

# High precision ground-based photometry

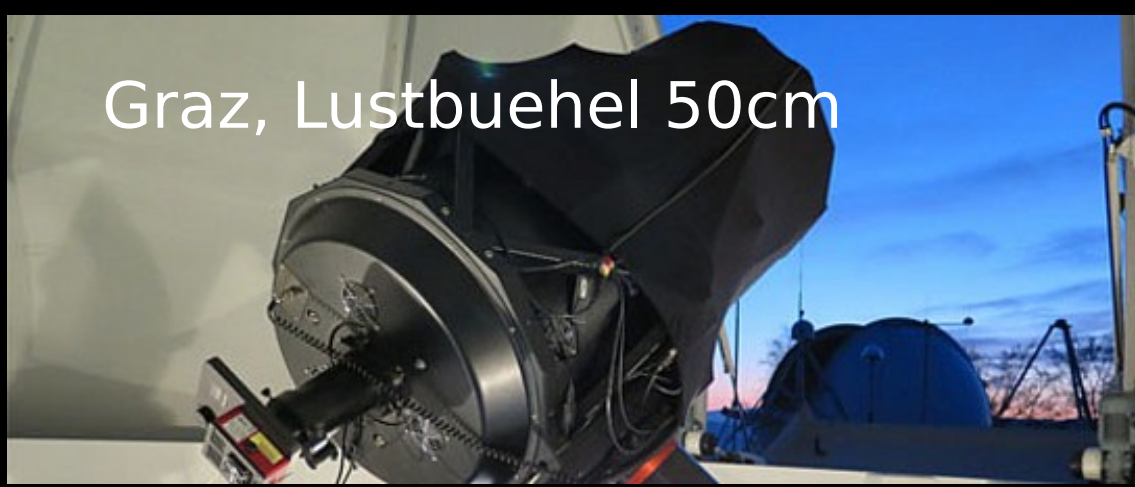
Observing techniques, instrumentation and science  
for metre-class telescopes II

24.9.2018

**Monika Lendl**

Austrian Academy of Sciences

Graz, Lustbuehel 50cm



Euler 1.2m, La Silla



TRAPPIST 60cm



Skalnate Pleso 1.2m, high Tatra



STELLA, Tenerife 2x1.2cm



LCOGT 3x1m Cerro Tololo

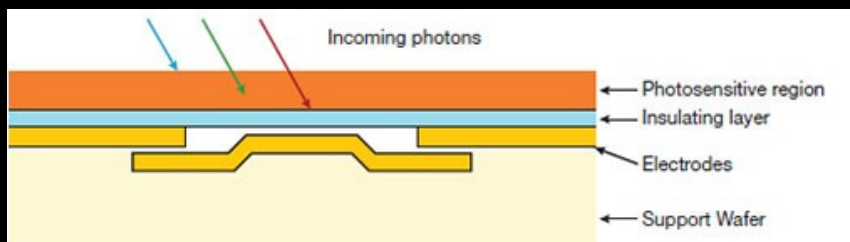
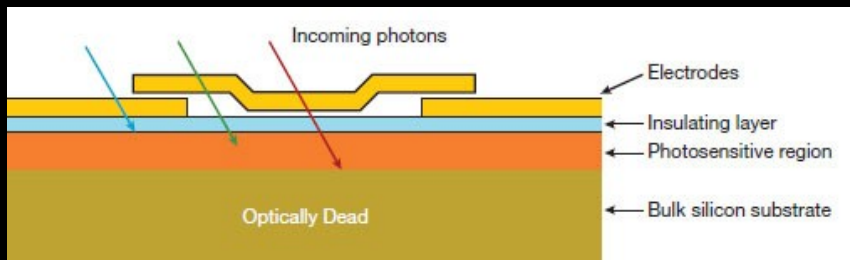


# Instrumentation



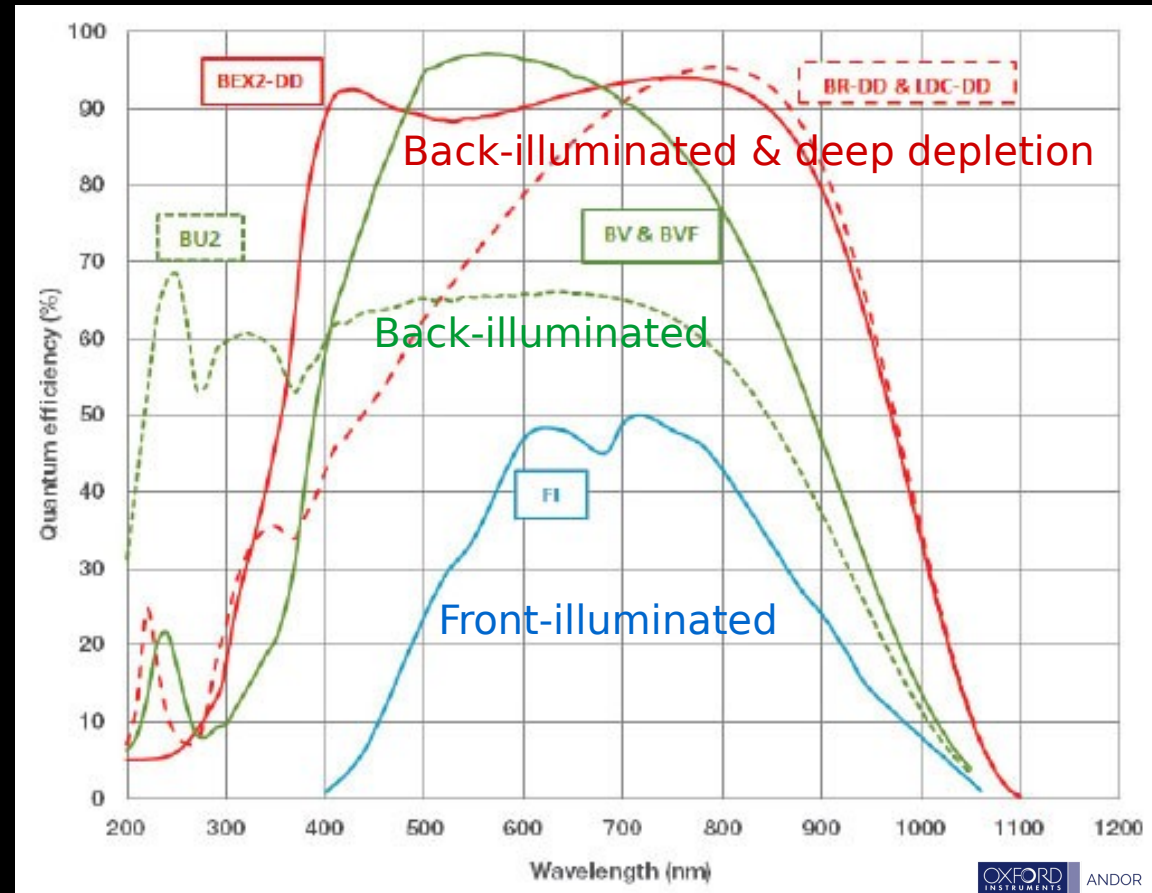
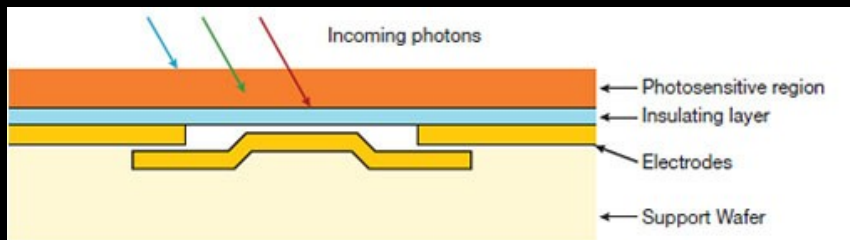
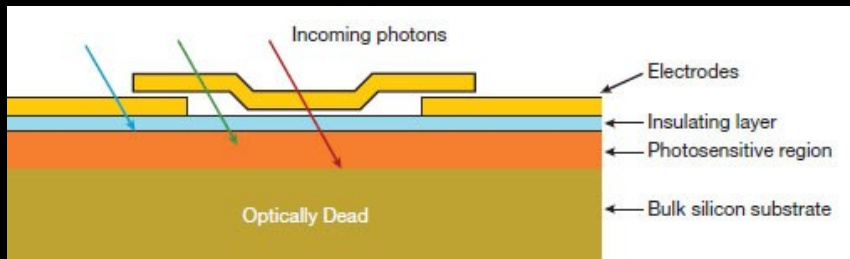
# Optimized CCDs

- Improved QE (back illuminated)
- Near-IR sensitivity (deep depleted)
- Multi-stage Peltier cooling (easier to handle than N<sub>2</sub>)



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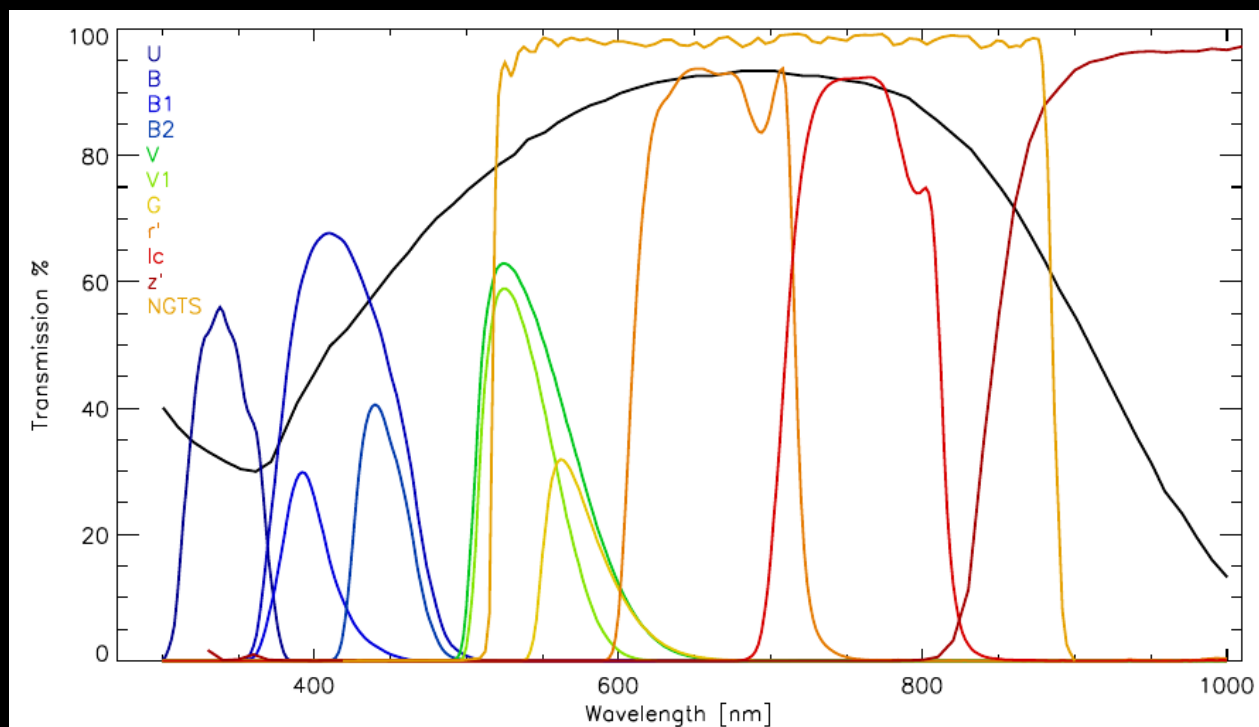


# Imaging CCDs at small telescopes

- Technically straight forward

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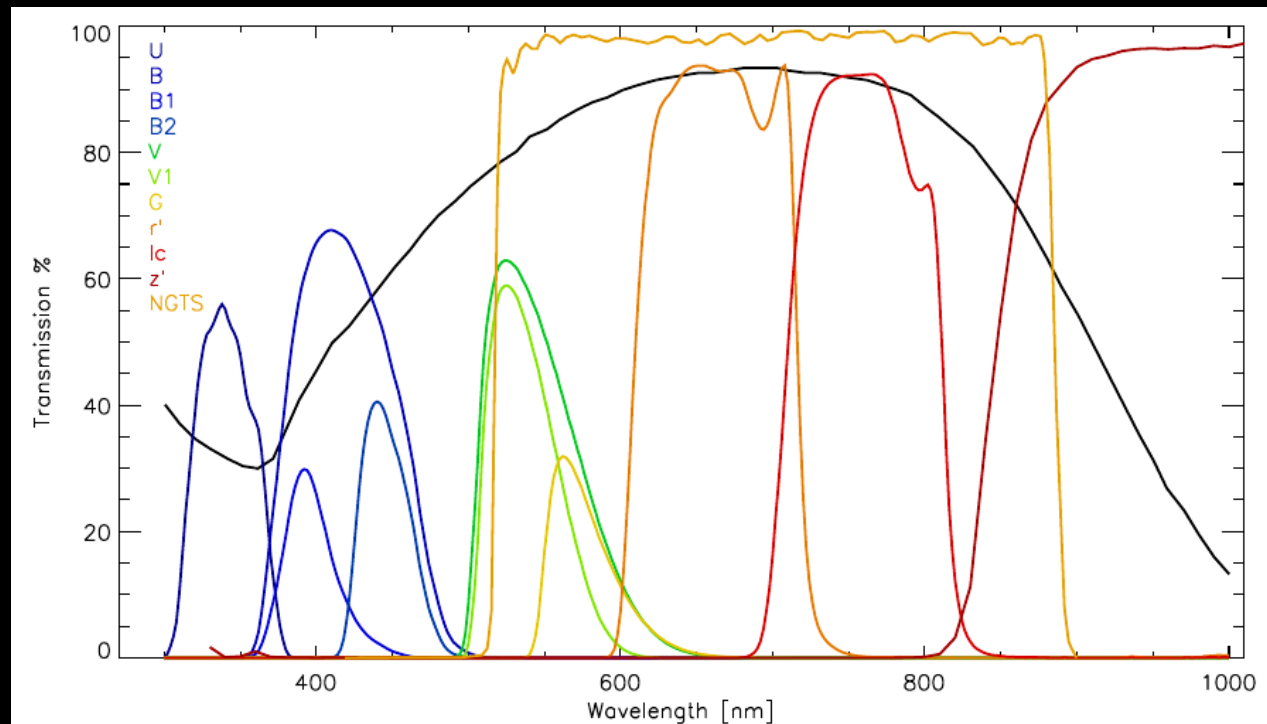
- Technically straight forward
- Easy to automatize, no (little) human interventions necessary
  - roboic/remote operations
- Standard or custom filters





