# Three reasons why Kepler's discoveries will continue

Jessie Dotson Kepler/K2 Project Scientist NASA Ames Research Center



4



Three reasons why Kepler's discoveries will continue

& why I'm looking forward to Cool Stars 21!!!

Jessie Dotson Kepler/K2 Project Scientist NASA Ames Research Center







Photo by Marc Schiele on unsplash.com



# At present, 2.1 publications per day use 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)



# Many of Kepler's most intriguing discoveries are still emerging.

1) new data 3) new tools

# Kepler's discoveries will continue

- 2) new methods

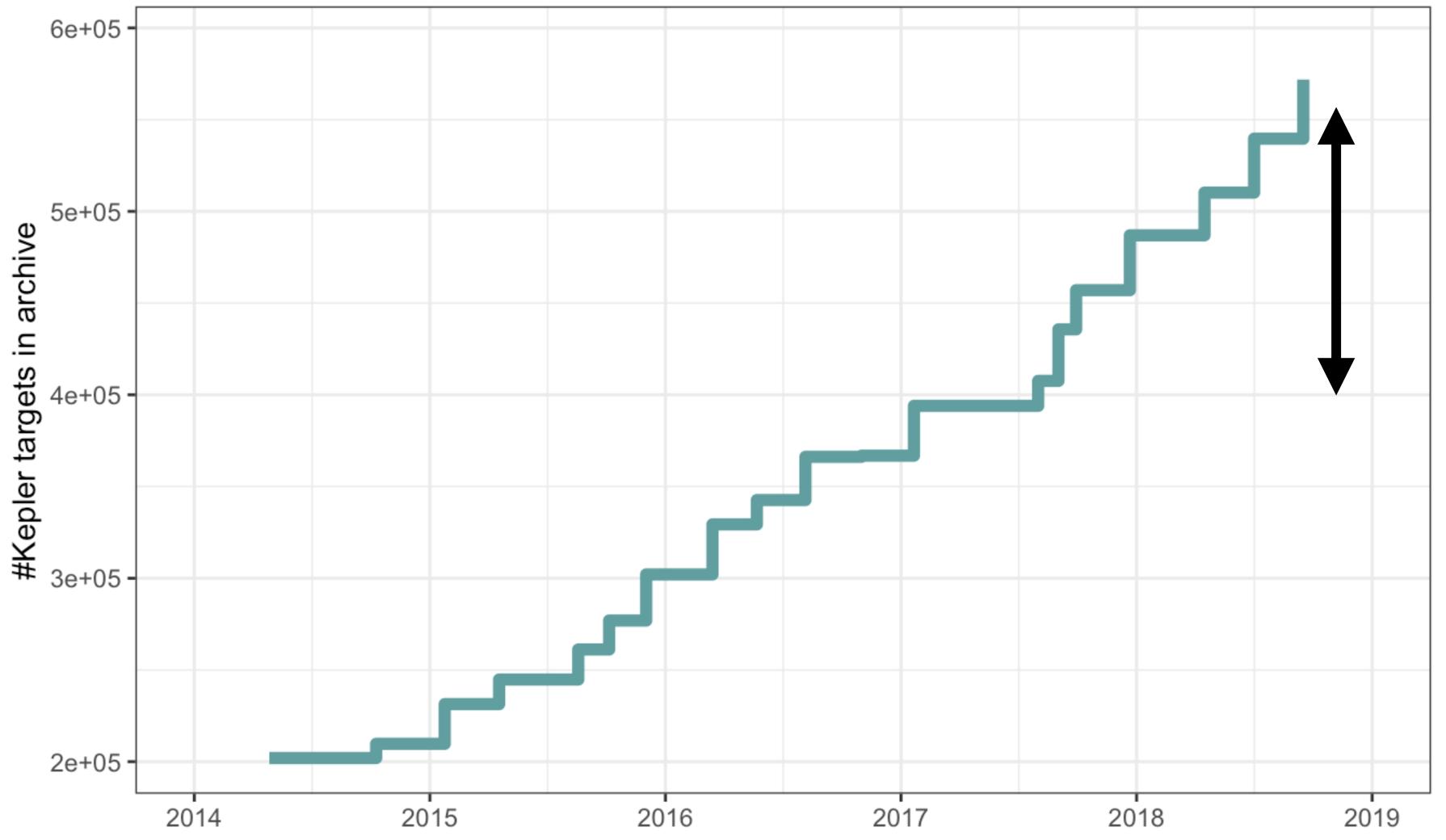


# 1. nev data

Photo by Samuel Zeller on unsplash.cor



## The number of targets with Kepler data increased by 30% over the past year

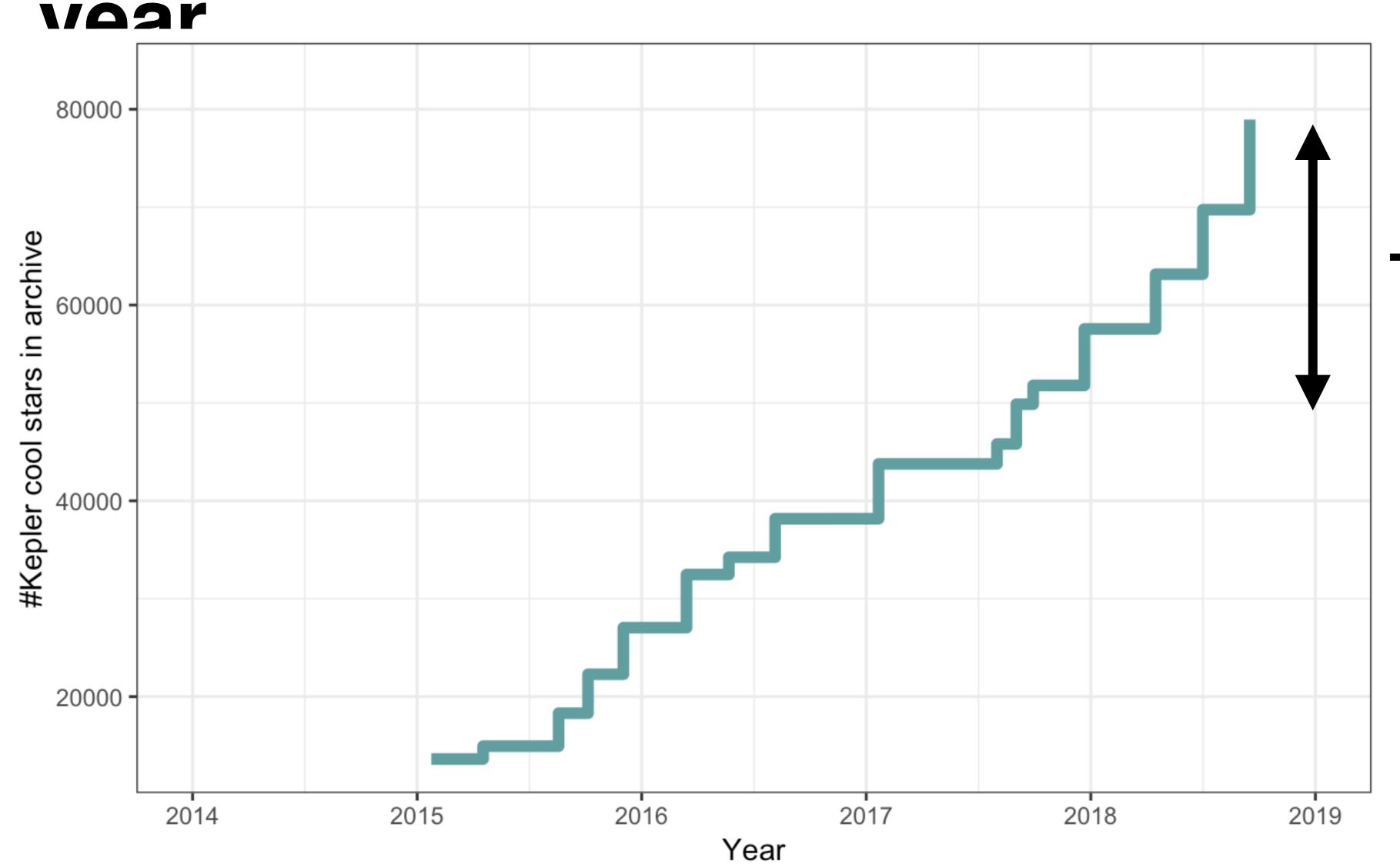


Year

