## **Prospects for Future Discoveries** with Kepler and K2

A talk by **Geert Barentsen & the K2 team** at #AAS233, replacing *Jessie Dotson* (NASA Ames).





Cartoon by Dr. Christina Hedges







Photo by Marc Schiele on unsplash.com

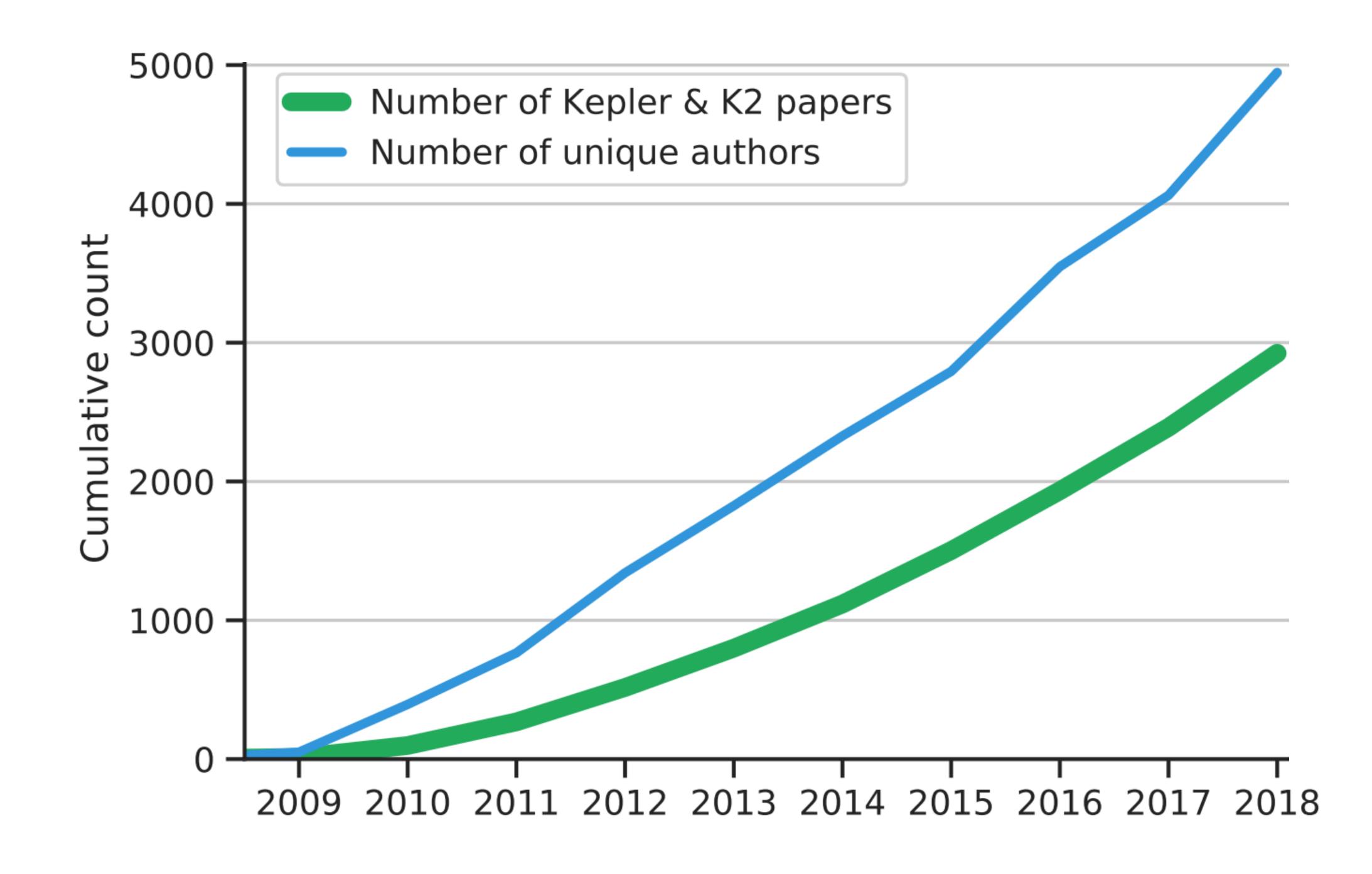


# In 2018, 1.6 publications per day used Kepler or K2 data

2016: 1.2 per day 2013: 0.8 per day 2010: 0.2 per day

Photo credit: motorverso.com (cc-by)