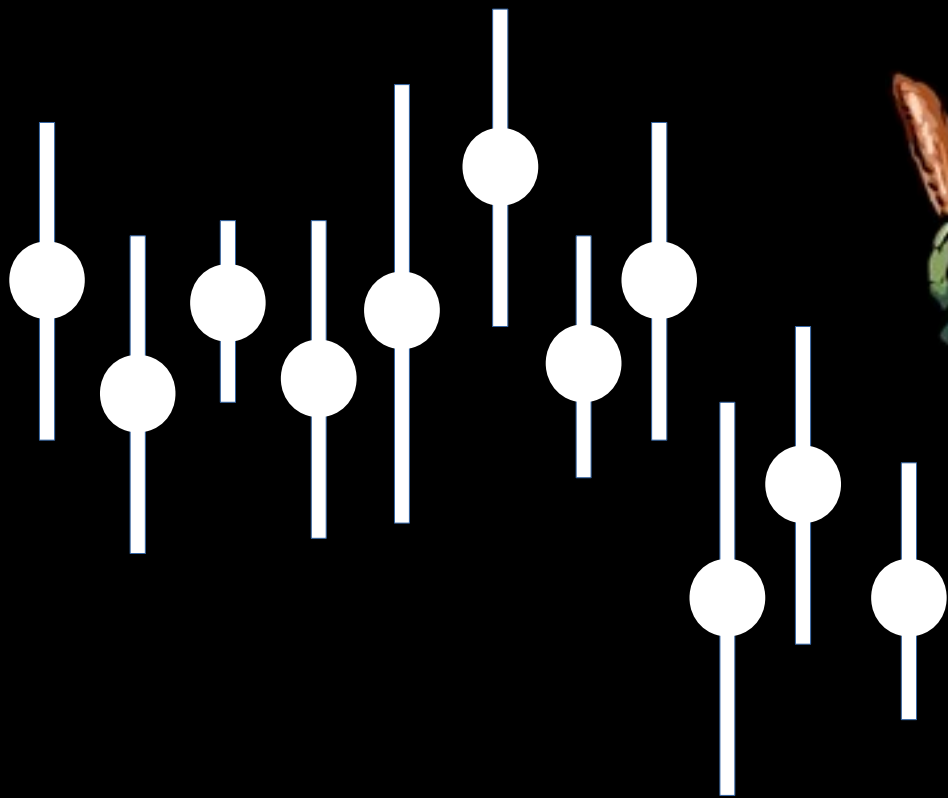
# Imaging CCDs at small telescopes

- Technically straight forward
- Easy to automatize, no (little) human interventions necessary
  - roboic/remote operations
- Standard or custom filters
- Large field-of-view easily attainable
  - good for relative photometry of bright stars, or clusters





# Data analysis



# Aperture photometry

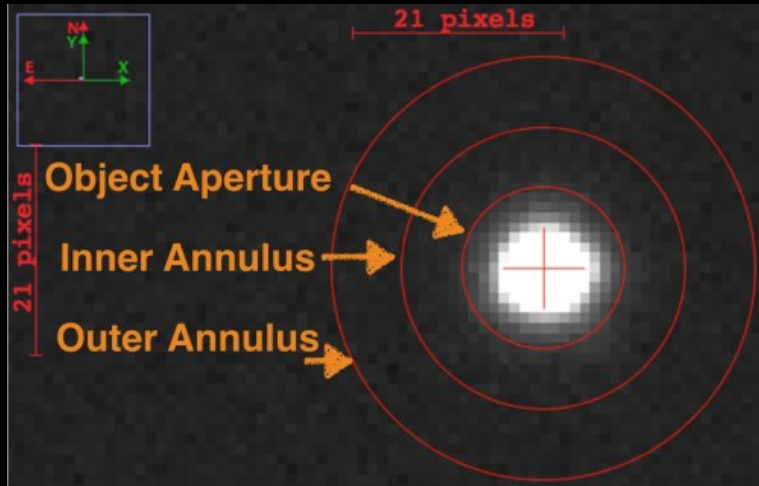


Image: Astrobites / Gudmundur Stefansson

→ Fast and easy

→ Works well for bright, well-resolved objects

# Aperture photometry

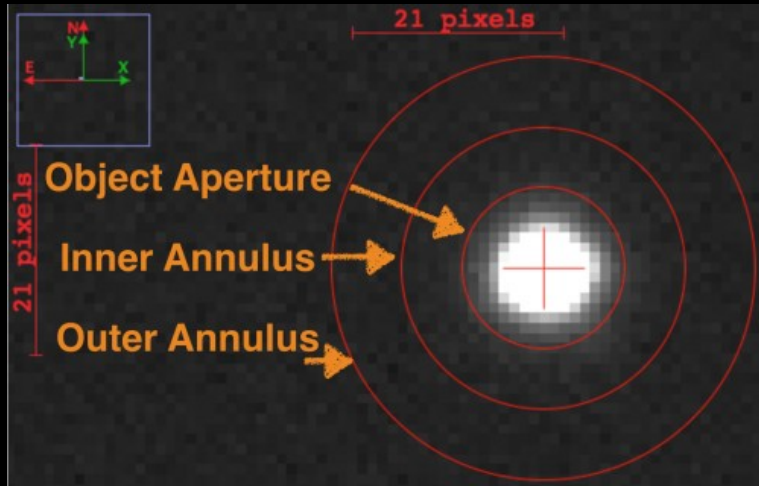
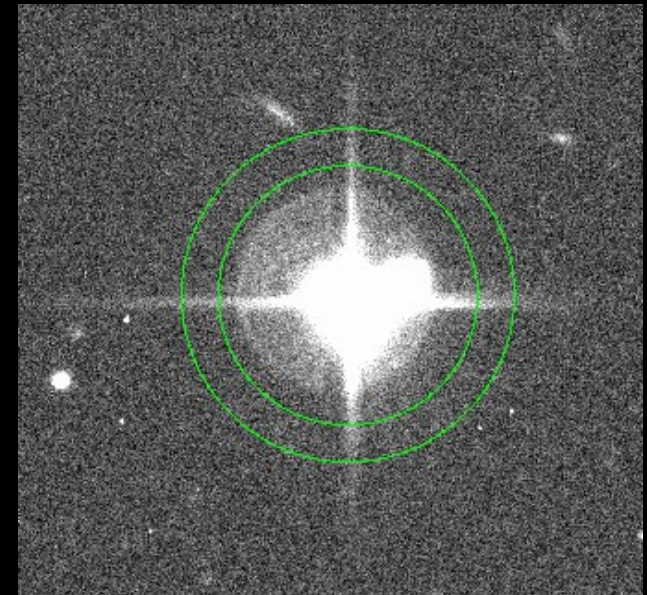


Image: Astrobites / Gudmundur Stefansson

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## Pitfalls:

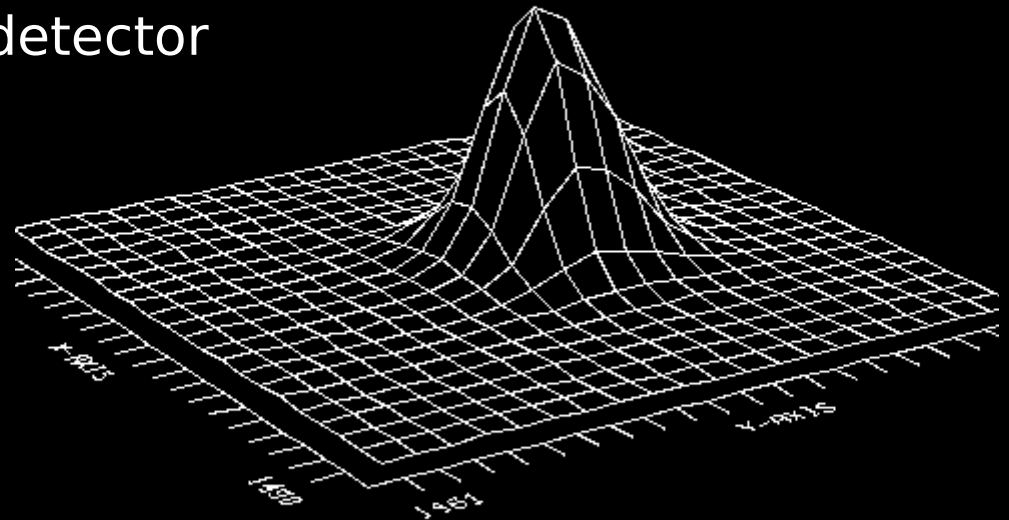
- Blending - or stars in sky aperture
- Centering must be precise
- Optimization of aperture size and sky annulus can be non-trivial





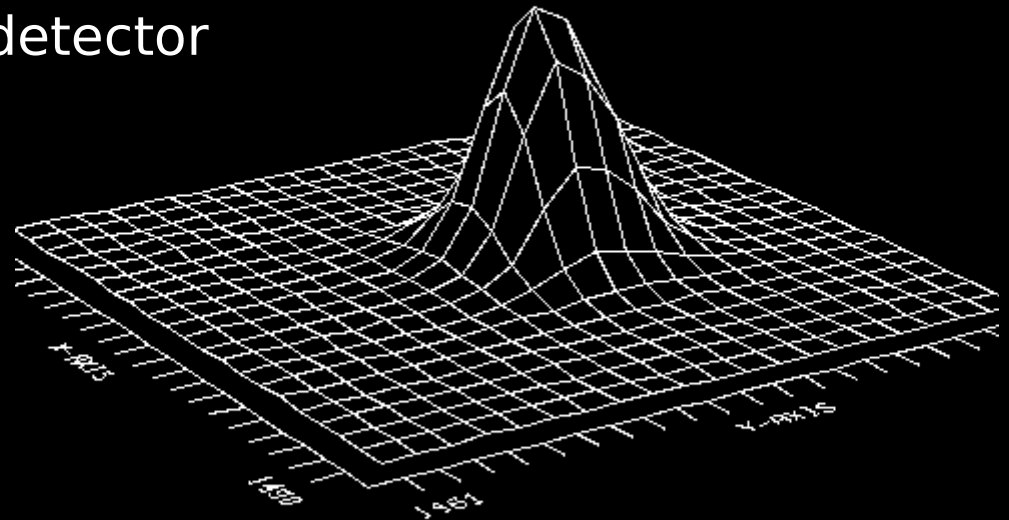
# PSF photometry

- Construct a model PSF for each image
- Iterative process based on selecting isolated field stars
- Account for variation across detector



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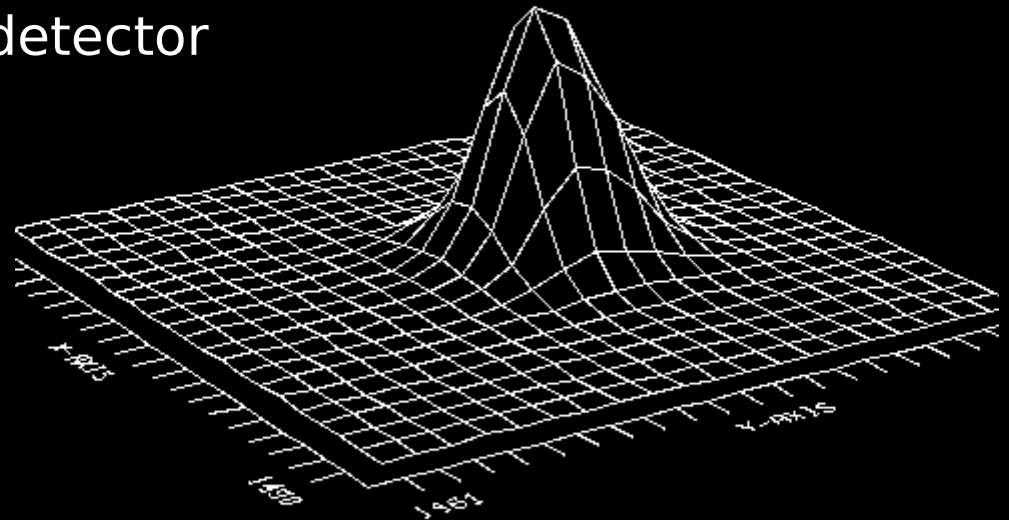


## Advantages:

- Works well for faint sources
- Can handle crowded fields

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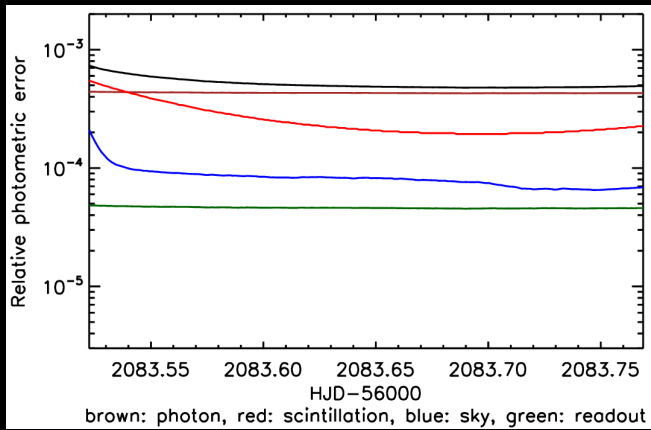
- Works well for faint sources
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## Disadvantages:

- More complex, no added benefit for bright isolated stars



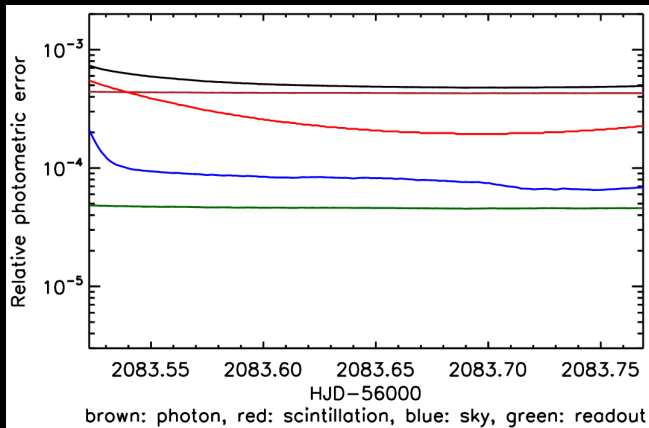
# Noise in time-series photometry



## Well-understood noise sources:

- photon & readout
- scintillation
- background (sky)

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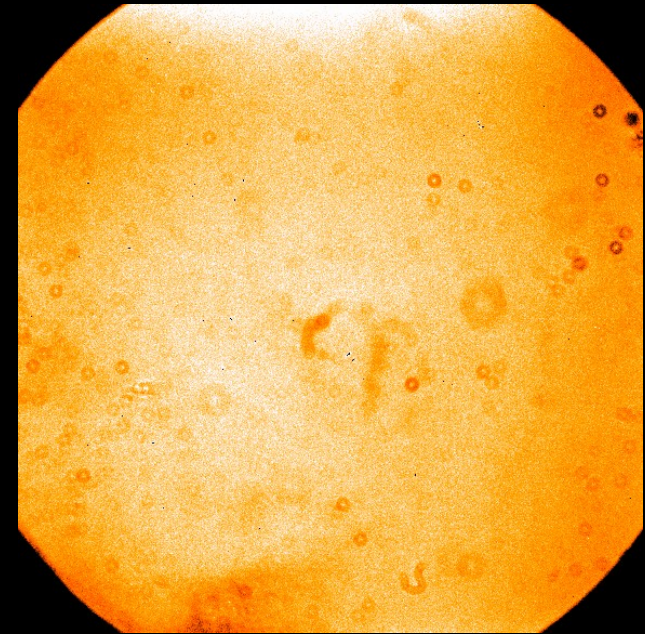


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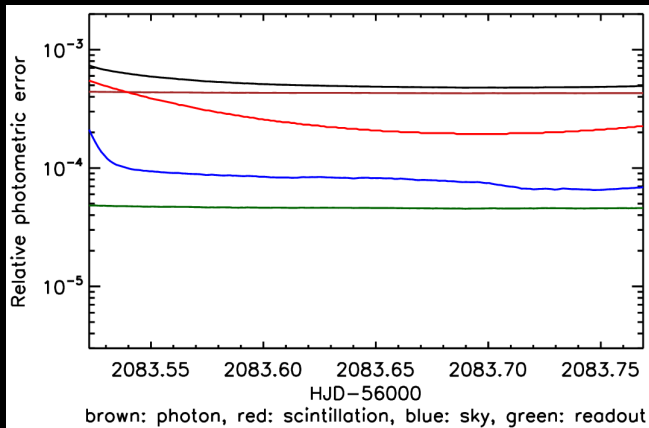
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## Pesky noise sources:

- flat field
- PSF variations (time/detector)
- Cosmics, bad / hot pixels
- detector non-linearity