### +150,000 targets



## The number of cool stars with Kepler data has almost doubled over the past



### +35,000 cool stars

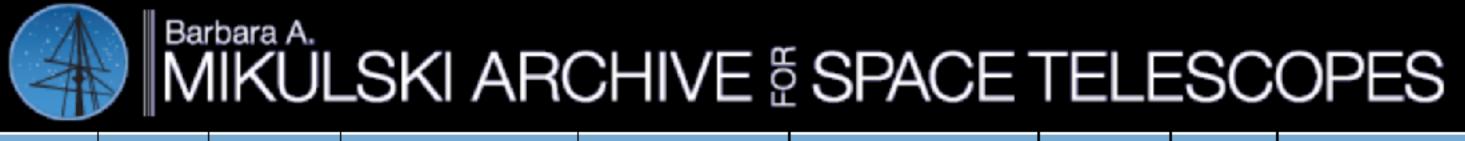


## K2 has observed two dozen clusters across all ages

- Young open clusters (1-10 Myr) Taurus, Upper Sco, rho Ophiuchus, Lagoon (NGC 6530).
- Moderately young open clusters (0.1-1 Gyr) Pleiades, Hyades, M35, M44 (Beehive), NGC 1647, NGC 1746, NGC 1750, NGC 1758, NGC 1817.
- Middle-aged clusters M67, Ruprecht 147, NGC 2158.
- Globular clusters M4, M9, M19, M80, Terzan 5. NGC 5897, NGC 6293, NGC 6355.

Campaigns 5, 16, & 18 overlap => M67 & M44 were observed for 3 x 80 days (3-yr baseline)





MAST	STScl		Tools 💌		Mission Search	•	Search Website
About MAST 0			tting Starte	ł			

### K2SUPERSTAMP

Cody et al. 2018, RNAAS, 2a, 25 Source code available on GitHub.