# Will Kepler's discoveries continue? Is there any science left to do?

Christina Hedges Are there **any more planets** in the Kepler/K2 data?

Susan Mullally How can we go about **vetting new planets** from K2?

Daniel Huber What is left to learn about Kepler/K2 **planet host stars**?

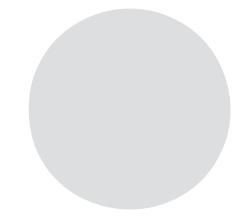
James Davenport What will Kepler/K2 teach us about **our Galaxy**?

Krista Lynne Smith What will Kepler/K2 tell us about **other galaxies**?

Daniel Foreman-Mackey How can new **data analysis methods** get more out of Kepler/K2 data?

Megan Ansdell How can **machine learning** contribute to mining Kepler data?





## Poster session at 1pm today (445.xx)

Nick Saunders (445.02) Exoplanet science with Lightkurve

Michael Gully-Santiago (445.03) Stellar rotation & asteroseismology with Lightkurve

Ken Mighell (445.04) A tool to improve Short-Cadence Light Curves

Steve Bryson (445.05) Exoplanet Ocurrence Rates using Kepler DR25

Jeff Coughlin (445.06) **The K2 Uniform Reprocessing Effort** 

Doug Caldwell (445.07) **The Kepler Photometer after 10 years** 

Jason Curtis (445.08) **Gyrochronology (Ruprecht 147)** 

Ellianna Schwab (445.09) **M Dwarfs in the Kepler Field** 

# Will Kepler's discoveries continue? Is there any science left to do?





# Kepler's discoveries will continue

1) new data 3) new tools

- 2) new methods



# 1. new data

Photo by Samuel Zeller on unsplash.com

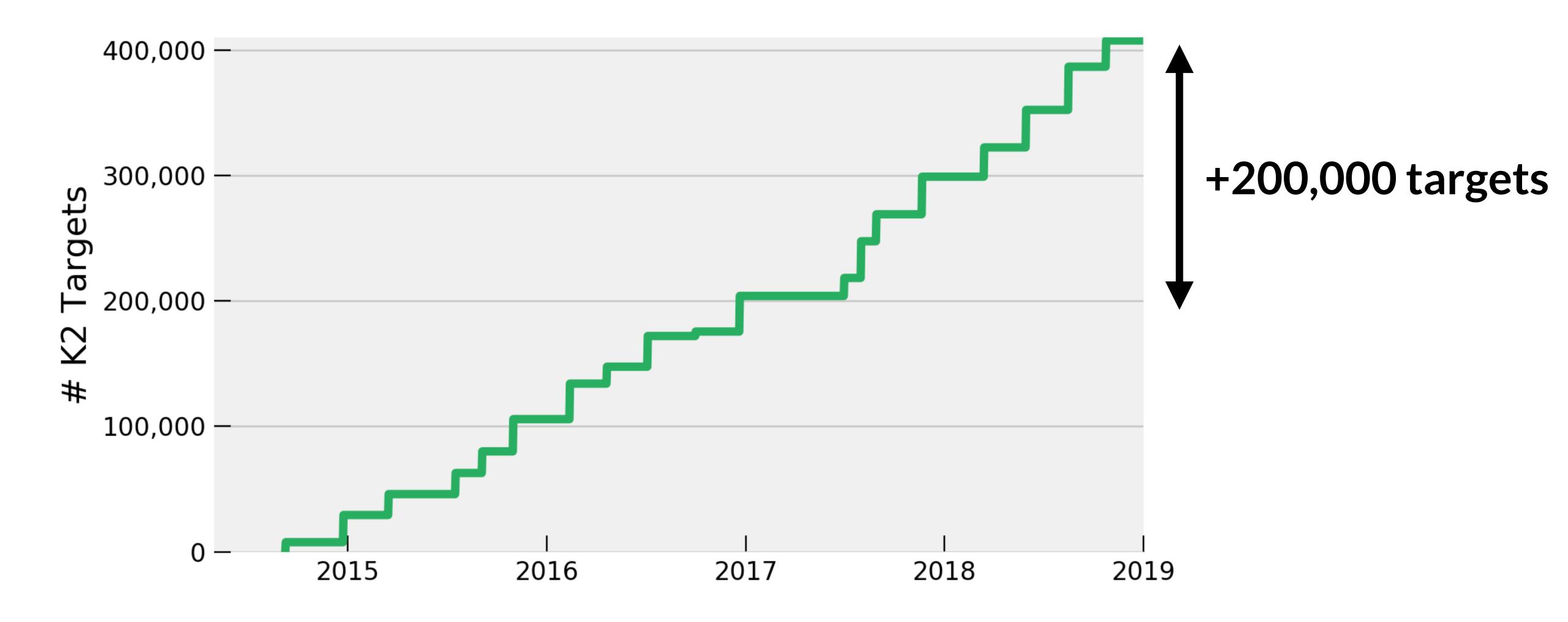


# GALAI

### See talks by Huber & Davenport in this session.

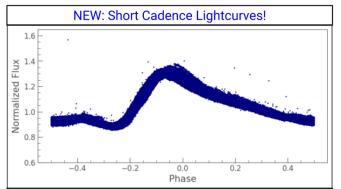


## The K2 data set doubled in the past 18 months

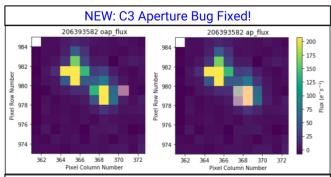


## K2 data is being re-processed in a uniform way

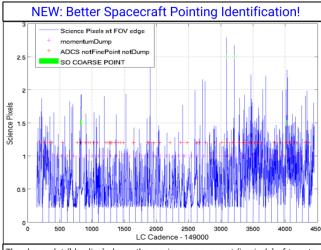