# Noise in time-series photometry

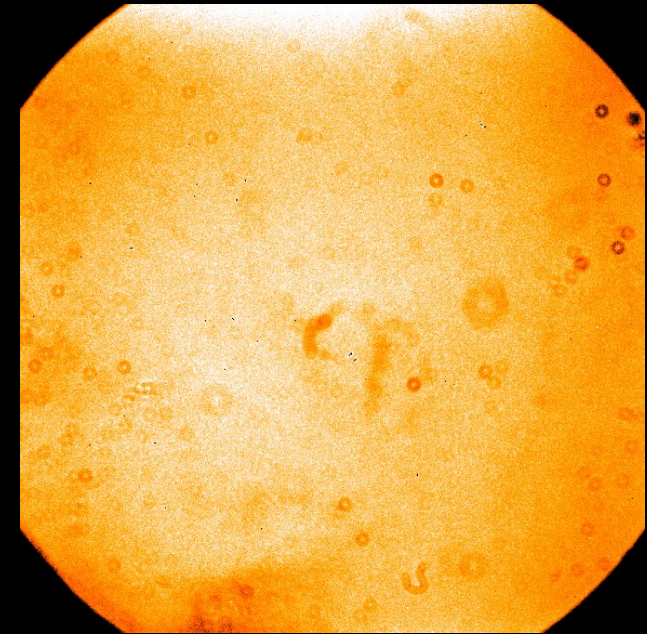


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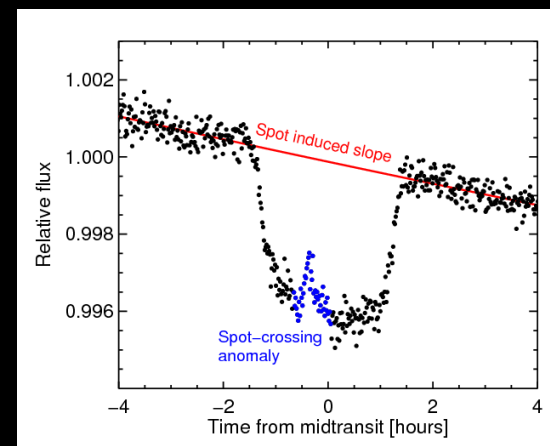
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## Noise that isn't noise

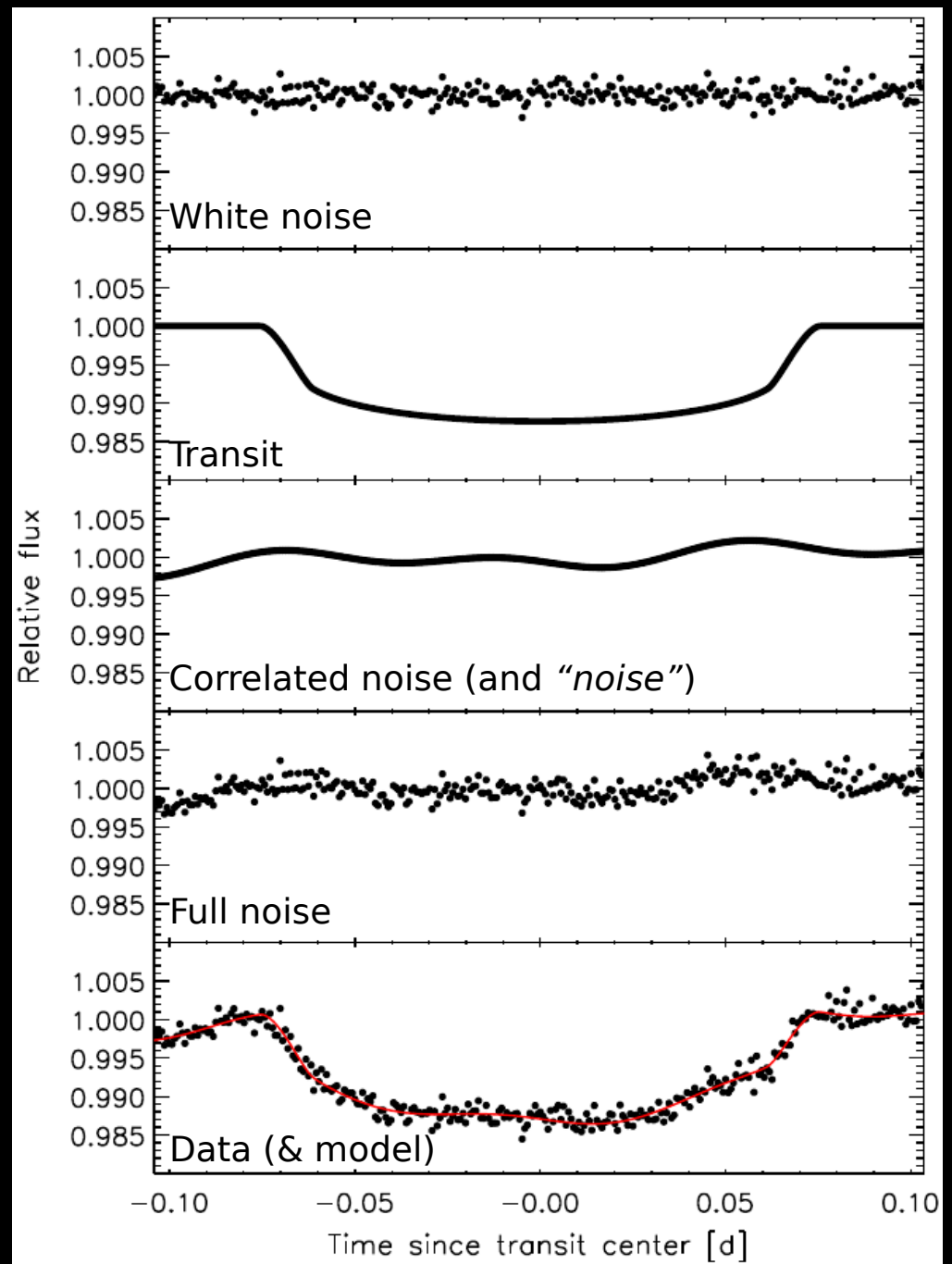
- various forms of stellar variability  
(the one's you are not interested in)



Sanchis-Ojeda+  
(2016)



# Noise in time-series photometry



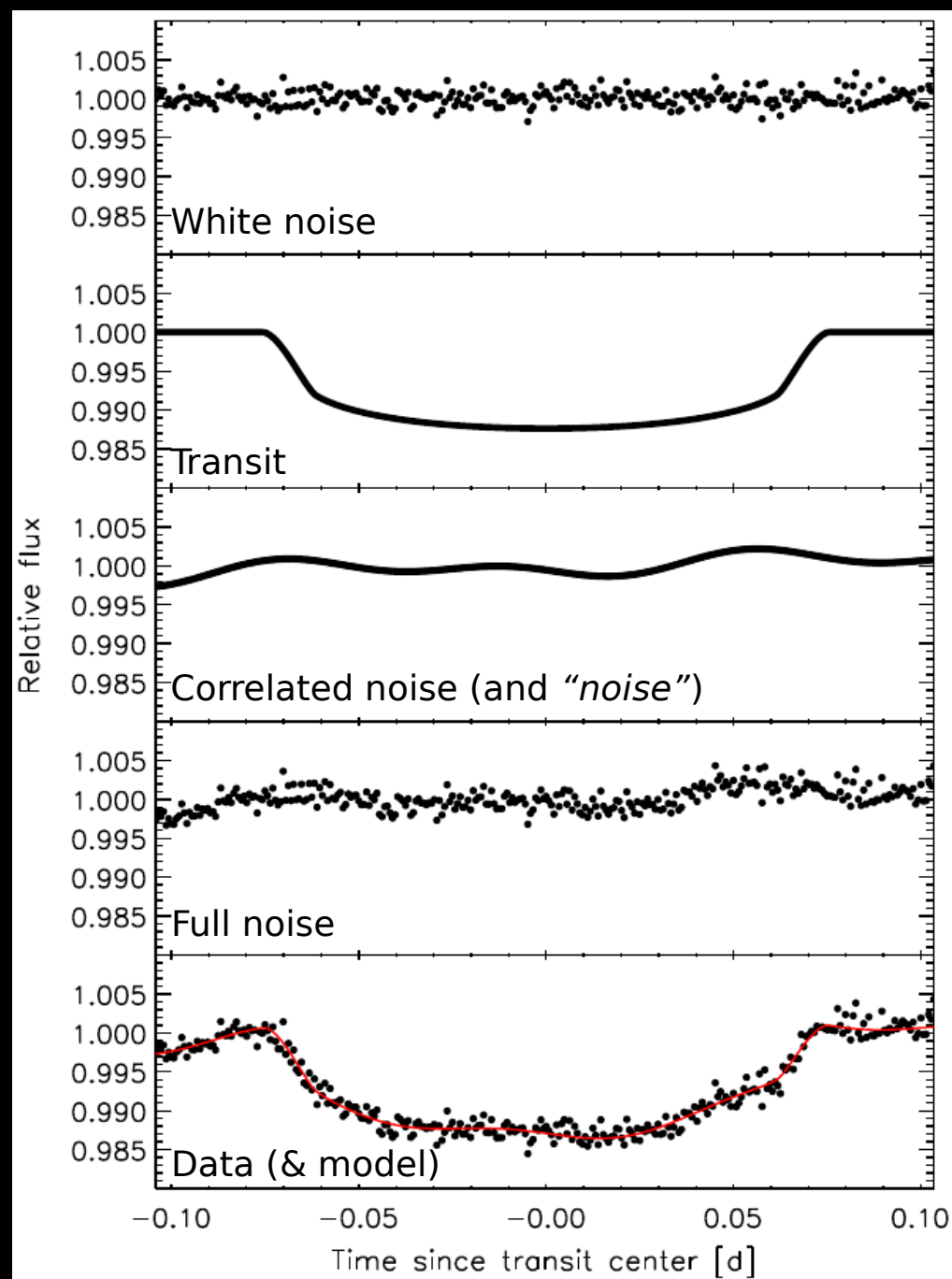
# Noise in time-series photometry

This is an ideal case

non-Gaussian random noise ←

noisy correlations ←

Variable noise properties ←



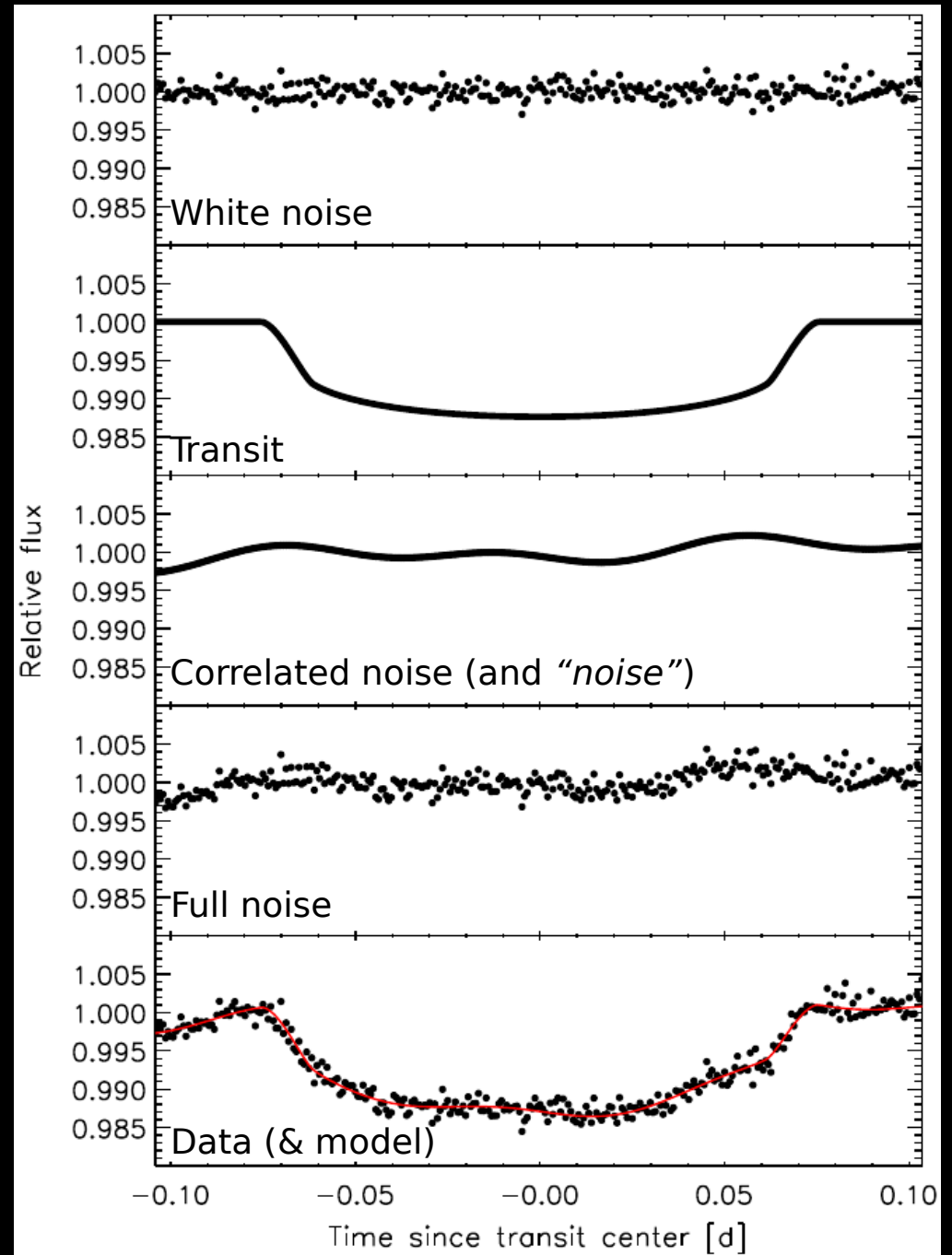
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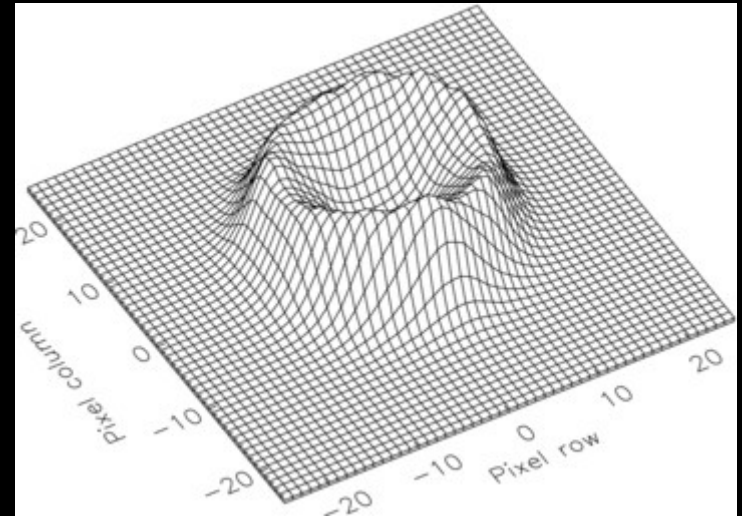
Different ways of treating  
correlated noise in time-  
series photometry



## Step 0: Minimize it!

### High PSF sampling

- pixel-to-pixel differences smoothed out
- optimize detector resolution
- defocus if target well-resolved



Southworth+ (2009)



