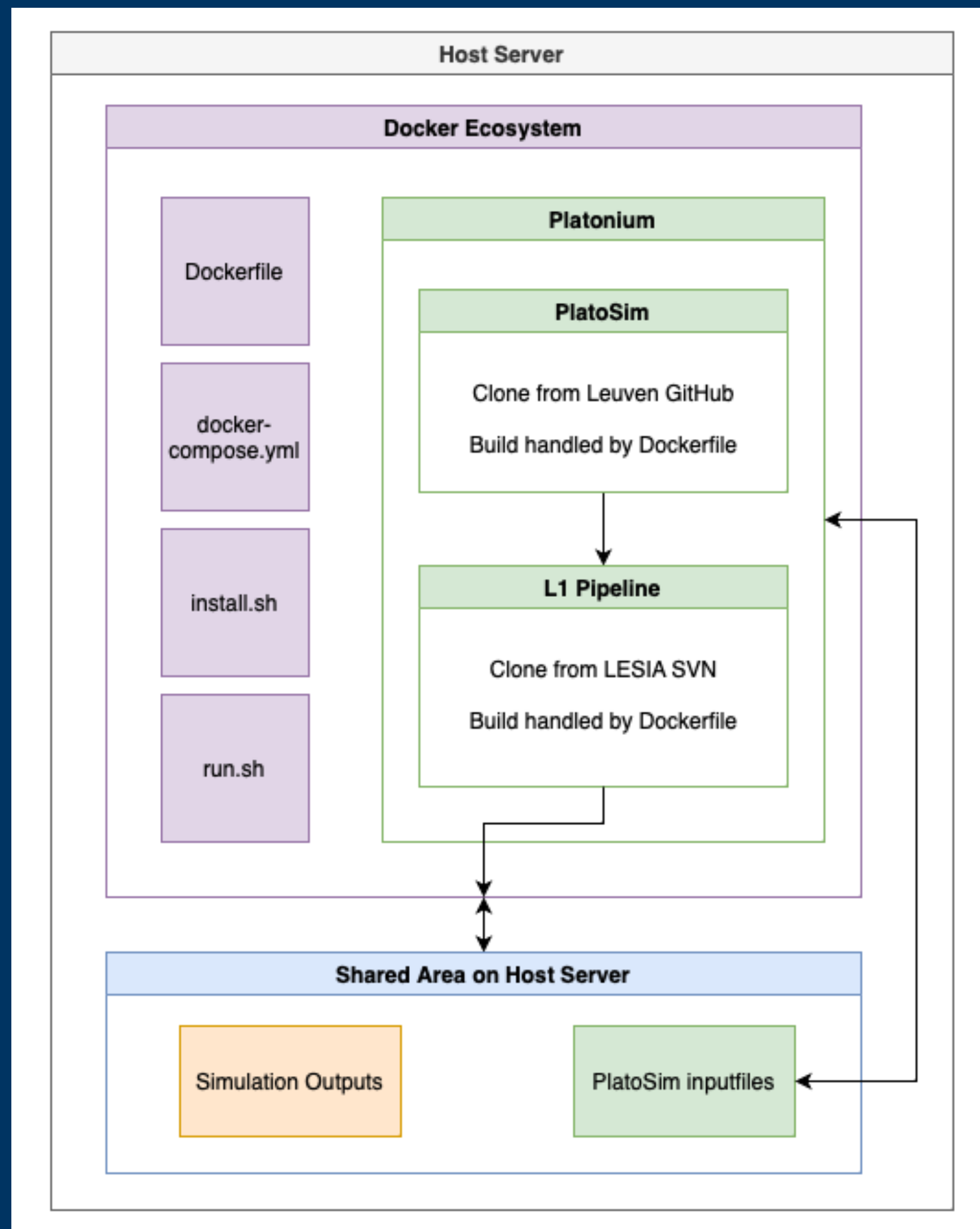


## Building a Docker image

1. Clone my `docker_ecosystem` repo, then inside:
  1. Clone PlatoSim3 repo
  2. Checkout L1 pipeline LESIA SVN
2. Edit `docker-compose.yml`
  1. Add PATH for shared area to mount inside container
  2. PlatoSim + L1 pipeline products saved here
3. Run `install.sh` to build Docker image
  1. Ubuntu image
  2. Poetry python install matching PlatoSim + L1 requirements
  3. Linux library requirements
  4. All environment variables set

