



Summer 2021
ERS PRE-LAUNCH
DATA HACKATHON

CHALLENGES IN EXOPLANET TIMESERIES OBSERVATIONS

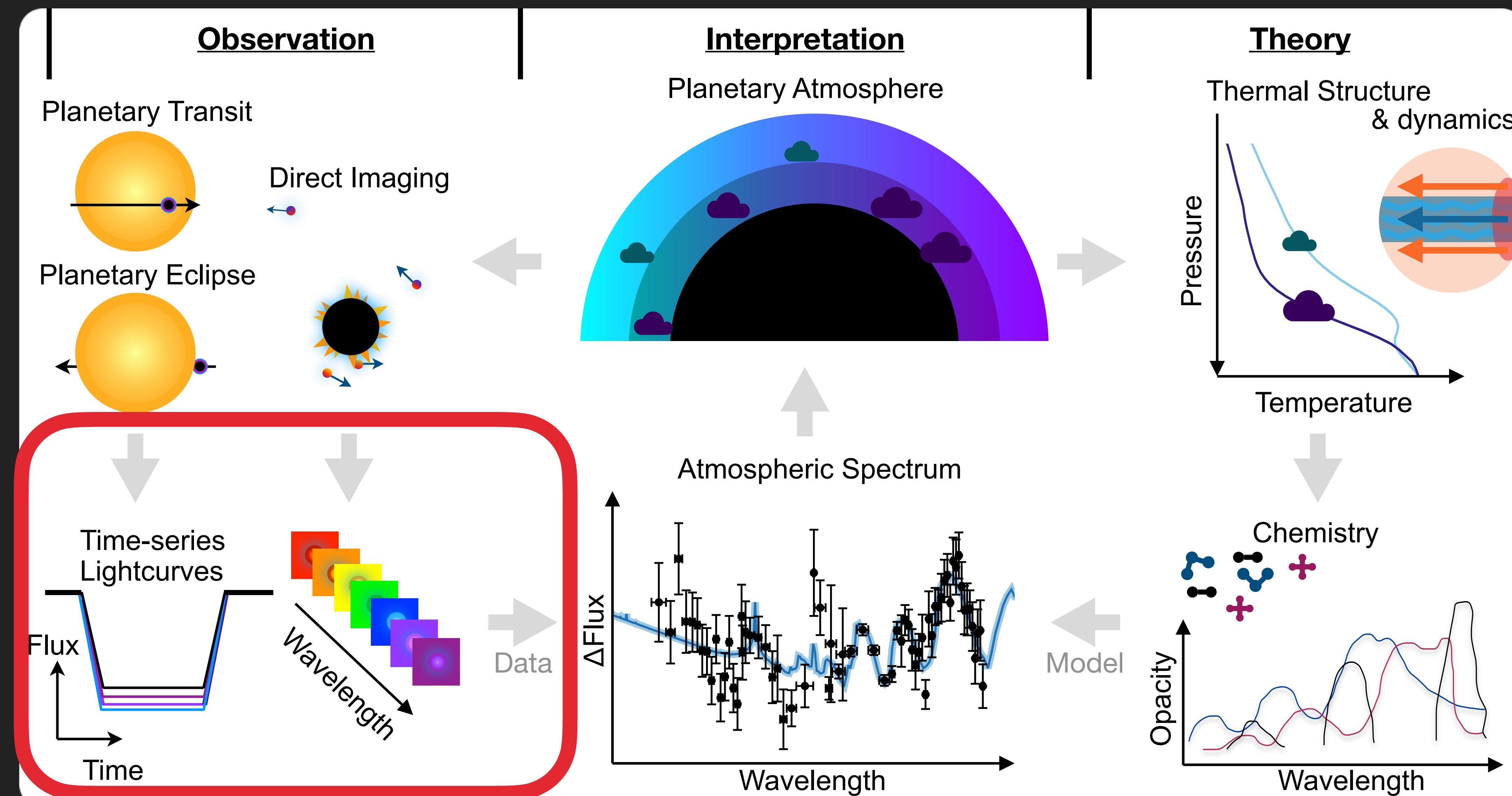
DR HANNAH R. WAKEFORD

Lecturer in Astrophysics

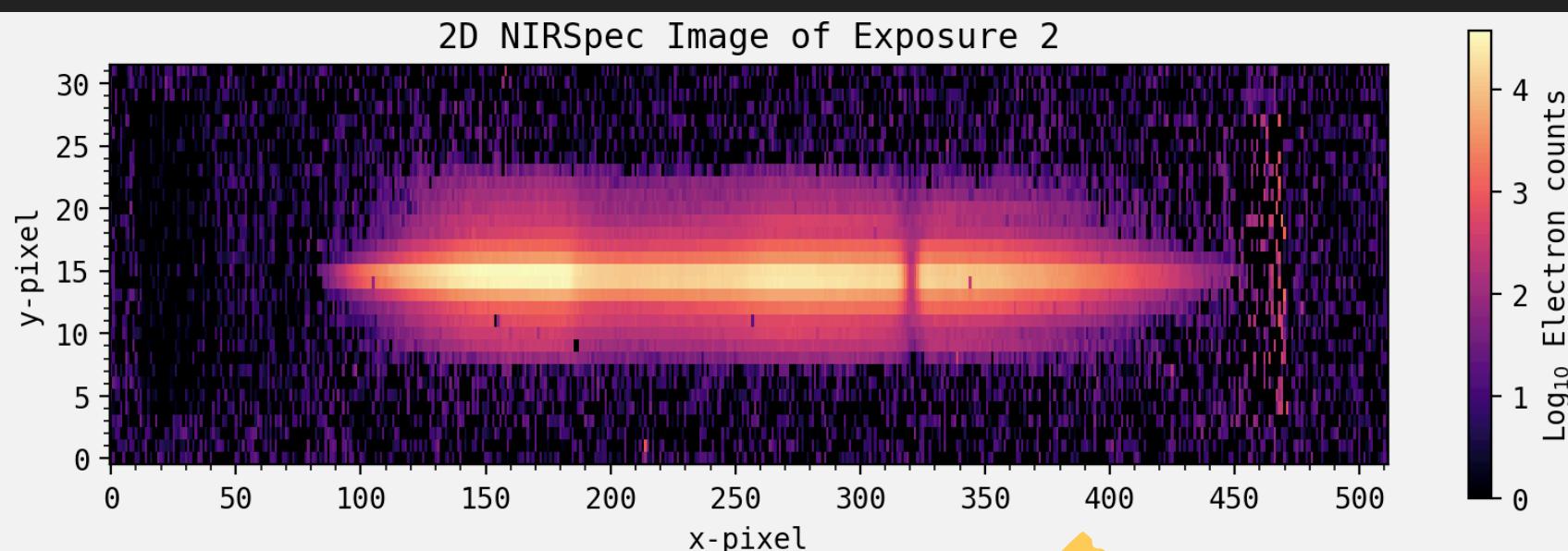
University of Bristol



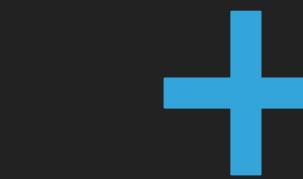
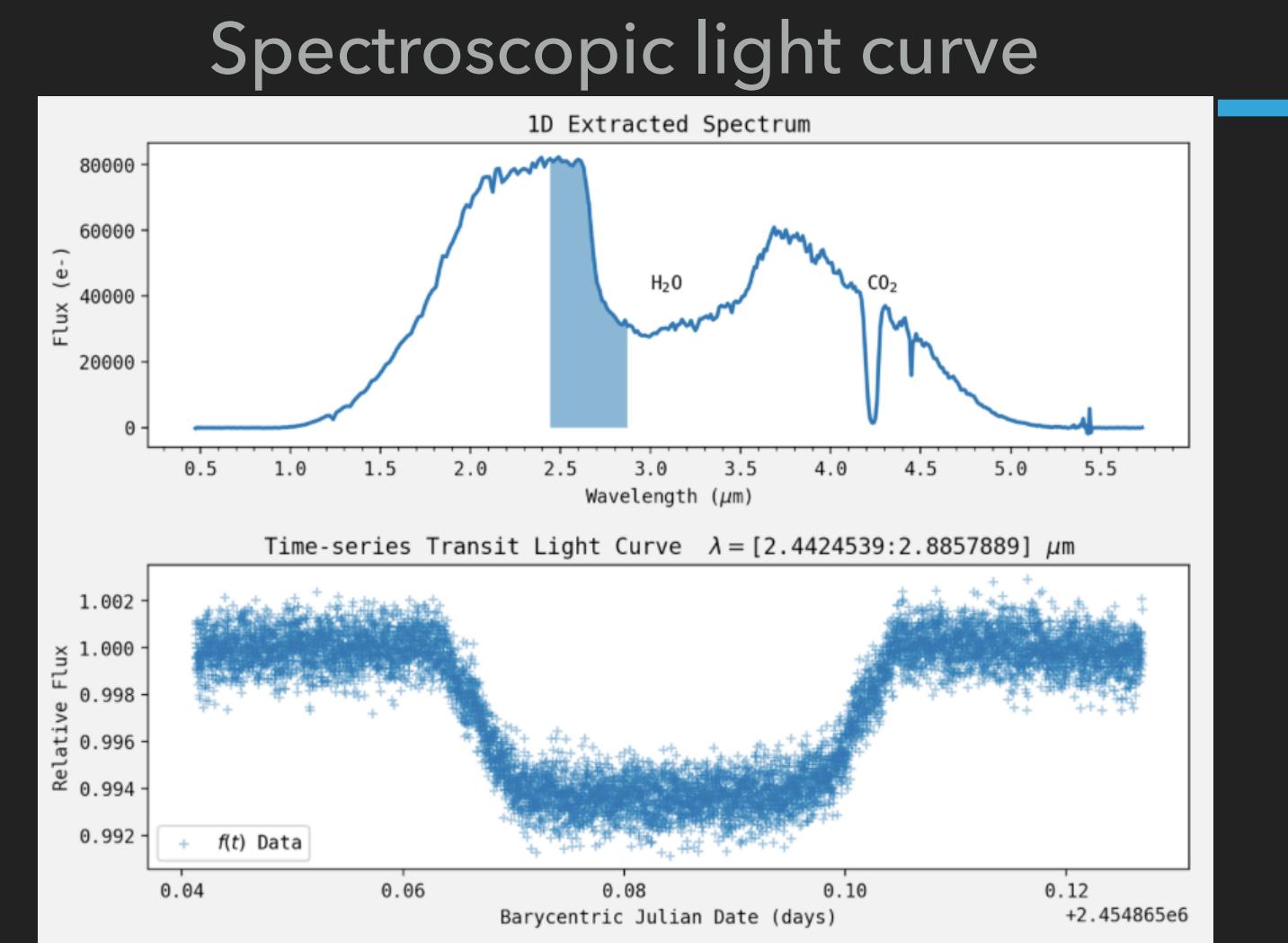
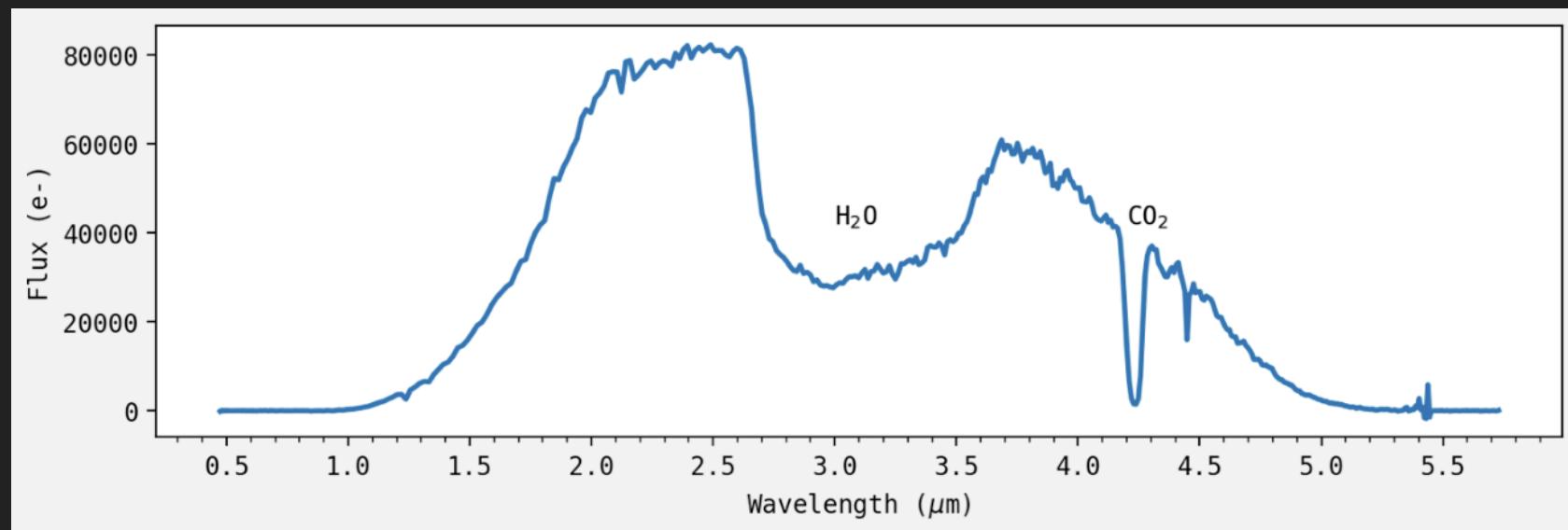
THE GOAL OF UNDERSTANDING THE ATMOSPHERES OF EXOPLANETS



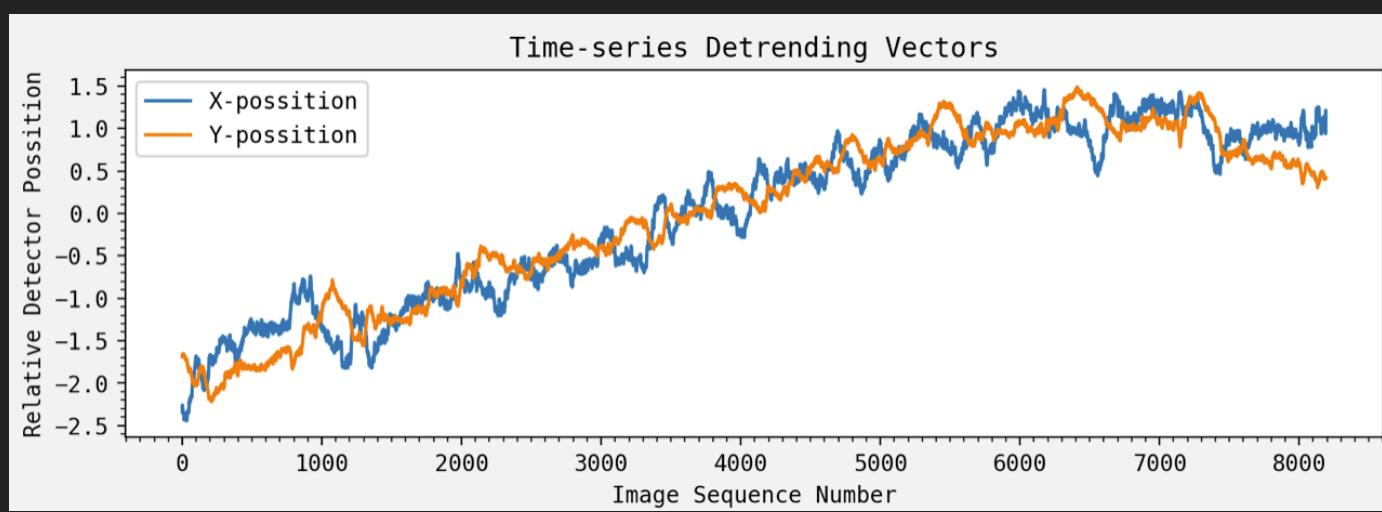
HOW TO GO FROM STELLAR TO PLANETARY SPECTRA



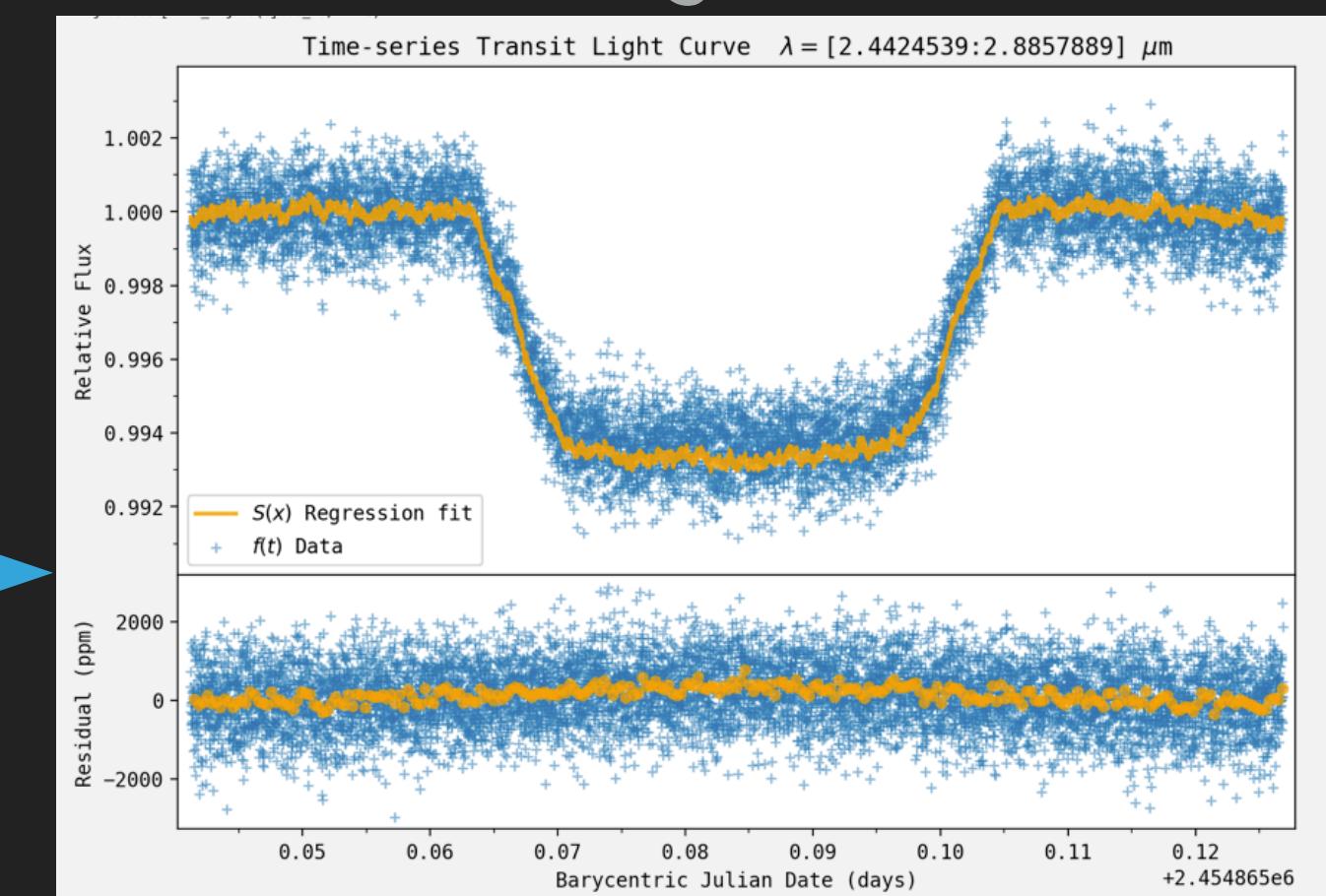
From 2D images
to
1D stellar spectra



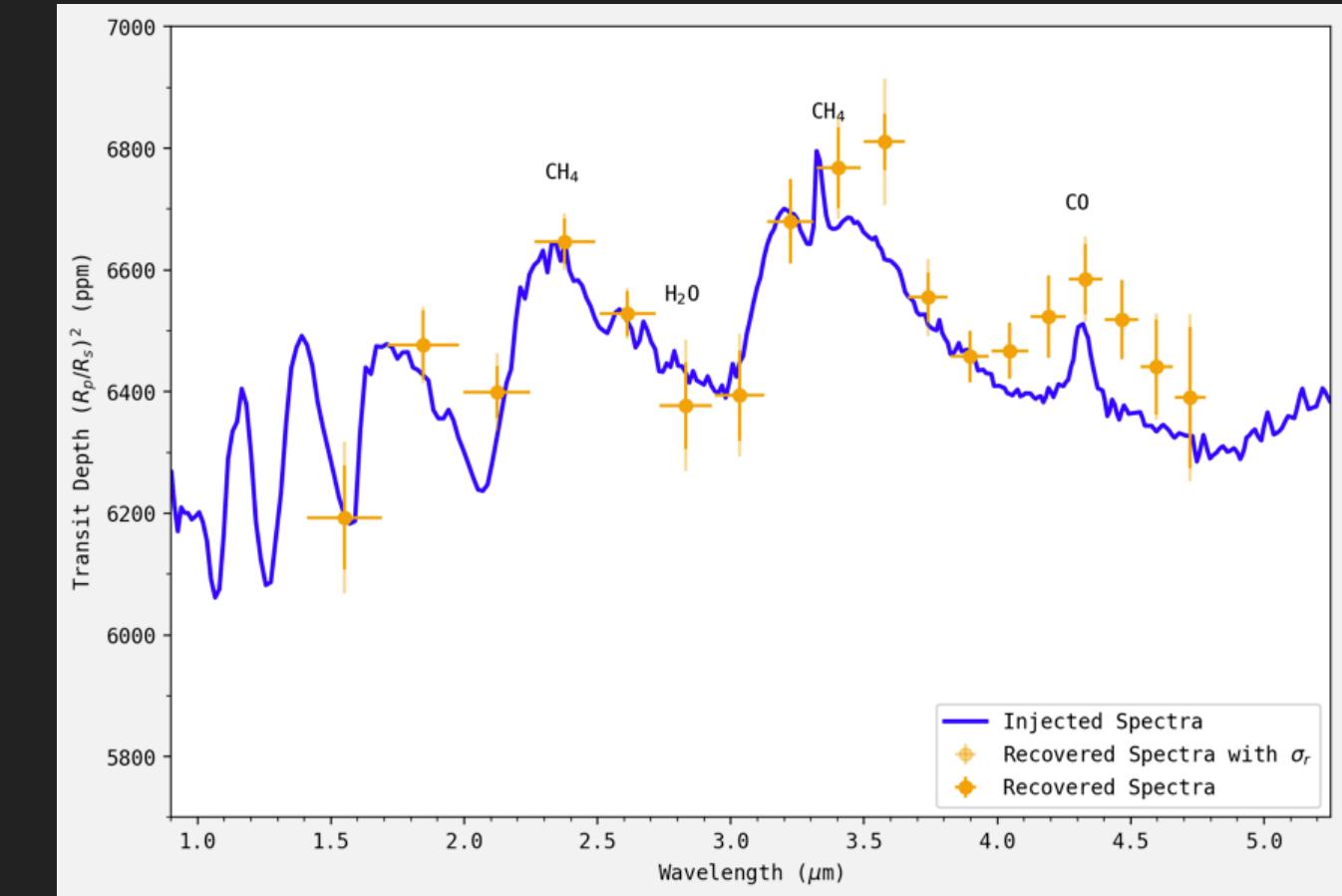
Detrending parameters



...



Planetary spectrum



WHAT WE USE TO MAKE OUR ATMOSPHERIC MEASUREMENTS

Many of the telescopes we use to characterize exoplanet atmospheres were not designed for it!

Hubble, Spitzer, and even Webb were not initially designed to deal with time series data at all.

A dense field of galaxies in space, showing a variety of shapes and colors against a dark background.

They were designed for this.....

YET, EXOPLANET SCIENCE COMMAND A HUGE FRACTION OF TIME



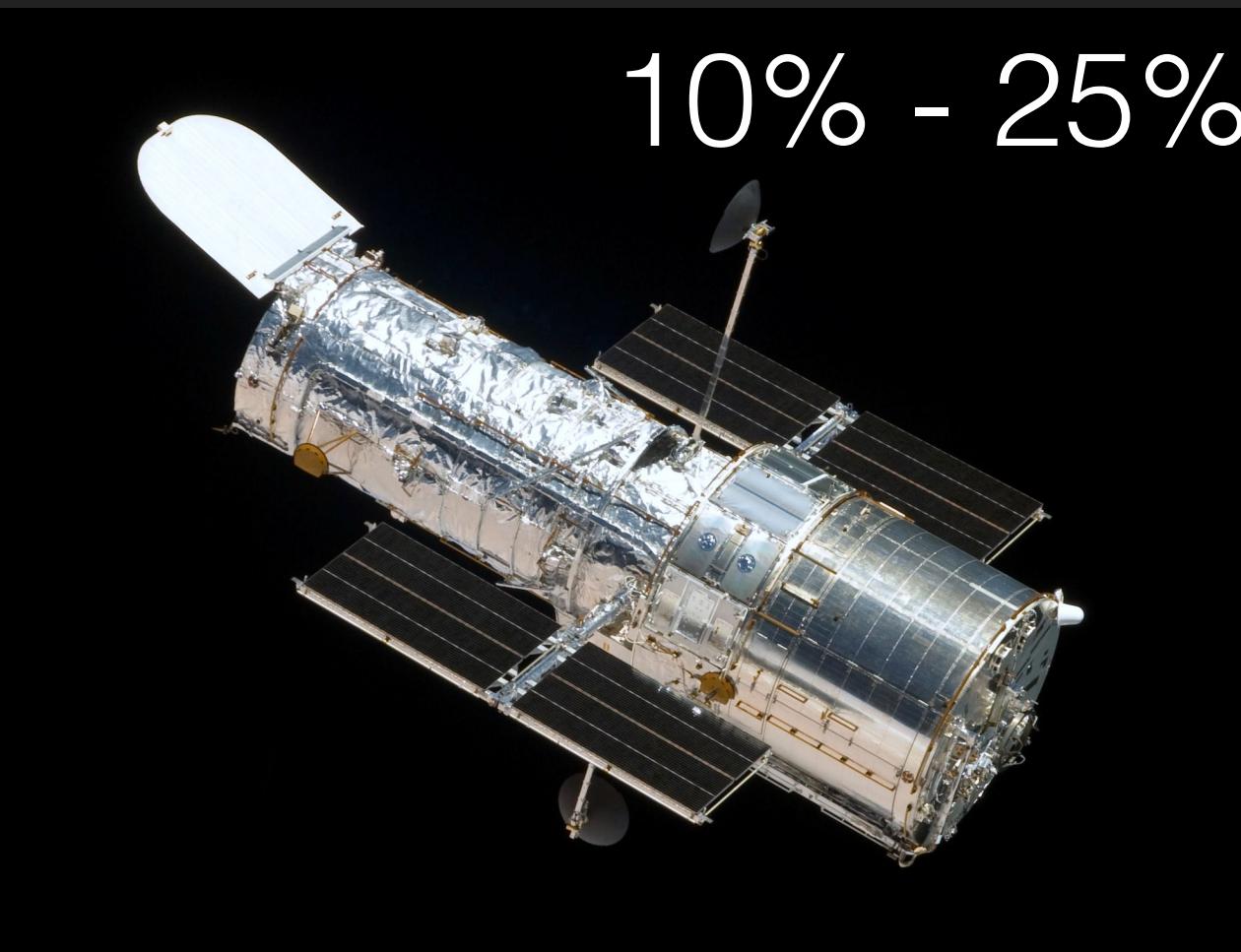
20% - 40%

No longer in operation

Conducted long >1000 hour observations

IR spectra and multi-band photometry before 2008

IR two-band photometry
warm-Spitzer

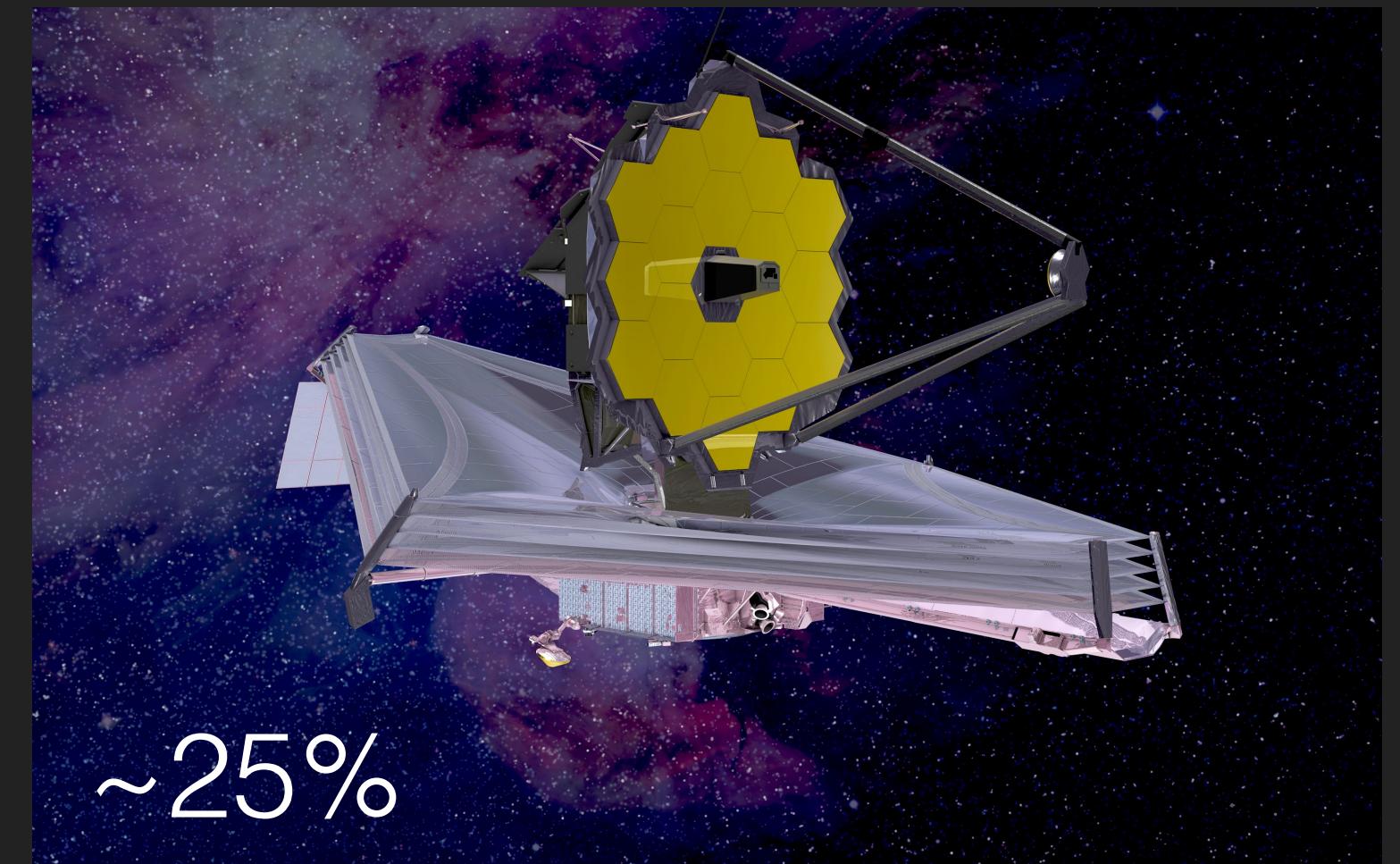


10% - 25%

Still conducting observations and is expected to last many more years.