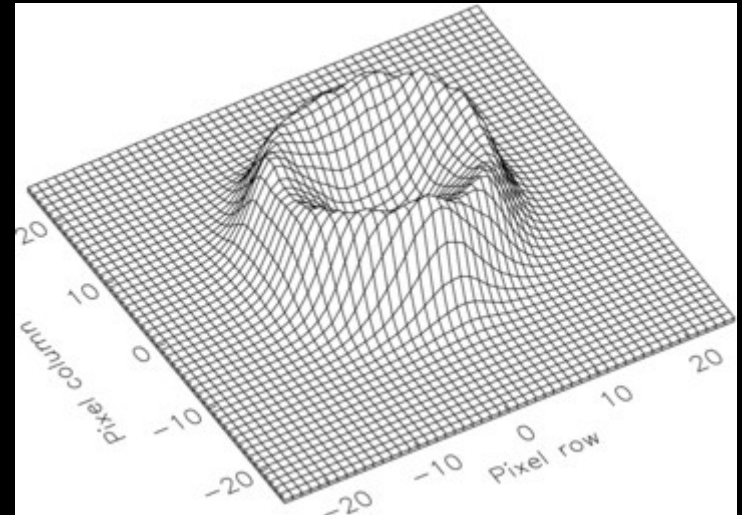
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- pixel-to-pixel effects as constant as possible



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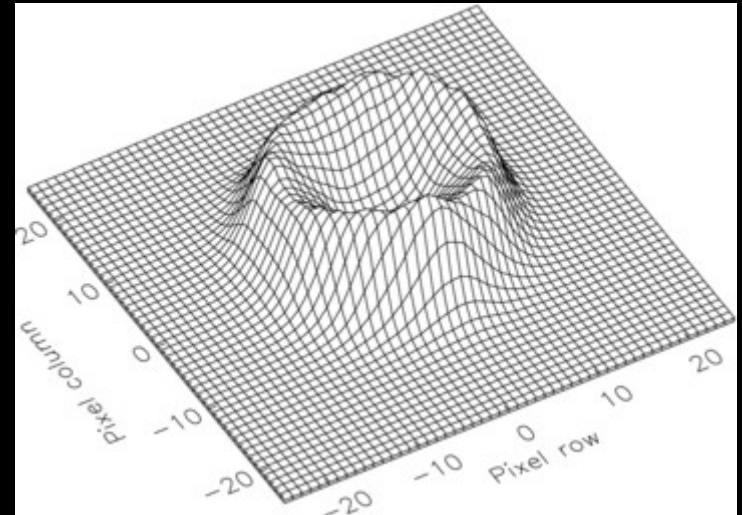
- pixel-to-pixel effects as constant as possible

### **Optimize exposure times**

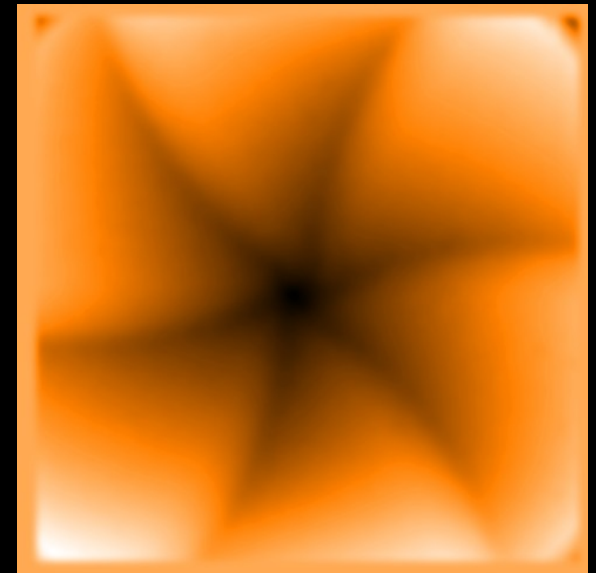
- avoid tiny exposure times to reduce shutter effects

### **Know your detector linearity range**

- it may be smaller than you think!



Southworth+ (2009)



## Option 1: parametric models

**Model your noise as a function of external parameters**

→ Model = astrophysics \* baseline

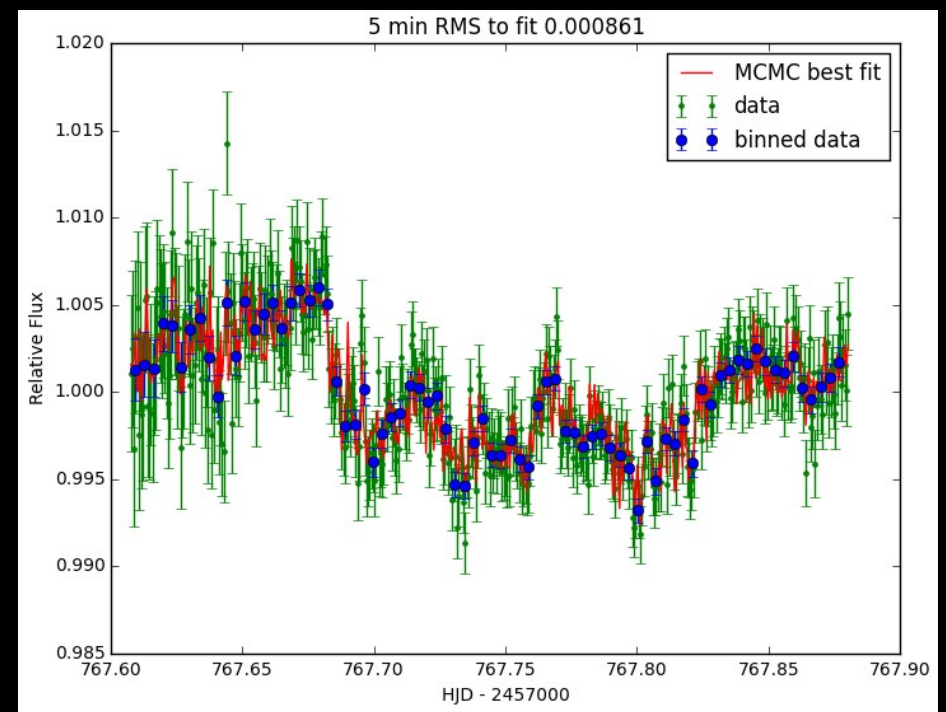
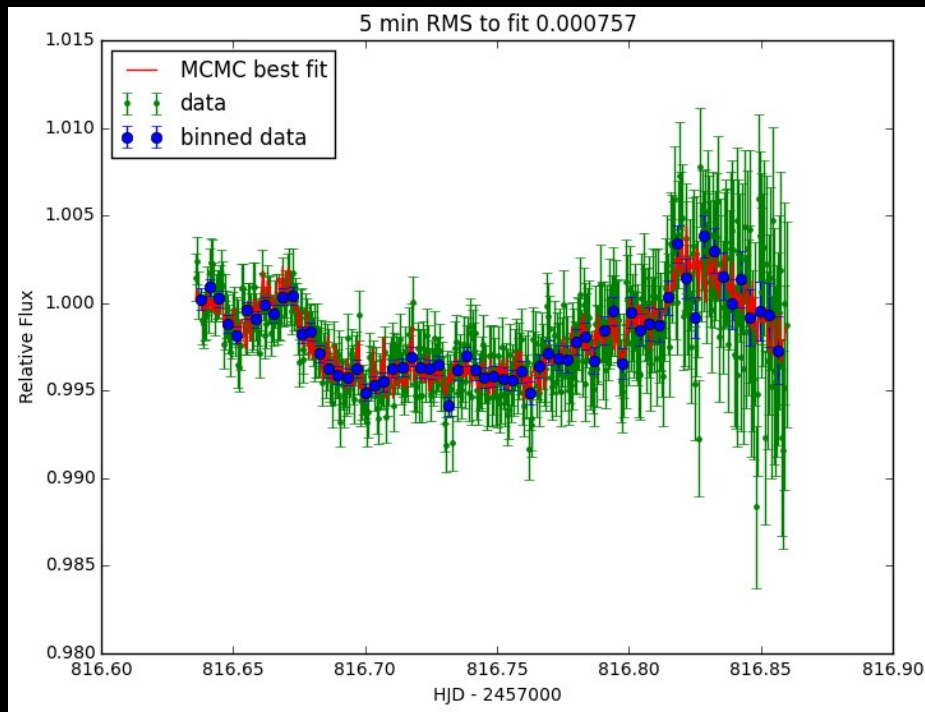
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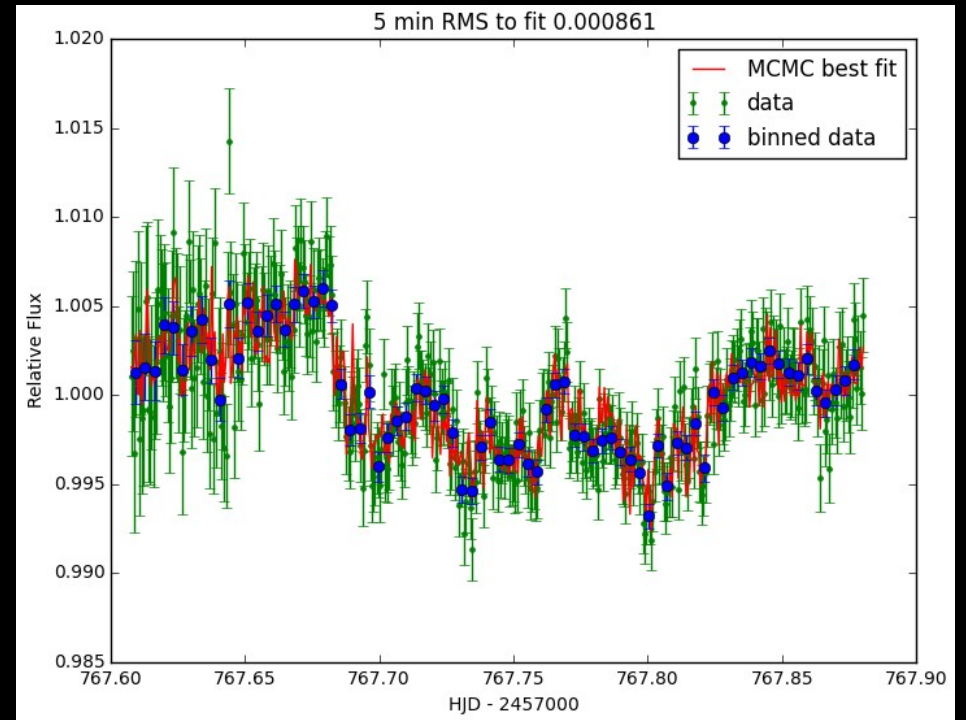
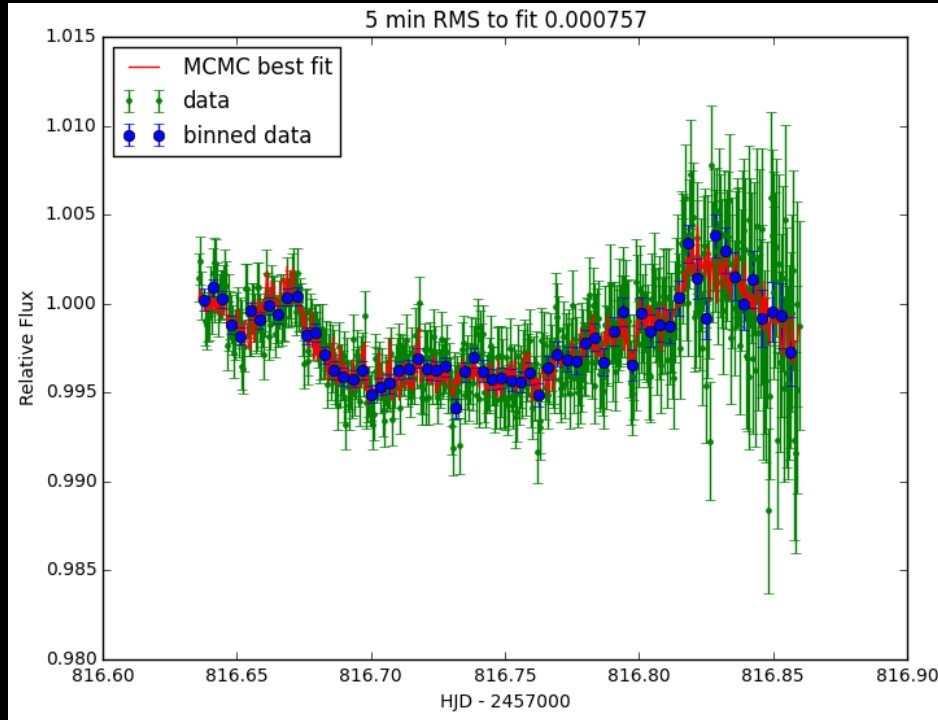
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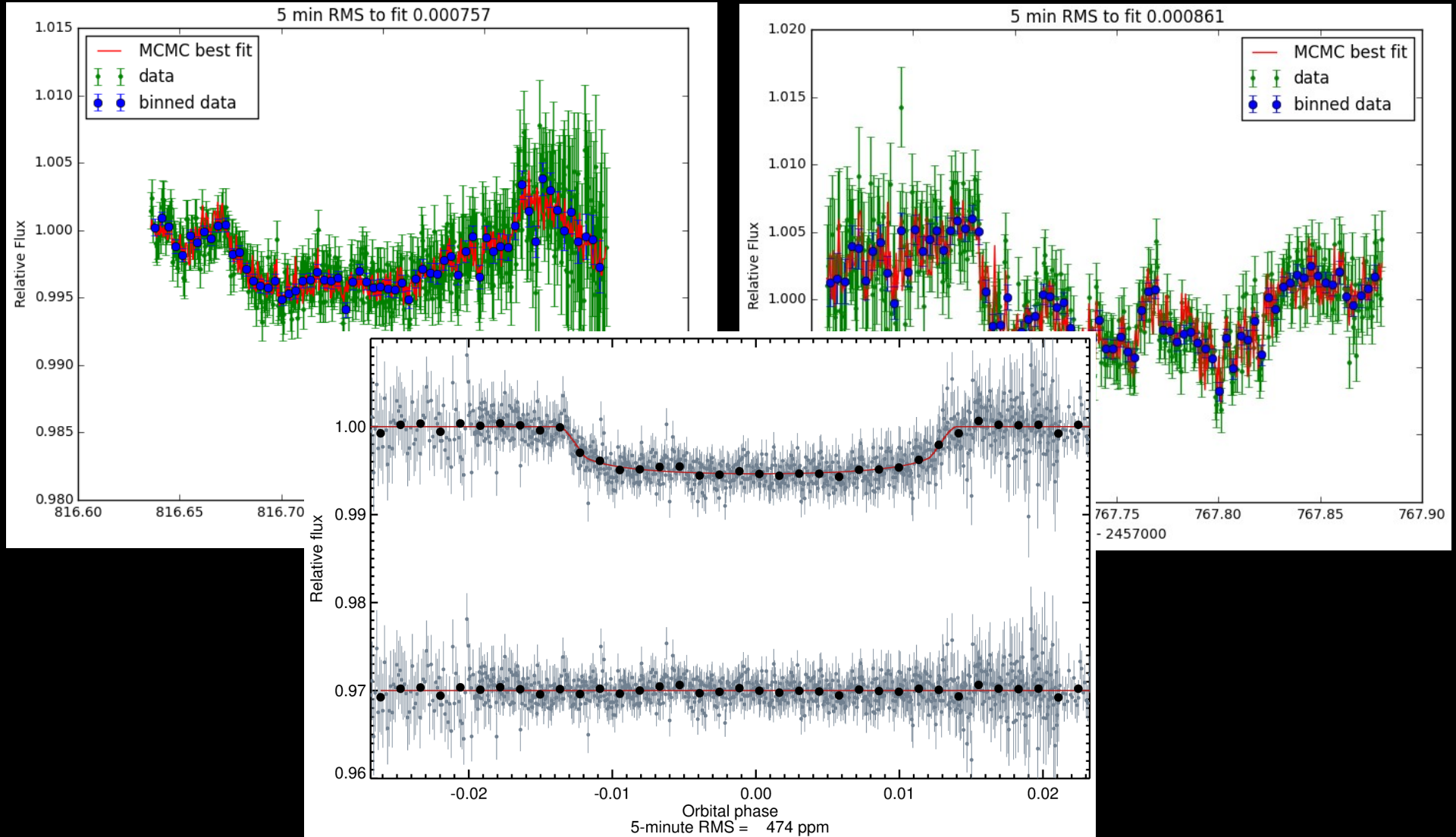
Transit LCs with nonlinearity problem: baseline =  $A_0 + A_1 * \text{FWHM} + A_2 * \text{FWHM}^2$