## Running a simulation with L1 photometry

1. Configure your PlatoSim `inputfile.yaml`
2. `Platonium` (N. Janssen):
  1. Calls PlatoSim to generate imagerettes
  2. Calls L1 pipeline for PSF (P1) or Aperture (P5) photometry
3. Results saved to mounted area on Docker host.



```
$> platonium <star_id> <cam_id> <group_id> <quarter_id> <project> <sample> <varfile>
```

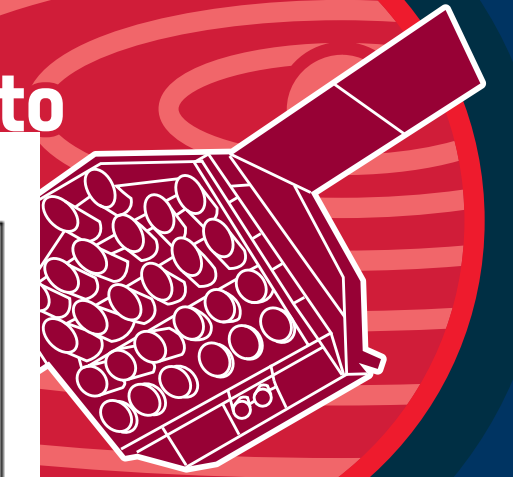


Thanks, questions?