**Introduction** 

**Description of Data Products** Download README Data Access

### Introduction

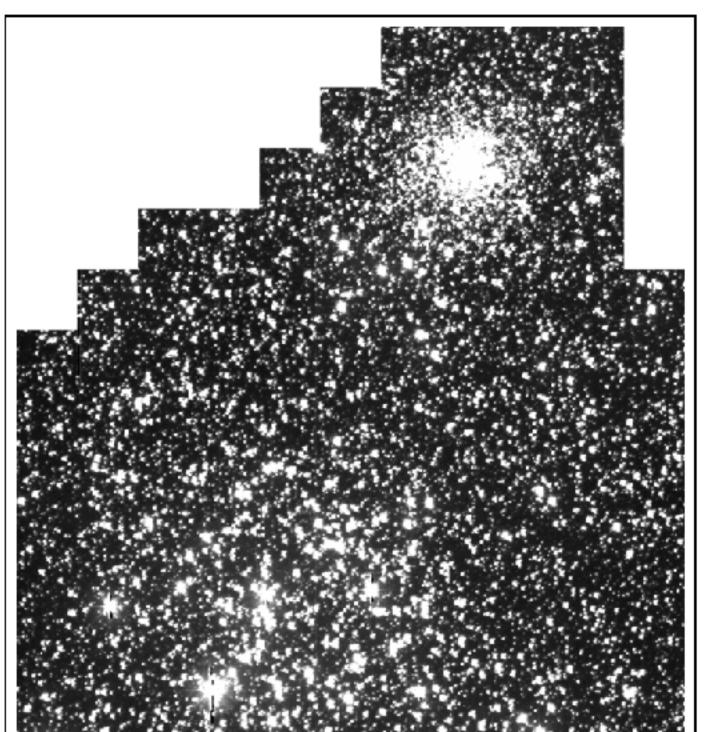
The K2SUPERSTAMP project consists of image data on four open clusters observed by the NASA K2 Mission. The clusters are M35, M67, Ruprecht 147, and NGC 6530-- the Lagoon Nebula Cluster (referred to here as the Lagoon). While data for these regions were previously released by K2, it consisted of small (~50x50) target pixel file stamps. In this release, the K2SUPERSTAMP team have stitched together all small stamps for each region to create one larger image for every epoch, and subsequently fit a world coordinate system (WCS) solution to each resulting FITS file.

With these products it is now possible to identify any and all stars in these open cluster regions via their right ascension and declination. Most stars that fell across the edge of the target pixel files now have spatially continous data. The data is flux in counts (e-/s), and for M67 and Ruprecht 147 only, it has been background subtracted (background was not estimated by the K2 pipeline for M35 and the Lagoon). Each file corresponds to a single timestamp at the 30 minute long cadence of K2, and may be read in via standard FITS handling programs (e.g. IRAF or Python/astropy). This format enables the production of time series photometry for cluster stars, and the resulting light curves are now being used to study stellar rotation in M35 (Cody et al. 2018, in prep.) and M67 (Giampapa et al. 2018, submitted) as well as pre-main sequence star variability in the Lagoon (Cody et al. 2018, in prep.)

Scienc cluster eve ta S

👔 😏 Follow Us

Register Forum



work by @astronomcody



## Simultaneous Data —> C16 & C17 were "forward facing"



3.5m telescope / Calar Alto Observatory Spain Optical + NIR Radial Velocity



Telescope Bernard Lyot (2m) / Pic du Midi Observatory France Spectropolarimetry

K2 Kepler telescope / NASA Space Photometry



SOPHIE 1.93m telescope / Haute-Provence Observatory France Radial Velocity



TRAPPIST-N Oukaïmeden Observatory Morocco griz photometry

ESPaDOnS

CFHT (3.5m) / Mauna Kea Observatory

Hawaii / USA

Spectropolarimetry

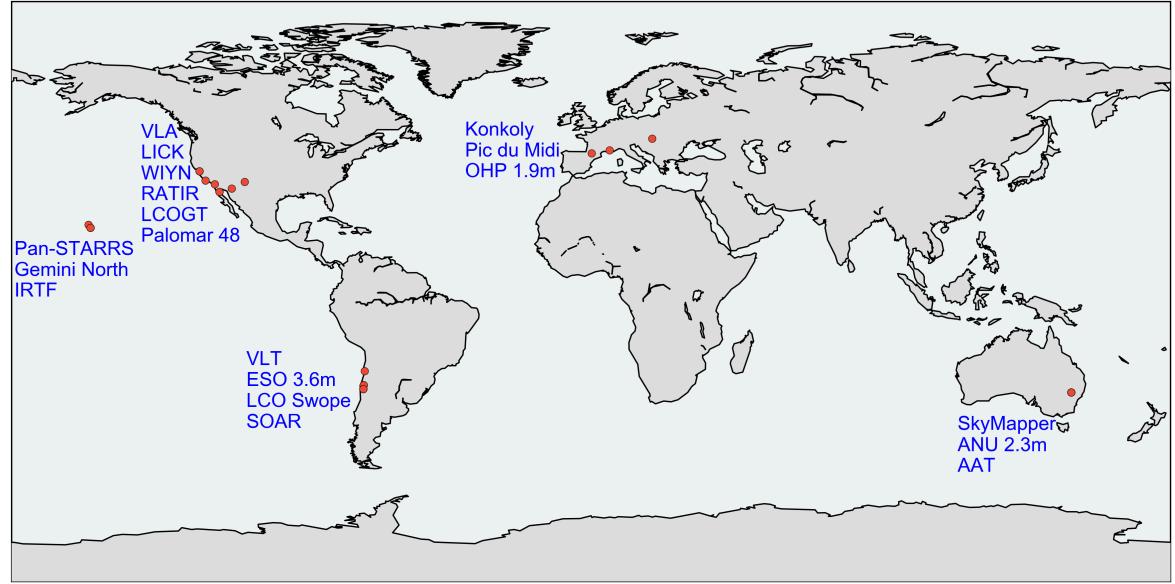
HARPS ESO-3.6m / La Silla Observatory Chile Radial Velocity

> The K2 stellar activity campaign December, 7<sup>th</sup> 2017 to February, 22<sup>nd</sup> 2018