A new feature of the final K2 pipeline is the creation of short-cadence lightcurves. Above is the phased PDC short-cadence lightcurve of an RR Lyr type (pulsating) star, EPIC 206003187, observed in Campaign 3. Cadences right near thruster firings have been removed (see poster 445.04 by Ken Mighell), but no other modifications have been made to this publicly available PDC lightcurve. While not every short-cadence target is guaranteed to be detrended by well by PDC as this one, having these lightcurves available to the community should enable increased ence on targets with short-cadence data.



The original C3 processing was affected by a bug that resulted in several thousa targets having poorly chosen photometric apertures. The reprocessing of C3 fixed nis bug, as shown by the example above for EPIC 206393582, where the pixels comprising the optimal aperture are identified via a transparent grav overlay. In the original processing (left) the optimal aperture was a single pixel to the right of the target, which is clearly wrong - in the reprocessing (right) the optimal aperture is 4 els centered on the target.



e above plot (blue line) shows the maximum movement (in pixels) of targets at the edge of the field of view during each long cadence exposure throughout Campaign 15. Outliers due to poor pointing during an exposure should be removed prior to detrending by the PDC module – the less outliers there are to detrend, the more detrending power can be spent on more important large-scale systematics. us versions of the K2 pipeline removed outliers marked by a red cross (ADCS notFinePoint notDump), which are automatically flagged by the spacecraft rzealously in some campaigns, resulting in a loss of many good cadences. In the final version of the K2 pipeline, the ADCS flag is ignored, and instead the cadences marked in green (SO Coarse Point; any cadence above 2.5 pixels, or several cadences in a row above 1.5) are removed prior to PDC, resulting in better PDC lightcurves and preservation of good cadences. Additionally, the magenta ntumDump) indicate times of thruster firings - for C6-C10 this flag was ignored, but as these are indeed truly poor quality cadences, in the final K2 pipeline these cadences are also removed prior to PDC. Figure Credit: Jeffrey Van Cleve