# Multi-quarter Stellar & Transit Signal Injection

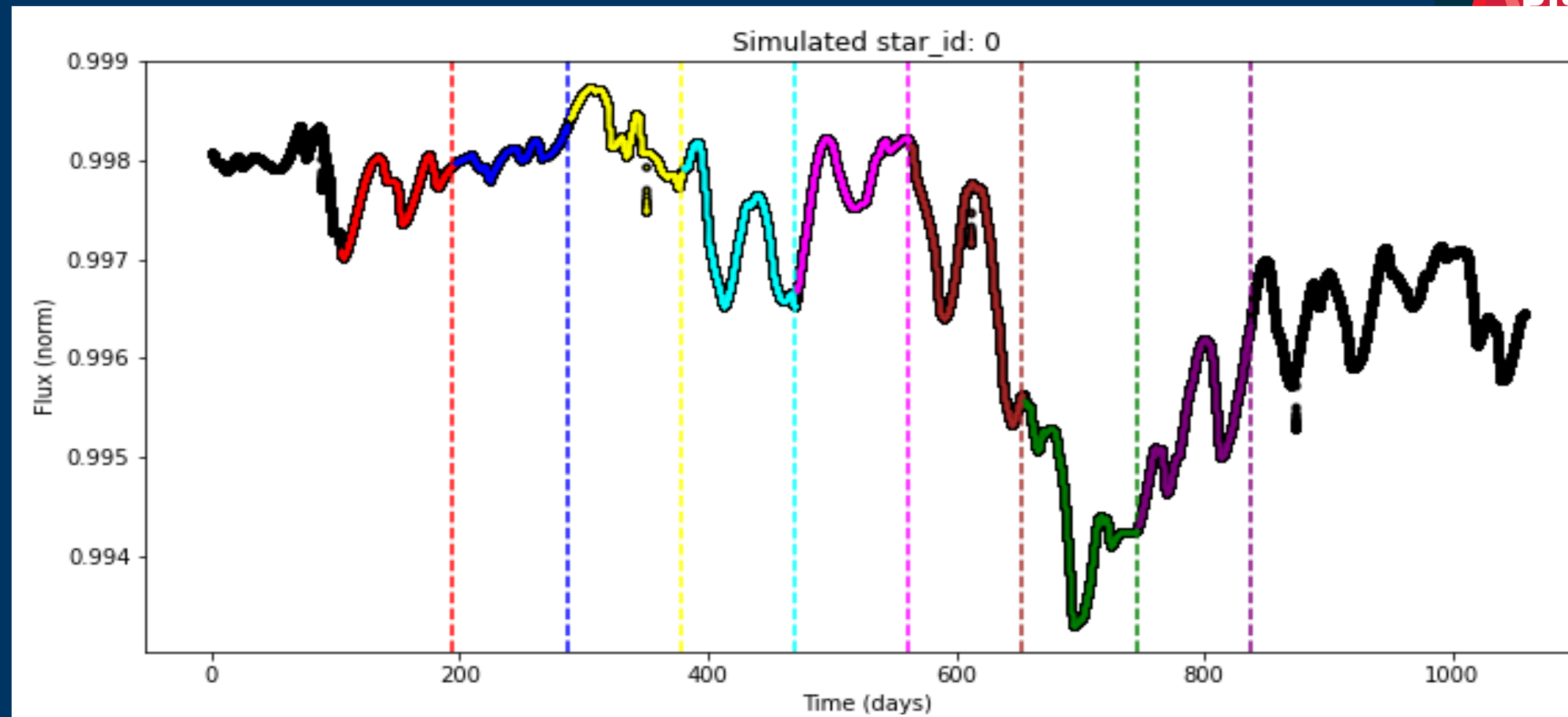


plato

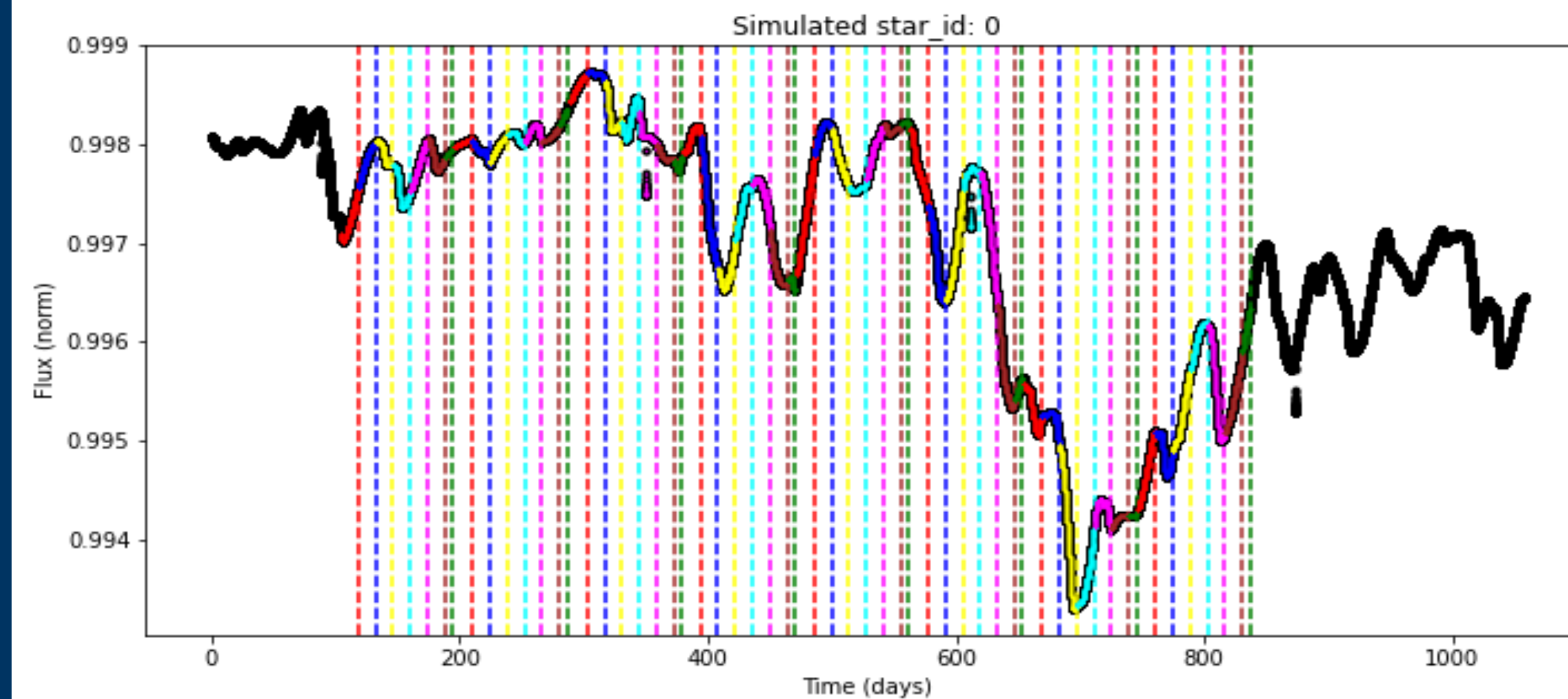


- Signals simulated by S. Aigrain (Oxford)
- 1250 stars
- 3 years duration
- 10 mins cadence
- 1-3d gaps between quarters
- Real stellar signals from modelling active regions etc.
- Many injected transit signals

Randomly selected slices to inject into PIS/PSLS light curves



bm injection



ubm injection

# PDC-MAP vs PLATO Republic



Exploit the multi-camera approach in PLATO knowing that **the stellar signal is common across all the cameras**, while the systematics in each camera are *expected* to be different.