# Option 1: parametric models



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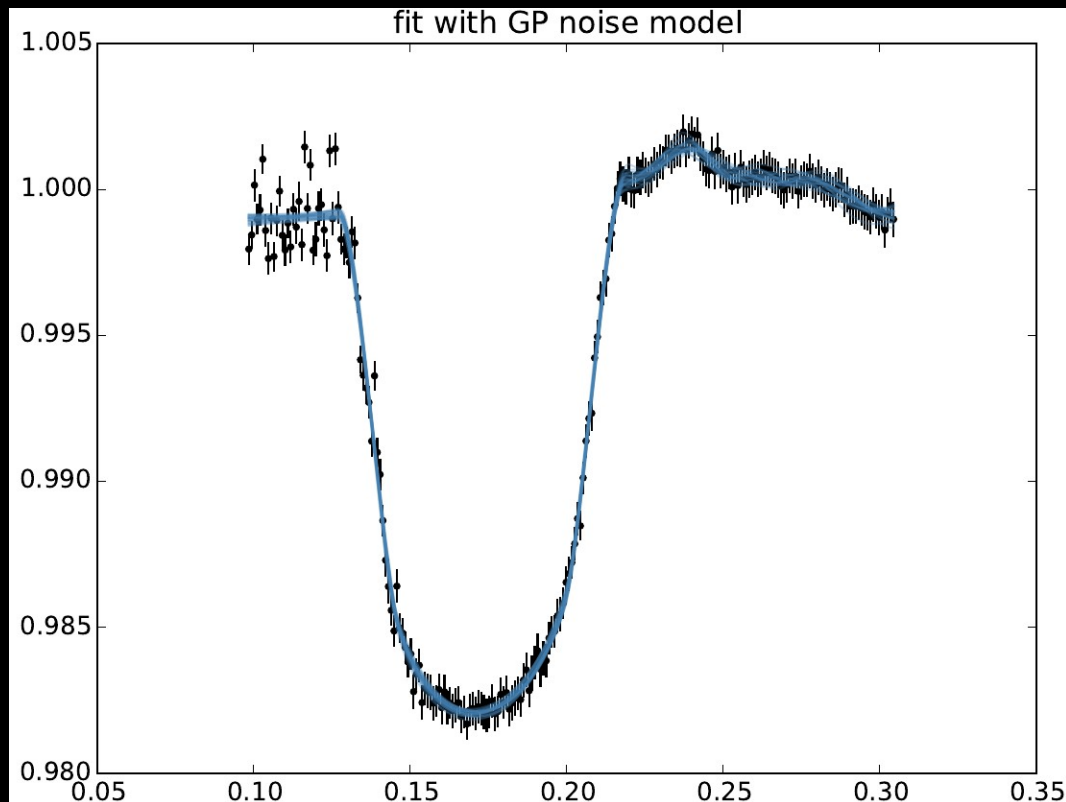
Danger: of over-fitting, incorrect error propagation

## Option 2: Gaussian processes

- Treat the time series as a stochastic process defined by its covariance function
- The covariance function is assumed to have an analytic form, e.g. exponential decay or periodic function
- The coefficients are fit with the data

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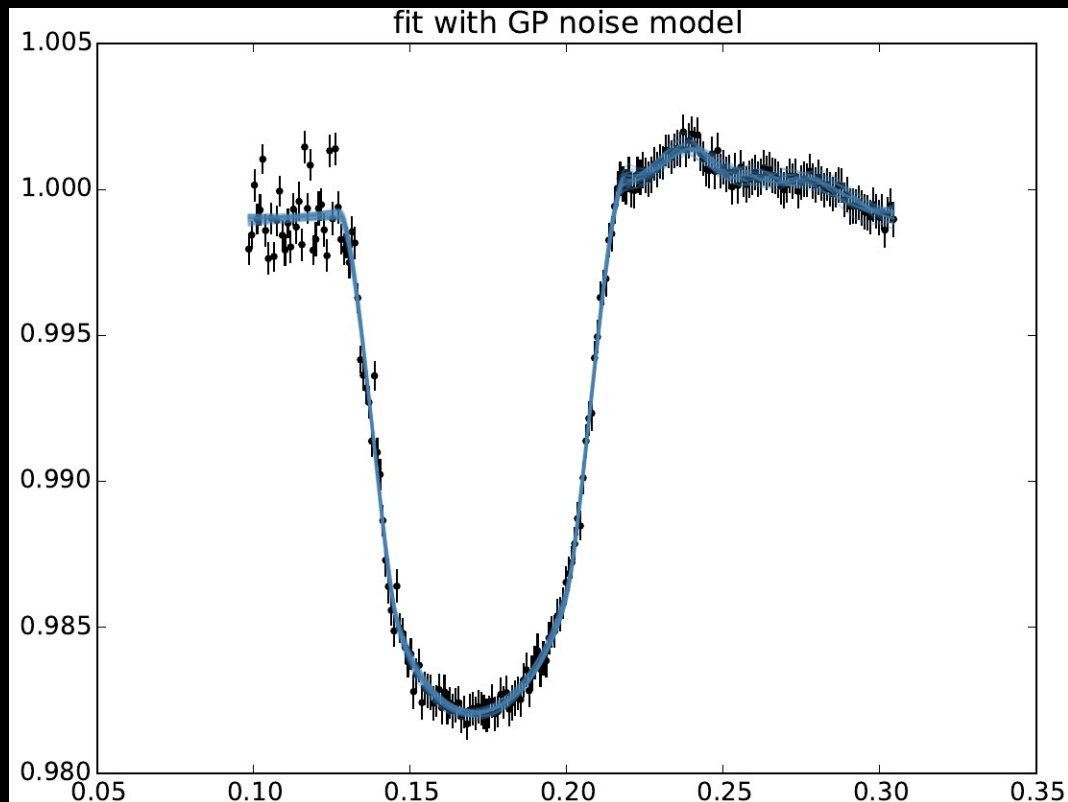
→ Gibson+ 2013,  
Foreman-Mackey 2015



## Option 2: Gaussian processes

*With great power comes great responsibility*

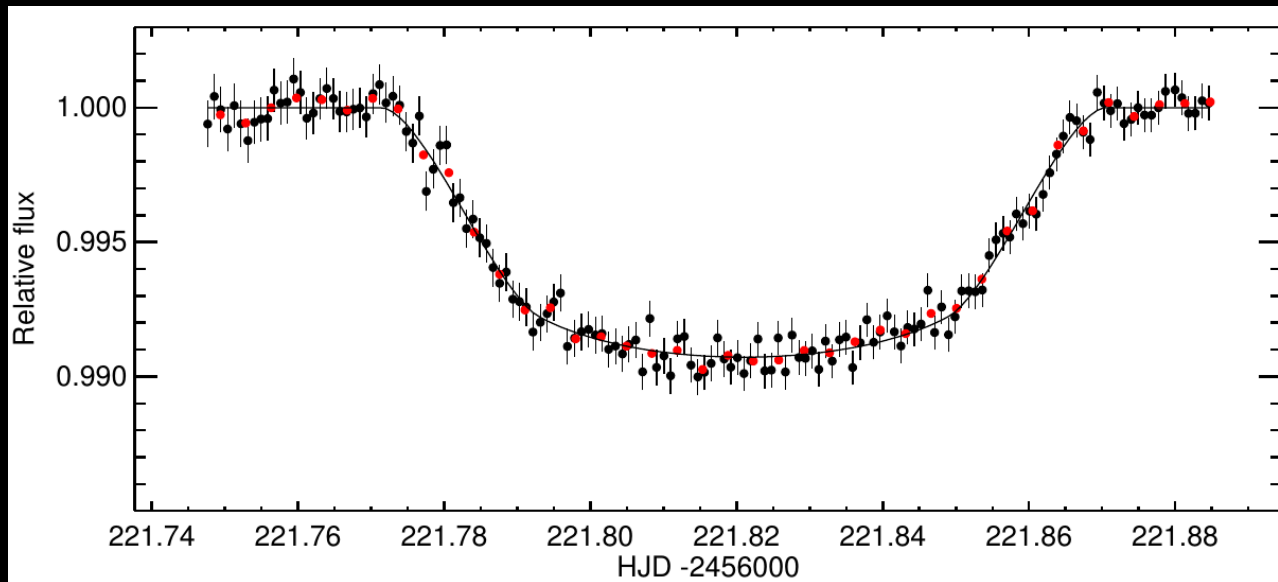
- GPs are good at modeling the data, based on the data
- Kernel parameters can be ill-constrained but fit looks good
- Size of errors are key (but you can fit for white noise)



## In a nutshell

→ Decrease noise sources by optimizing observation strategy (defocus, optimize exposure times, guiding)

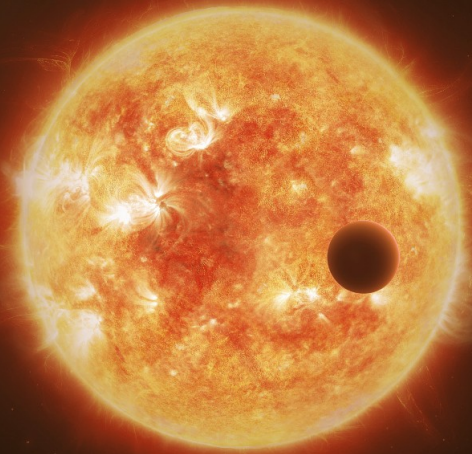
→ Model red noise *together* with your favourite astrophysics



WASP-146 with  
EulerCam

RMS/5min = 245ppm

# Applications

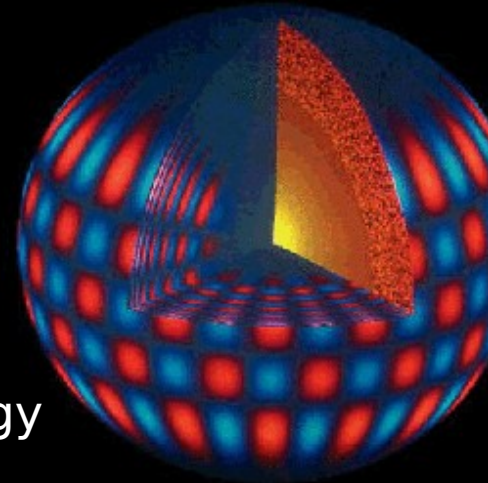


Exoplanets

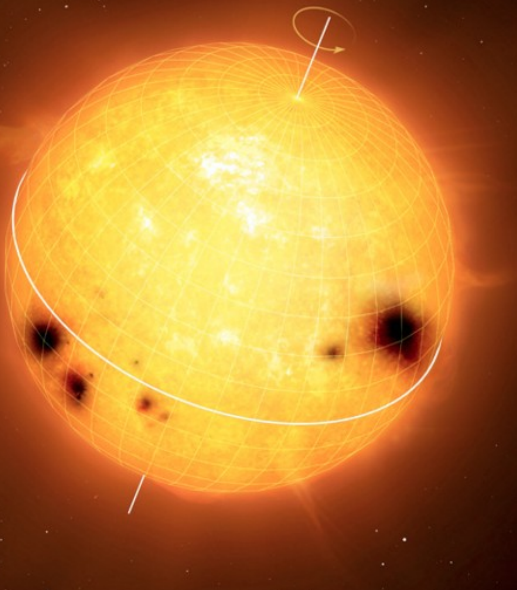


Binary stars

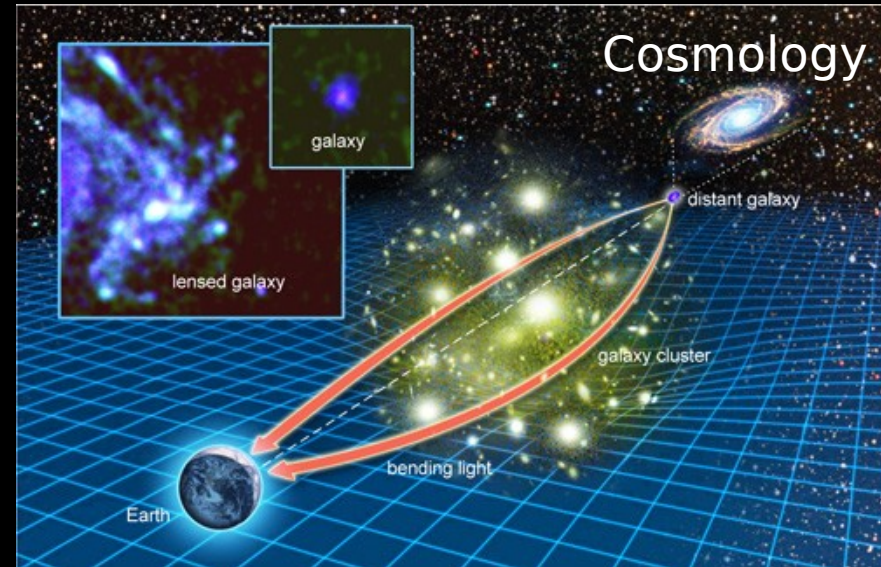
SCIENCEPHOTOLIB



Asteroseismology

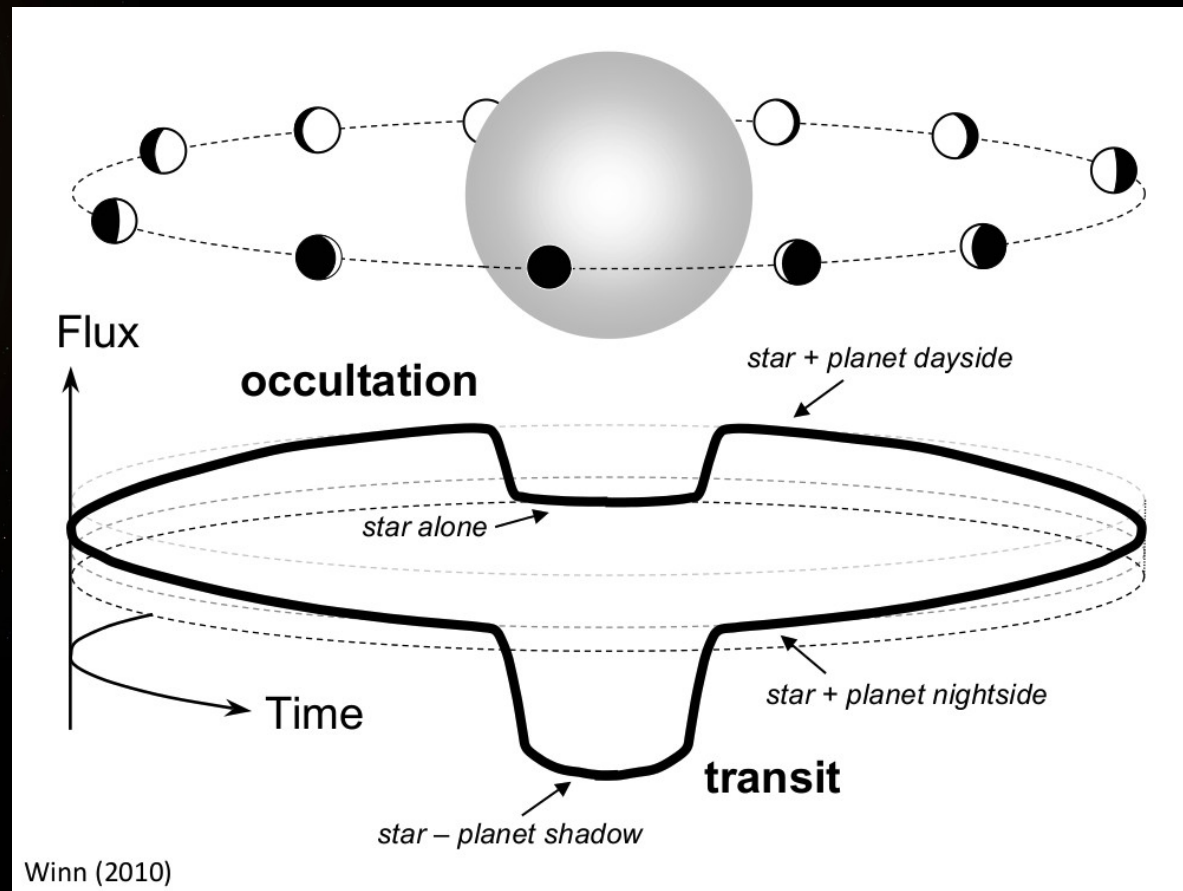
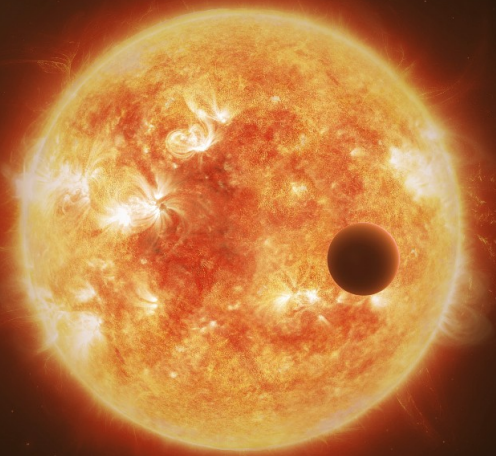