UV to near-IR low res spectra with 3/4 core instruments used for exoplanets

UV - near-IR observations are vital for our interpretation of exoplanet atmospheres, especially their aerosols



~25%

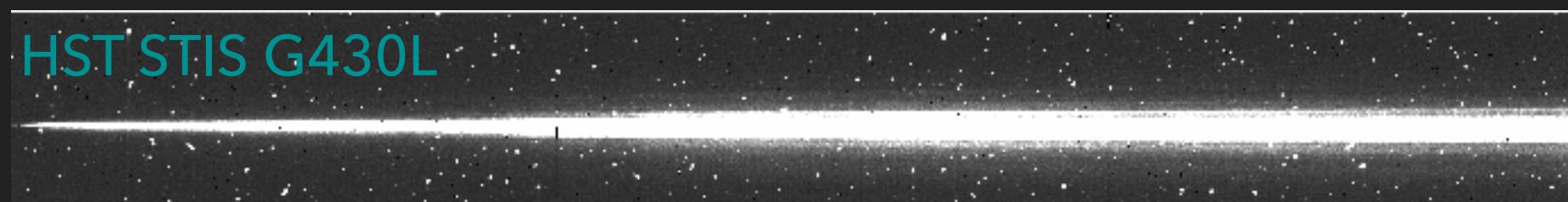
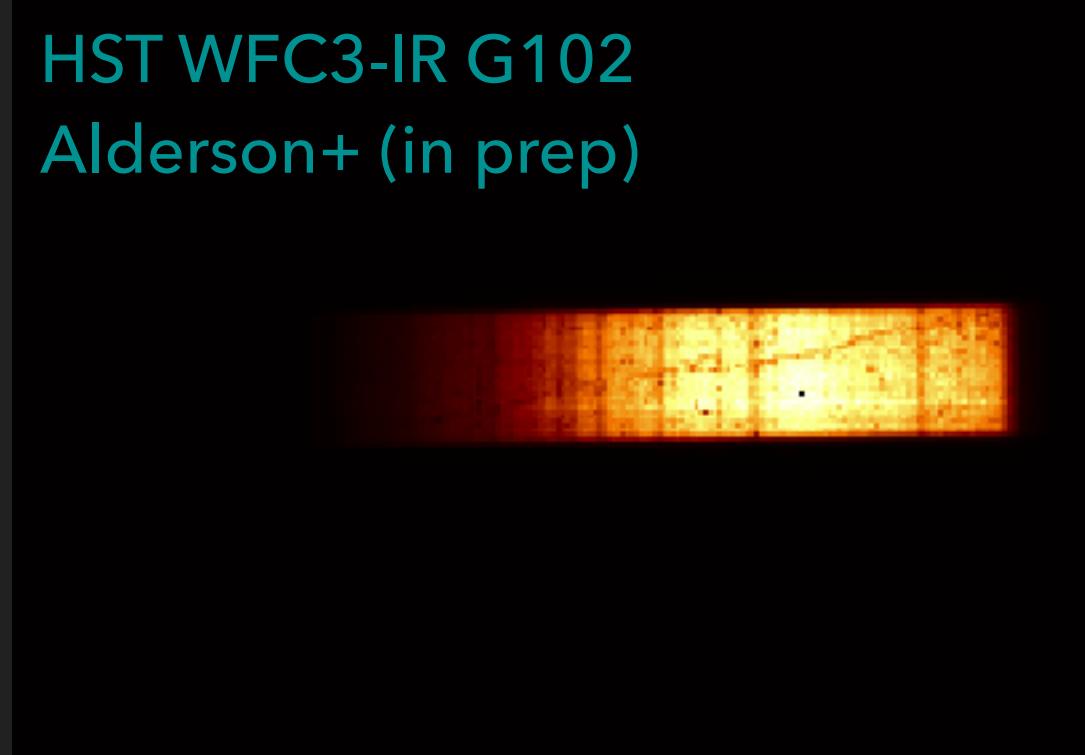
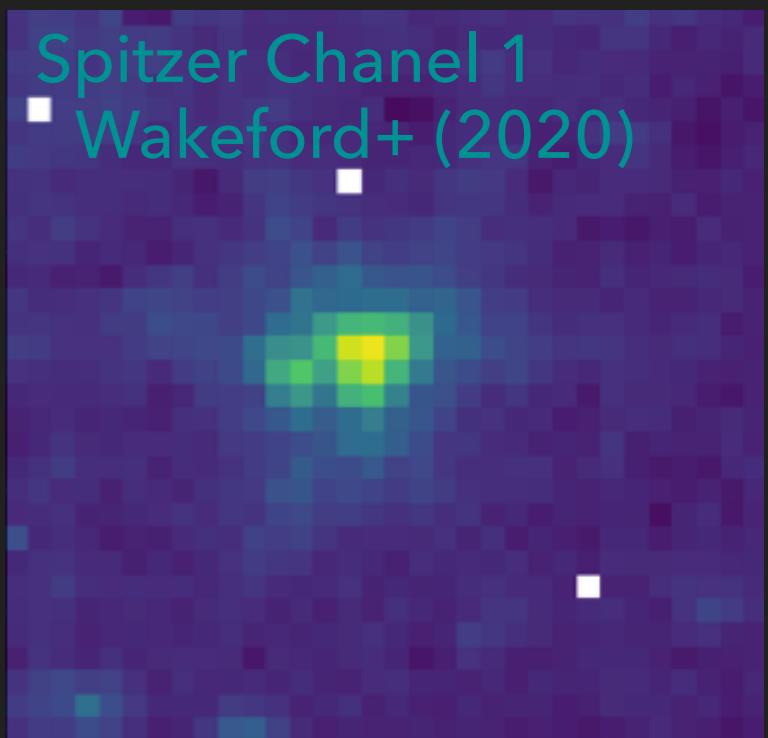
Soon to be in operation

IR from 1 - 30 microns, low to high res spec, **chronography**

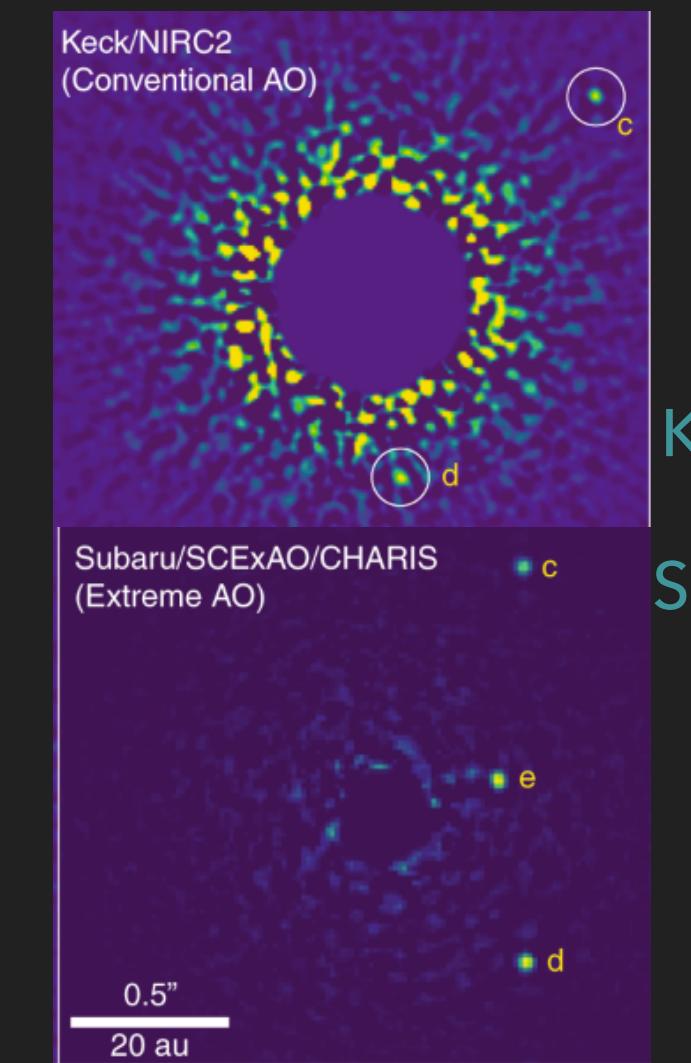
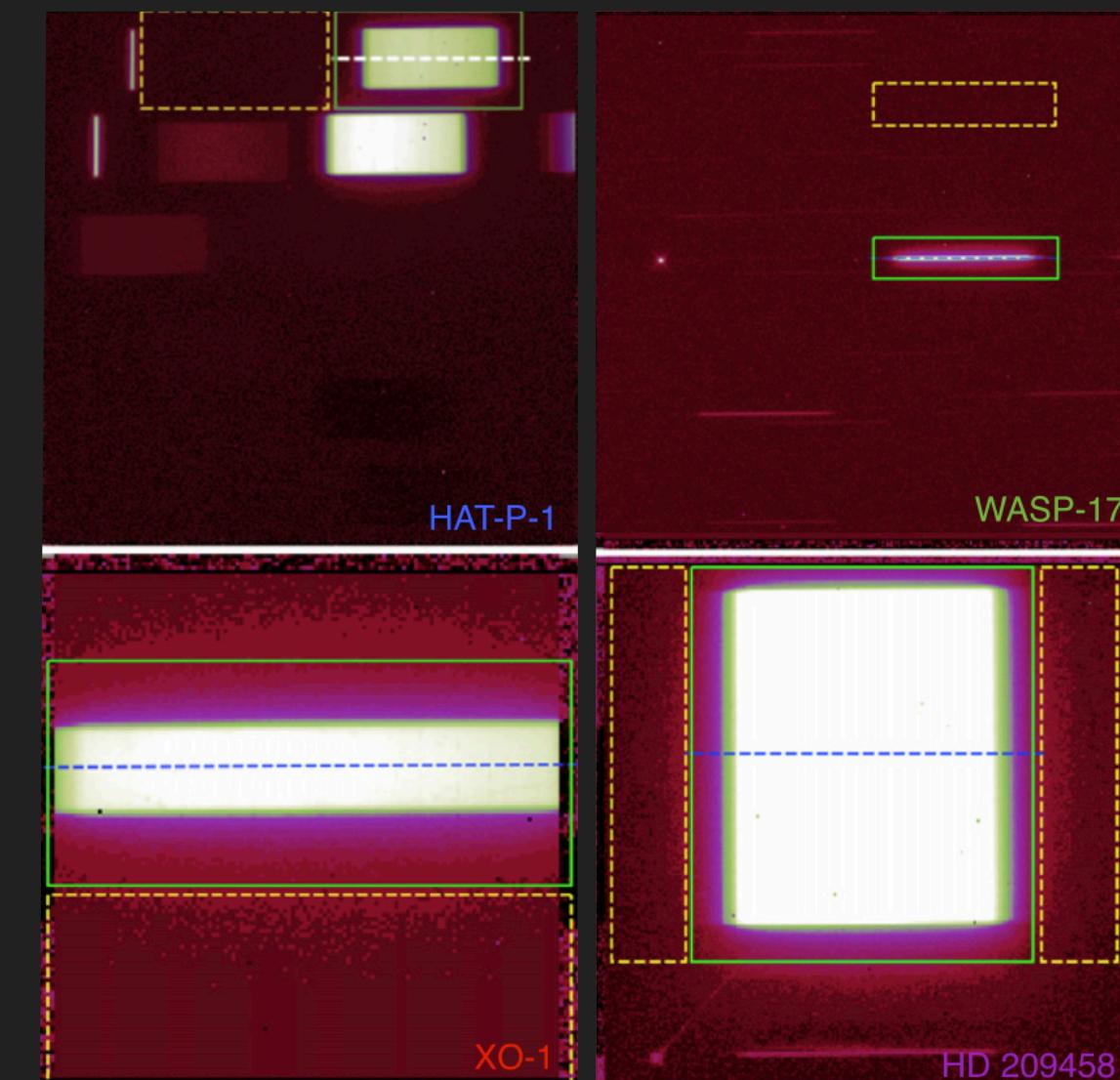
Cycle 1 proposal call showed the exoplanet community has at least a 25% stake in the future jobs of Webb

GTO + ERS + GO time is ~27% of time given out.

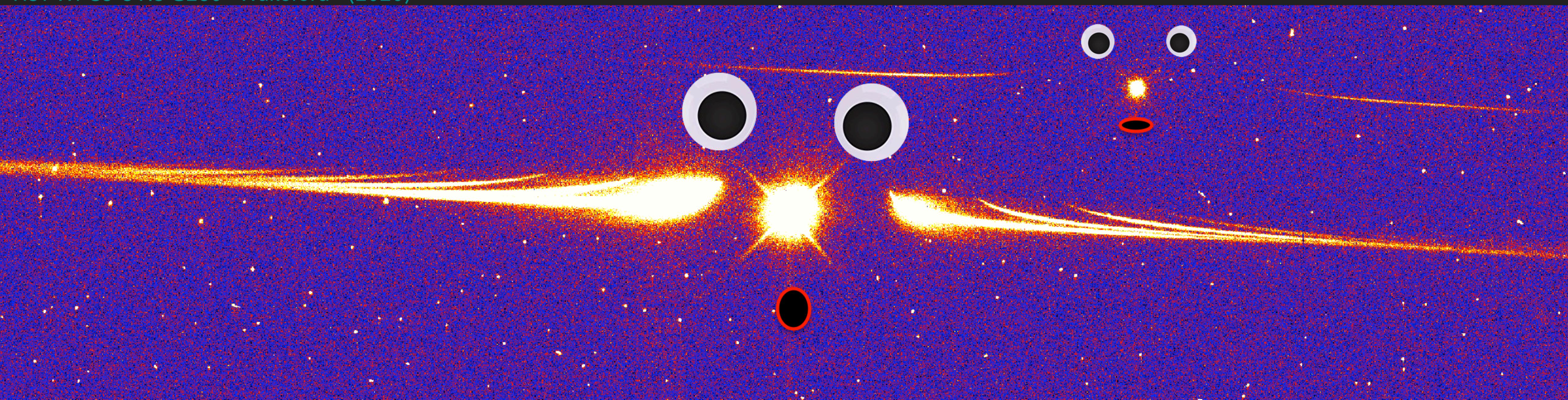
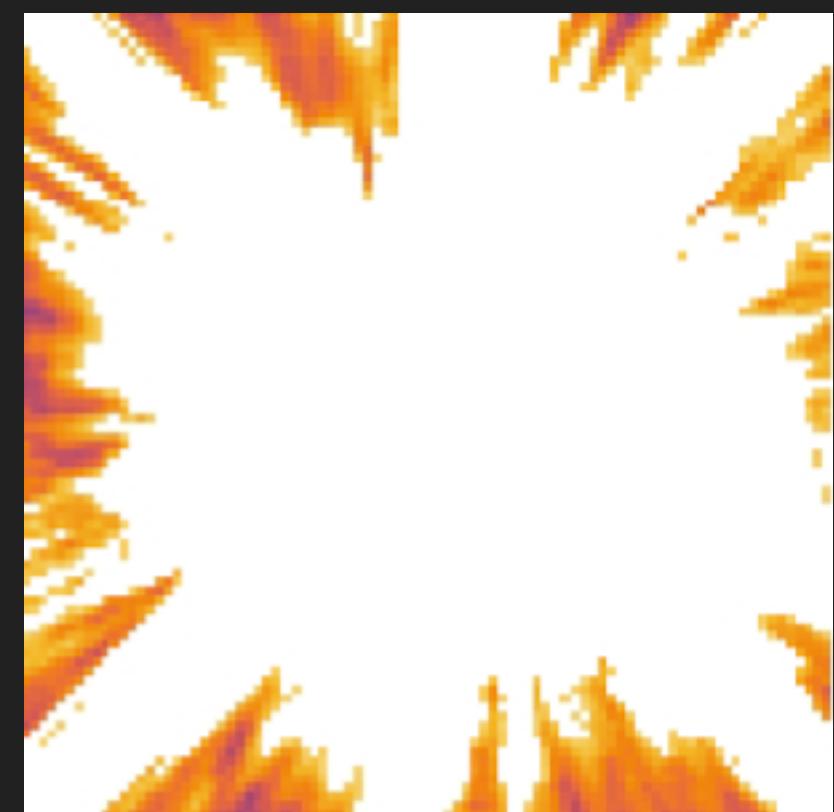
NO INSTRUMENT IS ALIKE...



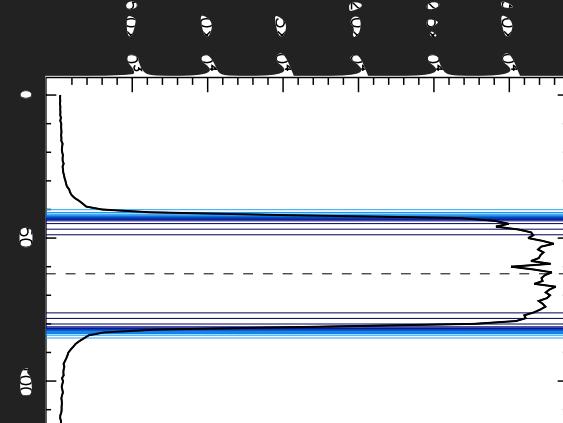
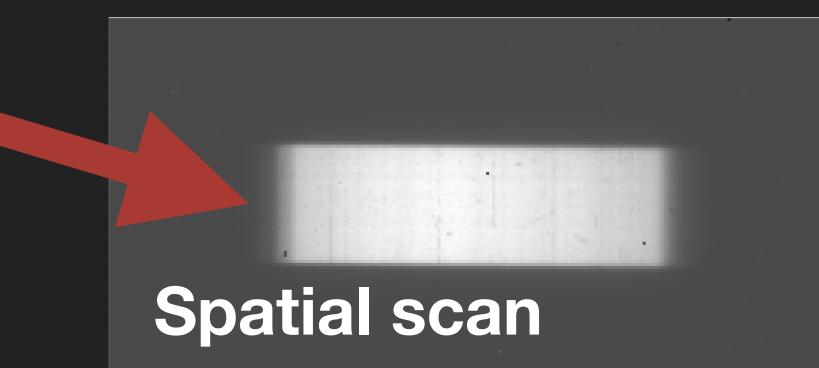
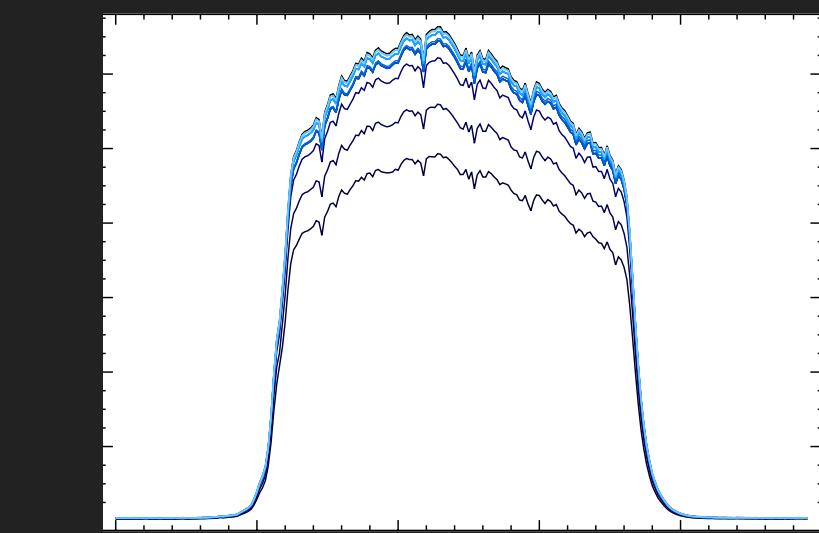
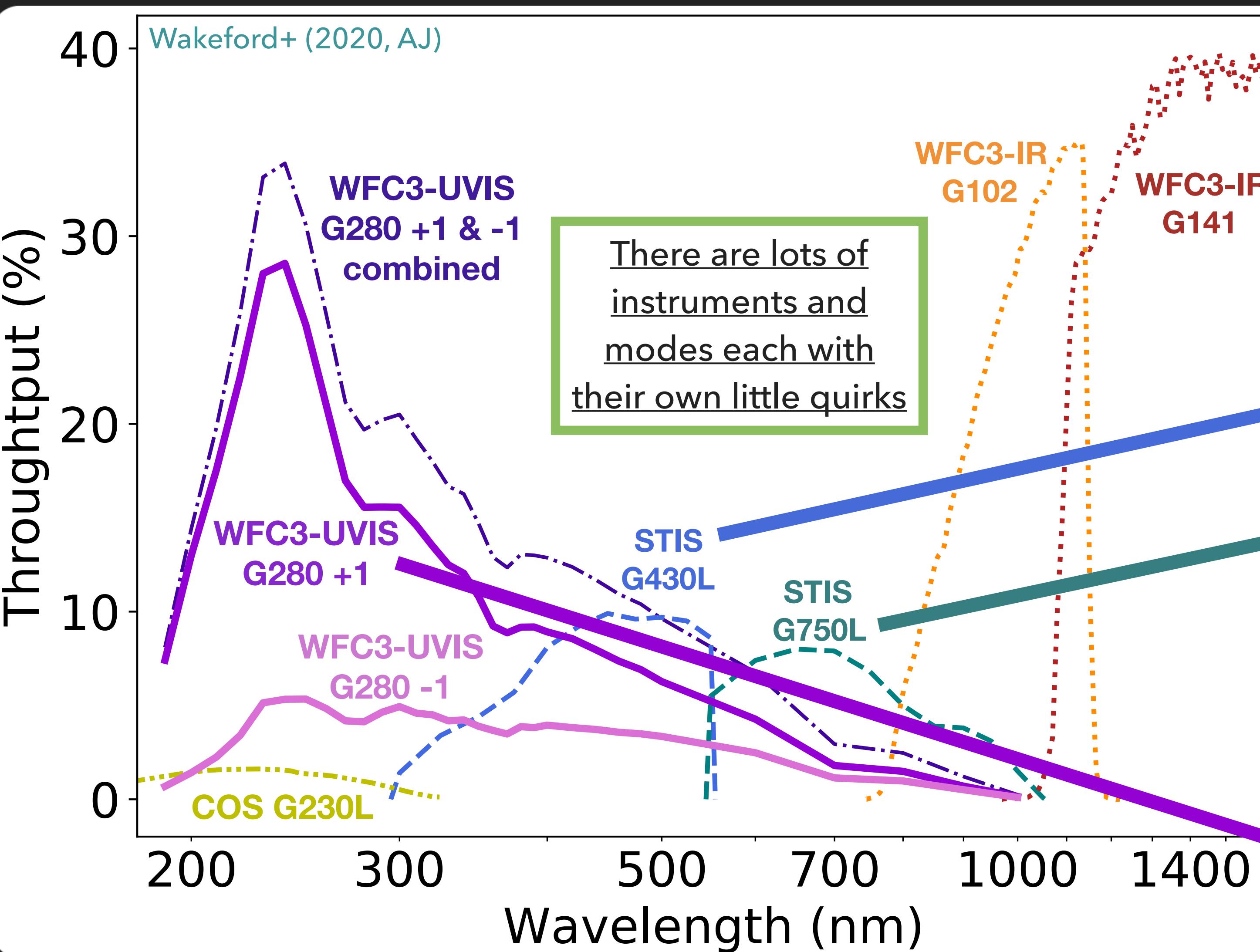
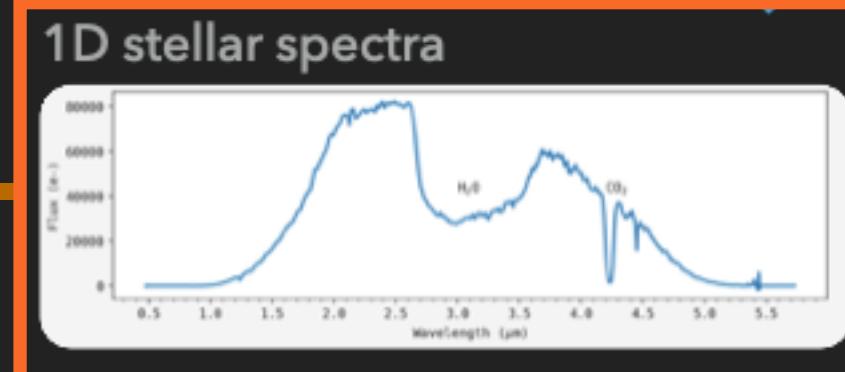
HST WFC3-UVIS G280 Wakeford+ (2020)