## How PDC-MAP works

- Treat each **camera** individually
- Compare every star to every other star
- Assumes systematics dominate the variance in the data of quiet stars
- **Tends to remove any systematics on timescales similar to the duration of a segment.**

## Whereas Republic

- Treats each **star** individually
- Compare the light curves from different cameras
- Model the stellar signal alongside the systematics
- **Signals common across the multiple cameras for a given star will tend to be preserved (regardless of timescale)**
- Several flavours of Republic, focused on version 1 so far

Republic developed by Suzanne Aigrain and Oscar Barragán, University of Oxford



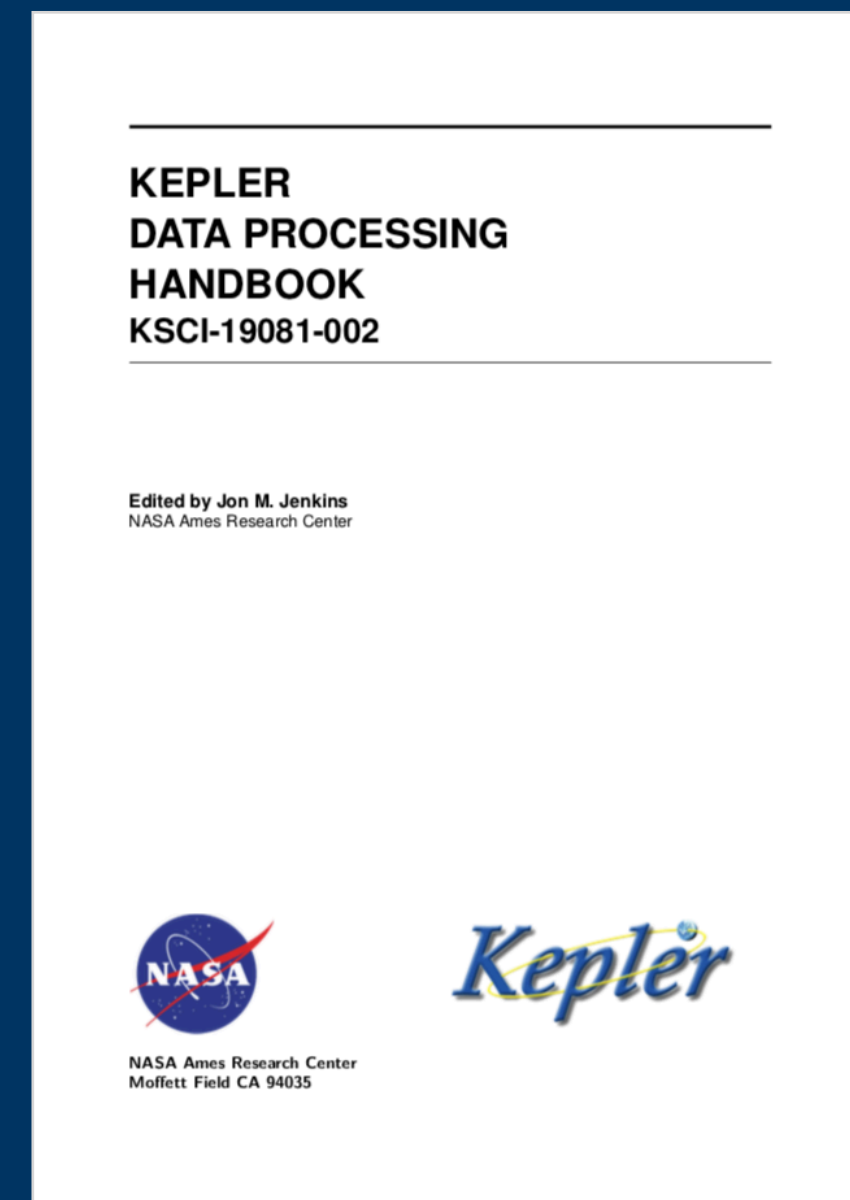
# PLATO P-samples

Sample	target <i>V</i> mag	noise ppm in 1 h	type	no targets	sampling sec	data
P1	≤11	≤50	F5-K7	≥15 000	25	imagerettes
P2	≤8.5	≤50	F7-K7	≥1 000	25	imagerettes
P4	≤16		M	≥5 000	25	lightcurve/imagerettes
P5	≤13		F5-K7	≥245 000	600	lightcurve
including:				≥10 %	50	lightcurve
				≥5 %	50	centroids
				≥9000	25	imagerettes