Stellar activity



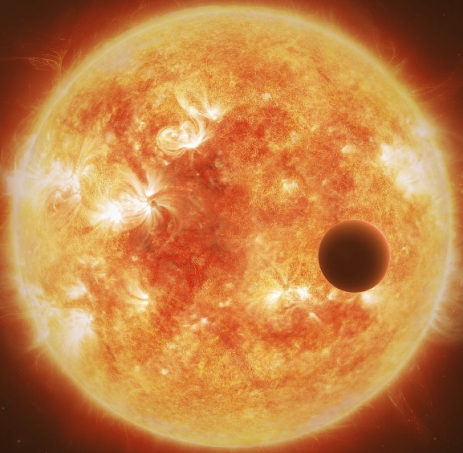
Cosmology

# Exoplanets

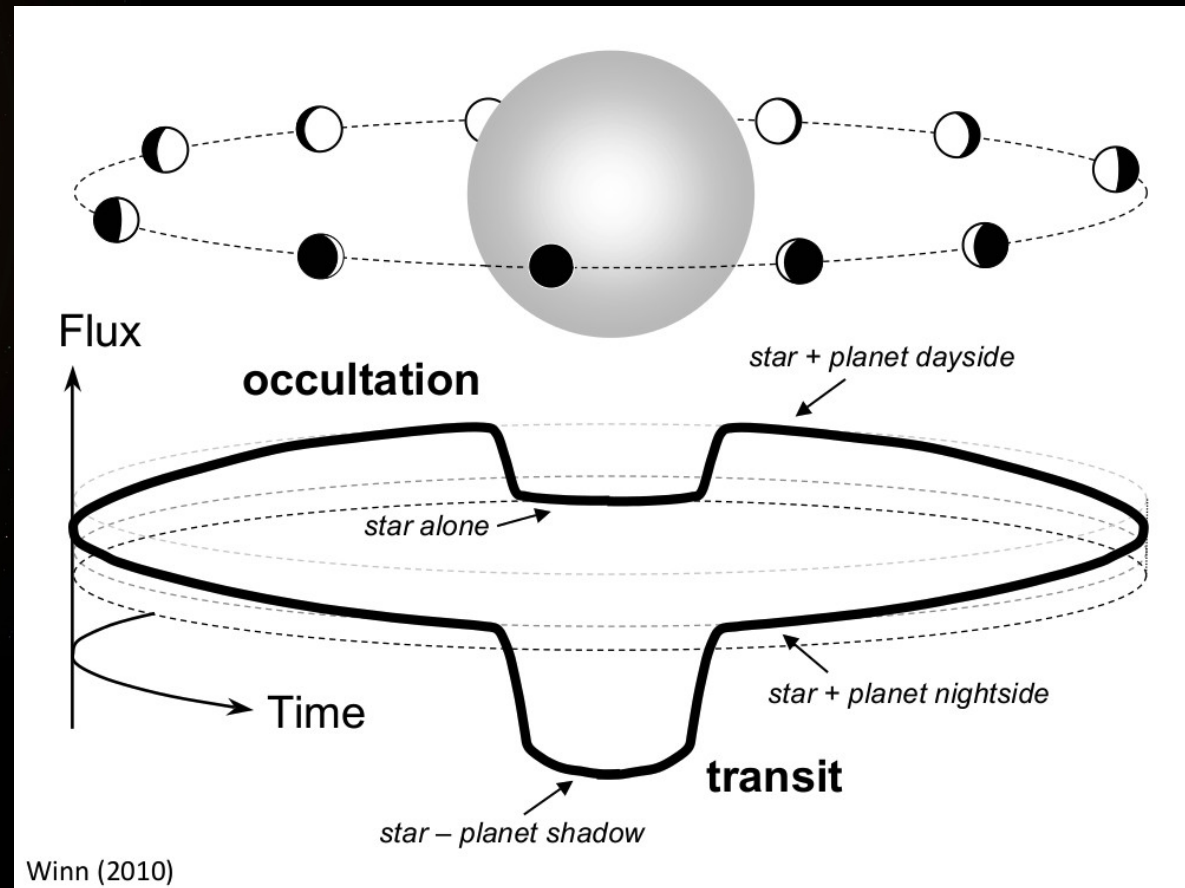




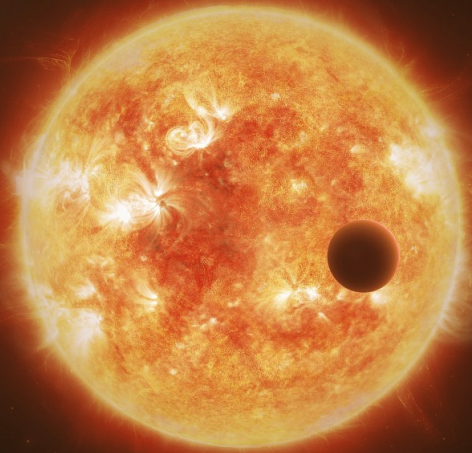
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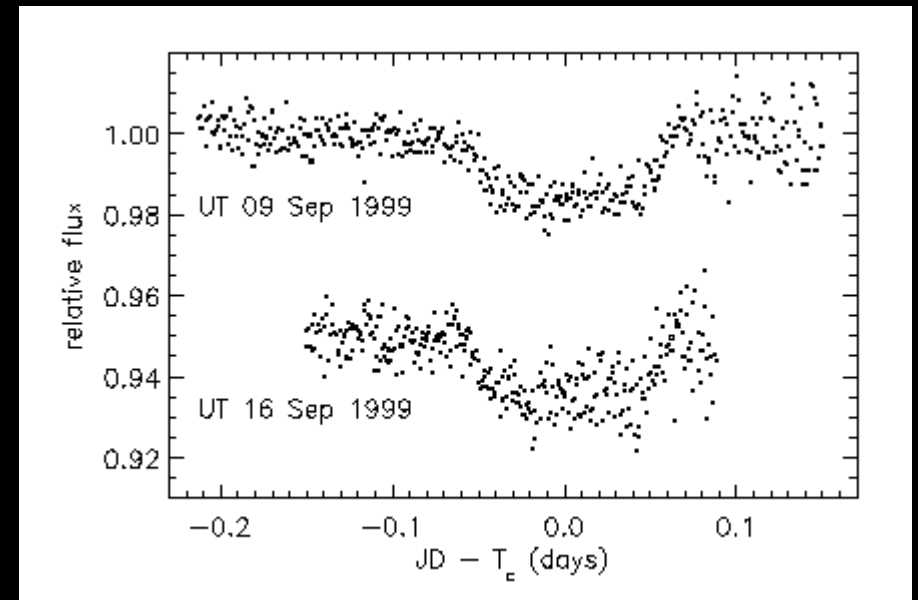
- Jupiter – Sun transit: 1%
- Earth – Sun transit: 80 ppm
- Earth – late M star transit: 1%
- 2000K hot Jupiter occultation (z): ~500 ppm



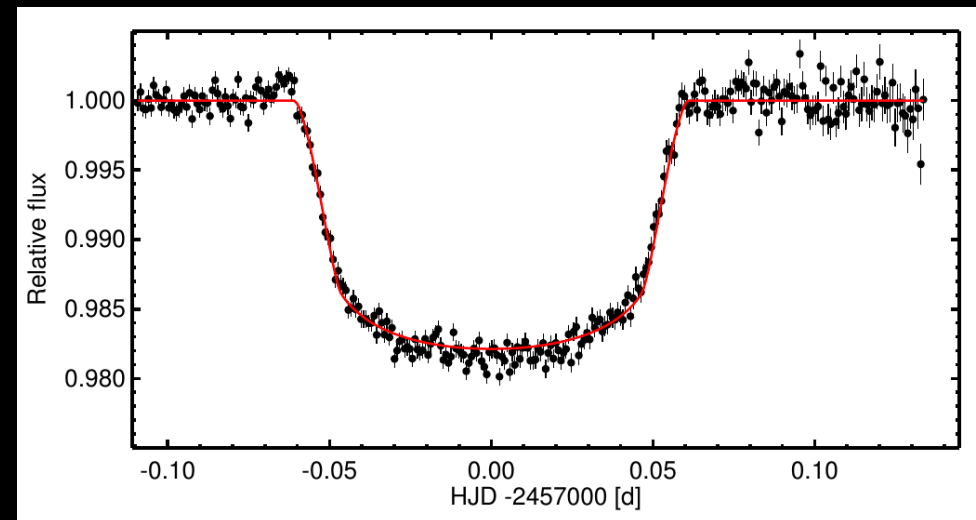
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HD 209458 Charbonneau+ 2000

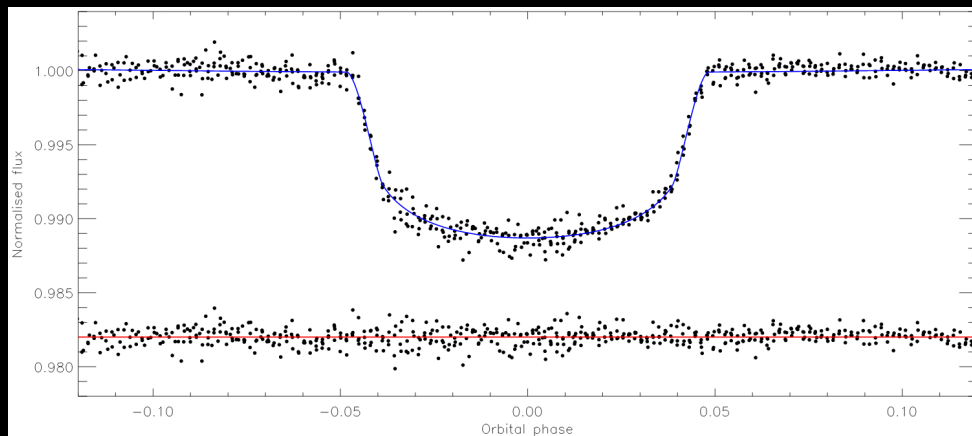


WASP-121, EulerCam, January 2018

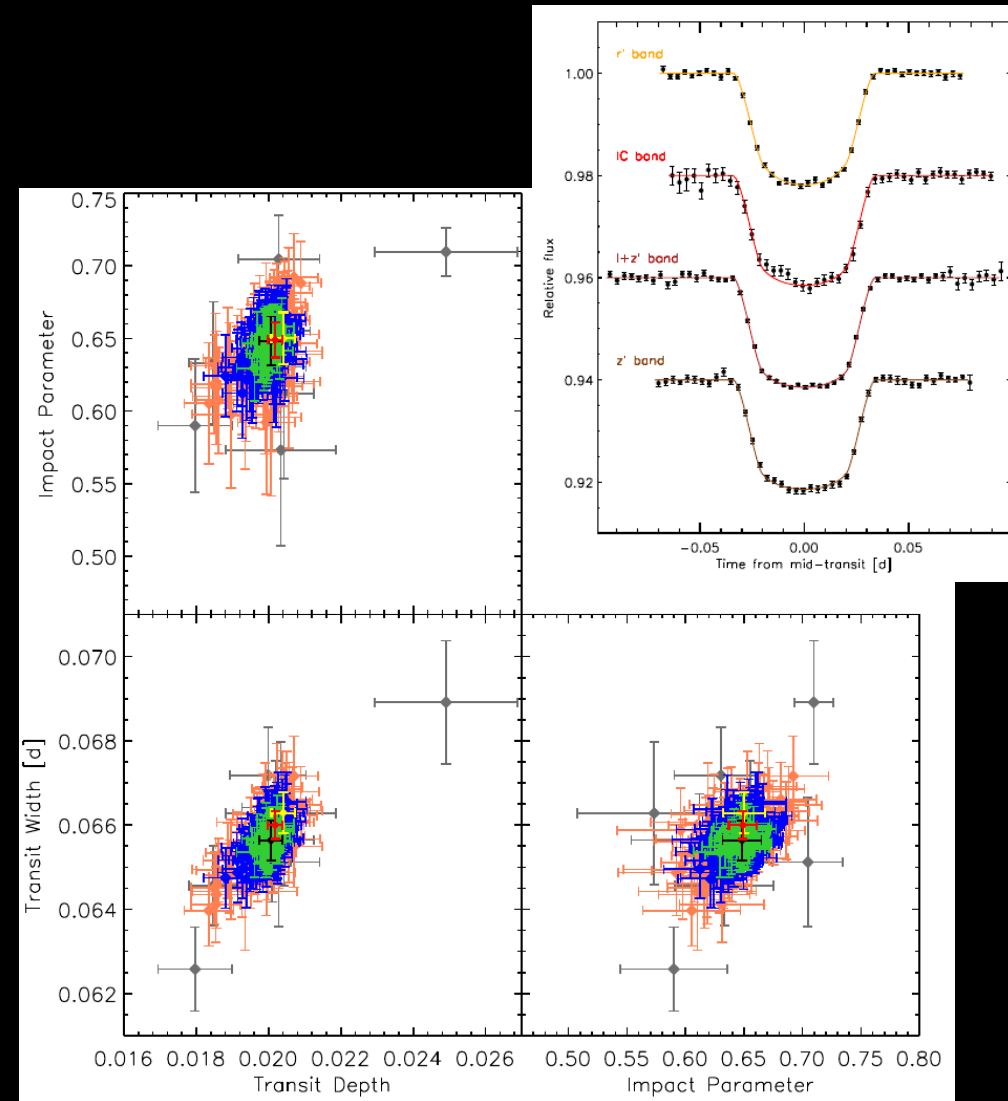
# Sizing planets

Measure precise transit shapes to better determine

- planetary radius
- orbital parameters  $a_{sm}$ , incl.
- stellar mean density (Seager & Mallen-Ornelas 2003)