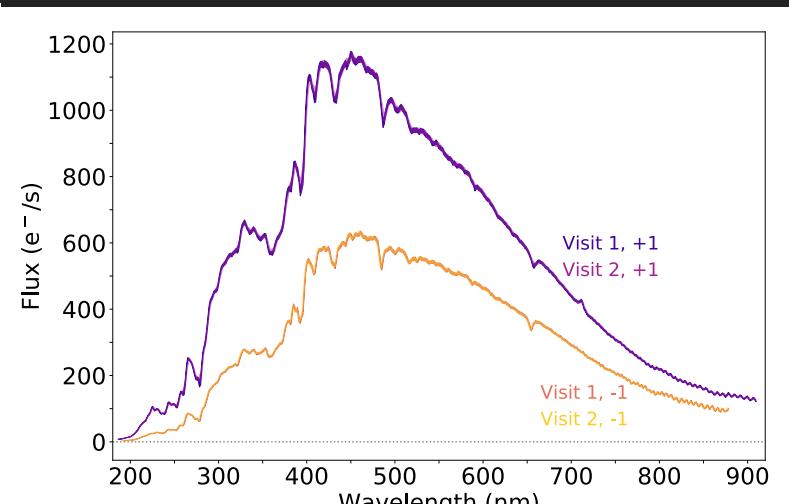
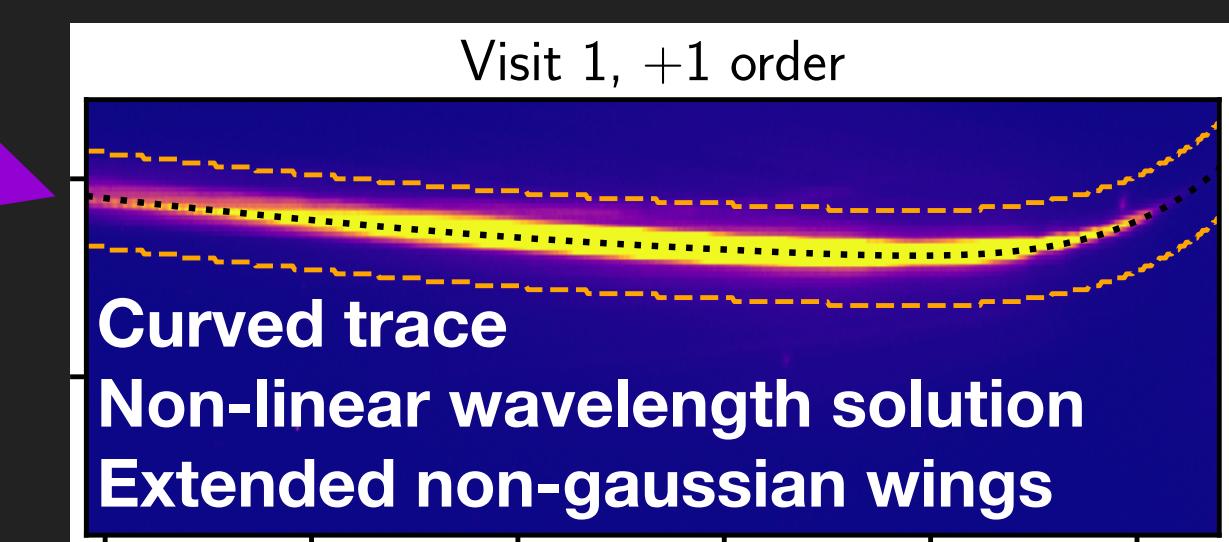
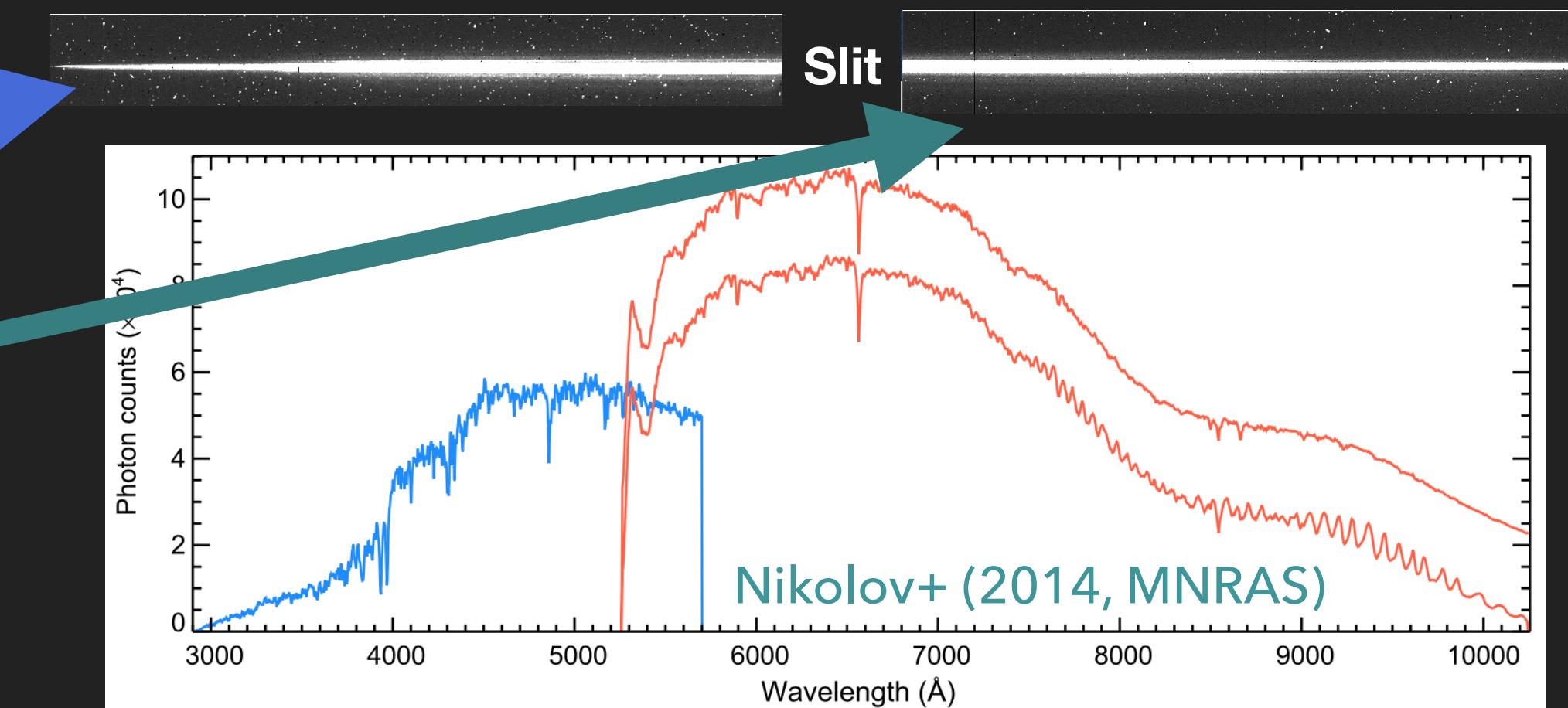
Currie (2019)



LEARNING FROM HUBBLE

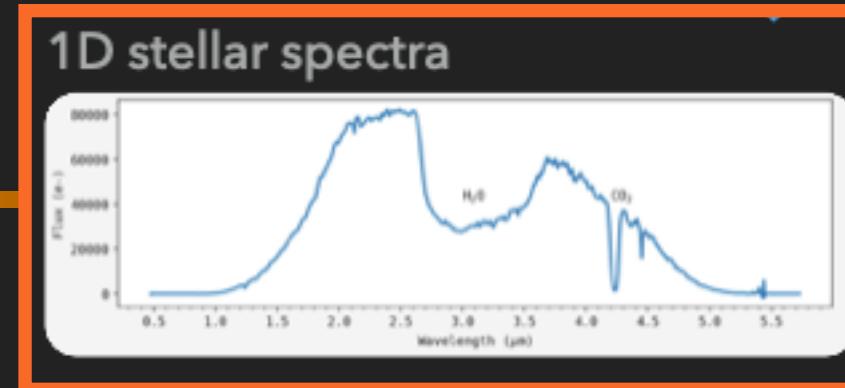


Wakeford+ (2013, MNRAS)

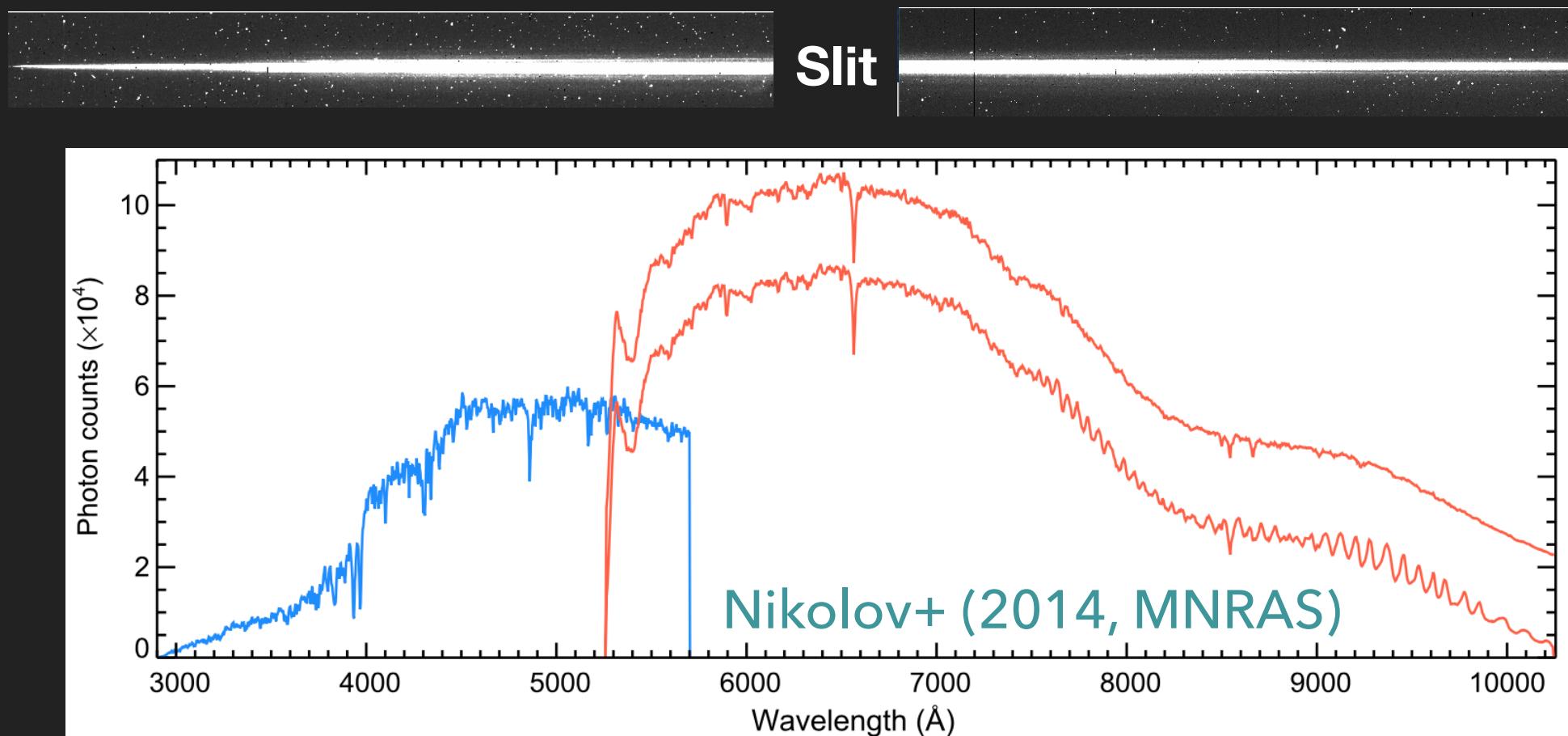


Wakeford+ (2020, AJ)

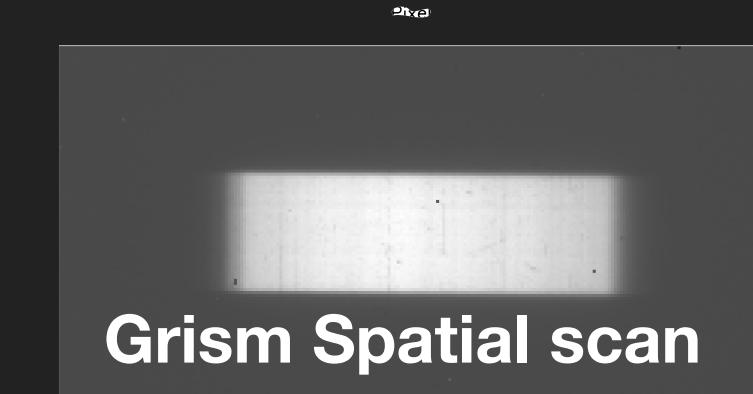
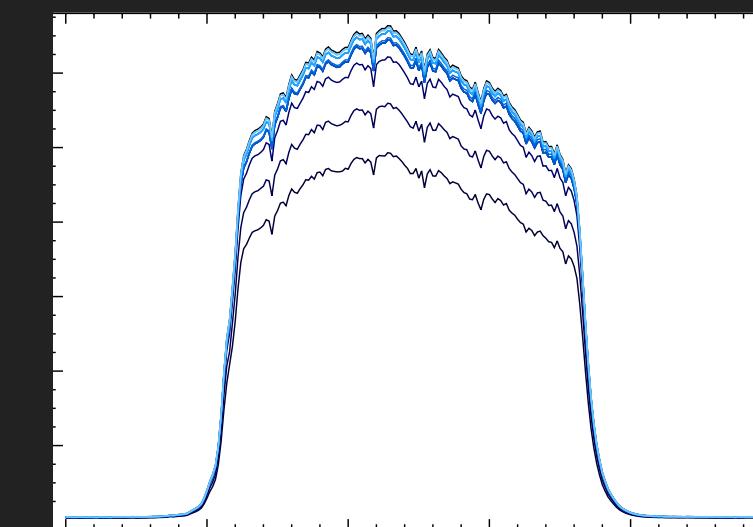
...BUT THERE ARE SOME SIMILARITIES TO WEBB



STIS G430L & G750L



WFC3-IR Grism

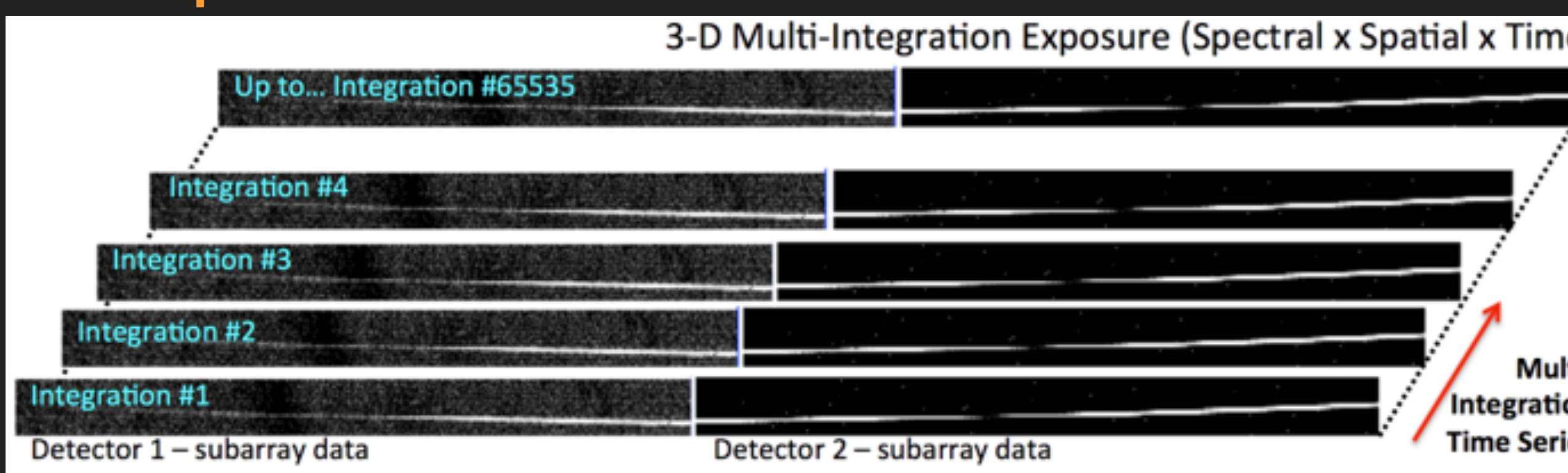


NIRCam
Grism

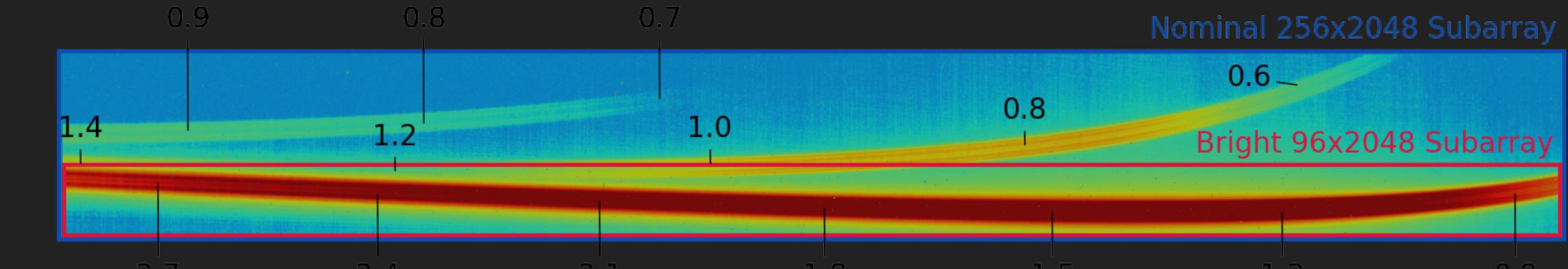


Wakeford+
(2013, MNRAS)

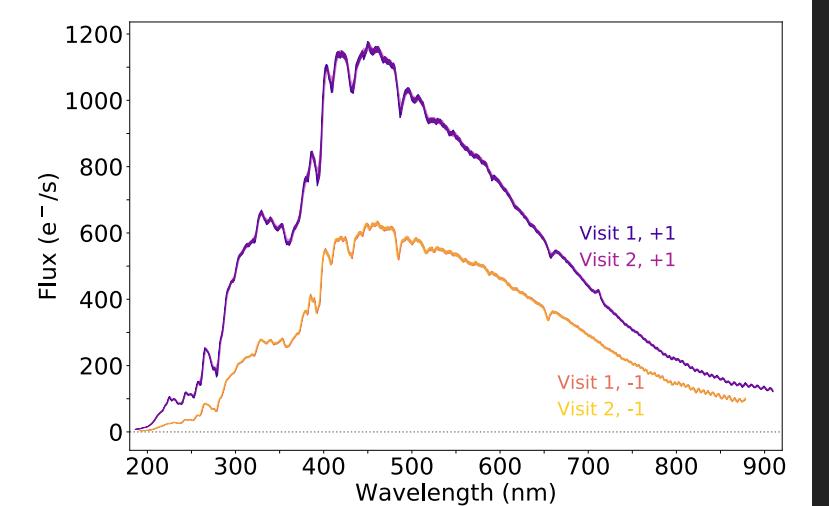
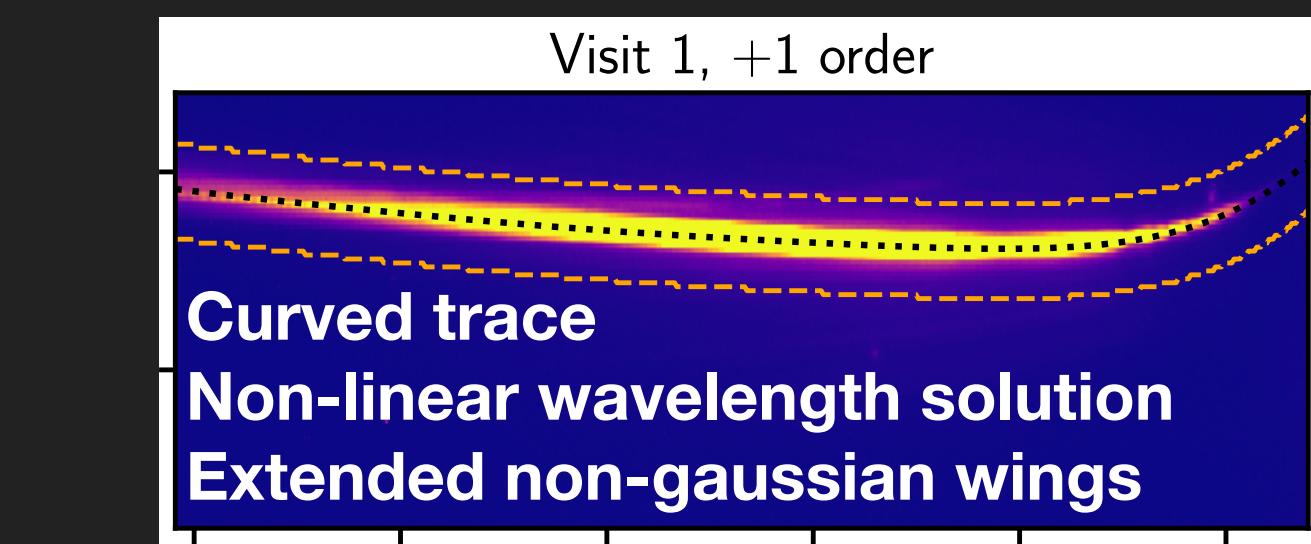
NIRSpec BOTS



NIRISS SOSS



WFC3-UVIS Grism

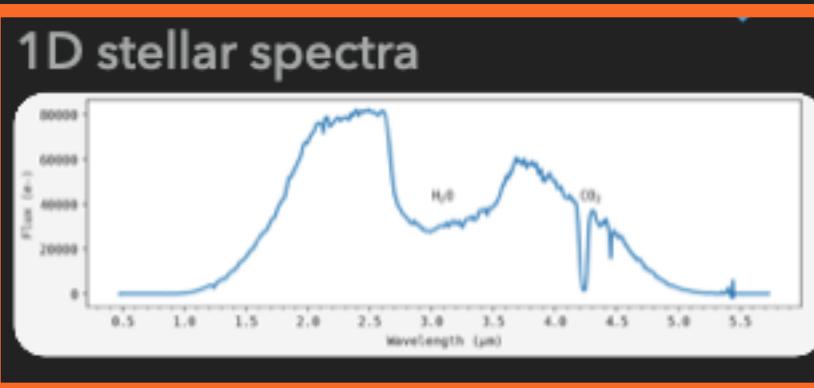


Wakeford+ (2020, AJ)

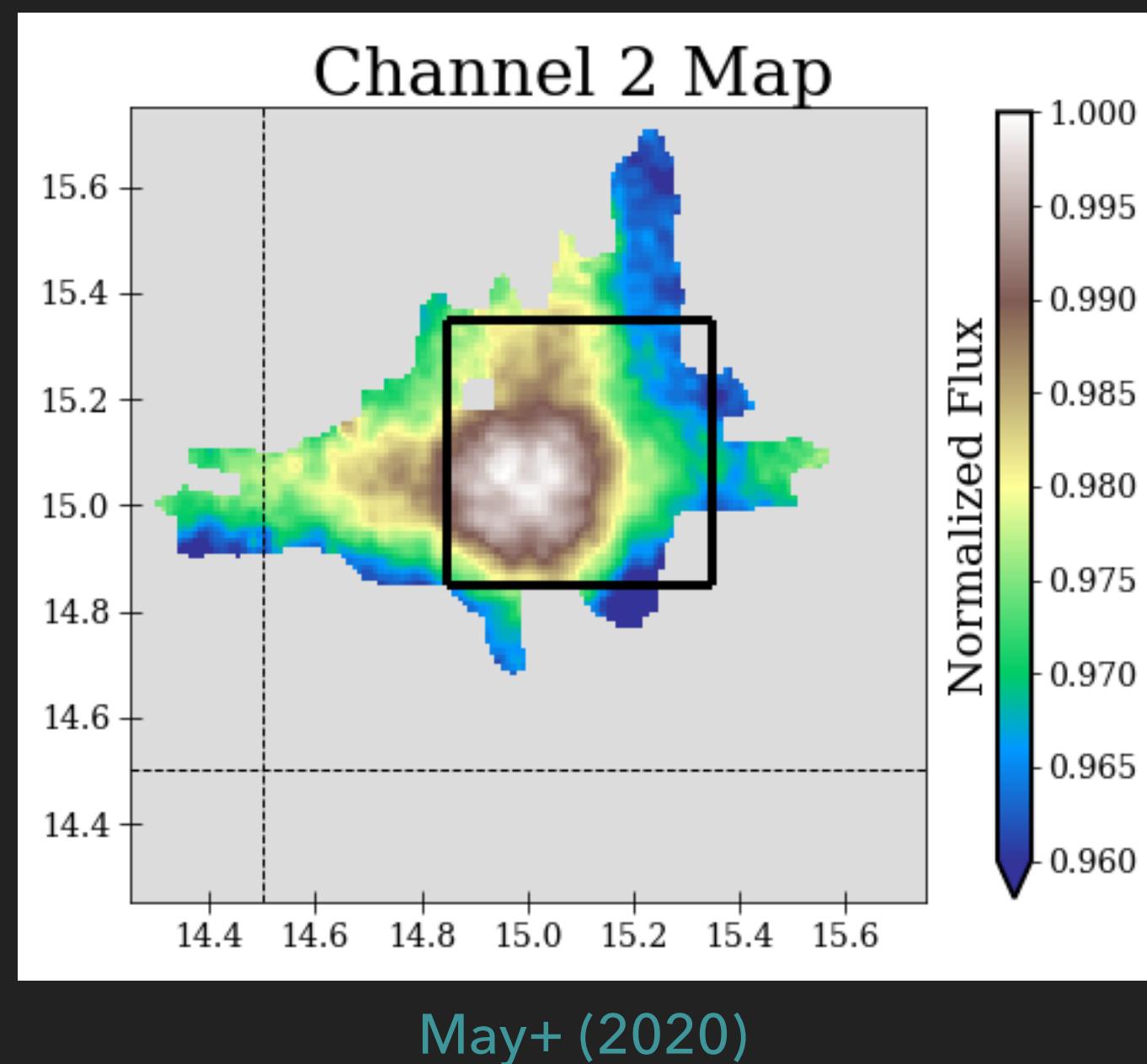
WHAT WE HAVE LEARNT FROM THE OBSERVATIONS

High-cadence long-duration time-series observations reveal many ‘hidden’ secrets of space-based observatories....