#### The **K**2 Mission Global **Uniform Reprocessing Effort**

Jeffrey Coughlin<sup>1,2</sup> for the Kepler/K2 Team <sup>1</sup>SETI Institute, <sup>2</sup>NASA Ames

- The Kepler pipeline was quickly adapted to run on K2 data when it was first obtained. Much has been learned about K2 data and many pipeline improvements have been made throughout the past several years.
- Most older campaigns were never reprocessed with newer versions of the K2 pipeline, resulting in campaign-to-campaign variations.
- A global, uniform reprocessing of all K2 data is being conducted to enhance scientific return of the K2 dataset. It is providing for consistent, high-quality data to all community members, and making statistical studies across multiple campaigns more feasible.
- Campaigns 15 and onward have been processed with the final version of the K2 pipeline. Older campaigns are being reprocessed with the same, final version. Campaigns have been prioritized by the expected enhanced scientific return due to reprocessing.
- This work is being done on a best-effort basis. There is no guarantee that all campaigns will end up being reprocessed prior to mission closeout, but every campaign that is reprocessed provides better data to the community and enhances scientific return.
- The reprocessed pixel-level data, lightcurves, and auxiliary products can be found at MAST: https://archive.stsci.edu/k2/
- (While old data are accessible, the reprocessed data are the default.) The tables below show the status of major and minor pipeline features for each campaign. Check marks indicate that the pipeline feature is present in the currently available data (black for the original data and blue for the reprocessed data). No check mark means that feature is not in currently available data

						М	ajoı	r Im	pro	ver	ner	its								
	C0	C1	C2	СЗ	C4	C5	C6	C7	C8	C9p	C10	C11	C12	C13	C14	C15	C16	C17	C18	C1
Improved Background Correction	•		•	•										•		~	~	~	~	•
Better Identification of Bad Spacecraft Pointing	-		•	~										•	~	~	~	~	~	
Better Identification of Good Spacecraft Pointing	•		•	•										•		~	~	~	~	•
Improved Cosmic Ray Correction	~		•	~								~	~	~	~	~	~	~	~	•
Short Cadence Lightcurves Produced	~		•	•										~		~	~	~	~	

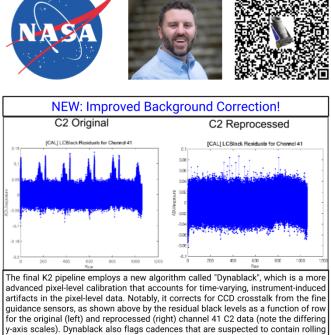
Minor Improvements

	CO	C1	C2	СЗ	C4	C5	C6	C7	C8	C9	C10	C11	C12	C13	C14	C15	C16	C17	C18	C19
LDE Parity Error Flag Ignored	•		~	•		~		~		~	~	~	~	~	~	~	~	~	۲	~
Momentum Dump Flag Used	~	~	~	~	~	~						~	~	~	~	~	~	~	٢	~
Smear Corrected Properly	~	~	~	~	~	~	~	~	~	~	~	~	~	•	~	~	~	~	~	~
FFI Interpolation Bug Fixed	~		~	~	~	~	~	~	~	~	~	~	~	~	~	~	~	~	~	~
Scrambled Uncertainties Bug Fixed	•		•	-								~	~	~	~	~	~	~	•	~
All Target Files Delivered	~	~	~	~	~	~	~	~	~	~	~		~	~		~	~	~	~	~