WASP-18, Southworth+ 2009

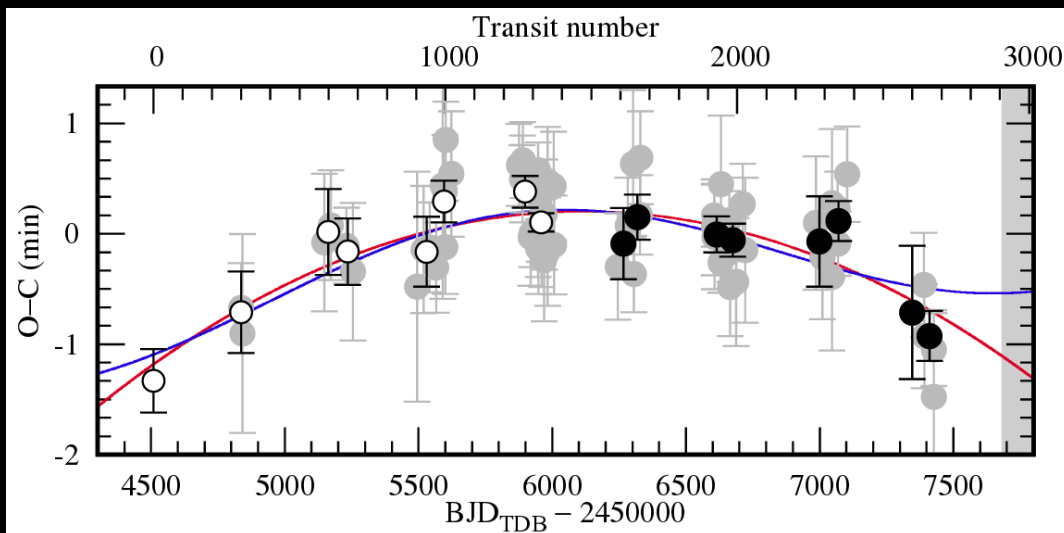


14 transits of WASP-19, Lendl+ 2012

# Transit Timing Variations

Measure precise mid-transit times over a long time baseline searching for period variations

- additional bodies
- orbital decay
- orbital precession

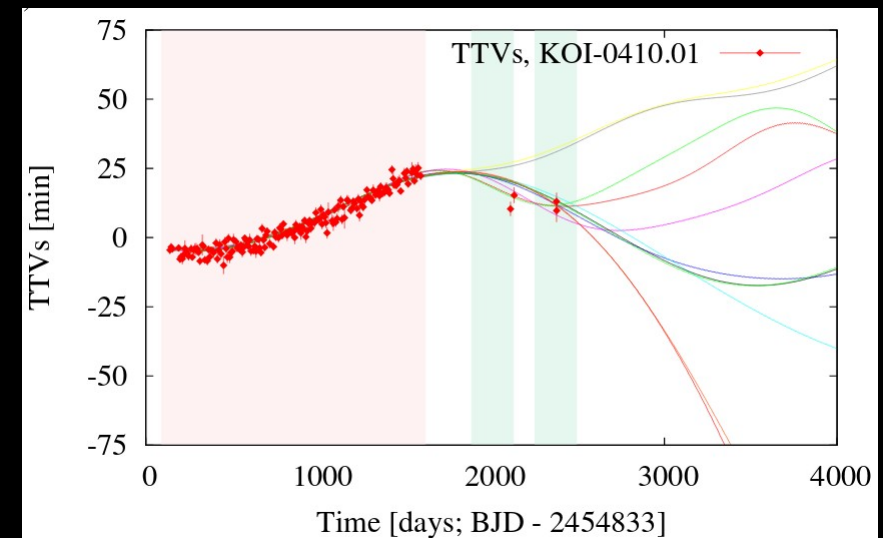
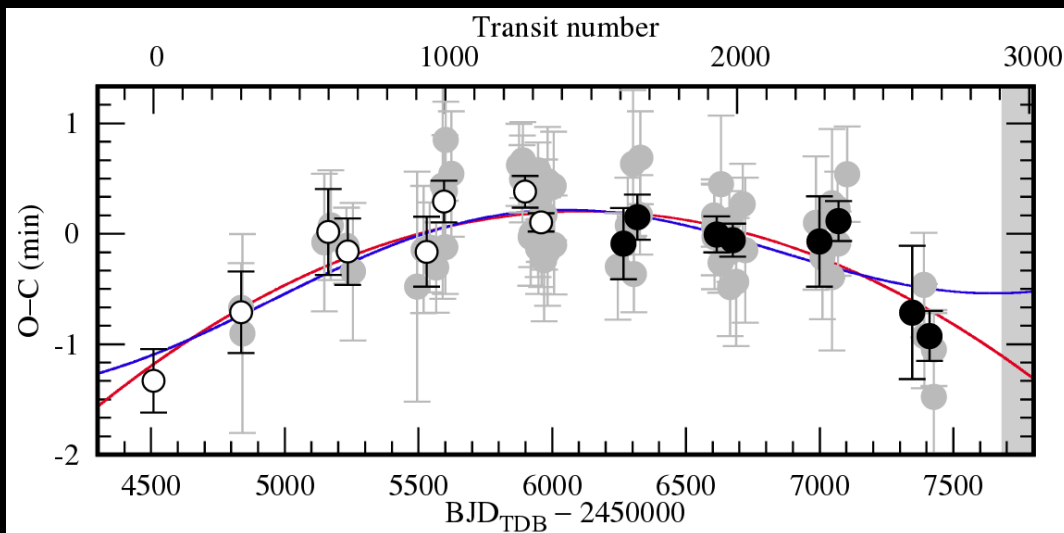
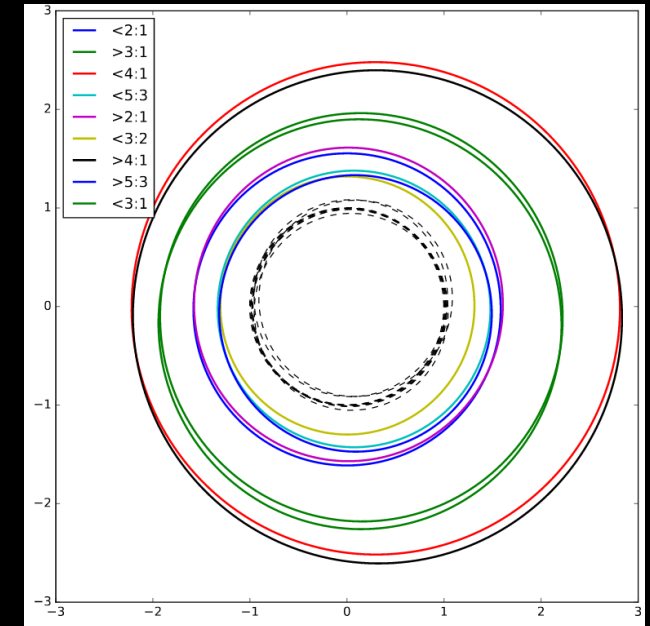


29+ transits of WASP-12, Maciejewski+ 2016

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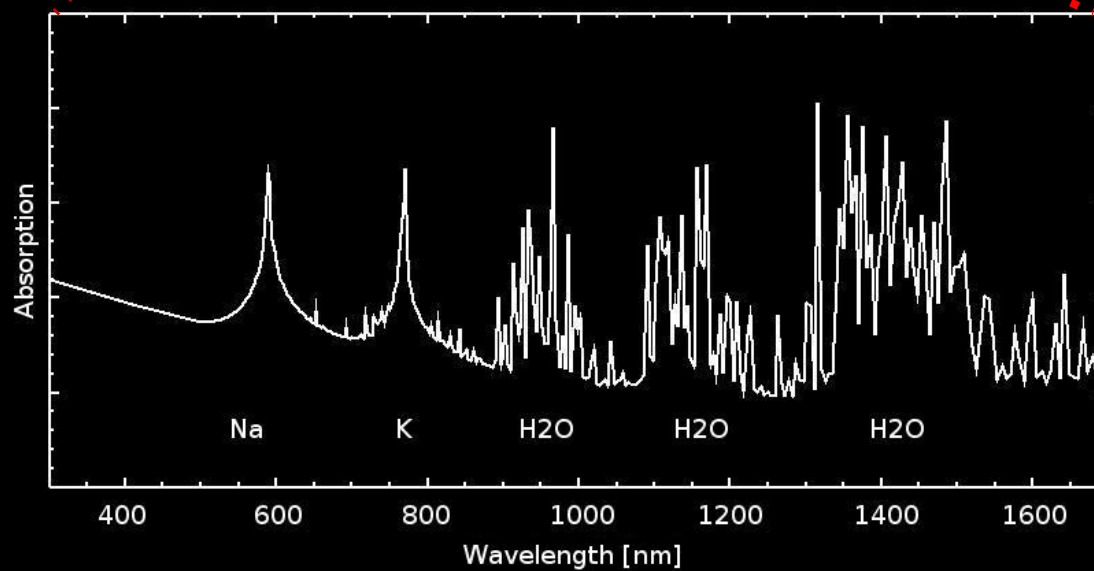
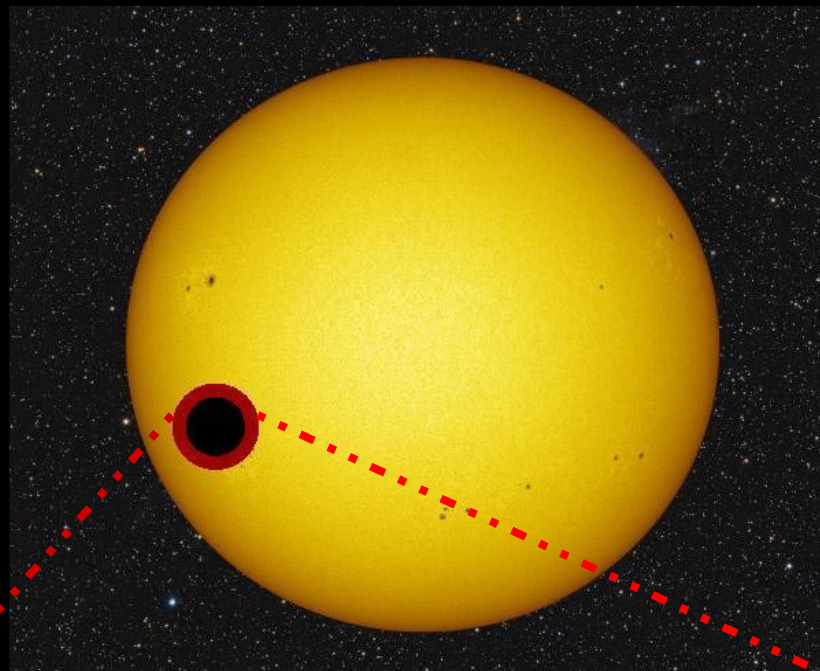
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# Transmission spectra

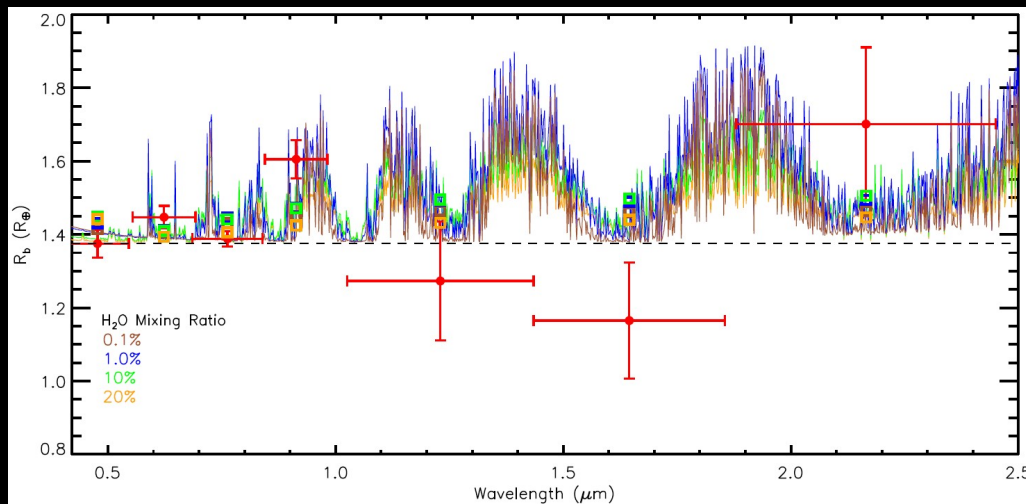


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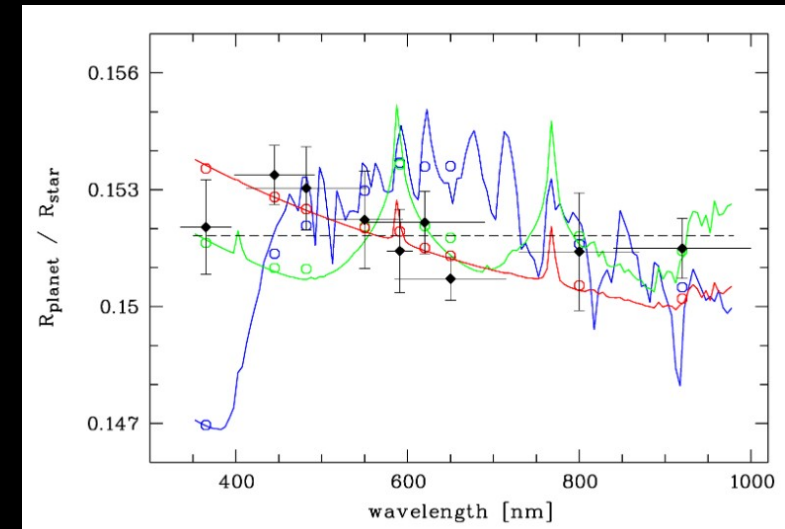
Wavelength-dependent variations  
in transit depth

→ absorption features in planetary  
atmosphere

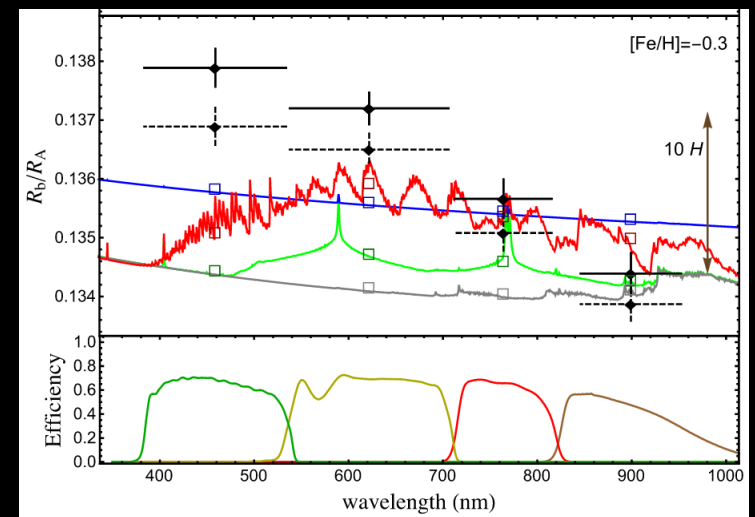
→ Na, K, H<sub>2</sub>O, TiO, VO, Aerosols