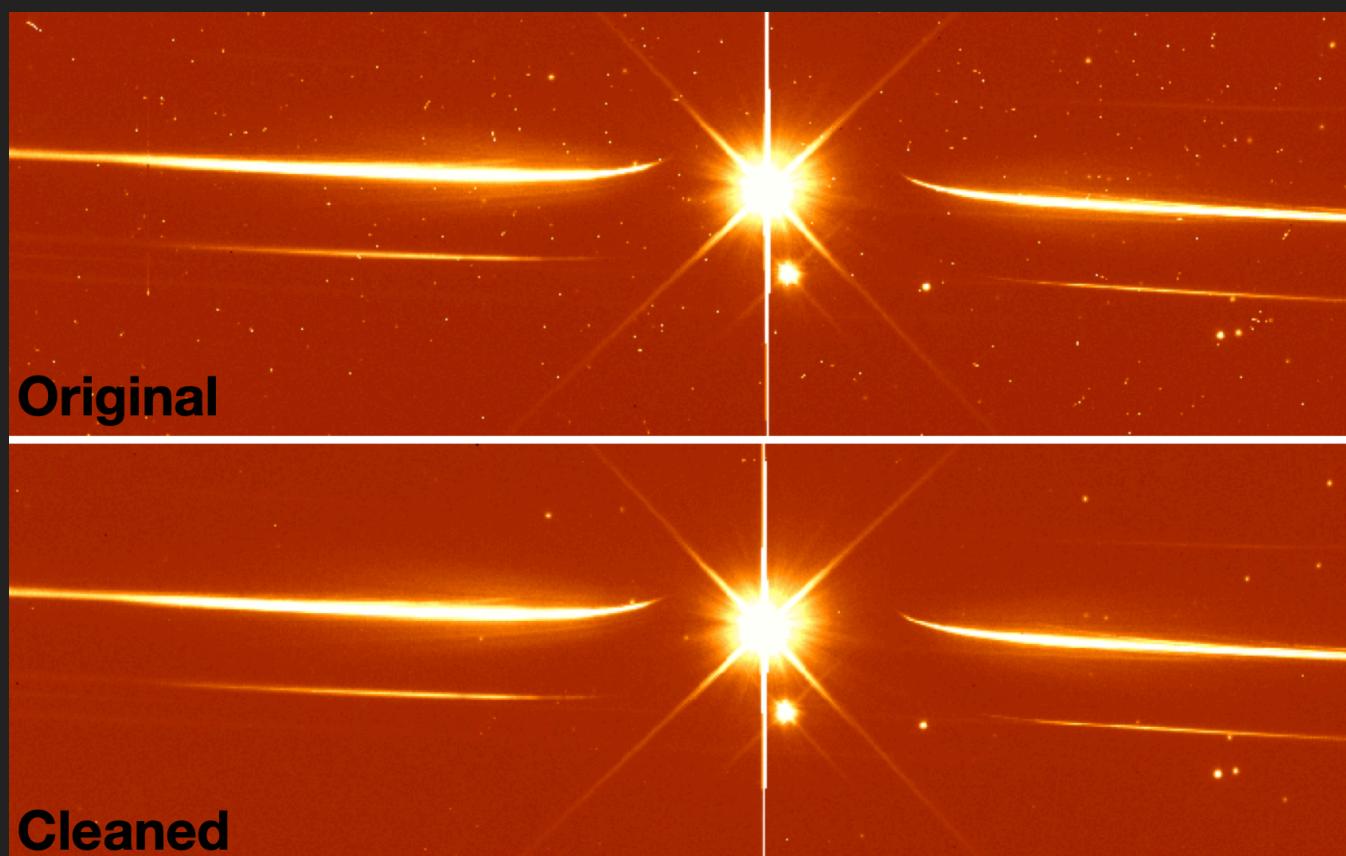
SOME OF THE 1ST ORDER EFFECTS TO CONSIDER



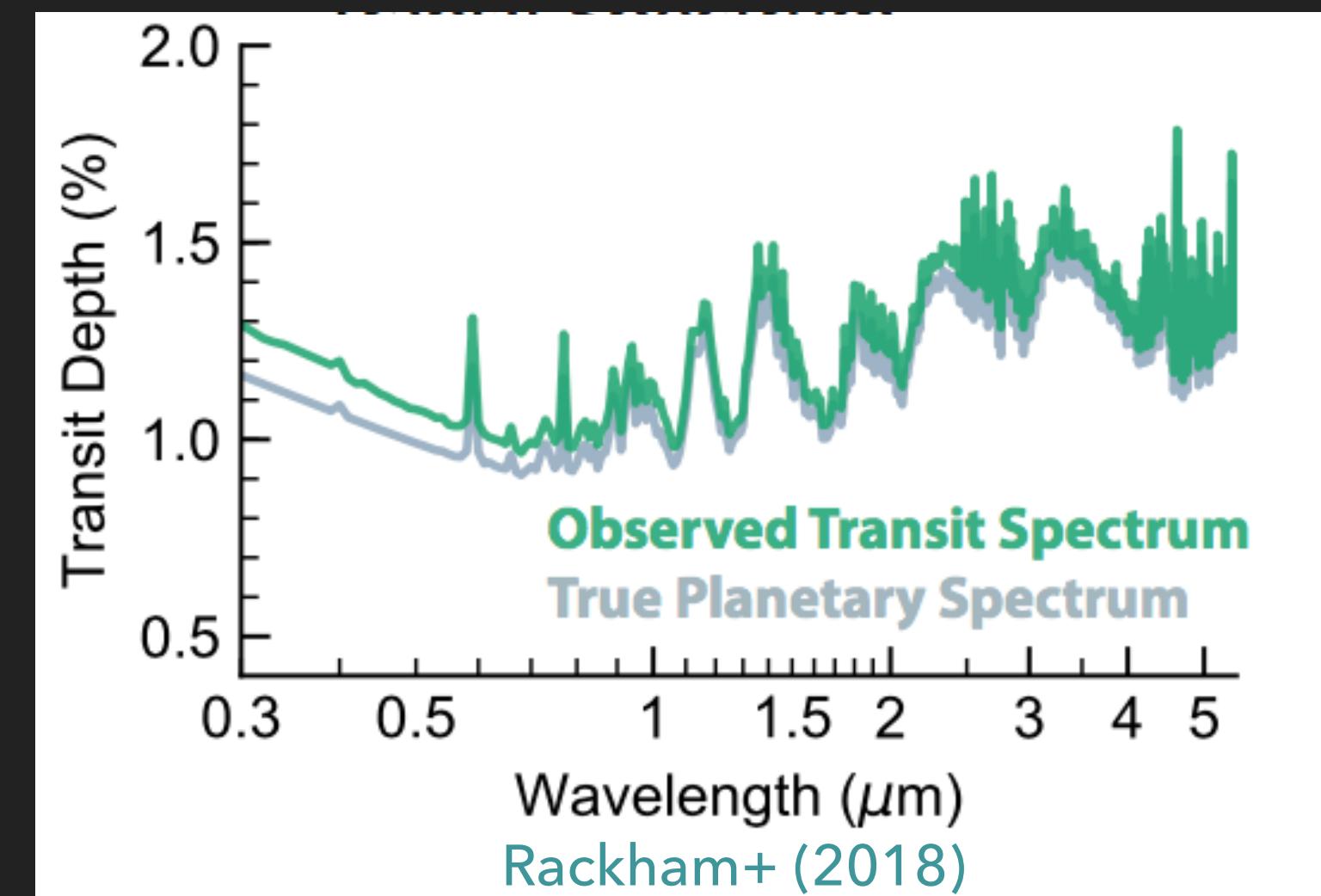
Pixel Sensitivity Maps



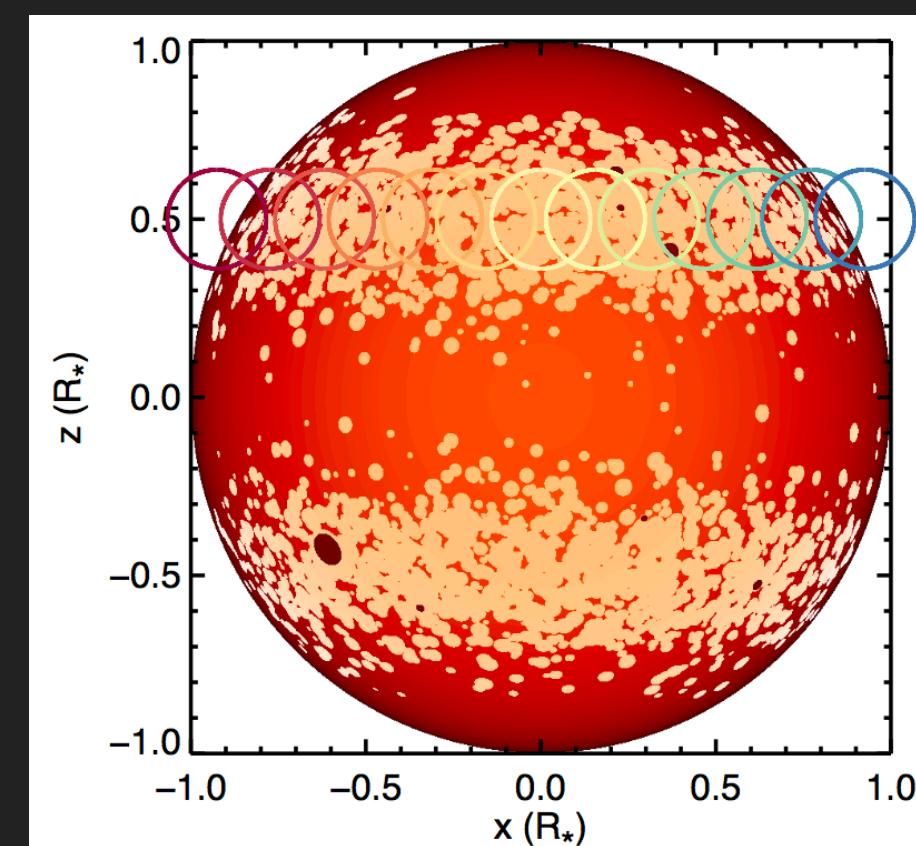
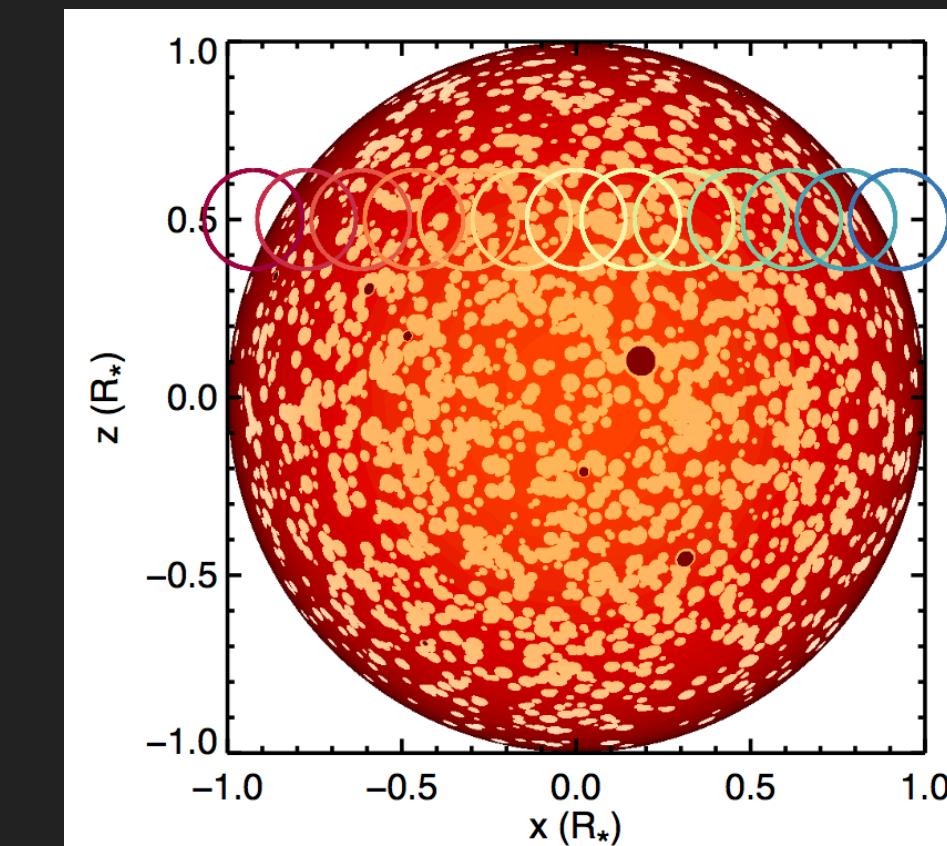
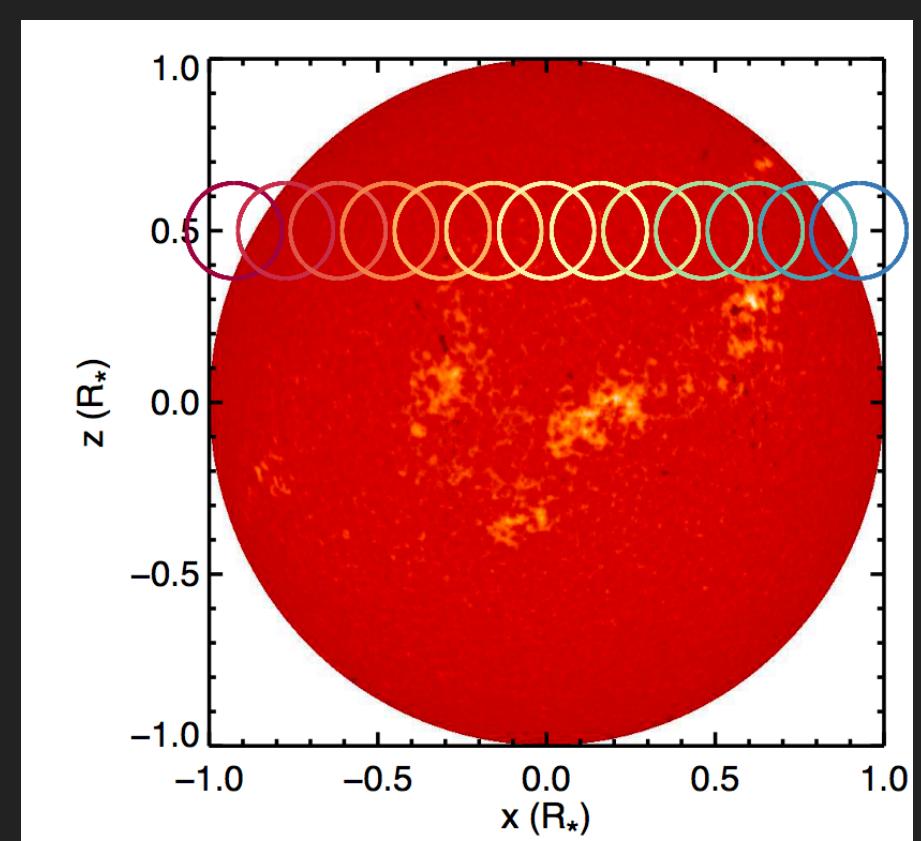
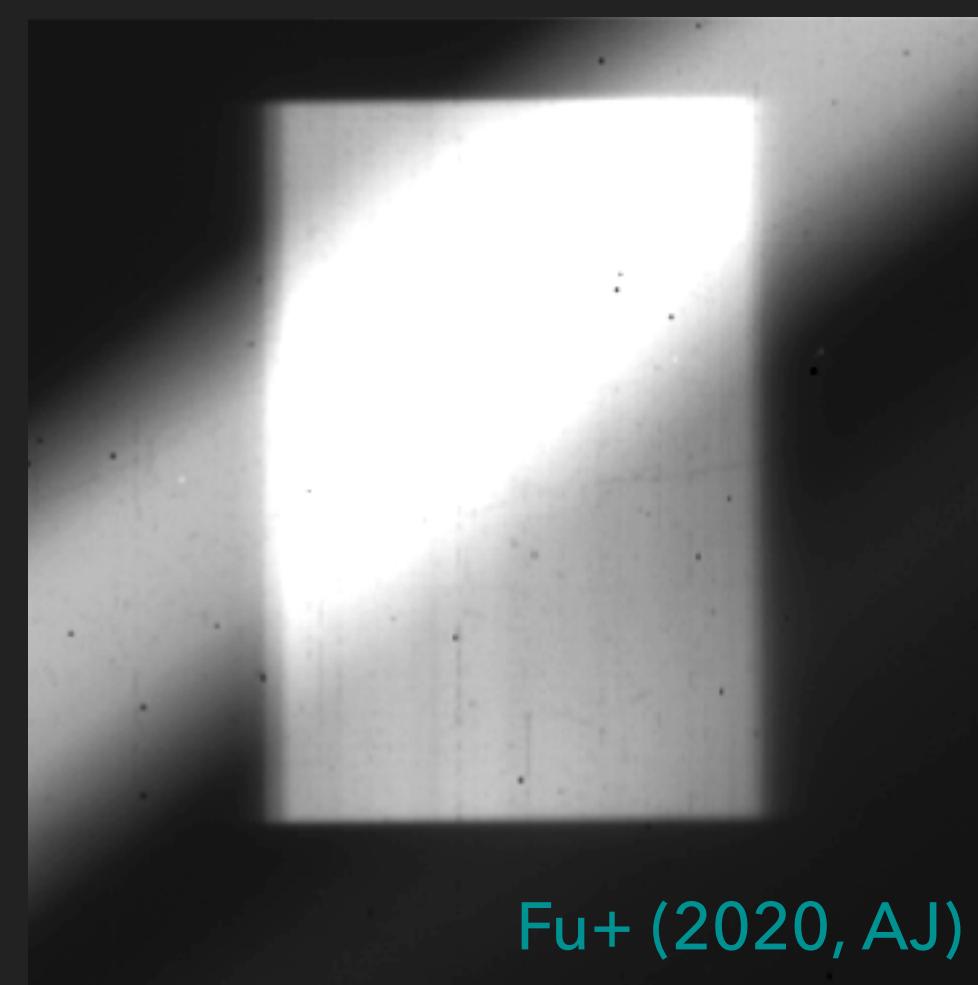
Cosmic rays & Background



Stellar Inhomogeneties

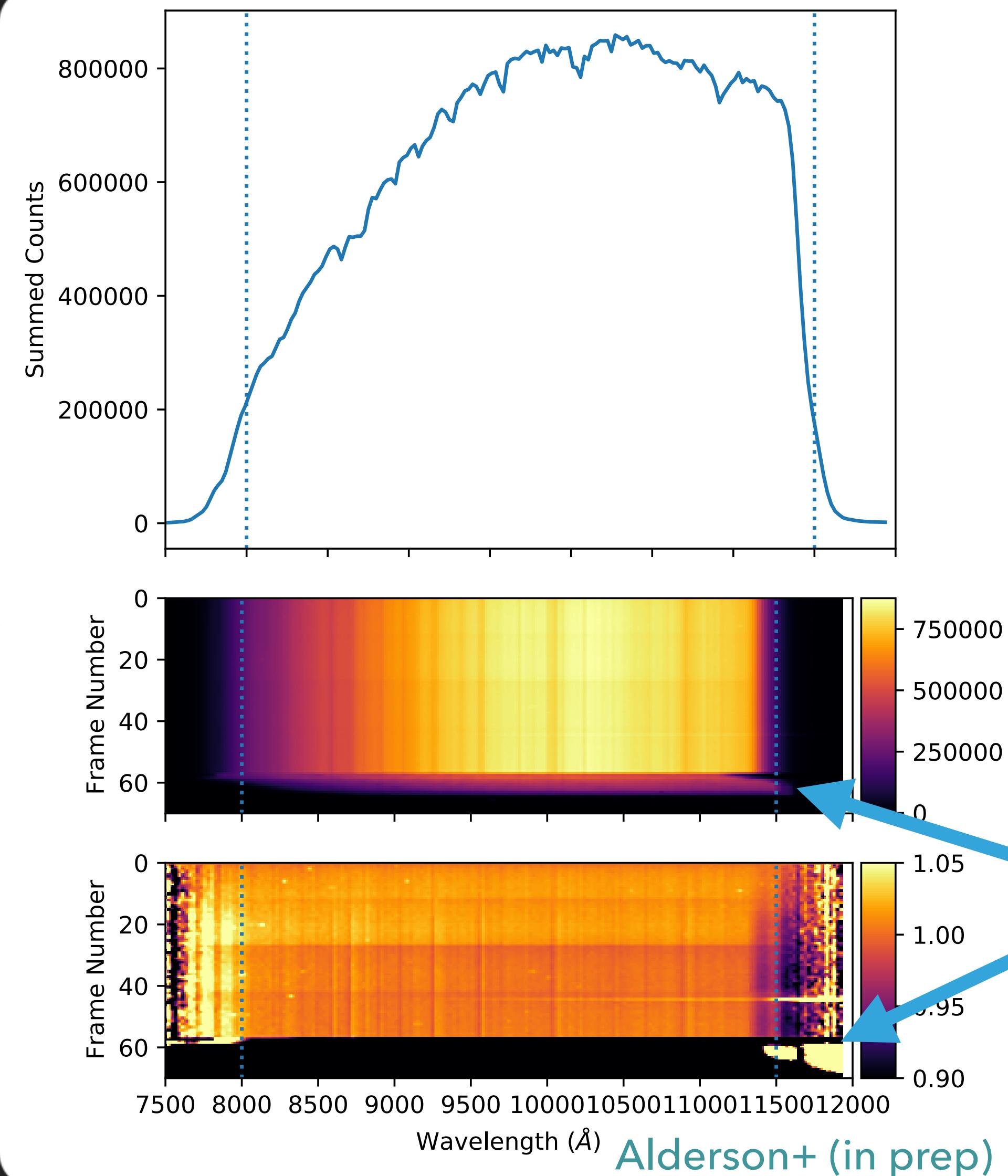
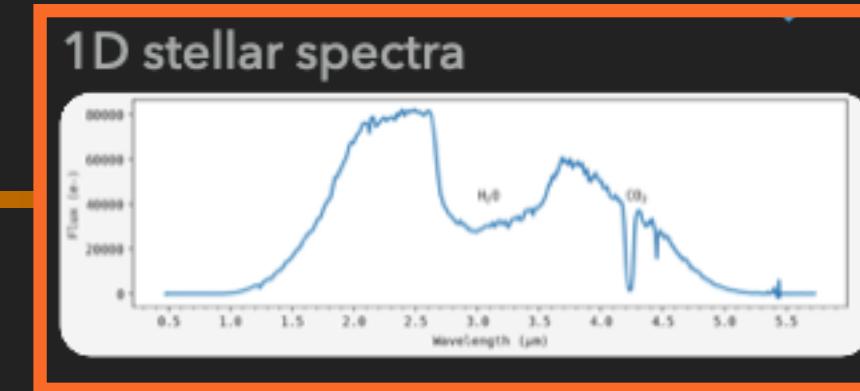


Transient Events

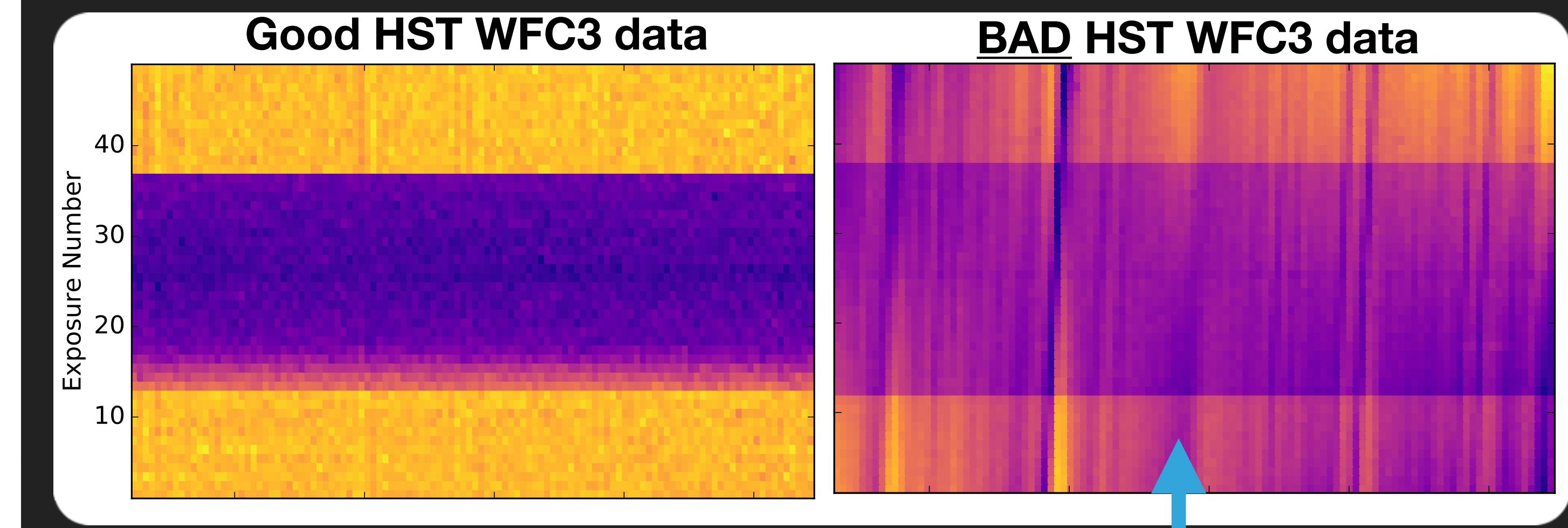


Cauley+ (2018)

VISUALIZING YOUR 1D STELLAR SPECTRA AS PIXEL MAPS



Plotting the stellar spectra as a pixel map can help reveal issues in the data before analysis even starts



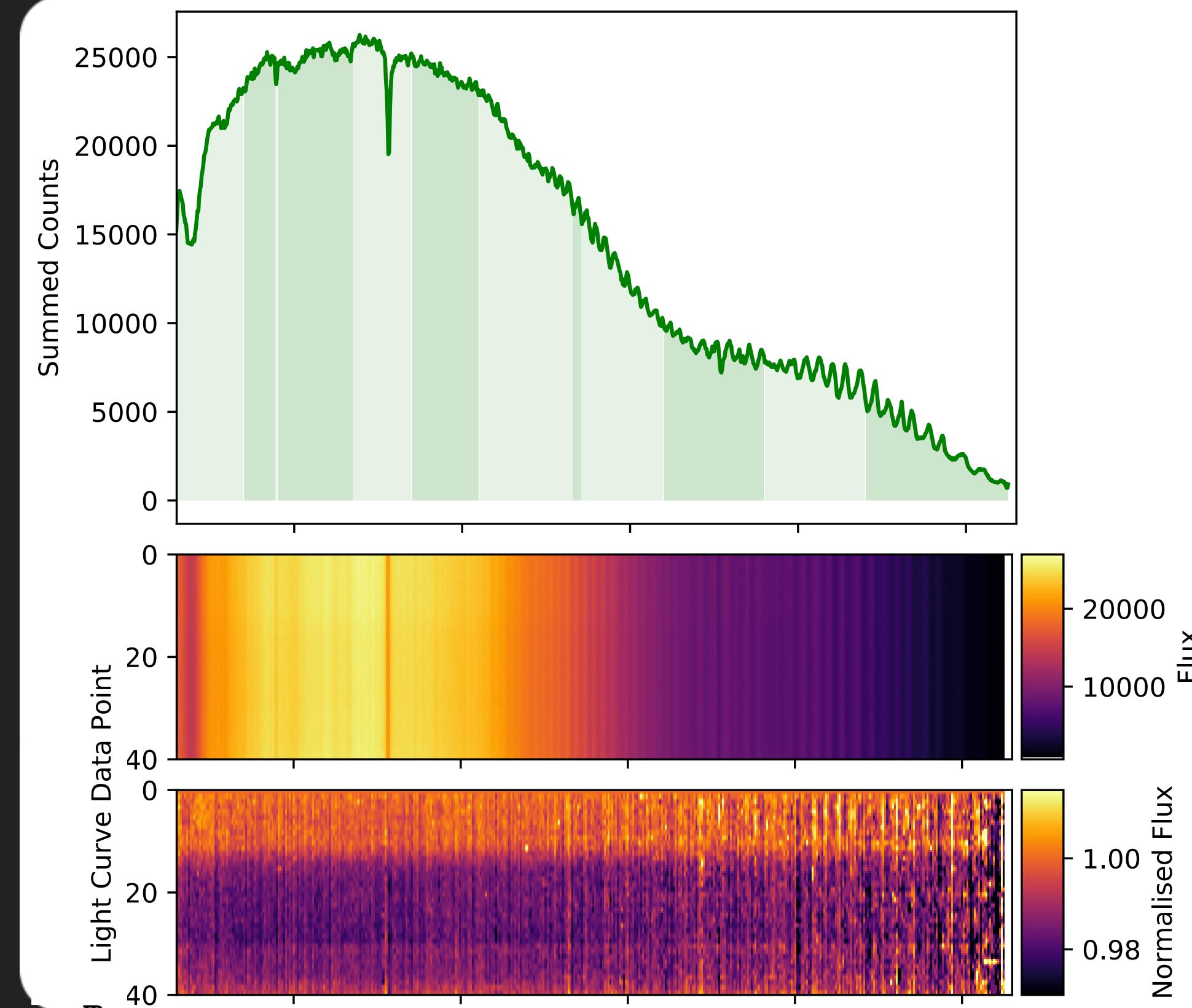
Pointing issues:
Star drifting off
the detector

Lili Alderson,
PhD Researcher,
University of Bristol



Warped scan shape
inducing wavelength
dependent cross-talk
Image credit: H.R.Wakeford published
in Sing (2018 book chapter)

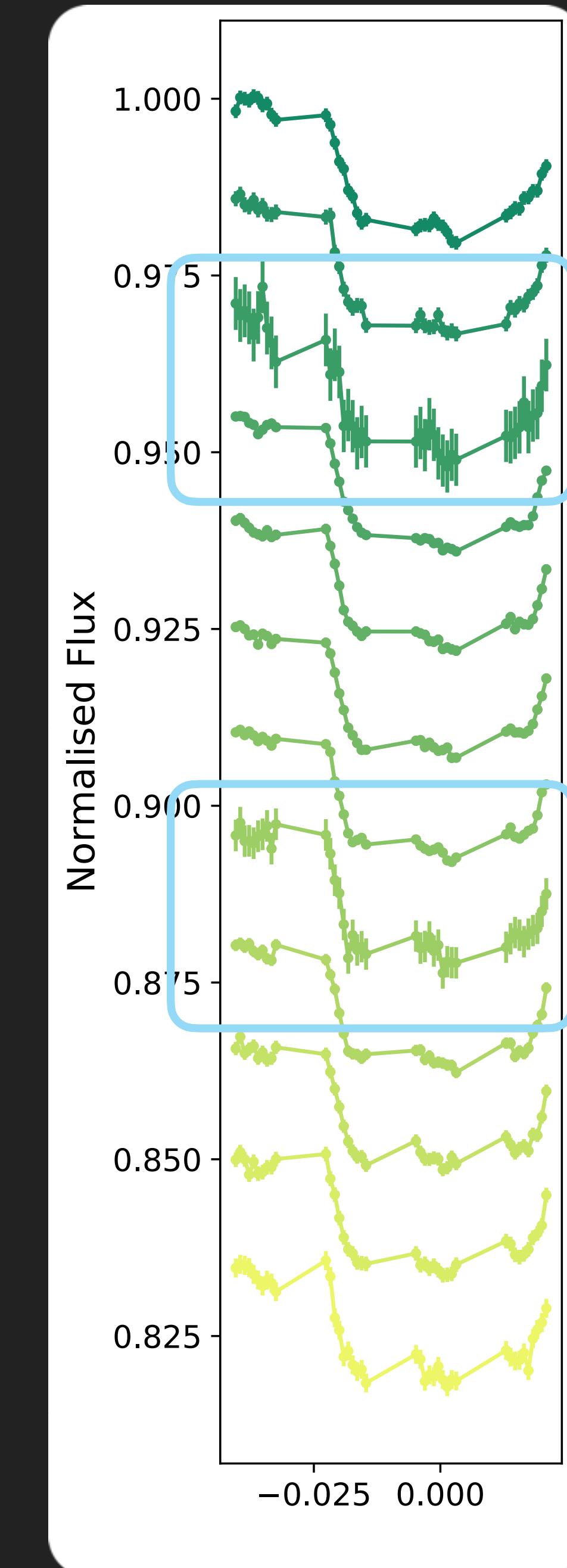
BINNING YOUR SPECTRUM



Alderson+ (in prep)



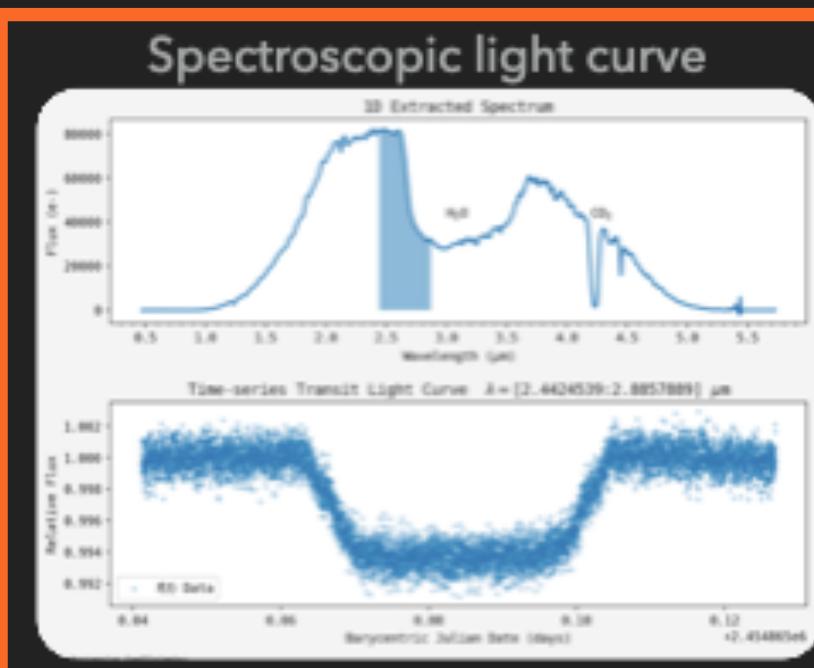
Lili Alderson,
PhD Researcher,
University of Bristol



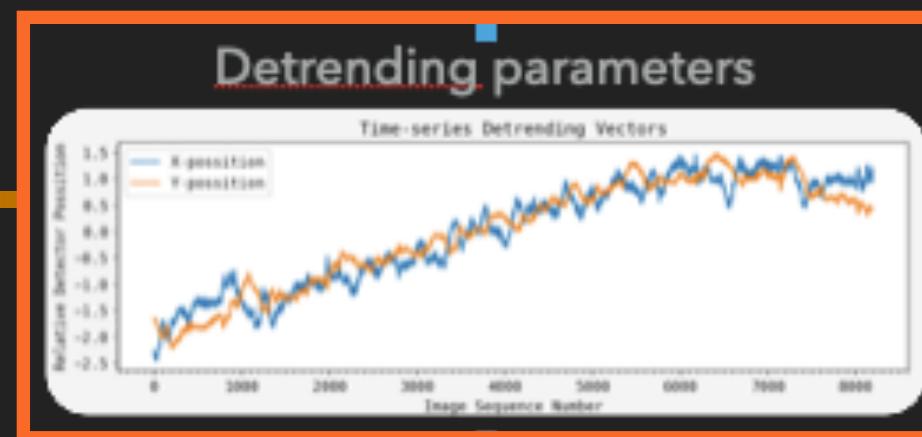
Bins are often determined by the features you are searching for.