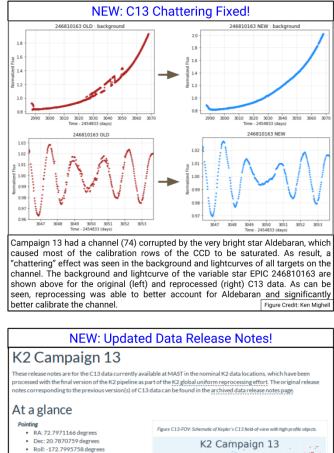
NEW: Updated Cosmic Ray Detection Threshold

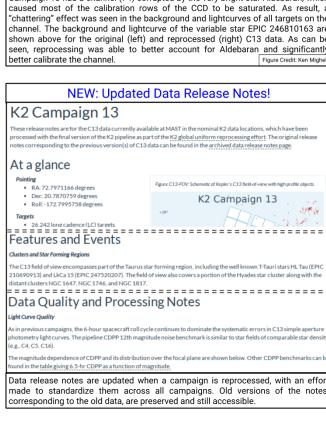
When cosmic rays impact the calibration region of a CCD during an exposure, if not corrected they result in an overcorrection of the affected column, darkening it compared to others. In the original Kepler pipeline, for the K2 pipeline prior to C11, a threshold of  $4\sigma$  was used to ntify cosmic rays. For K2 data, this threshold proved to be too aggressive, and often columns were falsely flagged, resulting in an undercorrection and thus a brightening of the entire affected column. For the final K2 pipeline, this threshold was increased to  $7\sigma$  after rforming tests with various threshold levels on real K2 datasets. The images above show one cadence of data containing Uranus - many columns can be seen as too bright (and thus alsely flagged) in the original (left panel) C8 processing. The middle panel shows a test run on the same C8 data with a  $7\sigma$  threshold, which reduces the number of falsely flagged columns. The right panel shows the same test with no cosmic ray flagging at all, but when examining the impact on all targets, this is not an acceptable option. The value of 7σ used in the final K2 pipeline provides a reasonable middle-ground. Figure Credit: Christina Hedges





band artifacts, which are time-varying electronic signals that can mimi astrophysical signals such as transits, lensing events, and supernovae. Th mprovement will result in better lightcurves and better identification of lightcurv ires due to systematics.





See poster by Jeff Coughlin at 1-2pm today (445.06)