### Supernova Campaign

Kepler/K2 Campaign 16 Contemporaneous Ground-based Observations



### PanStarrs images will be released at MAST this month!

# 



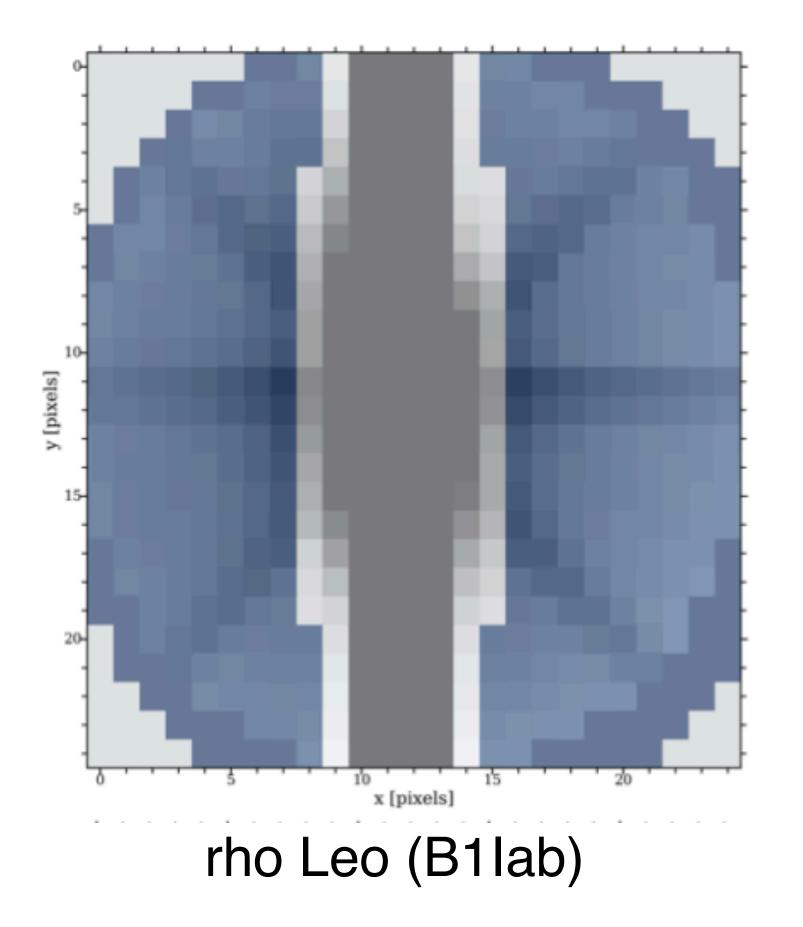


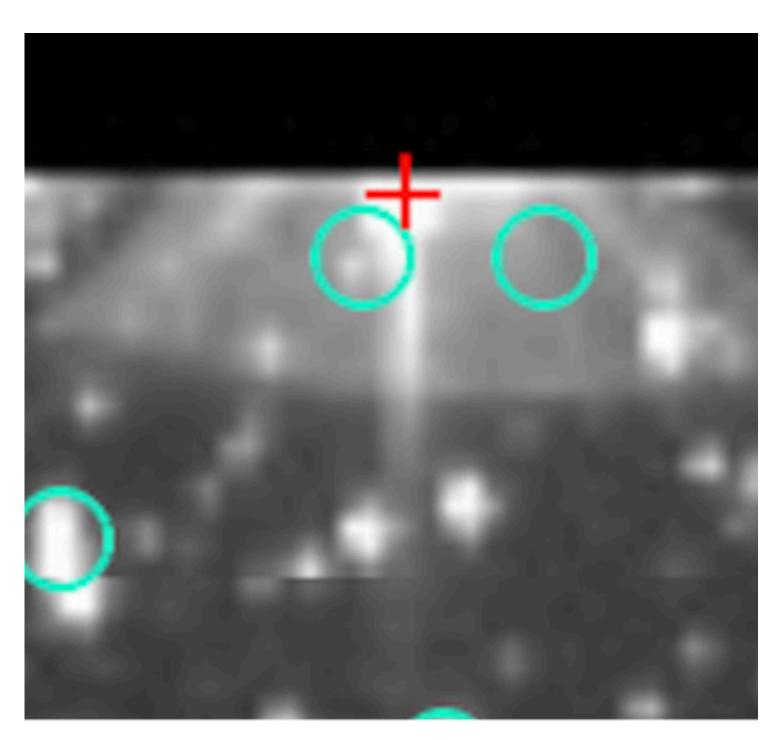
# 2. new methods

Photo by Jens Lelie on unsplash.com