The two narrow bins here are centered on the atomic Na and K lines in the optical.

Broader molecular features often benefit from even bin widths

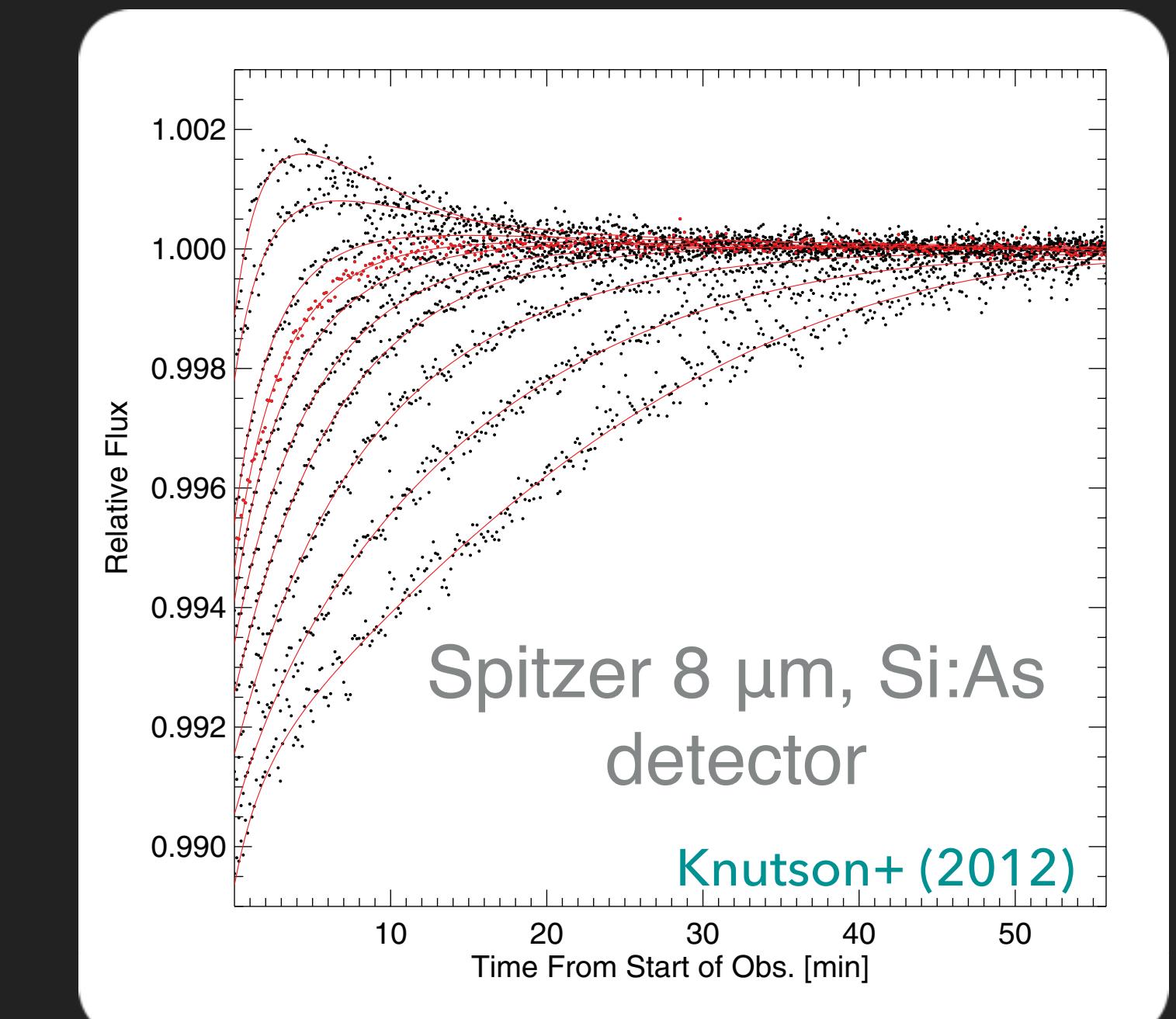
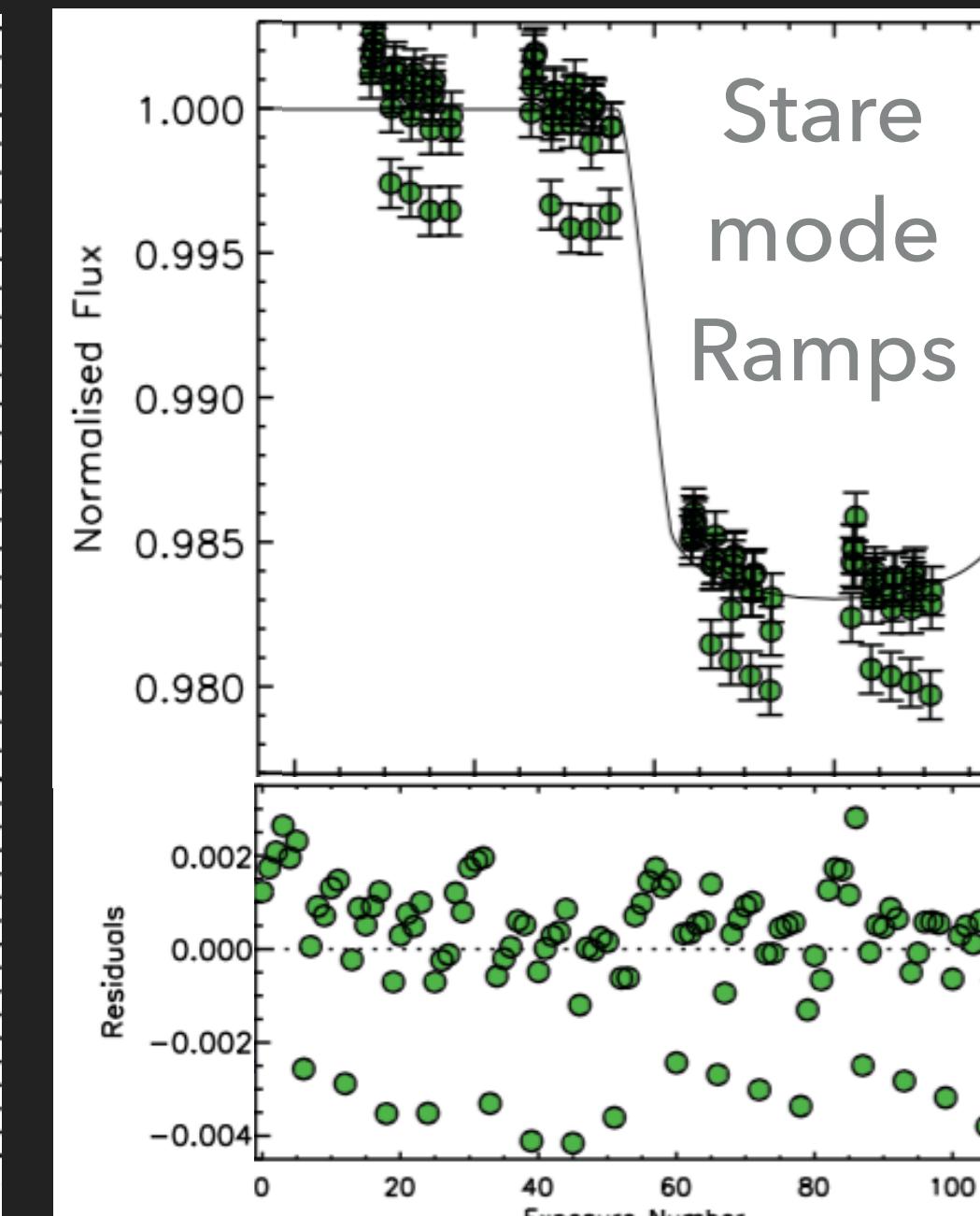
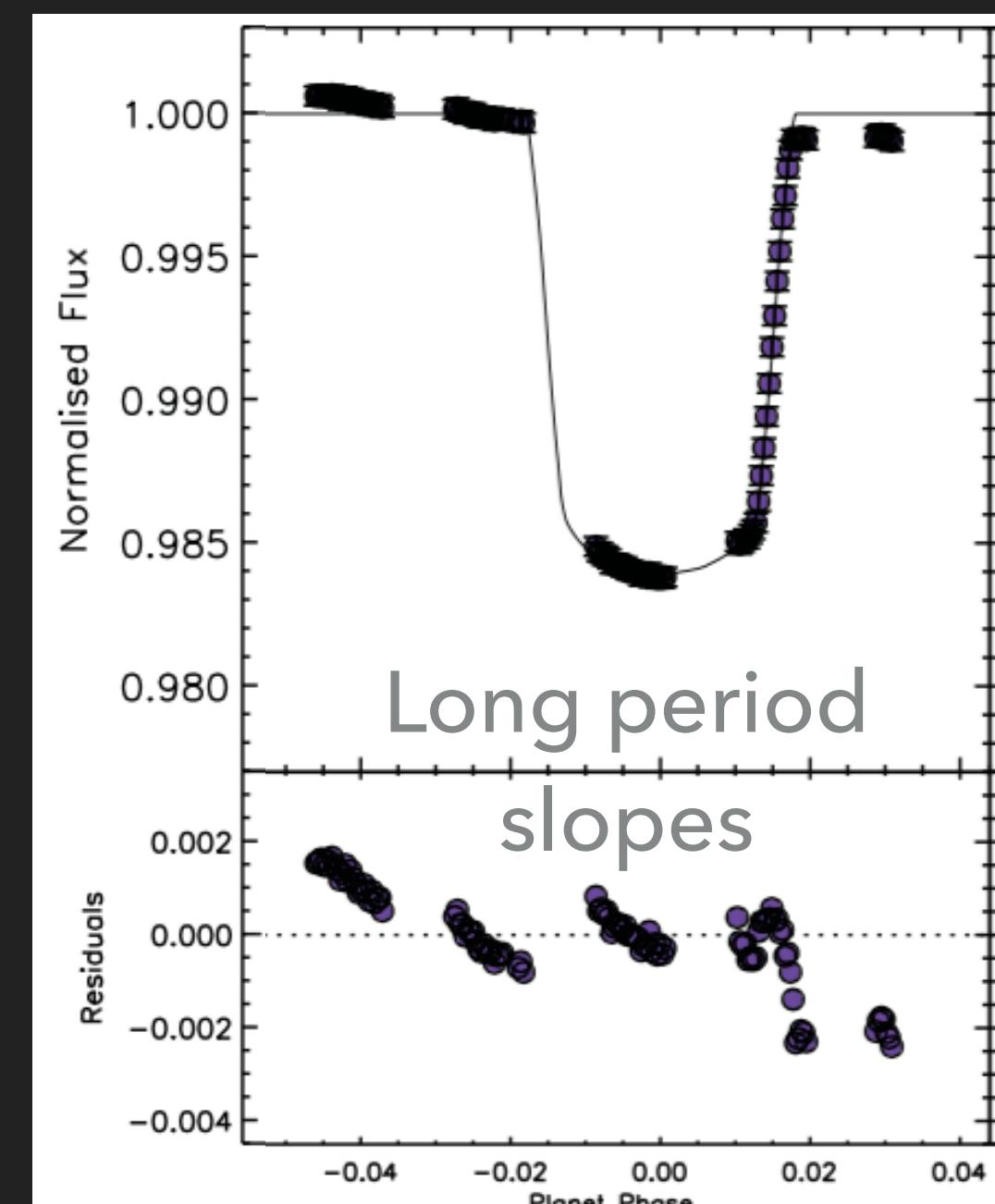


TIME SERIES SYSTEMATICS COME IN MANY SHAPES AND FORMS



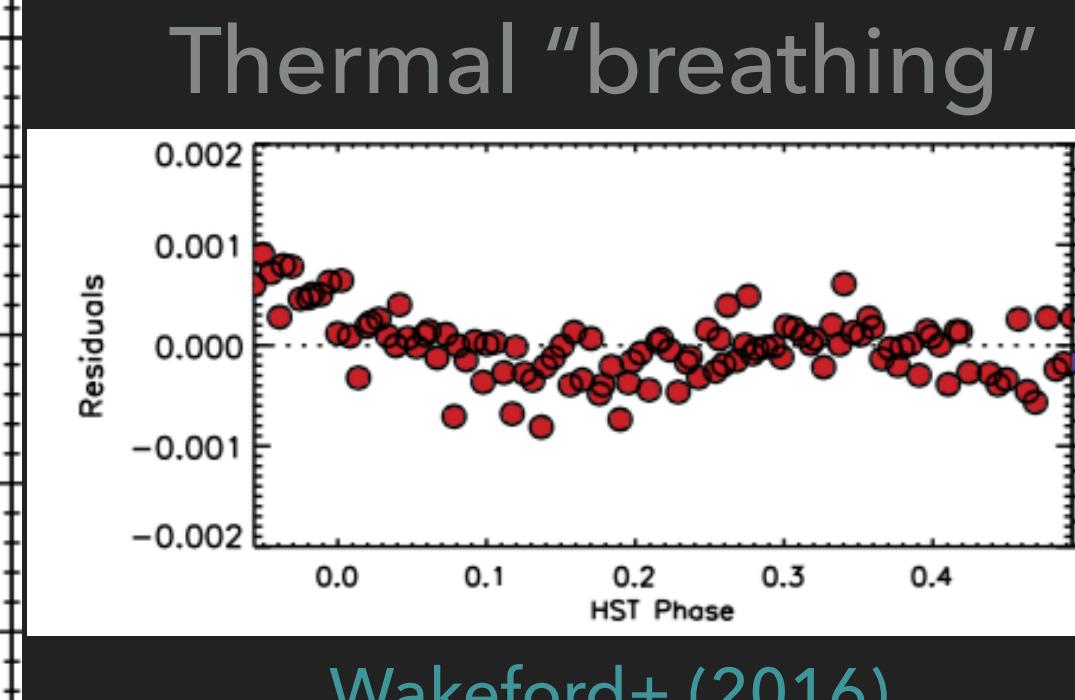
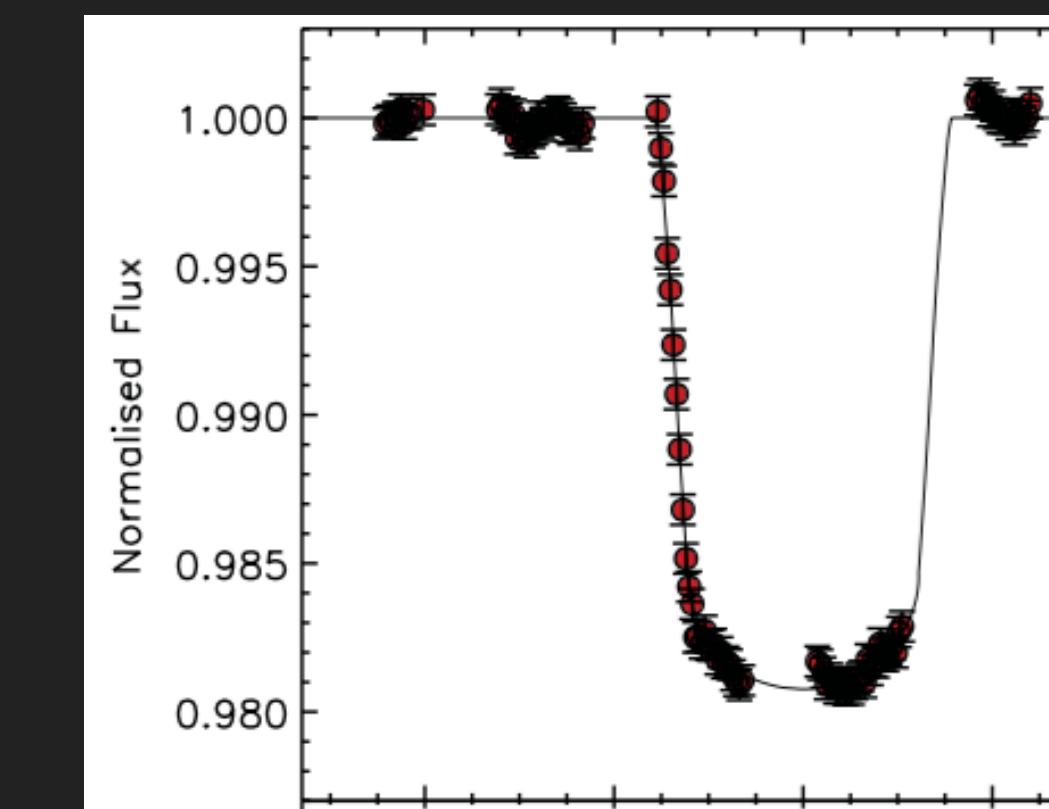
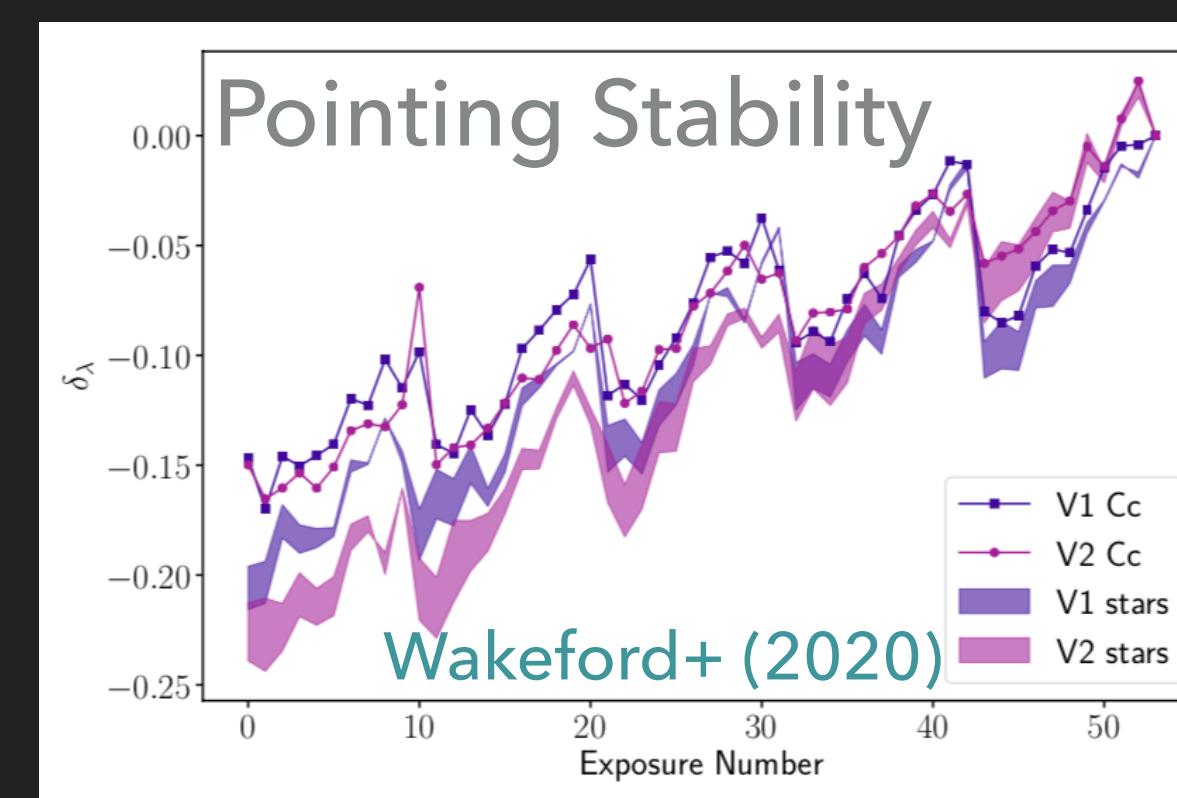
Instrument & Detector Ramps

All time series observations have time variable trends. Many detectors have "ramp" effects due to charge build up or trapping

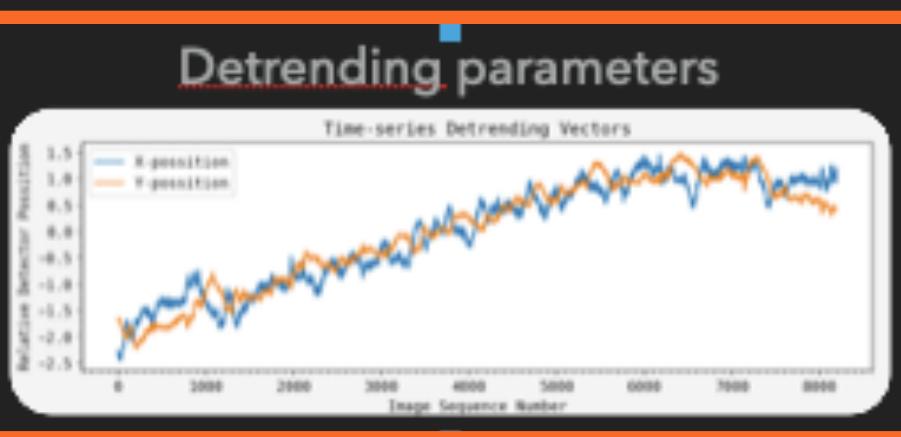


Telescope Ramps

Global impact of thermal and pointing from the whole observatory/telescope

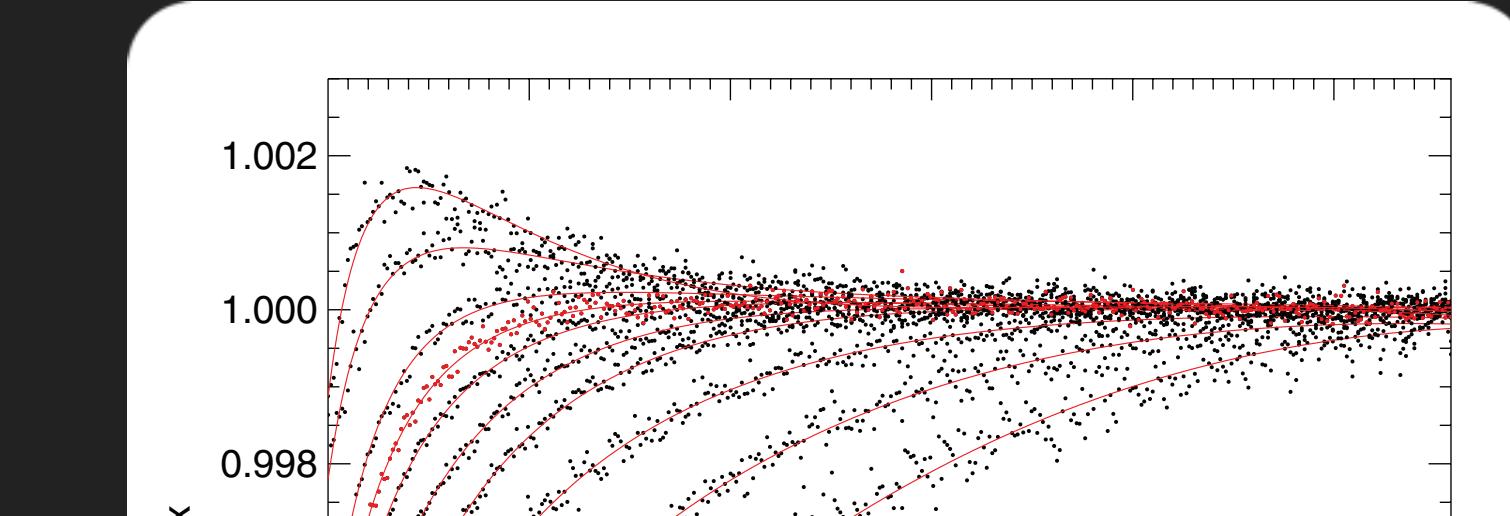
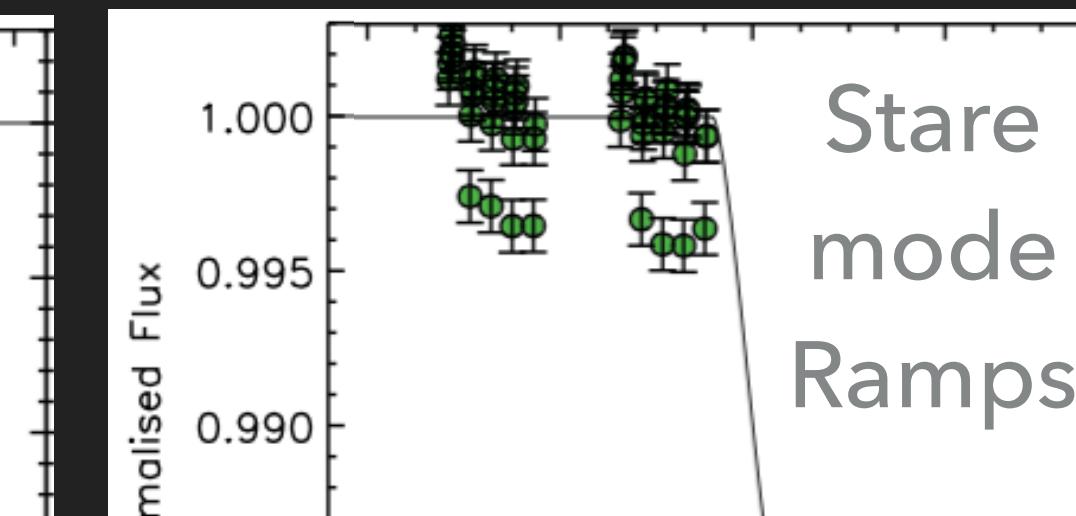
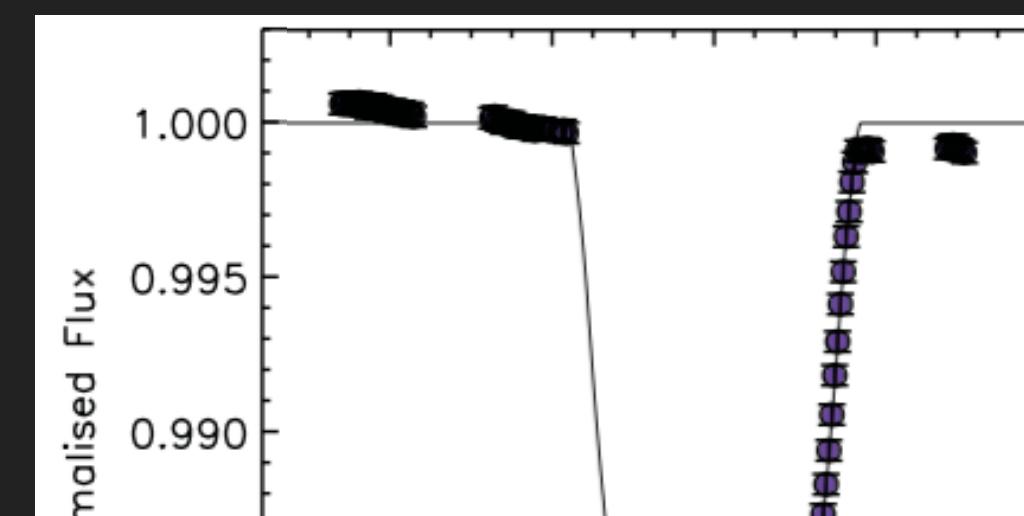