2. new methods

Photo by Jens Lelie on unsplash.com



### Examples include ...

# **Gaussian Processes Gradient-based methods** Machine Learning

### See talks by Foreman-Mackey & Ansdell in this session.



#### 🖀 lightkurve

### lightkurve

1.0b9

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**GETTING STARTED** 

Quickstart

Installation

API documentation

TUTORIALS

Introduction to lightkurve

Science with lightkurve

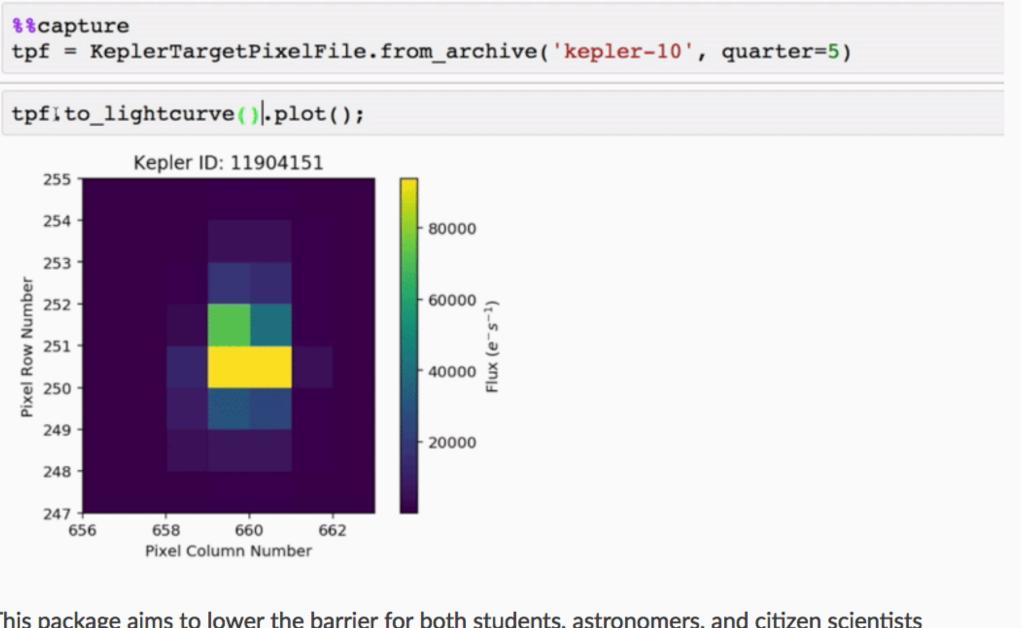
Systematics correction using lightkurve

ABOUT LIGHTKURVE

Contributing and reporting issues Citing and acknowledging lightkurve Other software Docs » Welcome to lightk

#### Welcome to lightkurve!

The **lightkurve** Python package offers a beautiful and user-friendly way to analyze astronomical flux time series data, in particular the pixels and lightcurves obtained by **NASA's Kepler, K2, and TESS missions**.



This package aims to lower the barrier for both students, astronomers, and citizen scientists interested in analyzing Kepler and TESS space telescope data. It does this by providing **high-quality** 

## docs.lightkurve.org

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#### lightkurve

## lightkurve

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### Tutorials

- Introduction to lightkurve
  - What are Target Pixel File objects?
  - What are Light Curve objects?
  - What are Light Curve File objects?
  - Interactively inspecting Target Pixel Files and Lightcurves
- Science with lightkurve
  - $\circ~$  How to recover a known planet in Kepler data
  - How to combine lightcurves from different Kepler quarters
  - How to perform aperture photometry with custom apertures
  - $\,\circ\,$  How to cut out Target Pixel Files from Kepler Super Stamps or TESS FFIs
  - How to store a light curve in FITS format?
- Systematics correction using lightkurve
  - How to remove common systematics using basis vectors (CBVs)
  - How to remove K2 motion systematics with SFF
  - How does the SFF method work?
  - Replicating Vanderburg & Johnson 2014 using lightkurve
  - How to identify time-variable background noise ("rolling bands")?

## docs.lightkurve.org



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#### CONTENTS:

