

CHEOPS T&S WORKING GROUP 2 – DATA ANALYSIS

CHEOPS AO-3

Long-term photometric stability and transit stacking



Motivation

- This slide set illustrates the current state of knowledge of the CHEOPS Data-Analysis working group concerning the long-term inter-visit stability of CHEOPS.
- Much of what we know is based on the single study of WASP-76 illustrated in the slides that follow.



The "Ramp"

- The shape of the defocussed CHEOPS PSF affects the extracted flux.
- The PSF shape varies with the temperature of the telescope tube assembly, measured with the *thermfront2* temperature sensor in the tube.
- This variation is rapid after a pointing change, and has an orbital modulation component.
- For a given target there is also a slow annual variation with Sun angle.
- The following slides illustrate the single-visit and annual effects for WASP-76 (magnitude G = 9.4).





Long-term inter-visit stability of CHEOPS using WASP-76

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and CHEOPS data-analysis working group



WASP-76: long-term flux trend

- Key:
 - Small grey dots:flux for each extracted frame,
 - Red discs: flux averaged per orbit, and
 - Black discs: flux averaged per visit.
- There is a clear negative trend with time.





WASP-76: thermfront2 sensor trend

- Key:
 - Small grey dots:flux for each extracted frame,
 - Red discs: flux averaged per orbit, and
 - Black discs: flux averaged per visit.
- There is a clear positive trend of tube temperature with time.





"Ramp" decorrelation

- With no decorrelation the RMS is unlikely to exceed 1 part per thousand (1000 ppm) at a single location at G = 9.4.
- Decorrelation against the thermfront2 temperature sensor reading is effective and is implemented in pyCHEOPS.
 - https://ui.adsabs.harvard.edu/abs/2021MNRAS.tmp.3057M/abstract
- Decorrelation against the U2 basis vector in PIPE* data products is equally effective.
- Using this methodology, 100 ppm RMS has been achieved at G = 9.4 over 70 days at single location.
- The following slides illustrate the linear dependence and the long-term photometric stability for WASP-76 after decorrelation.

* PIPE is a PSF photometric extraction package that models the PSF shape using principal component analysis. The PSF shape correlates with temperature, so the basis vector coefficients U1, U2, ... can be used for decorrelation.





The plot shows the PSF U2 PC coefficient vs. extracted flux for every data point of all visits. There is a clear correlation.



WASP-76 long-term data de-trended



The WASP-76 photometry de-trended with U2. No systematic trend is present. The scatter is reduced to 84 ppm over 70 days.

NB: The colour coding for the red and black discs is reversed compared to previous plots; red is here the visit average and black the orbit average.



Caveats

- Long-term photometric stability has never been part of the CHEOPS mission specification.
- The conclusions in this slide set are based on a single long-term study of one target, at a single PSF location on the CCD.
- The PSF location can be changed at any time for operational reasons. *This is not under user control.*
- The shape of the PSF, and hence the photometric zero point, varies strongly over the CCD area.





SNR advantages of transit stacking

CHEOPS data-analysis working group



Stacking multiple transits

- How does the SNR of the transit-depth measurement depend on the number of transits combined from multiple visits?
- The answer depends on
 - Interruptions
 - Target brightness
 - Correlated noise

pyCHEOPS multi-visit mode

• Resources:

- Documentation in the pyCHEOPS
 Cookbook
 - Section 5.5: Fitting your Data Multiple Visits
- Tutorial demonstrations in pyCHEOPS tutorial examples
 - WASP-189.ipynb: secondary-eclipse stacking with MultiVisit.

PYCHEOPS Cookbook v1.0

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Note: For the construction of this cookbook $\ensuremath{\mathtt{PYCHEOPS}}$ was successfully installed and run using Ubuntu 18 and Python 3.6.

Abstract

The purpose of this document is to provide users of *CHEOPS* data with information on the PYCHEOPS Python module. This cookbook details PYCHEOPS dependencies and installation, how to download *CHEOPS* data, and several data analysis recipes. Therefore, this document can be used as a walkthrough of obtaining and analysing *CHEOPS* data, or as a reference guide of PYCHEOPS.

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"Rules-of-thumb"

- Improved coverage of ingress and egress across multiple visits => SNR of transit depth will increase faster than sqrt(N) initially.
 - Significant advantages from stacking, particularly for low-efficiency observations.
- If observations are photon-limited, SNR will tend to sqrt(N) subsequently.
- For bright targets, SNR will eventually be dominated by correlated (astrophysical) noise
 - No advantage in further stacking beyond gap-filling.
 - Multiple visits allow better detrending of spacecraft systematics.



Summary of recommendations

- Long-term monitoring can be undertaken entirely at the applicants' risk.
- With no decorrelation the RMS is unlikely to exceed 1 part per thousand (1000 ppm) at a single CCD location at G = 9.4.
- Decorrelation against *thermfront2* in pyCHEOPS or U2 in PIPE can achieve 100 ppm RMS at G = 9.4 over 70 days at single PSF location.
- If a change of PSF location is made during a sequence of long-term monitoring visits, we recommend modelling the light curve with a floating zero point for each PSF location.
- Stacking of multiple transits over 2 to 4 visits is generally a good idea.
 - For lower-efficiency observations more visits could be needed to reach the sqrt(N) regime
 - For higher efficiency visits this might be obtained in only a couple of light curves.