TIME SERIES SYSTEMATICS COME IN MANY SHAPES AND FORMS



Instrument & Detector Ramps

All time series have time varying effects due to thermal or thermal

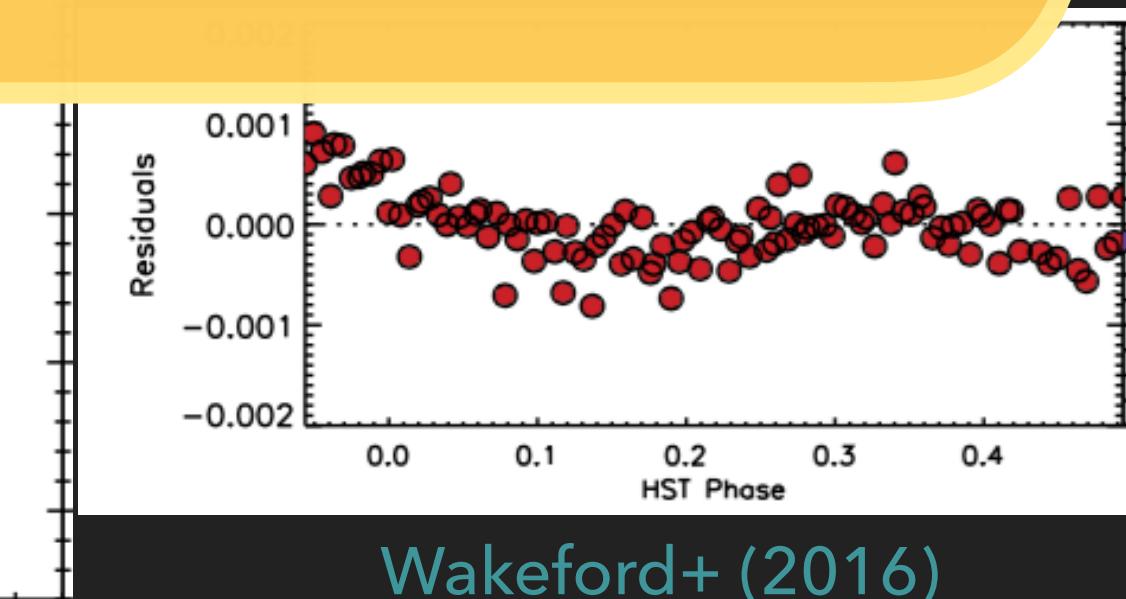
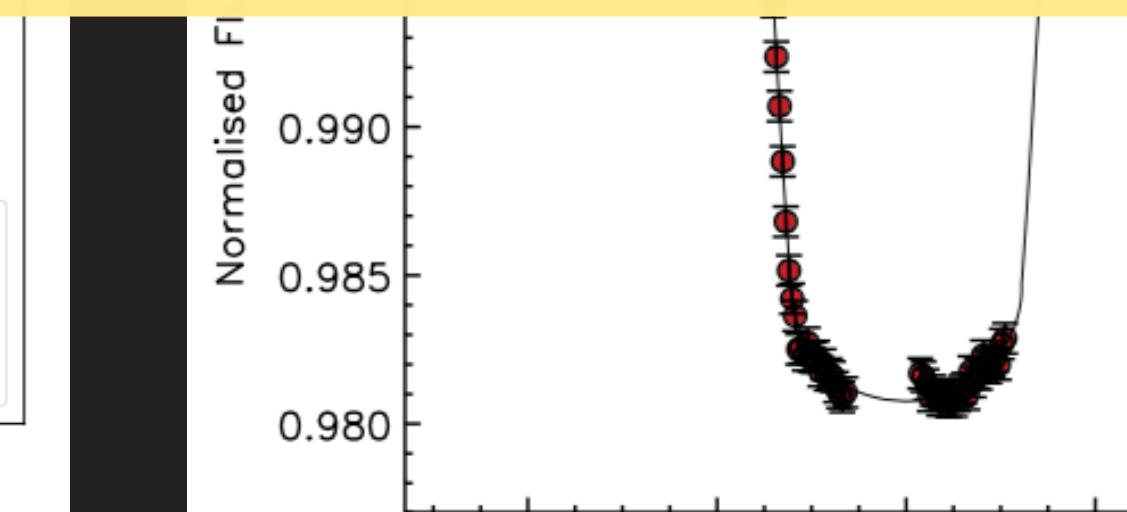
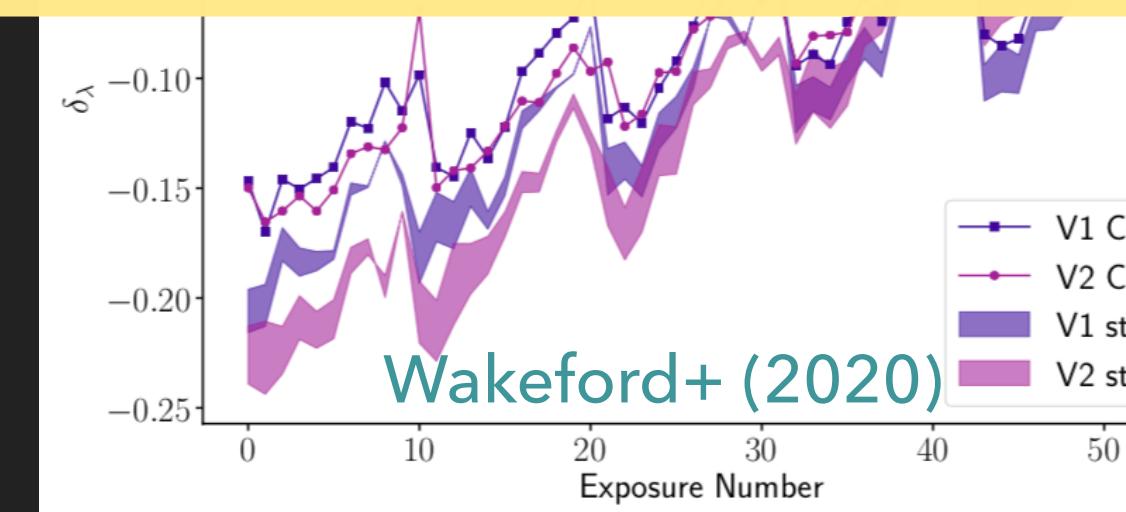


With Webb we will not need to deal with gaps in the observation like we do with Hubble, thermal breathing and pointing stability should also be smaller effects, but there are always surprises!



Telescope Ramps

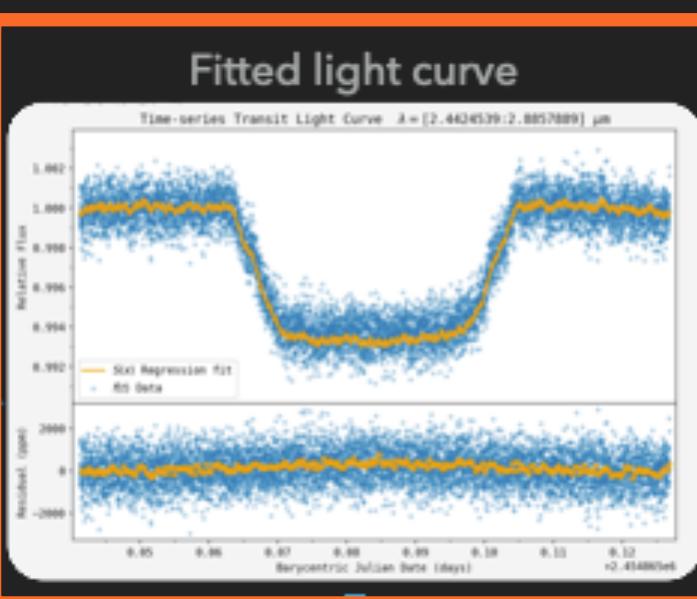
Global impact of thermal and pointing from the whole observatory/telescope



Wakeford+ (2016)

Si:As
+ (2012)
50

WHAT IS USED TO CORRECT ALL OF THIS



Models

Simple

Single systematic models

Common-mode
wavelength independent
model

Complex

Marginalization

Jitter decorrelation

GP

Solver

Least-square minimizer

MCMC

GP

Parameter Estimation

Single uncertainty on parameters

Output covariance matrix

Full posterior of estimated parameters

Correlation between parameters

Fastest

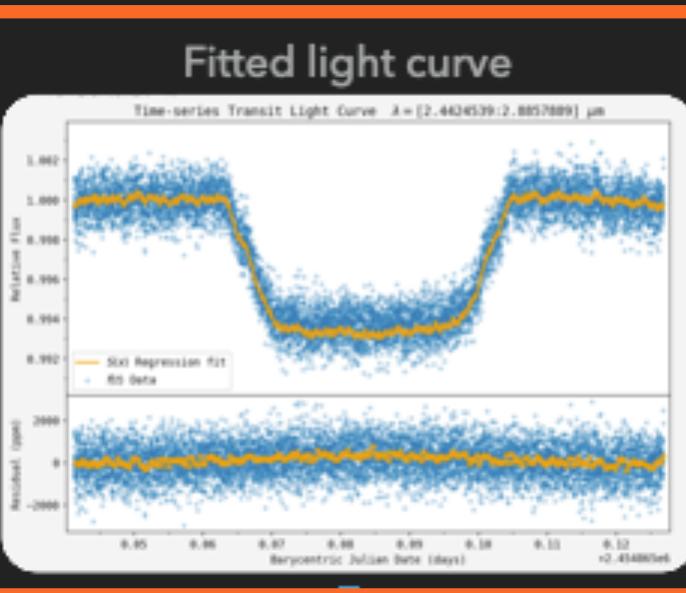
Slow

Faster

The larger suite of models considered, the smaller the space assigned to the probability that none of your models can explain your data.

See Gibson (2014, MNRAS) for examples of model treatments

WHAT IS USED TO CORRECT ALL OF THIS Models



Simple

Single systematic models

Common-mode
wavelength independent
model

Complex

Marginalization

Jitter decorrelation

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The larger suite of models considered,
the smaller the space assigned to the
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Solver

Least-square minimizer

MCMC

GP

Fastest

Slow

Faster

Parameter Estimation

Single uncertainty on parameters

Output covariance matrix

Full posterior of estimated parameters

Correlation between parameters



Example/Shameless Plug!

Complex and quick

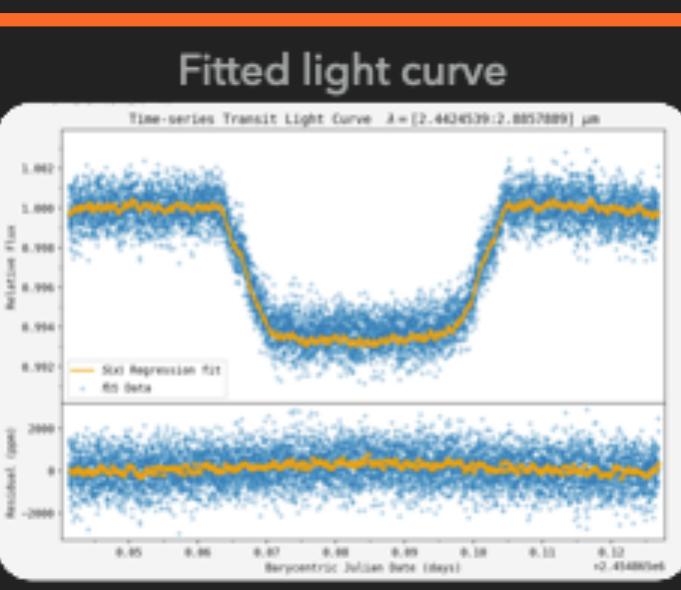
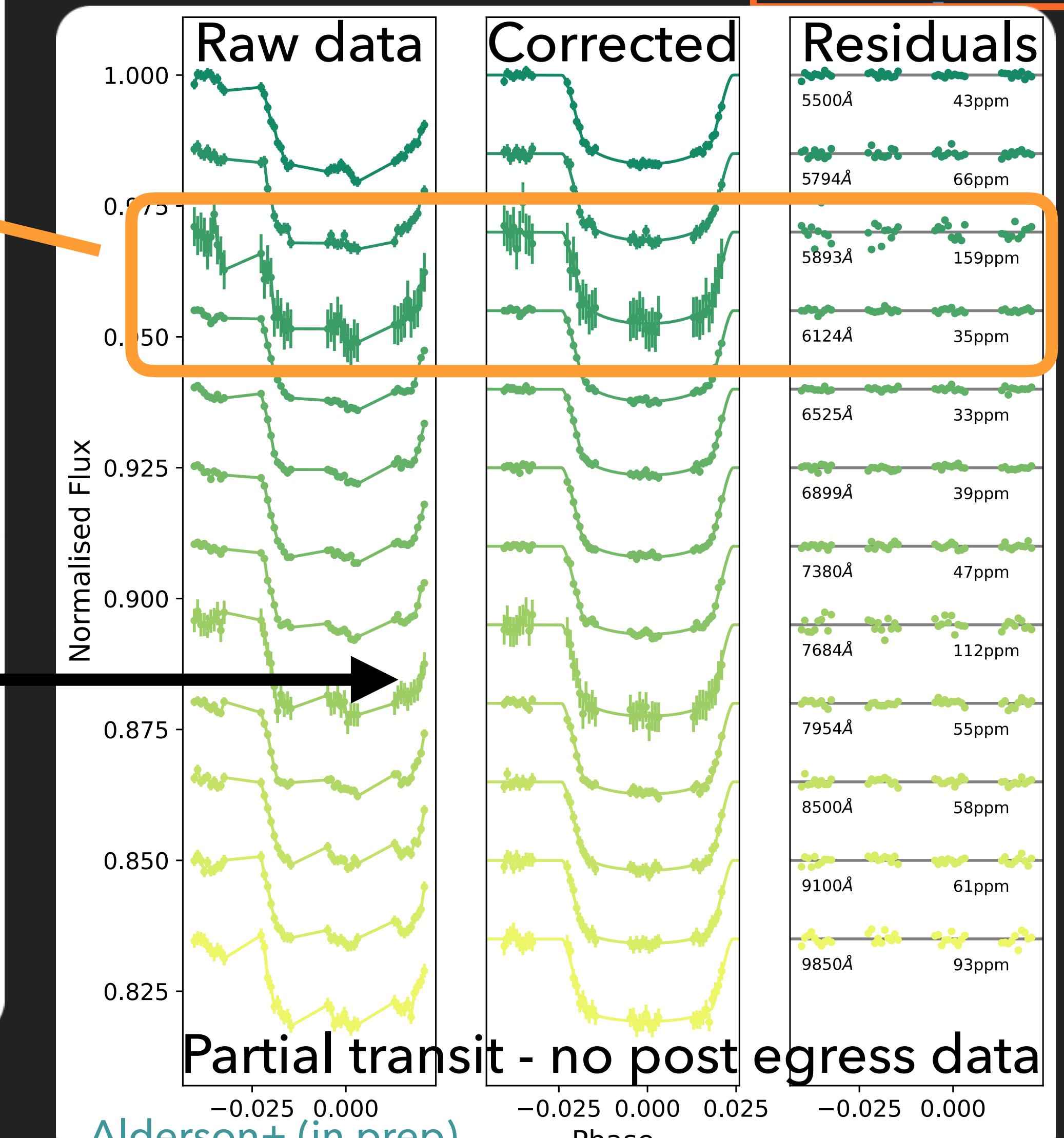
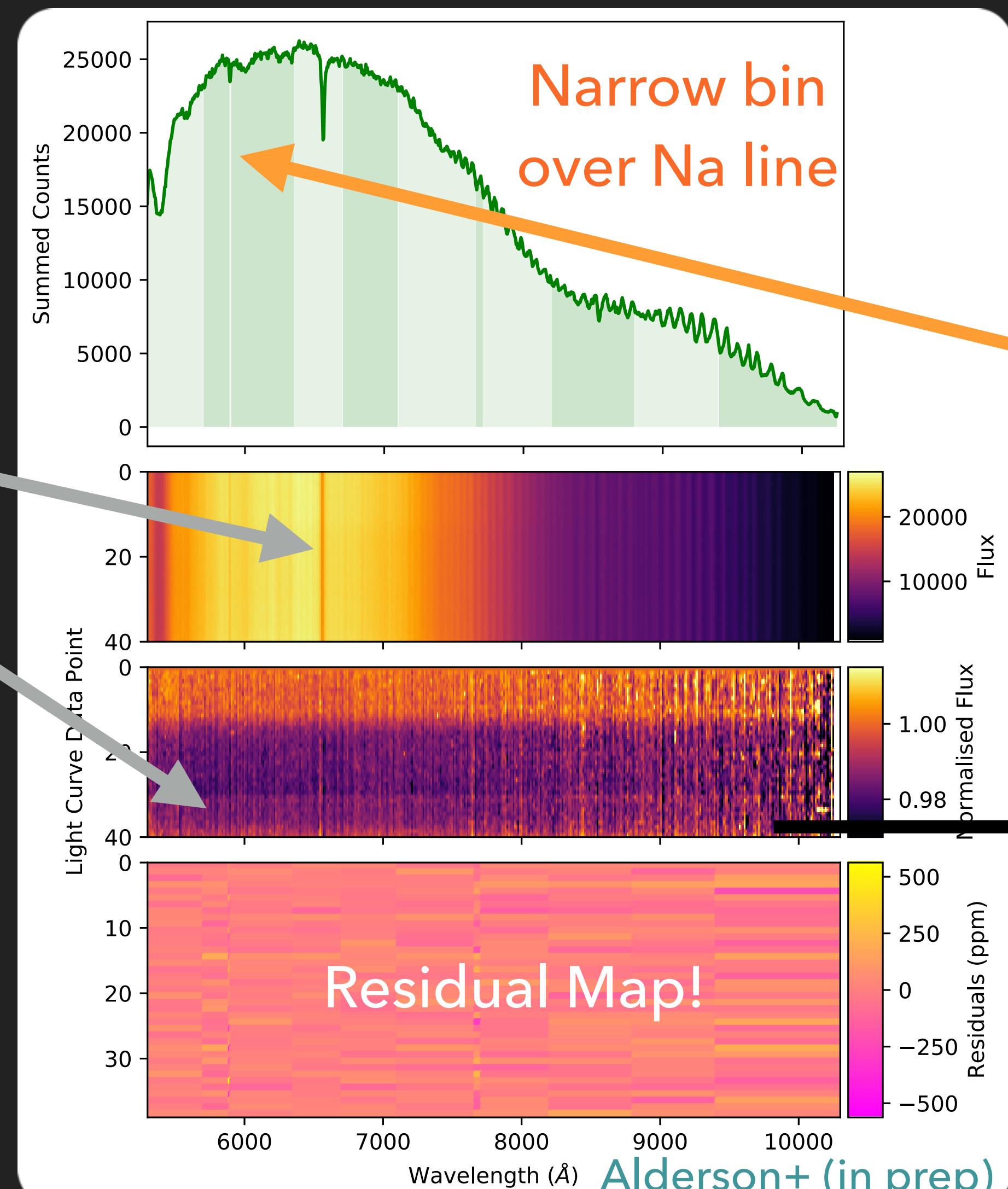


Instrument Systematic
Marginalisation package with
least-squares minimisation
Laginja & Wakeford (2020, JOSS)

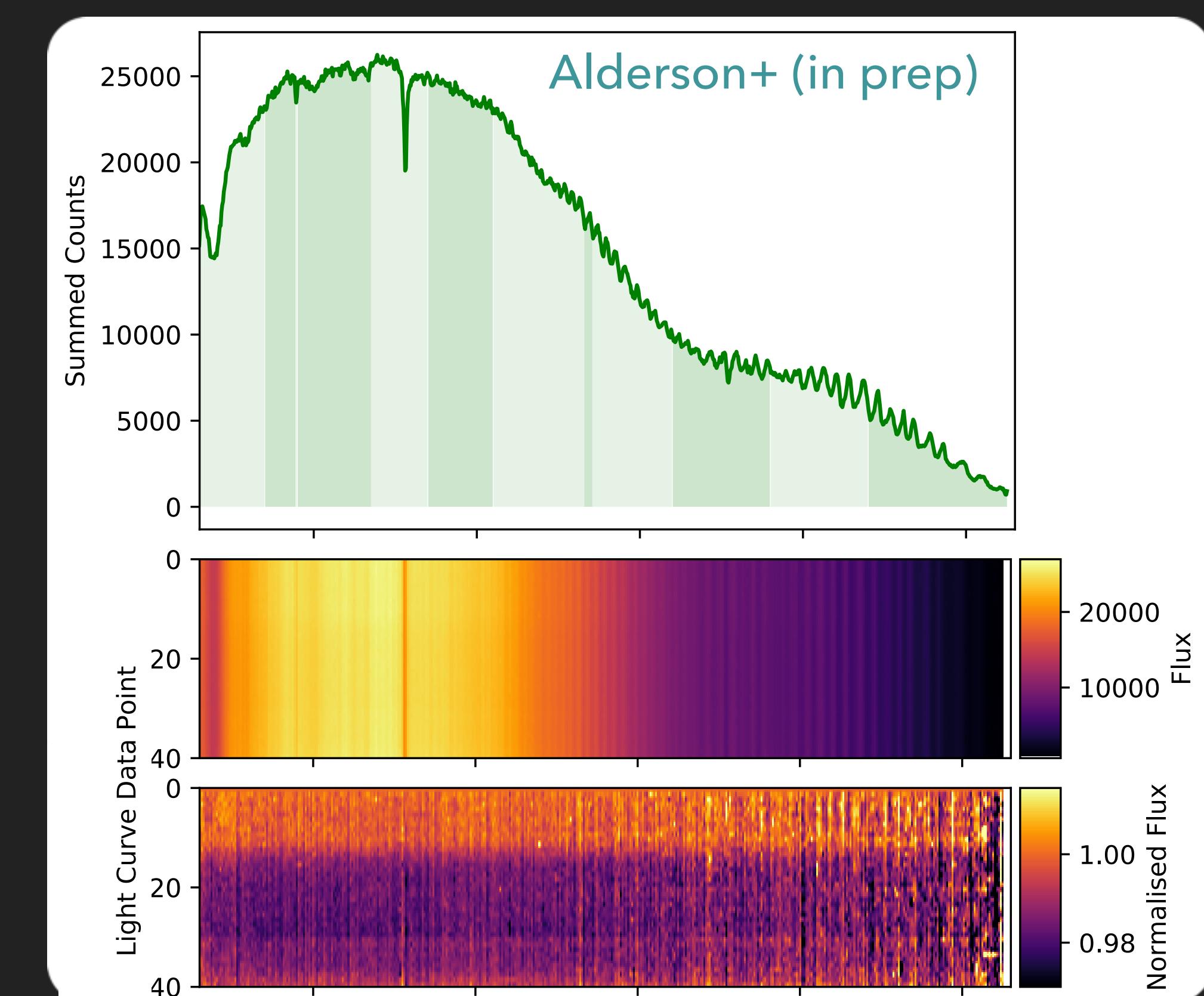
VISUALIZING YOUR RESULTS



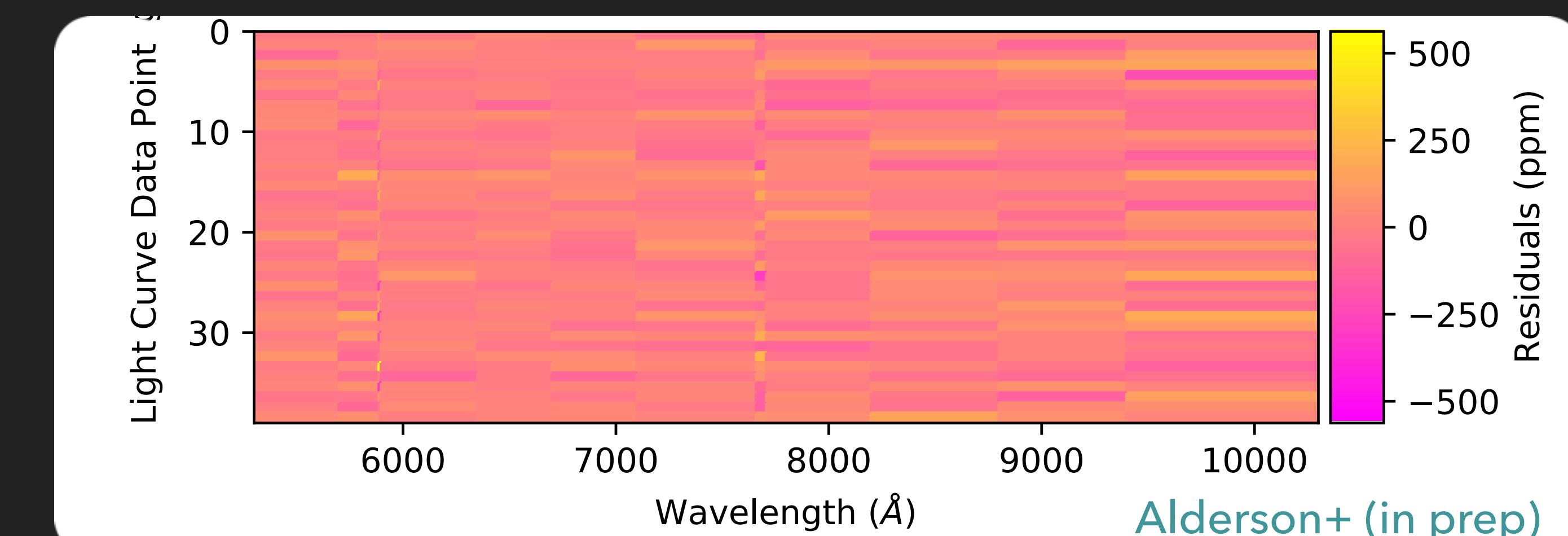
What is happening here?