Simulate Target

Scope Math

Batch

Source Code on Github

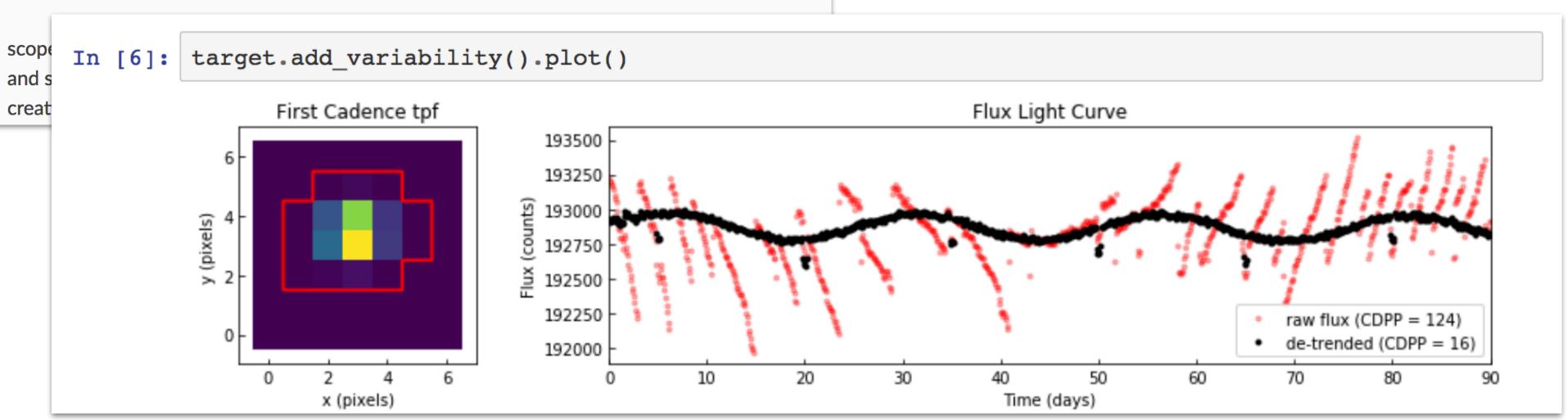
Examples

**Docs** » Welcome to scope!



#### Welcome to scope!

Simulated CCD Observations for Photometric Experiment

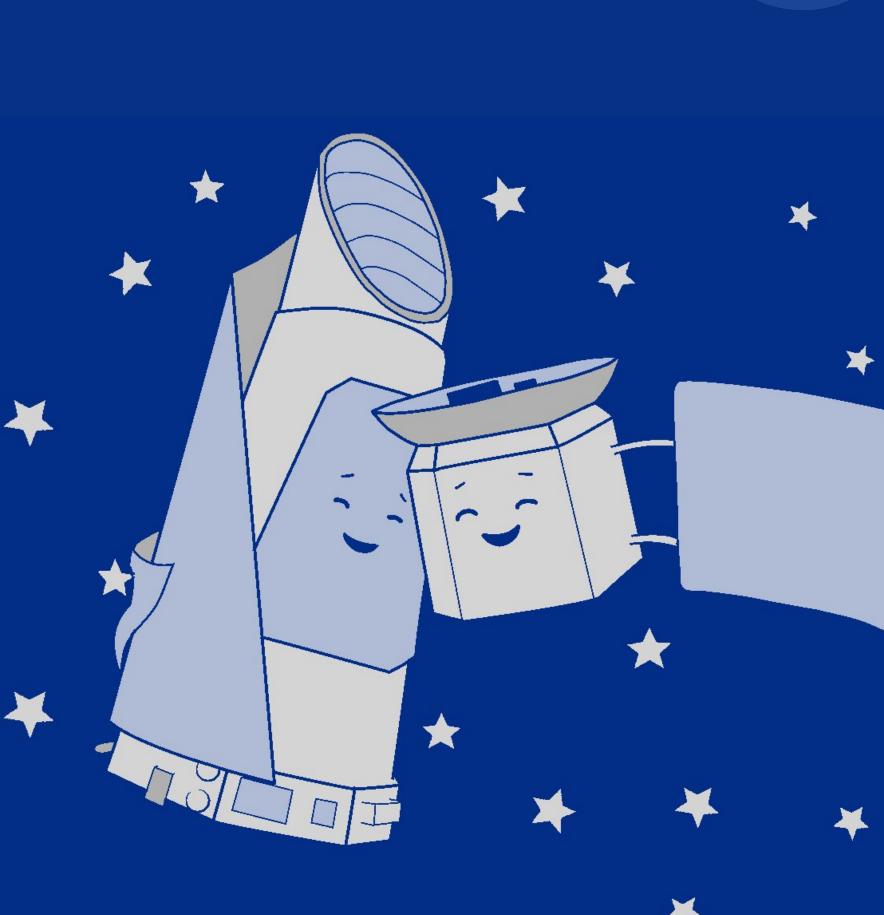


### https://nksaunders.github.io/scope

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While Kepler's data collection has ended, the space photometry revolution is only just getting started!

Congratulations to TESS for a beautiful first data release!



Cartoon by Christina Hedges





## Late posters accepted through Jan 15!

March 4 – 8, 2019 Glendale, CA

# KEPLER&K2 SciConV. 10 years since launch