## Creative analyses enable the study of stars brighter than ~5th magnitude



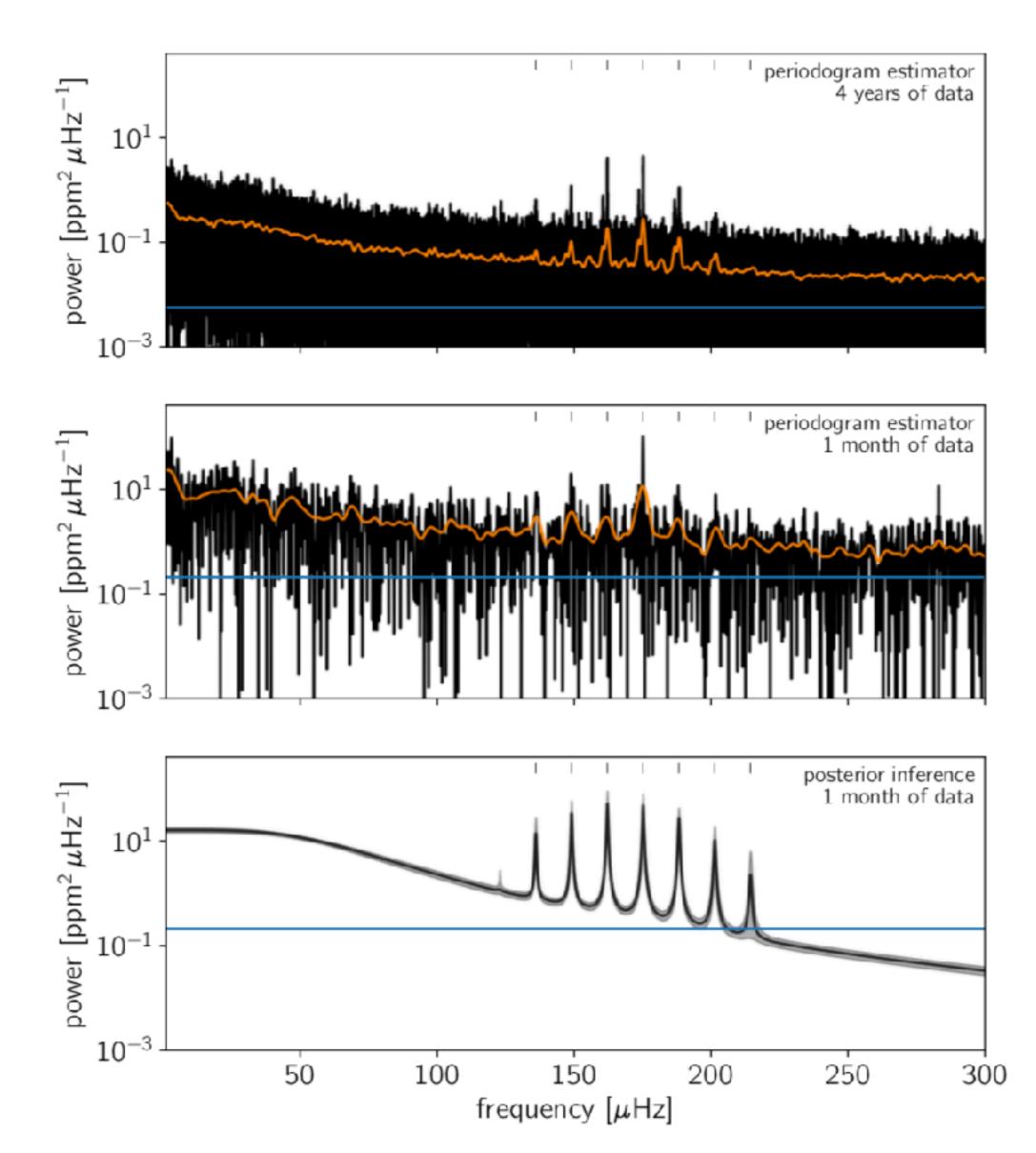


HD 188209 (O9.5lab)

Creative use of pixels in the PSF wings of bright stars enables the investigation of bright stars, including OB-type supergiants.