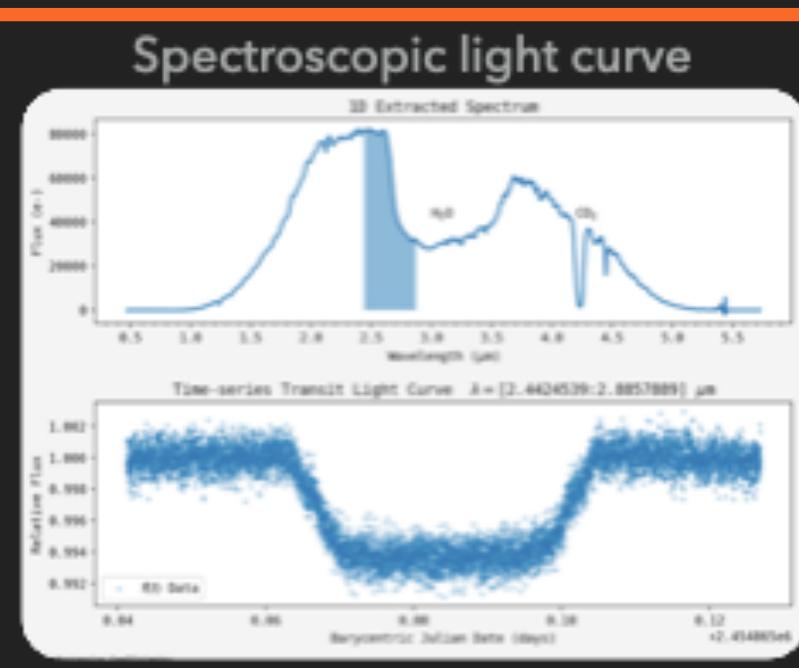
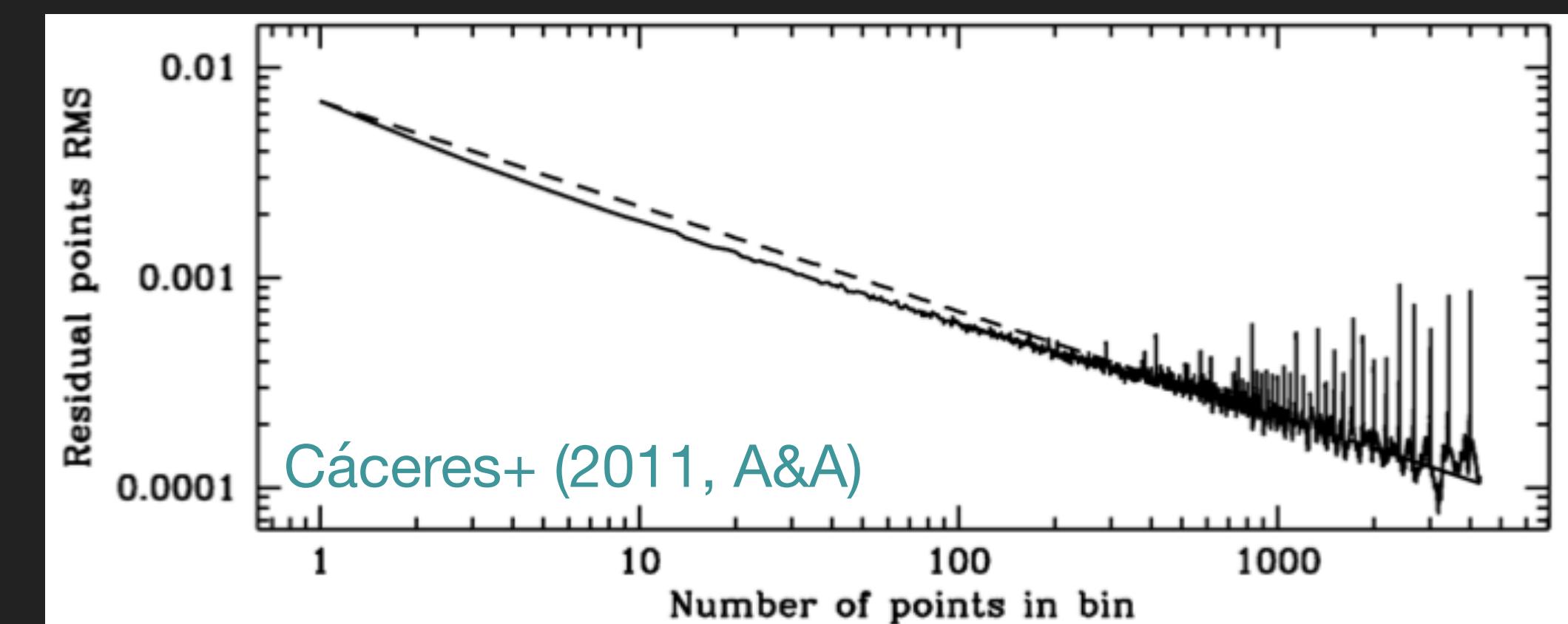
BINNING YOUR SPECTRUM



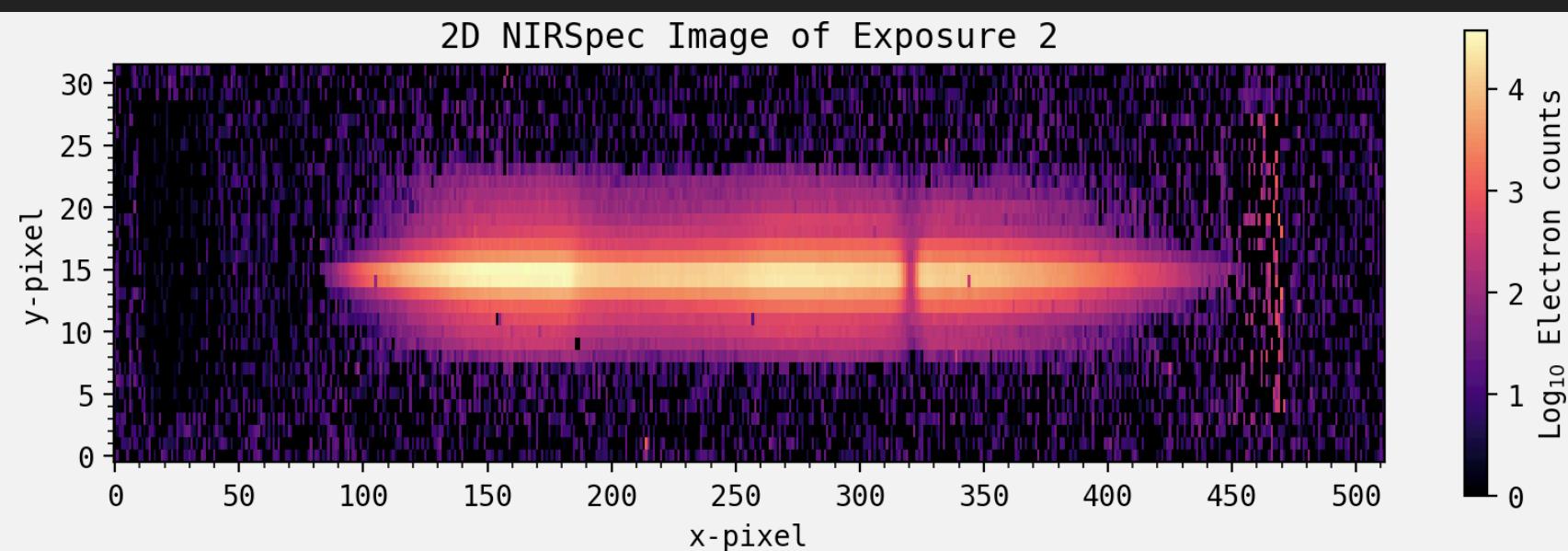
Pixel map of the light curve residuals
(data - model) for each wavelength bin



Lili Alderson,
PhD Researcher,
University of Bristol

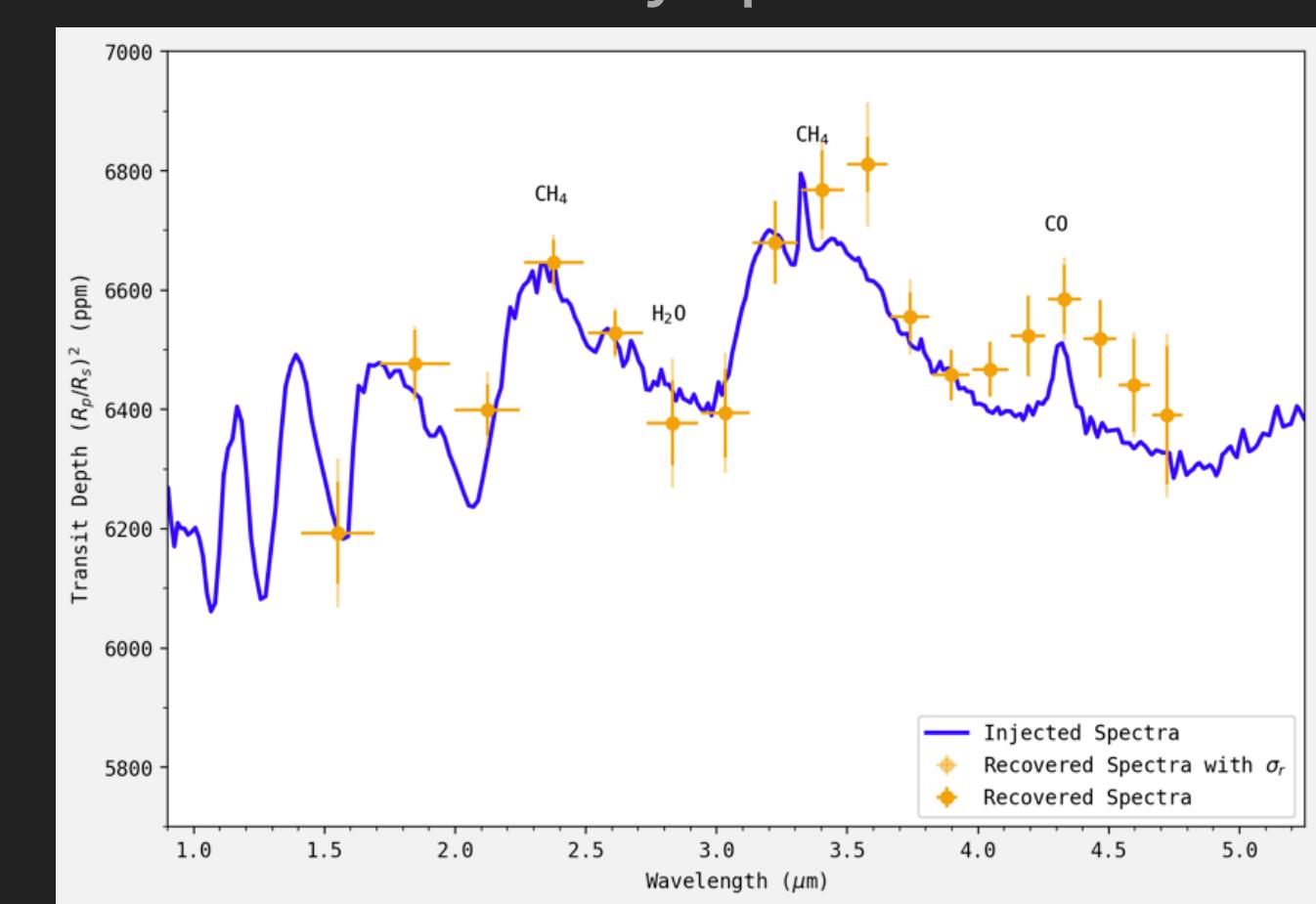
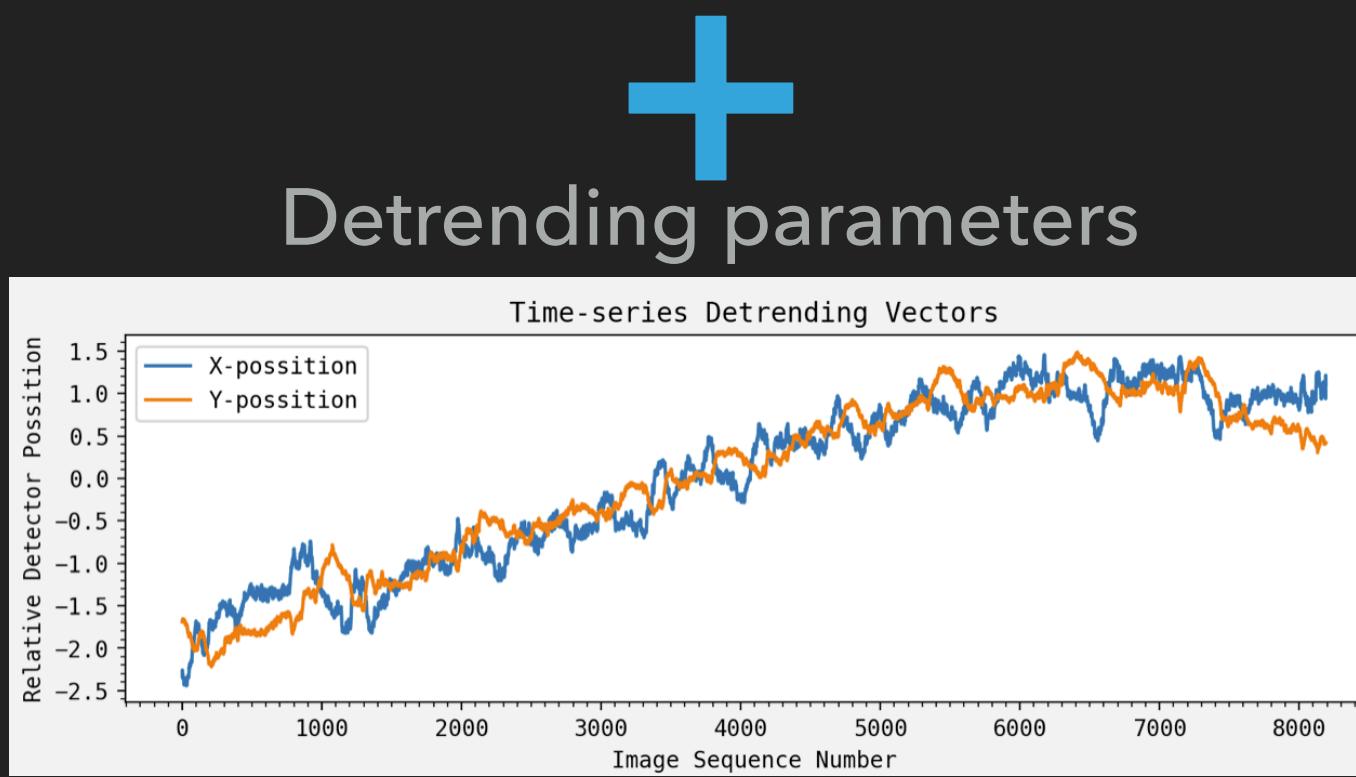
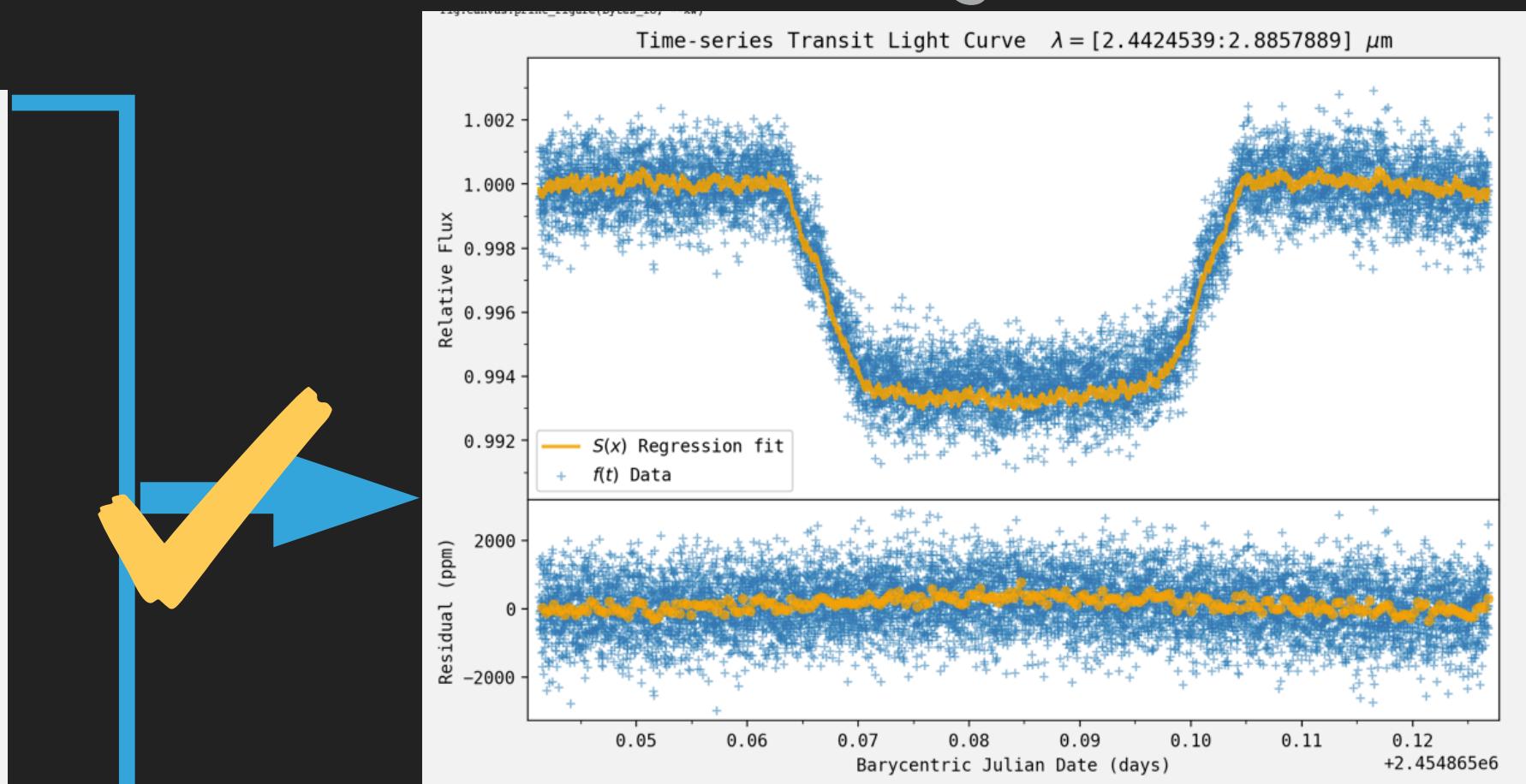
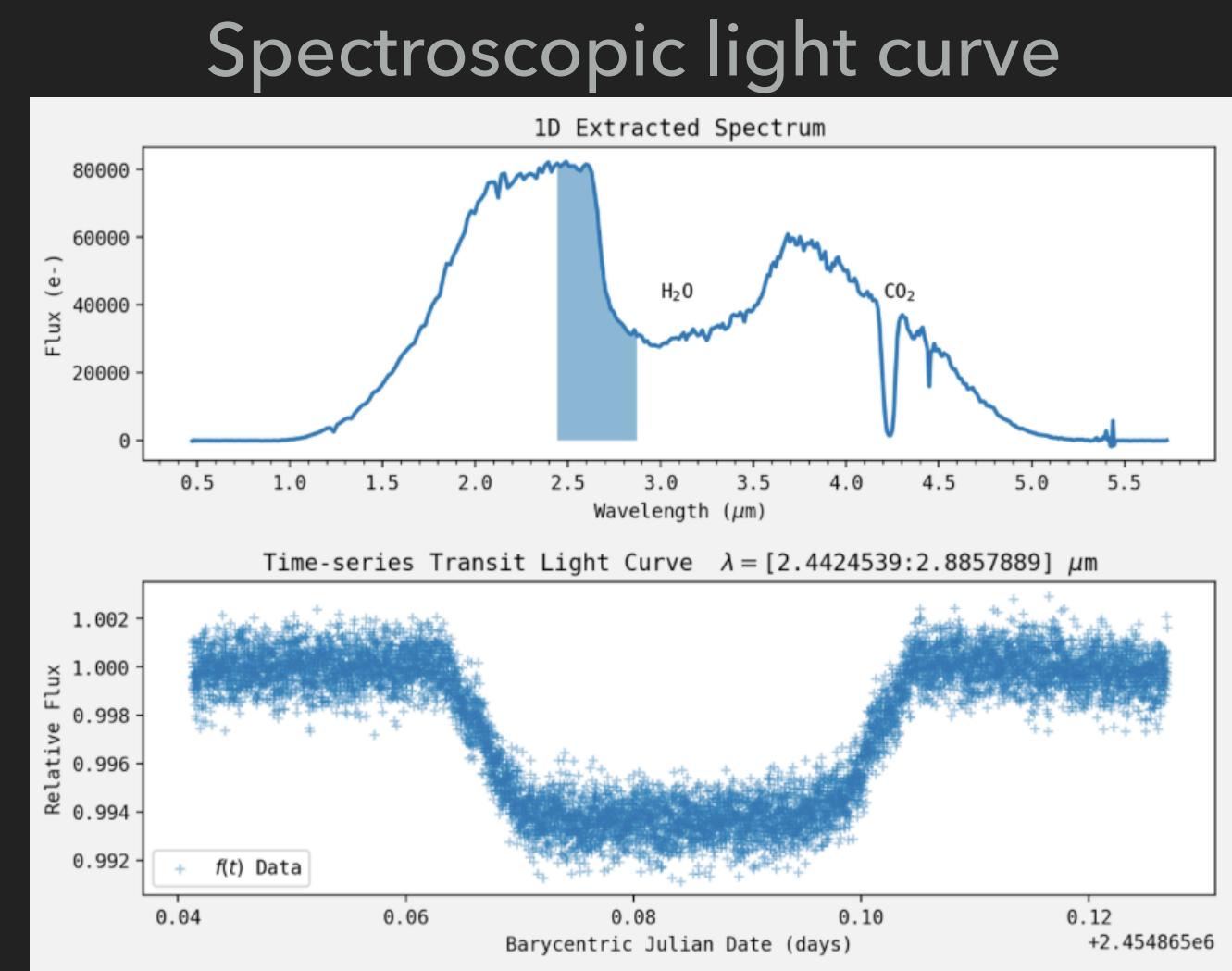
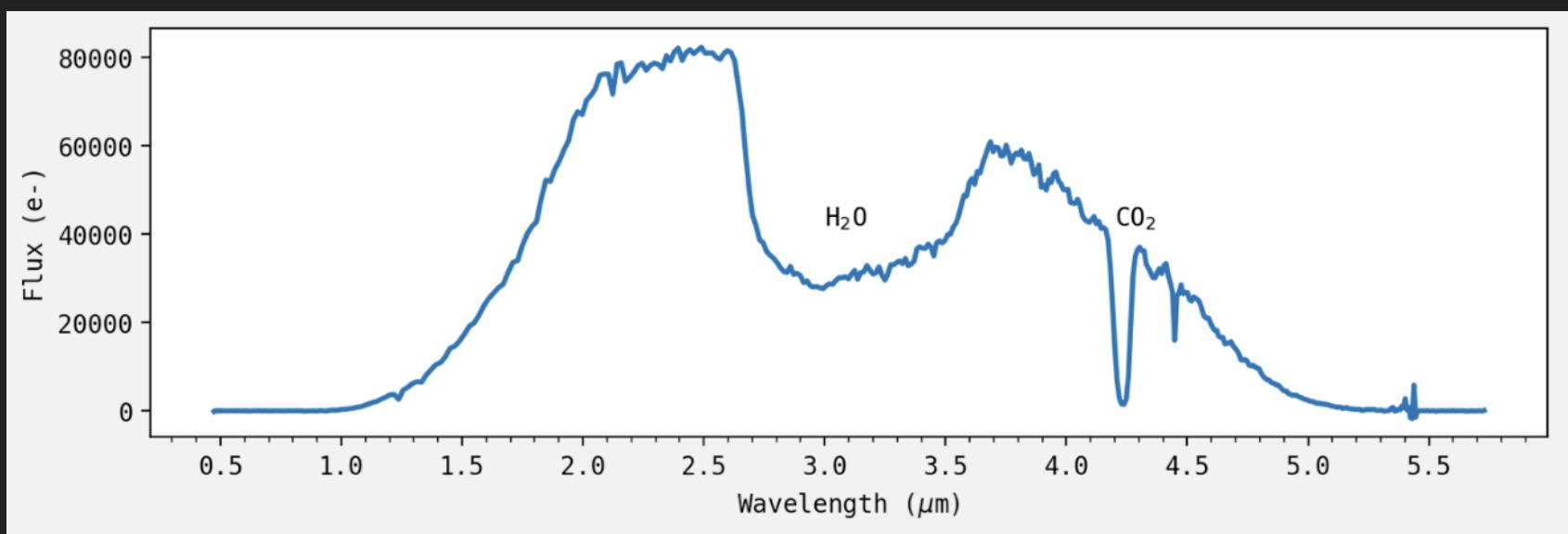


WHAT STEPS DO WE NEED TO LOOK AT?

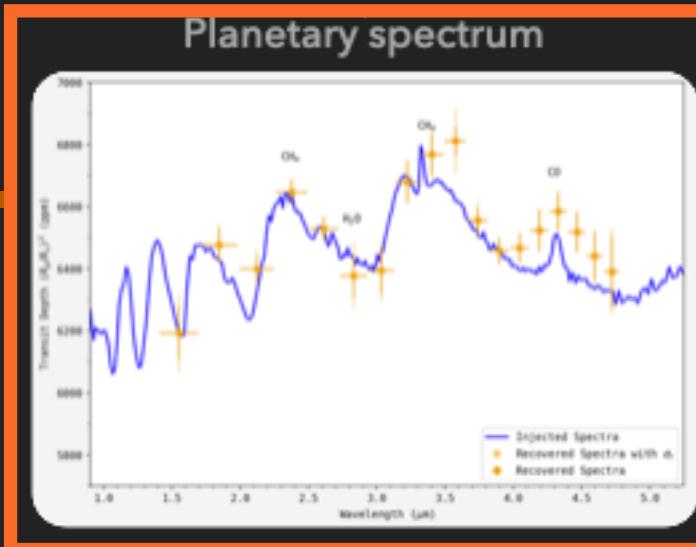


From 2D images
to
1D stellar spectra

A large blue arrow points from the 2D image down to a 1D spectrum, indicating the process of extracting a 1D spectrum from a 2D image.

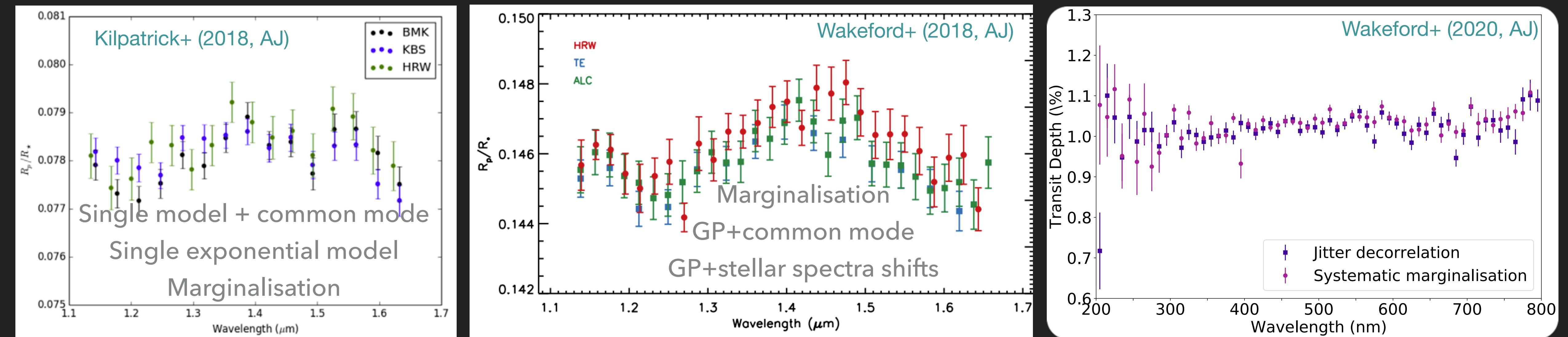


DIRECTLY COMPARING REDUCTION METHODS



It is equally as important to validate the shape of the transmission spectrum across multiple reductions.

If there is a feature there all of them should be able to find them.



Figures comparing the transmission spectra from various reduction techniques. In each of these examples the spectra were all well within 2σ of each other

COMPARING MULTIPLE VISITS AND INSTRUMENTS

It is important to determine if the spectra are consistent across multiple instruments and observations to combine multiple wavelengths.