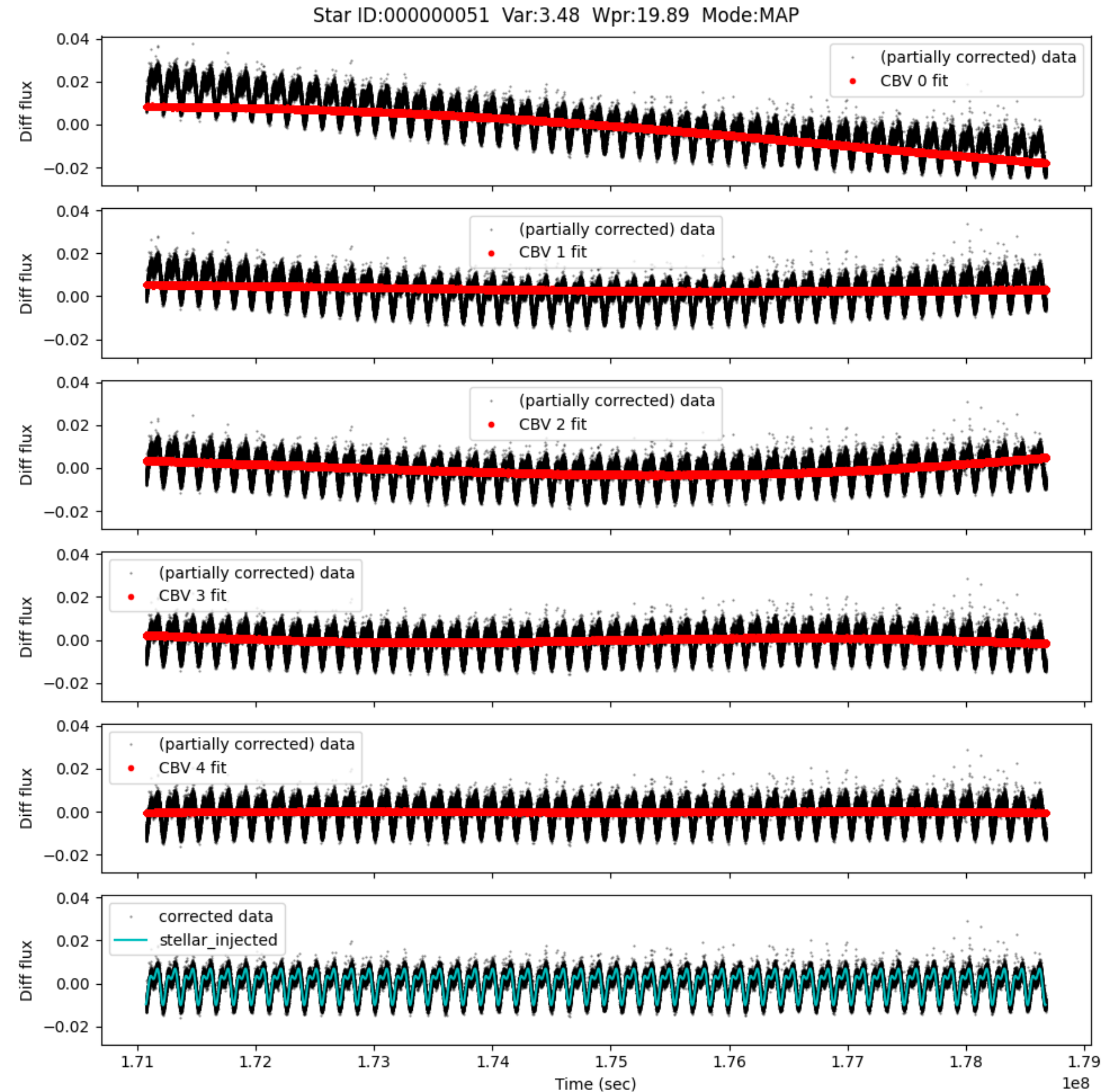
**Table 3** Summary of PLATO stellar sample requirements on dwarf and sub-giant targets.

**Detrending:** removal of low frequency trends via an arbitrary filter, leaving only high-frequency content

**Cotrending:** the projection of systematic effects' time series from a target light curve algebraically



# RoAP Stable Calibrator



# MERGED LIGHT CURVES

## 24 cameras

## 18 cameras

## 12 cameras