Pope+ 2016 White+ 2017 Aerts+ 2017 Aerts+ 2018

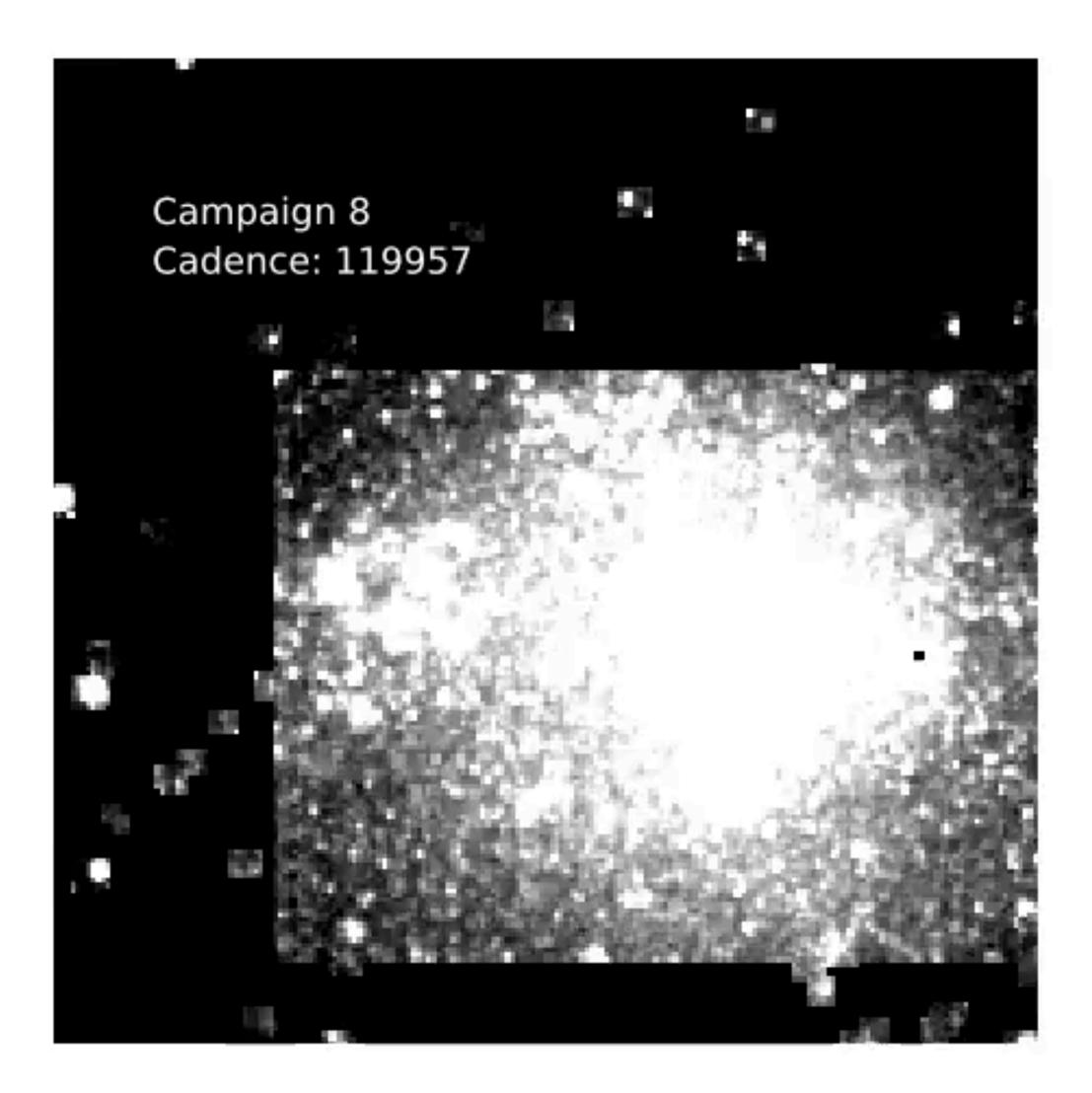
## Gaussian Processes



Probabilistic measurements of asteroseismic parameters in the time domain are becoming computationally tractable.

Foreman-Mackey+ 2017 Ambikasaran+ 2015

# Our ability to model Kepler's background systematics is improving

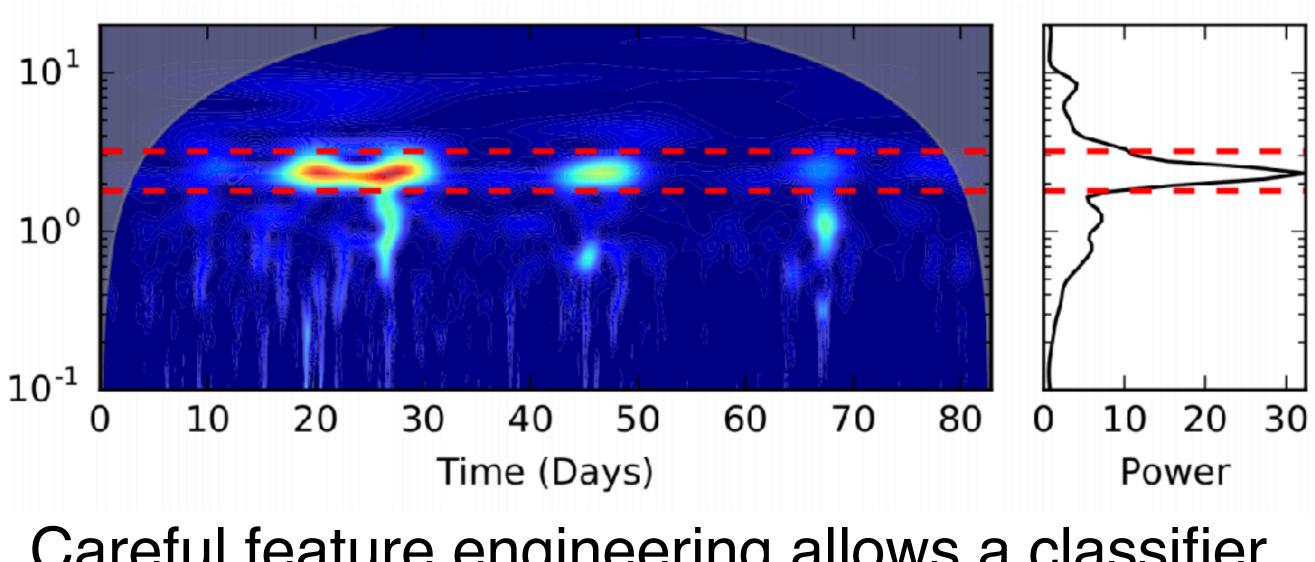


Electronic "rolling band" noise limits Kepler's sensitivity, but progress is being made towards modeling the varying background, e.g. using 2D Gaussian Processes.

Hedges+ in prep

## The community is getting ever better at leveraging AI & machine learning

	Beta Persei EB -	75.0%	7.0%	0.0%	9.4%	6.0%	1.1%	1.6%		()	
	Dipper -	9.7%	87.8%	0.0%	2.2%	0.2%	0.0%	0.0%		Scale (Days)	
L	ong Period Variable -	5.1%	0.7%	85.4%	2.8%	0. <b>0</b> %	5.9%	0.0%		cale	
	RR Lyrae -	9.1%	3.1%	0.1%	78.1%	1.0%	4.4%	4.2%		0)	
-	Beta Lyrae EB -	7.4%	3.7%	1.5%	5.1%	73.8%	5.1%	3.3%			
	Delta Scuti -	1.3%	0.2%	1.9%	2.3%	1.9%	90.3%	2.1%			
	Gamma Doradus -										
	Ş	eta Perseir	Dipper	Period Var	aple yrae	ta Lyrae f	pelta Scuti	nma Dorat	JU <sup>S</sup>		
	Predicted label										



Careful feature engineering allows a classifier to provide a complete and unbiased census of different types of stars.