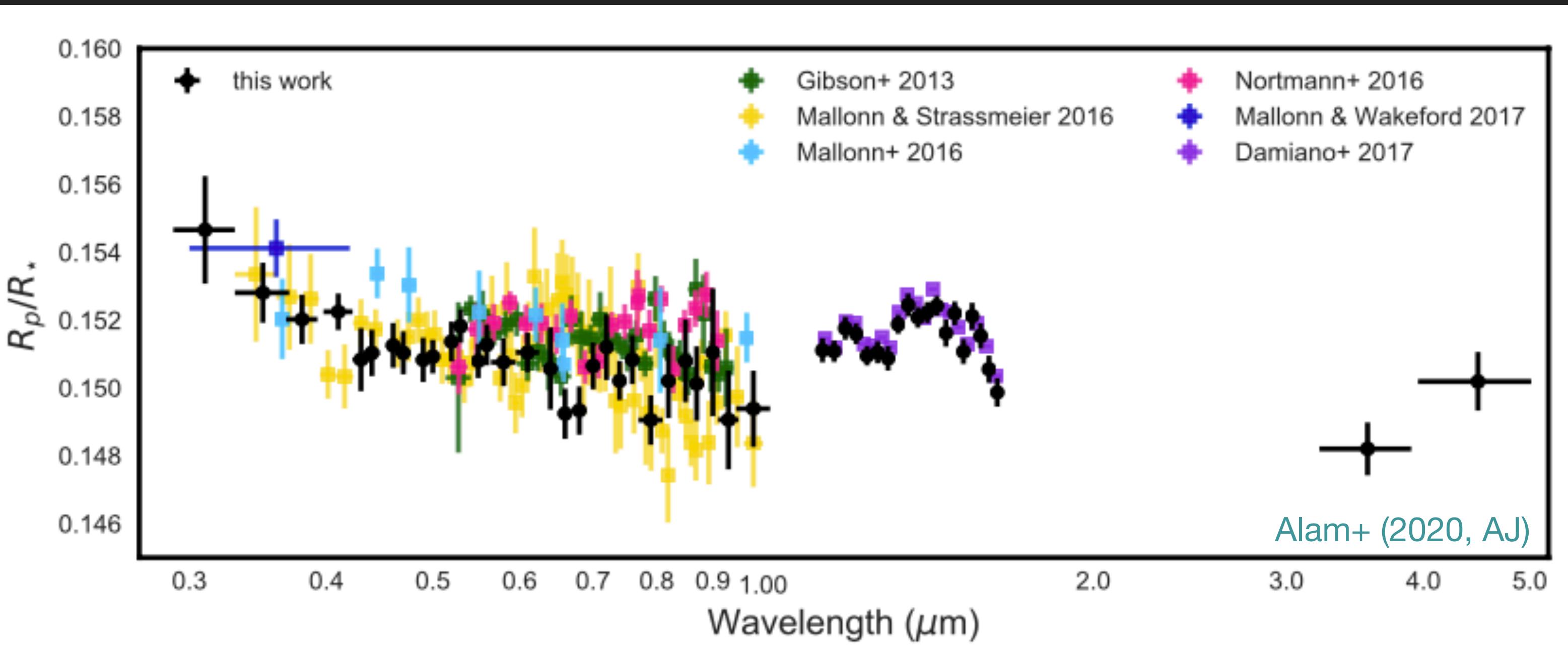
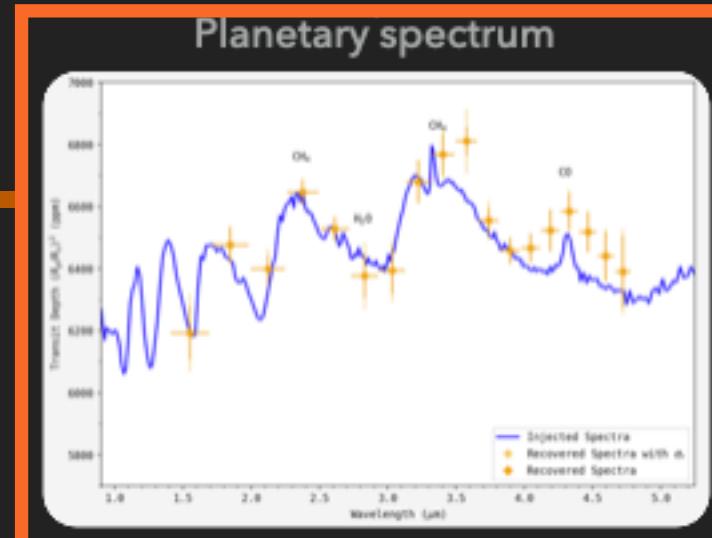


Figure showing the comparison across multiple instruments datasets and analysis

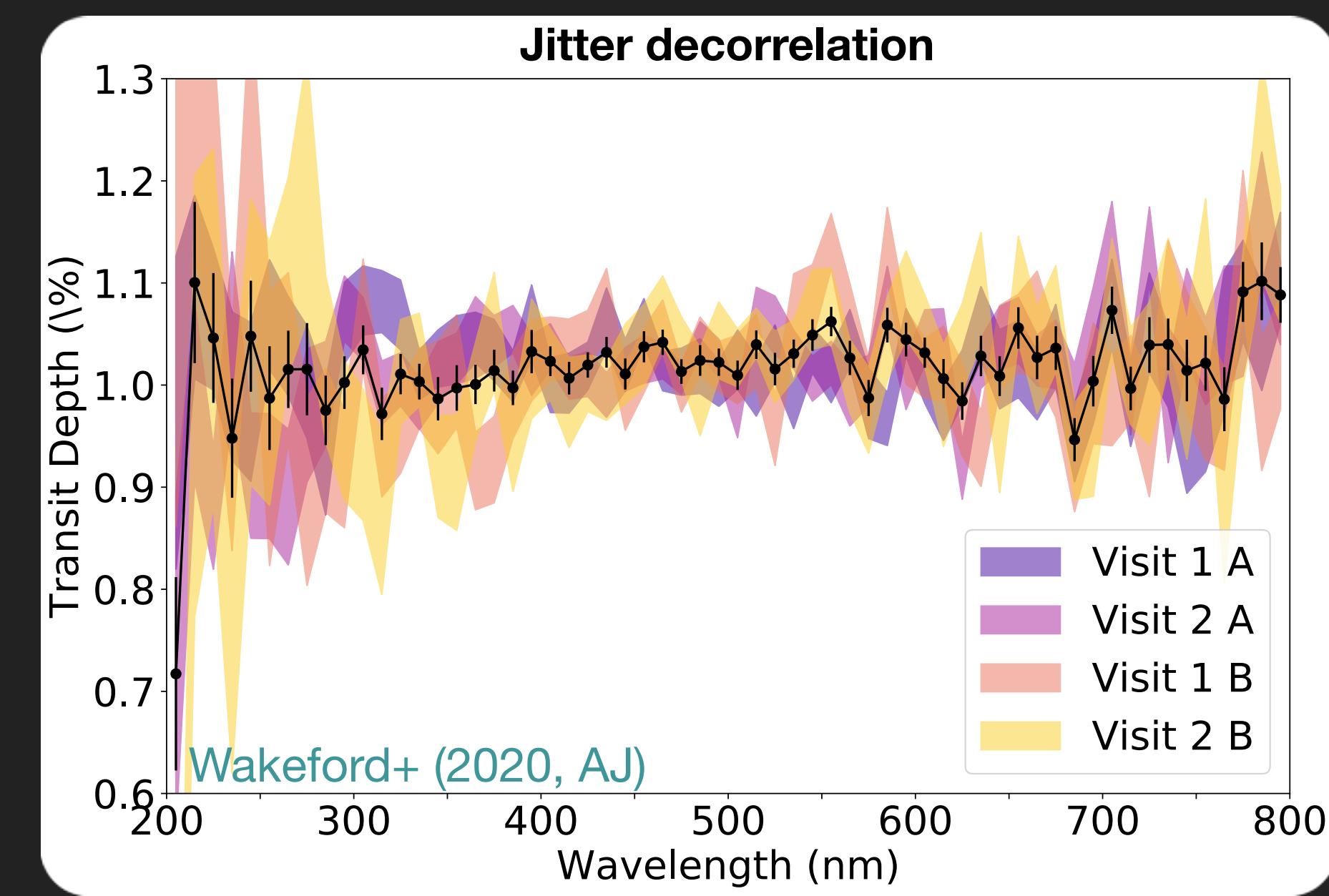
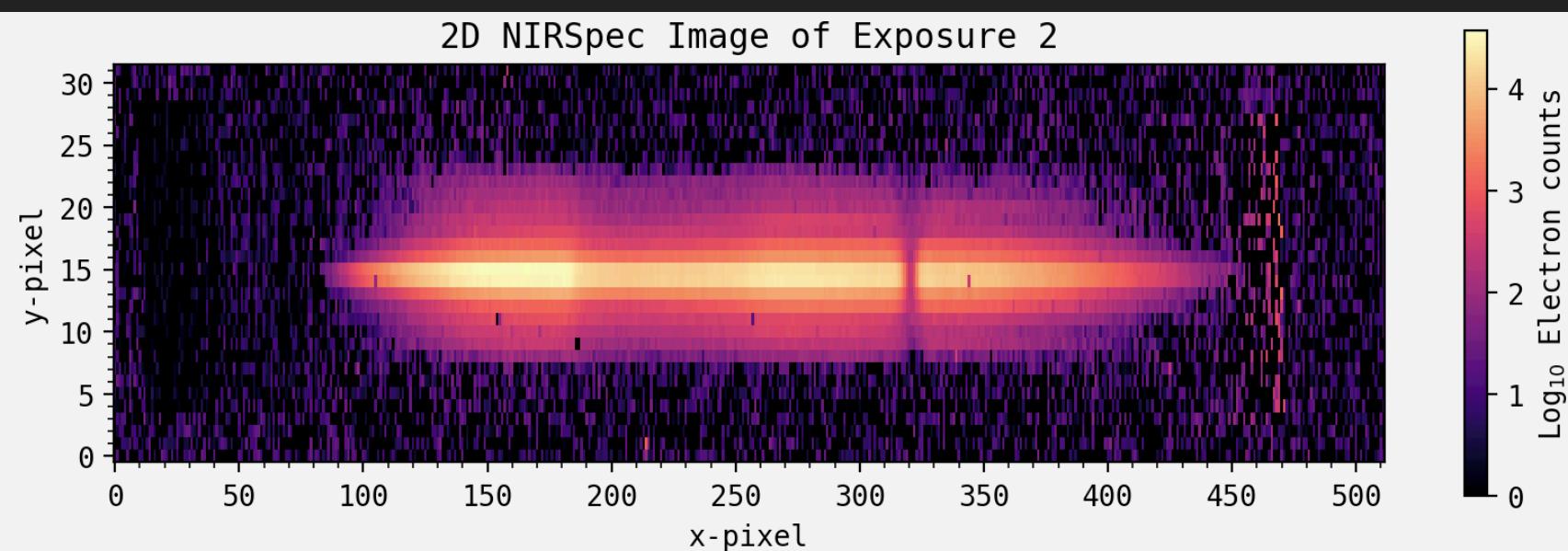


Figure showing the comparison across multiple observations with the same instrument and analysis

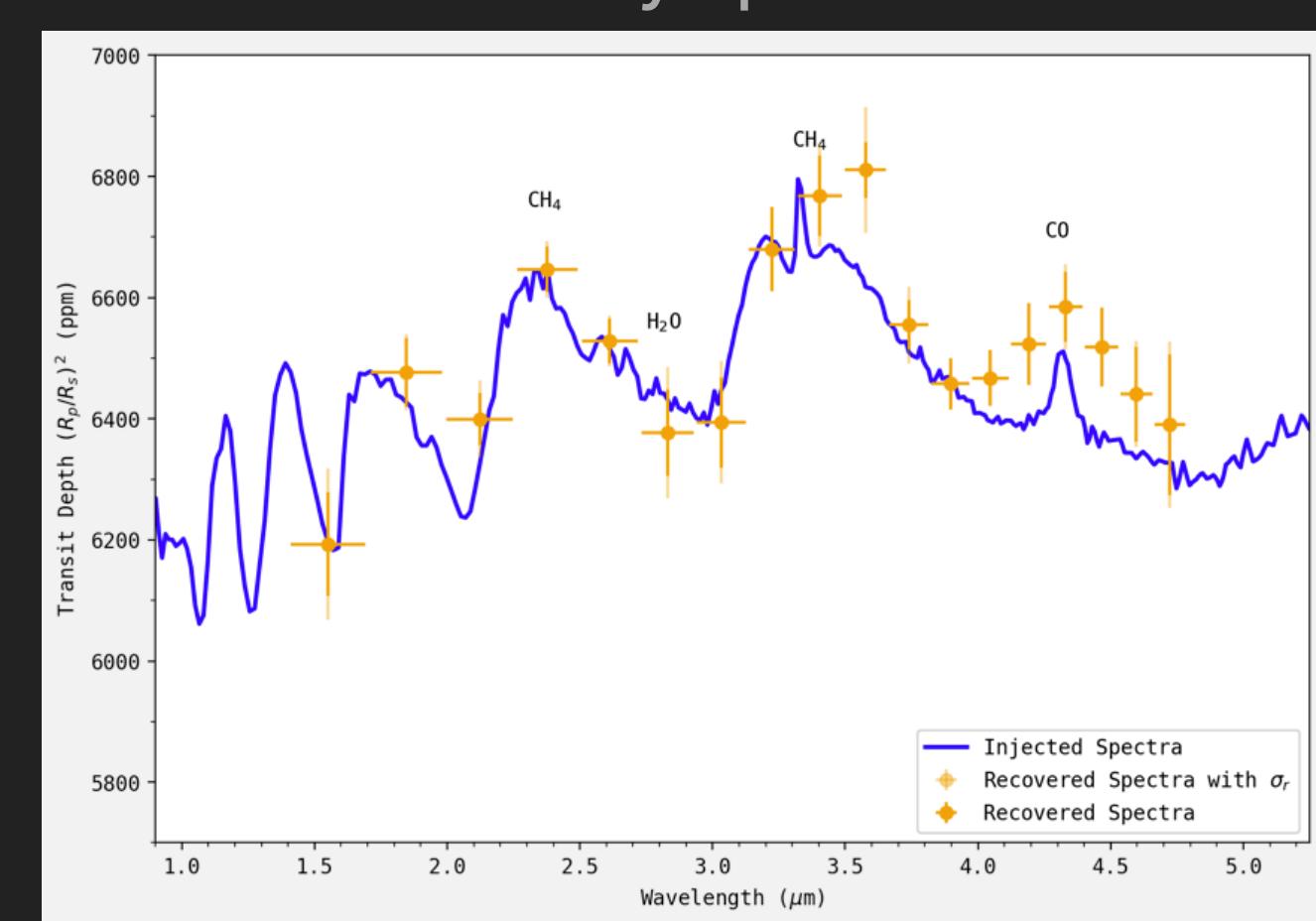
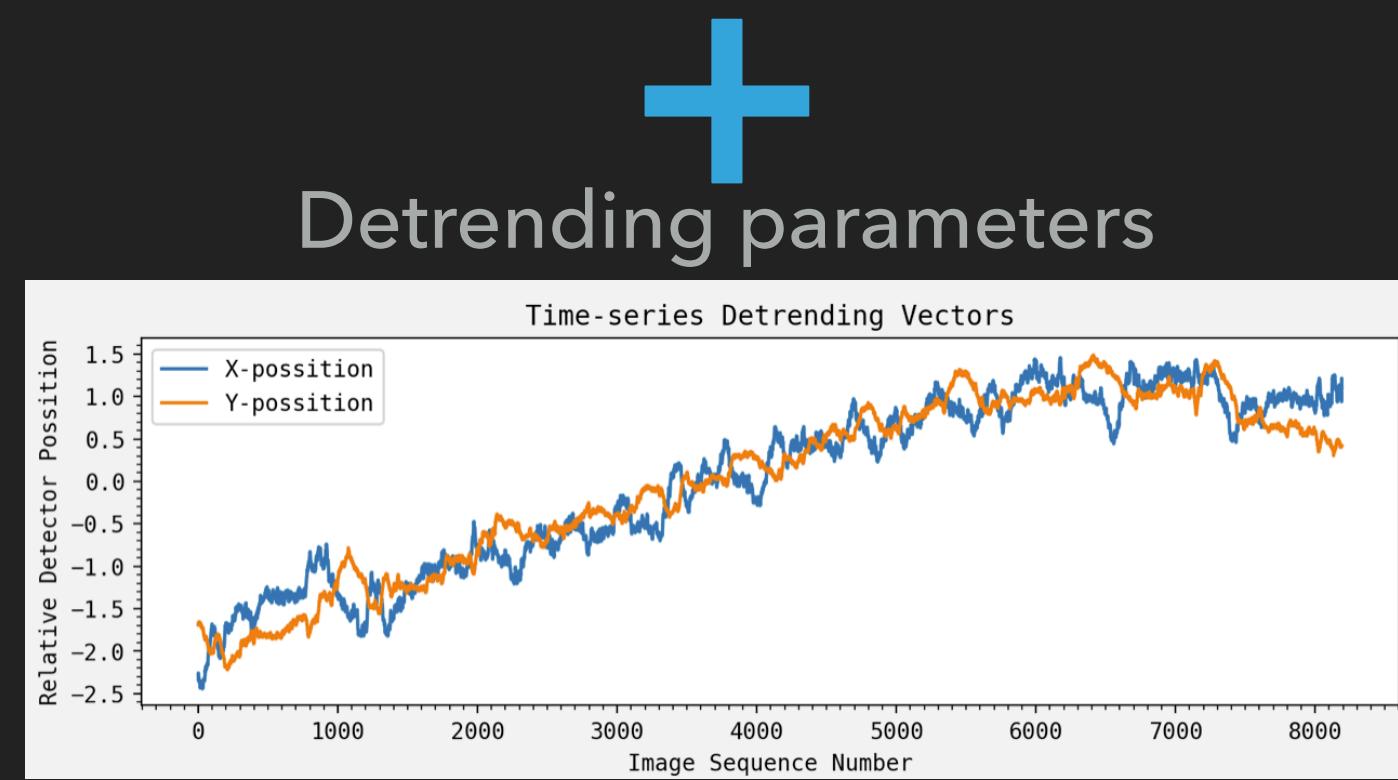
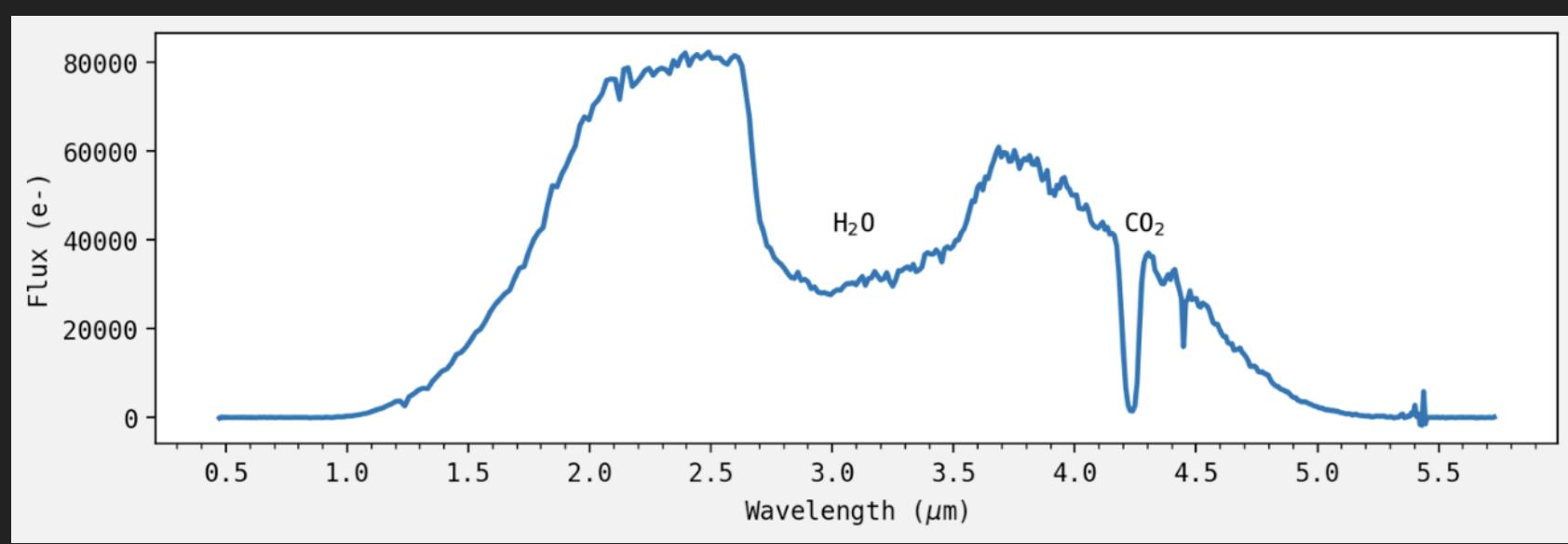
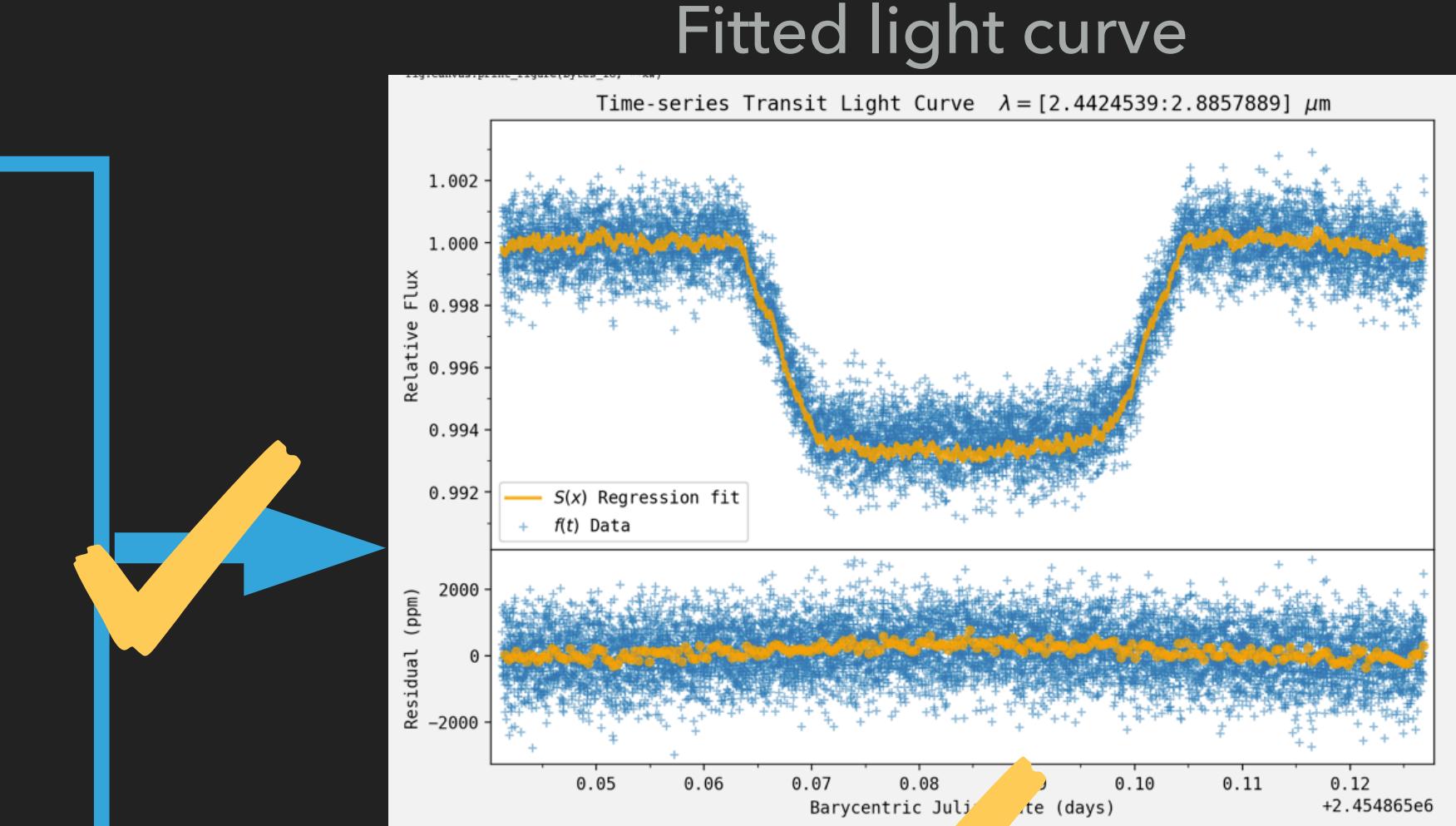
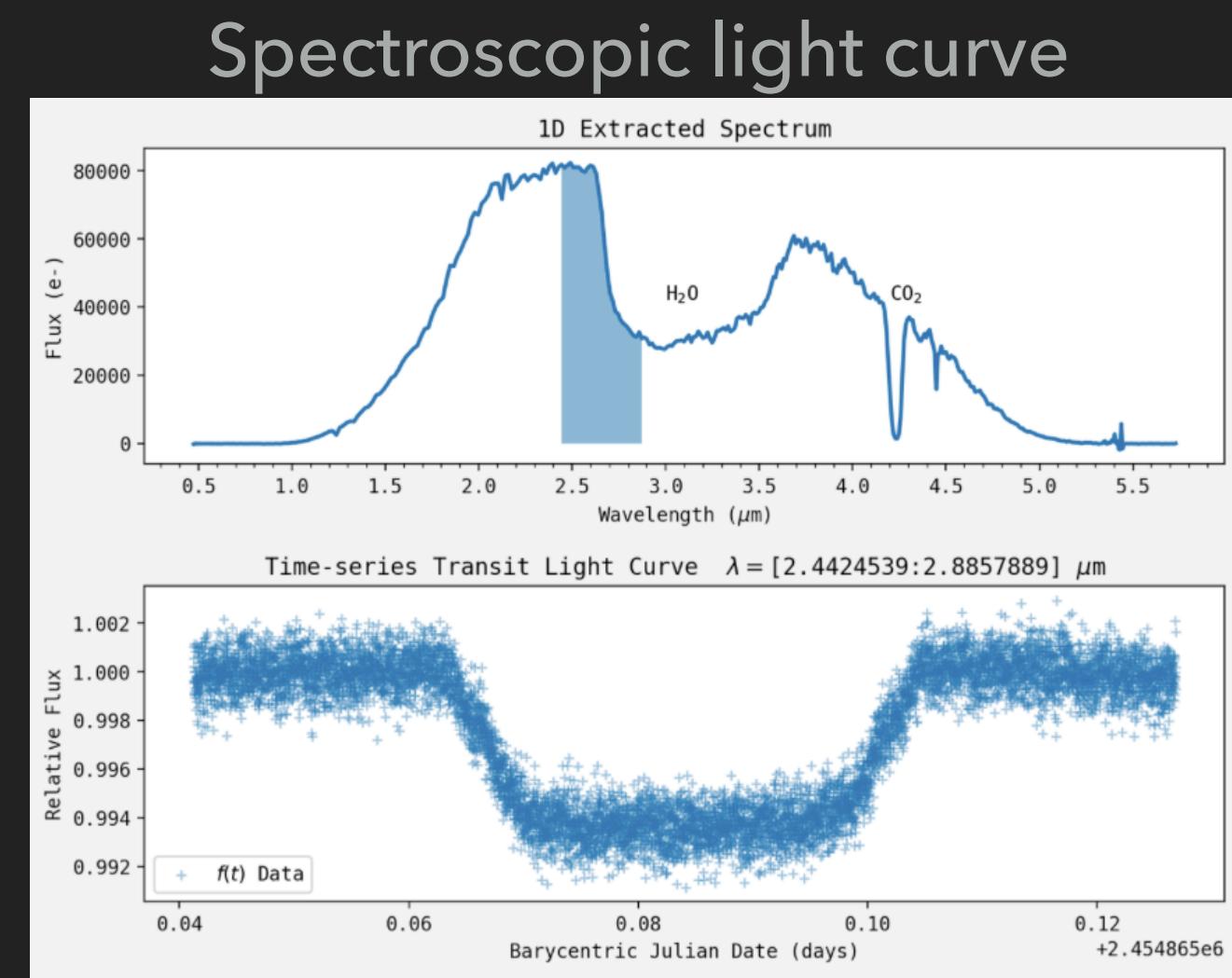
Is there enough information to determine a trend linked to 3D or 4D effects?
(See Kilpatrick+ 2020, AJ)

WHAT STEPS DO WE NEED TO LOOK AT?

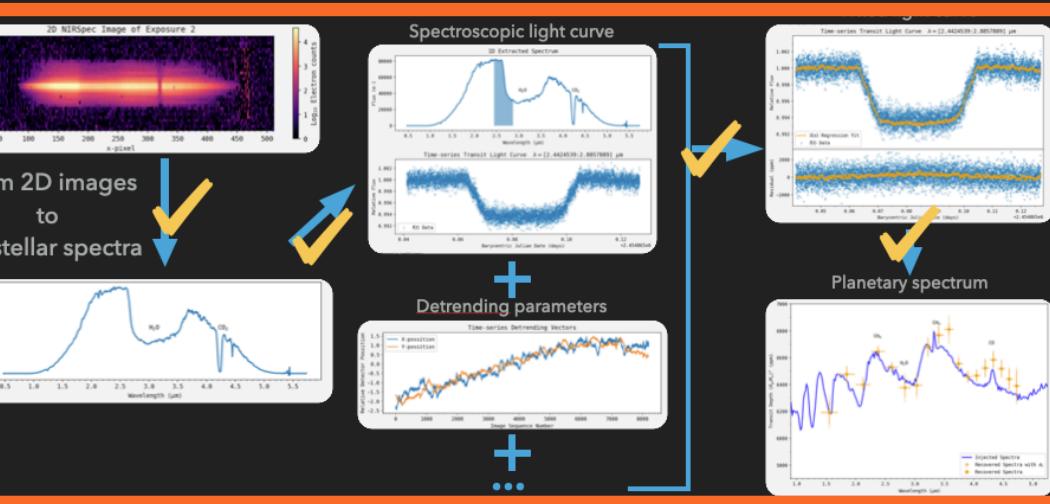


From 2D images
to
1D stellar spectra

A blue arrow points down from the 2D image to a 1D spectrum, and another blue arrow points up from the 1D spectrum to the 2D image, indicating a two-way process.



OUR JOB AS OBSERVERS



We need to be as consistent, complex, complete, and timely as possible in our analysis (please pick two)

Test the limits of the instrument (DD-ERS)

Model the systematics and PSF as a function of time and accurately adapt the analysis techniques to account for any changes

Determine if there are offsets between combined datasets or analysis methods

Learn from observations:

- the physical reasons for the dominant systematics
- how to make the next observations more precise

Explain the origins of the data uncertainty and discuss the impact that may have on retrieved abundances

NEXT! KEVIN STEVENSON WITH THE BREAKDOWN