Hedges+ 2018 and others





### 🖀 lightkurve

### lightkurve

### 1.0b9

Search docs

GETTING STARTED

Quickstart

Installation

API documentation

TUTORIALS

Introduction to lightkurve

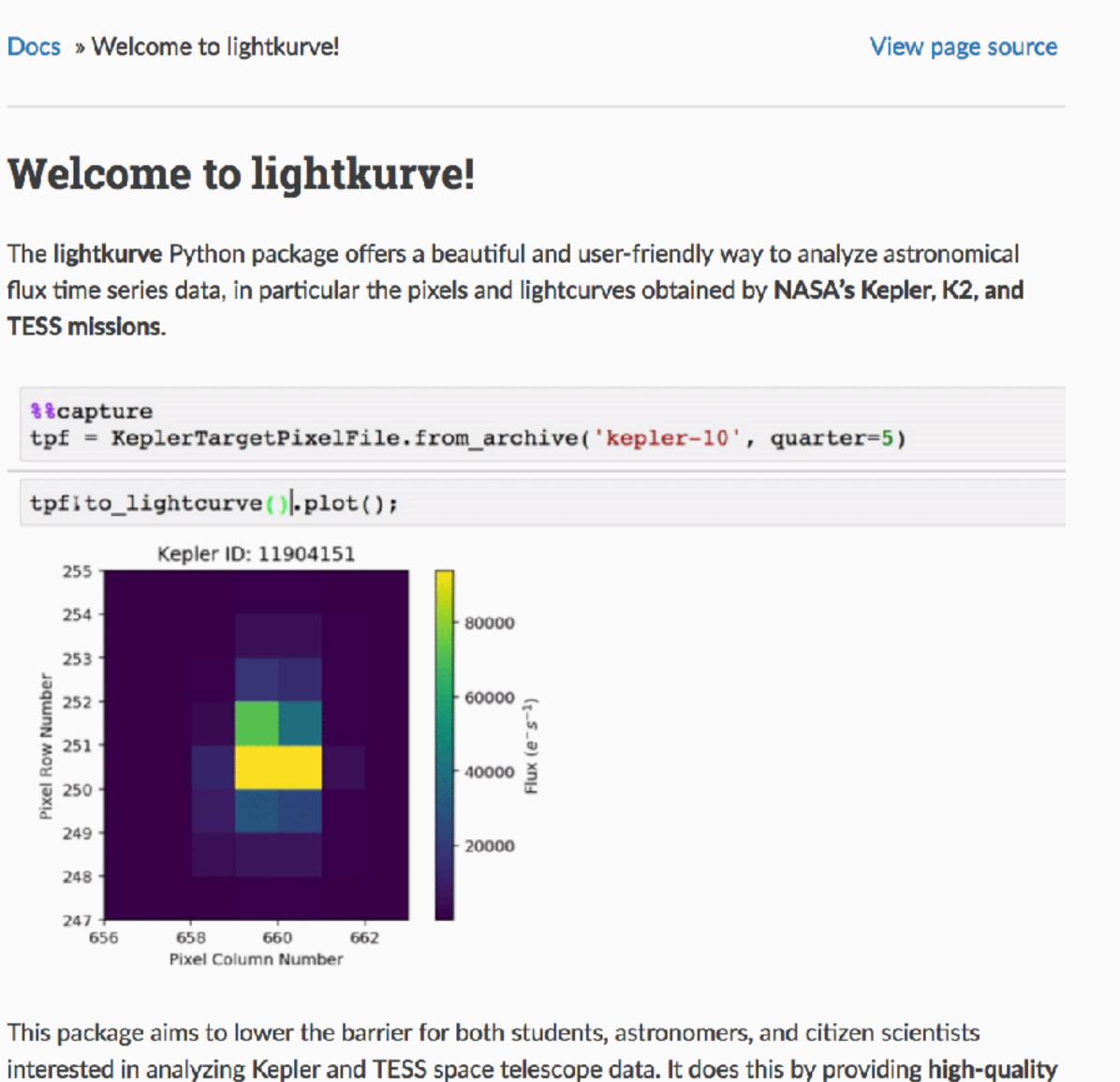
Science with lightkurve

Systematics correction using lightkurve

ABOUT LIGHTKURVE

Contributing and reporting issues Citing and acknowledging lightkurve Other software

**TESS missions.** 



					••••			
	File	Edit	View	Insert	Cell	Kernel	Widgets	ł
16								
	I	n [1]:					I	
	I	n [ ]:						

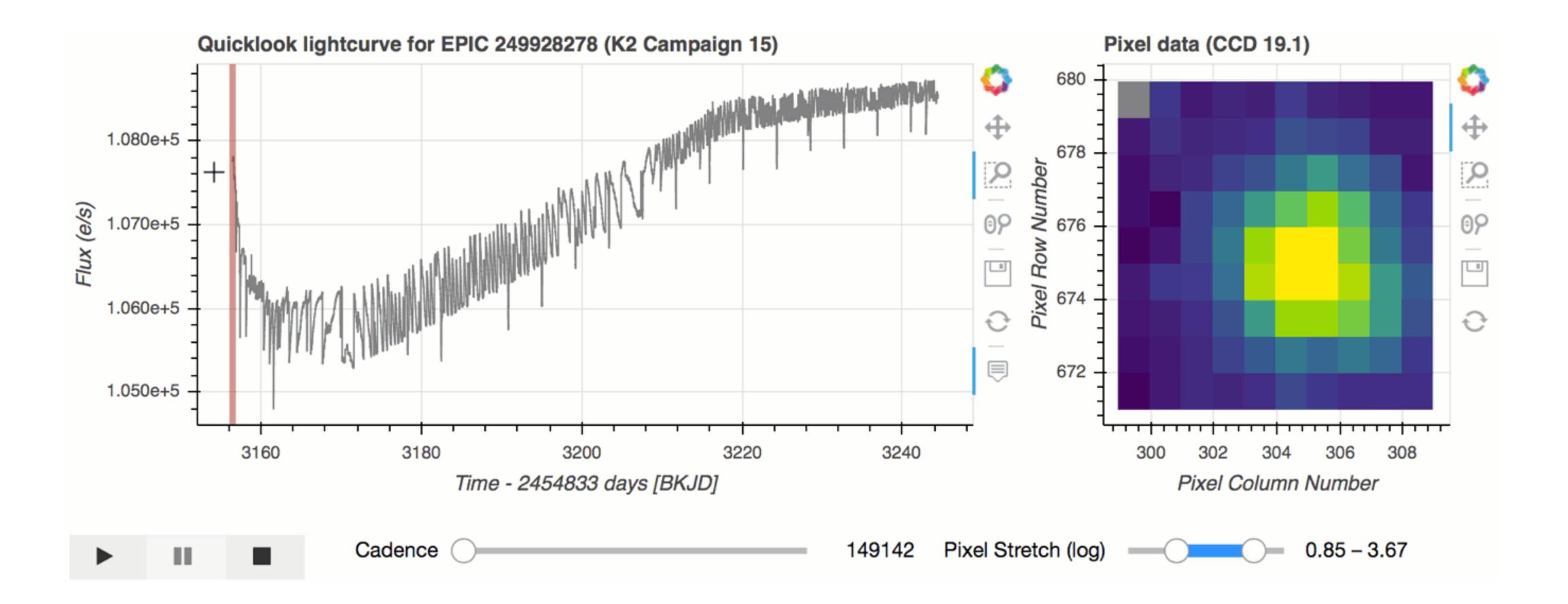
localhost	C
Help	Trusted Python 3

Video by Christina Hedges





## KeplerTargetPixelFile(filename).interact()



Work led by Michael-Gully Santiago (@gully\_)

### A lightkurve

# lightkurve

1.0b10

Search docs

### **GETTING STARTED**

Quickstart

Installation

**API documentation** 

TUTORIALS

Introduction to lightkurve

Science with lightkurve

Extracting lightcurves

Systematics correction

**ABOUT LIGHTKURVE** 

Contributing and reporting issues Citing and acknowledging lightkurve Other software

### **Tutorials**

- Introduction to lightkurve
  - What are TargetPixelFile objects?
  - What are LightCurve objects?
  - What are LightCurveFile objects?
- Science with lightkurve
  - How to recover a known planet in Kepler data?
  - How to use lightkurve for asteroseismology?
  - How to make a supernova lightcurve?
- Extracting lightcurves
  - How to perform aperture photometry with custom apertures?
  - How to perform PRF photometry?
  - How to cut out Target Pixel Files from Kepler Superstamps or TESS FFIs?
  - How to save a lightcurve in FITS format?
  - How to combine lightcurves from different Kepler quarters
- Systematics correction
  - Interactively inspecting Target Pixel Files and Lightcurves
  - 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")?

### A lightkurve

# lightkurve

1.0b10

Search docs

### **GETTING STARTED**

Quickstart

Installation

**API documentation** 

TUTORIALS

Introduction to lightkurve

Science with lightkurve

Extracting lightcurves

Systematics correction

**ABOUT LIGHTKURVE** 

Contributing and reporting issues Citing and acknowledging lightkurve Other software

### **Tutorials**

- Introduction to lightkurve
  - What are TargetPixelFile objects?
  - What are LightCurve objects?
  - What are LightCurveFile objects?
- Science with lightkurve
  - How to recover a known planet in Kepler data?
  - How to use lightkurve for asteroseismology?
  - How to make a supernova lightcurve?
- Extracting lightcurves
  - How to perform aperture photometry with custom apertures?
  - How to perform PRF photometry?
  - How to cut out Target Pixel Files from Kepler Superstamps or TESS FFIs?
  - How to save a lightcurve in FITS format?
  - How to combine lightcurves from different Kepler quarters
- Systematics correction
  - Interactively inspecting Target Pixel Files and Lightcurves
  - 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")?

### See Poster #266 (Sagear et al; @\_ssagear) for upcoming functionality



# **SEPLER& K2 SCICONV** 10 YEARS SINCE LAUNCH

March 4 – 8, 2019 Glendale, CA

Abstracts due Nov 15, 2018





### Want to chat Kepler/K2? Find one of us...

### **Jessie Dotson** @jessiedotson

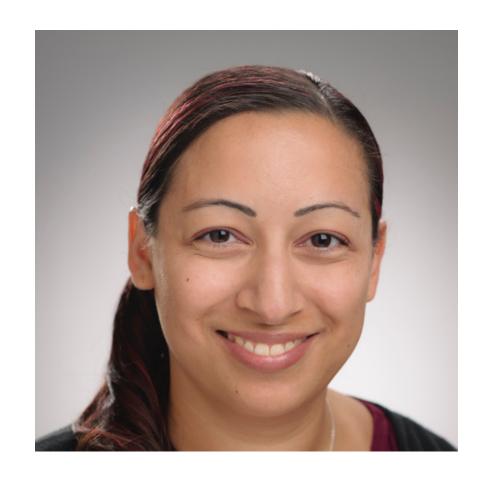


**Ann Marie Cody** @astronomcody

### or go to <u>keplerscience.arc.nasa.gov</u> to learn more



**Michael Gully-Santiago** @gully\_



### **Knicole Colon** @super\_knova



Sarah Sagear @\_ssagear