GJ1132, Southworth+ 2017



HAT-P-32, Mallonn+ 2016



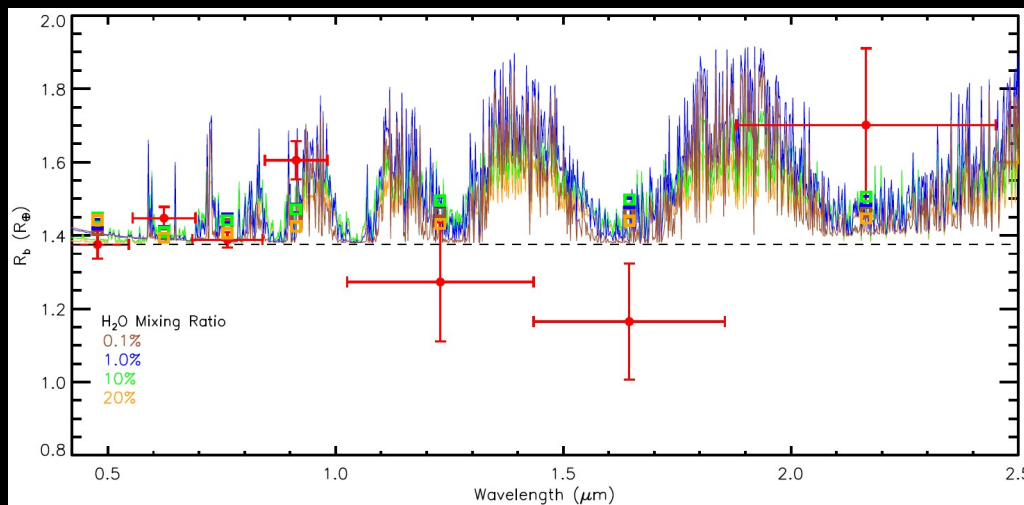
WASP-36, Mancini+ 2016

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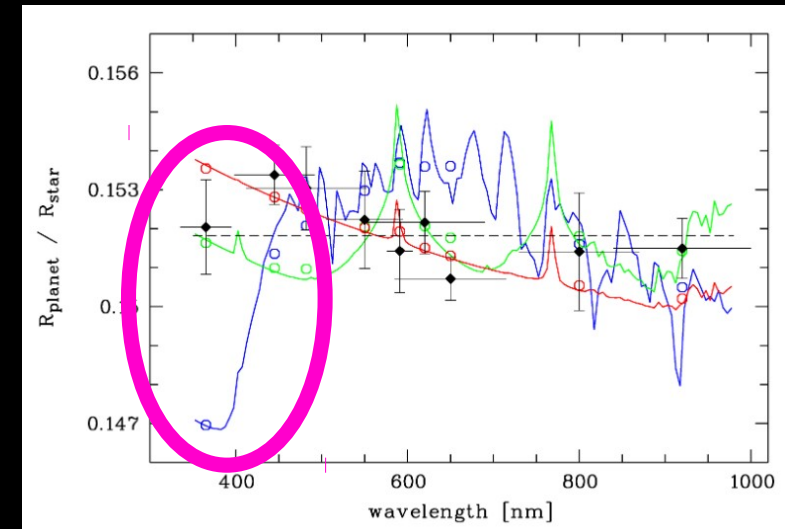
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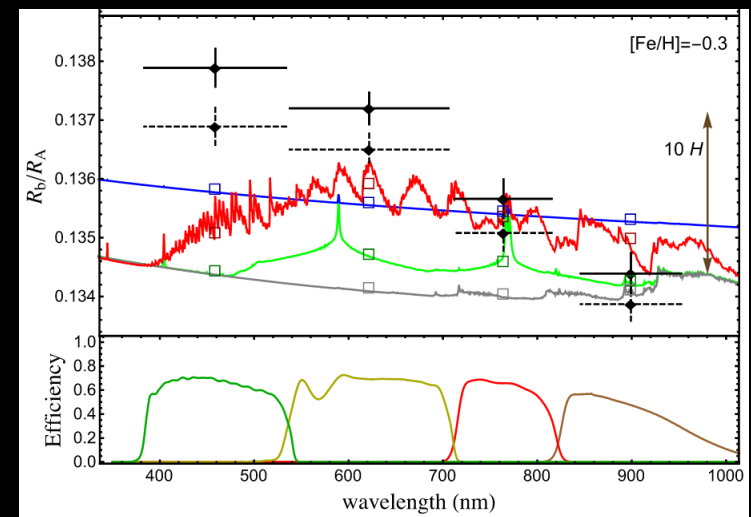
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GJ1132, Southworth+ 2017

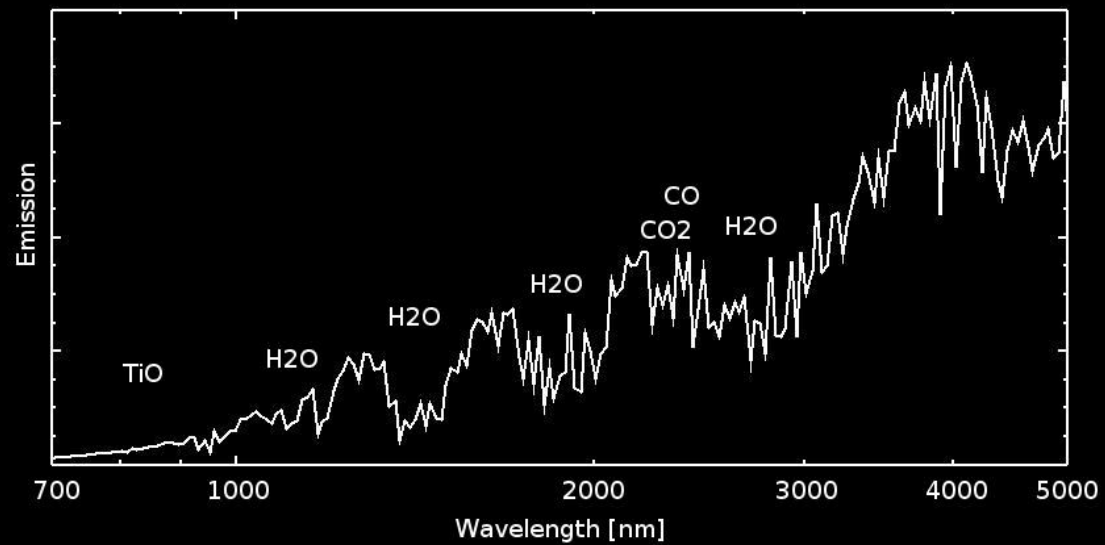
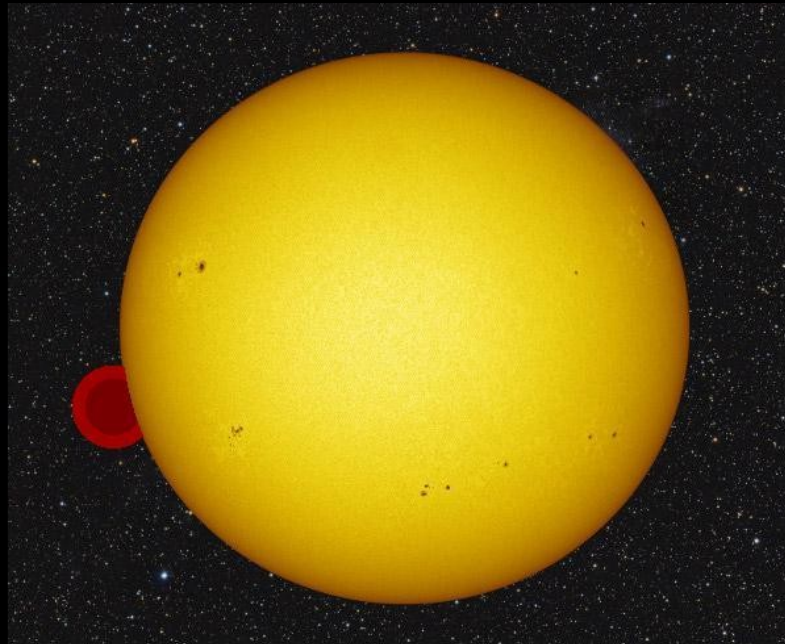


HAT-P-32, Mallonn+ 2016



WASP-36, Mancini+ 2016

# Emission spectra



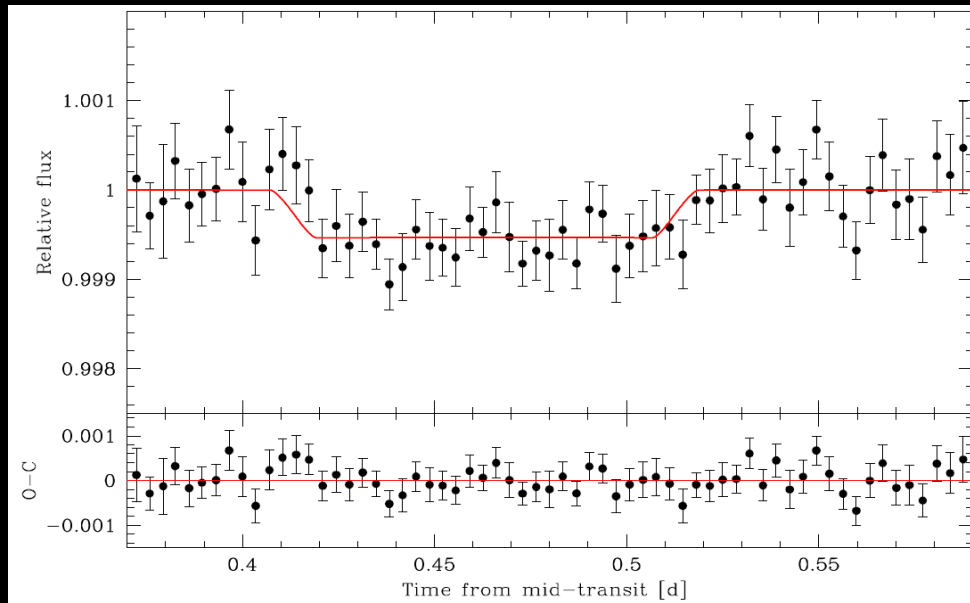
# Emission spectra

Occultations reveal planetary emission

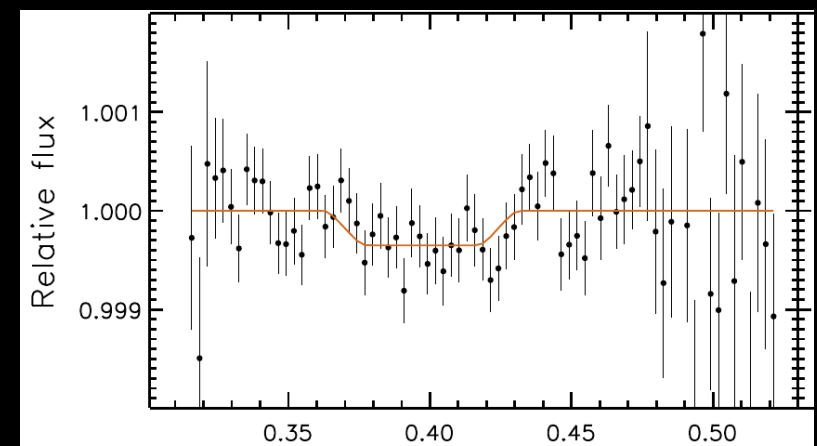
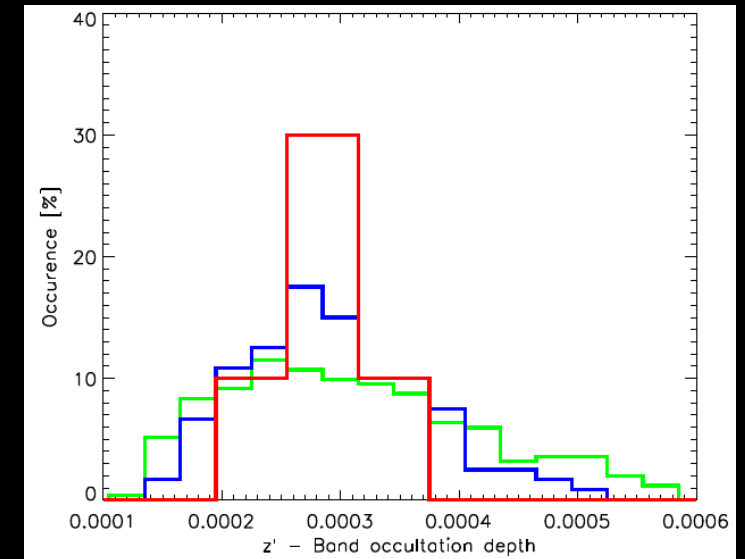
→ planetary temperatures

→ planetary composition/thermal profile

→ feasible with small facilities in z' band



WASP-103, 16 occultations combined,  
Delrez+ 2018



WASP-19, 10 occultations combined,  
Lendl+ 2013



# Surveys

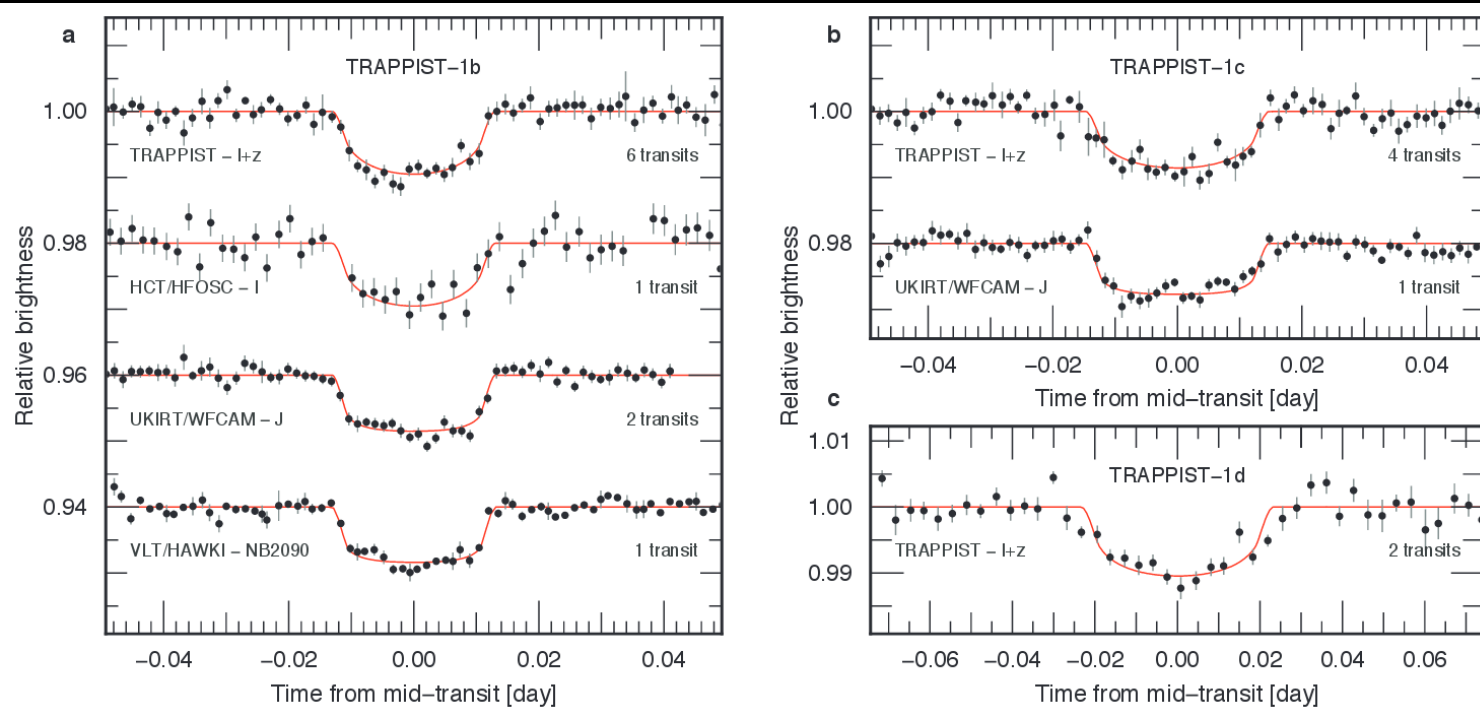
Point-and-stare surveys

→ high risk - high gain

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Point-and-stare surveys

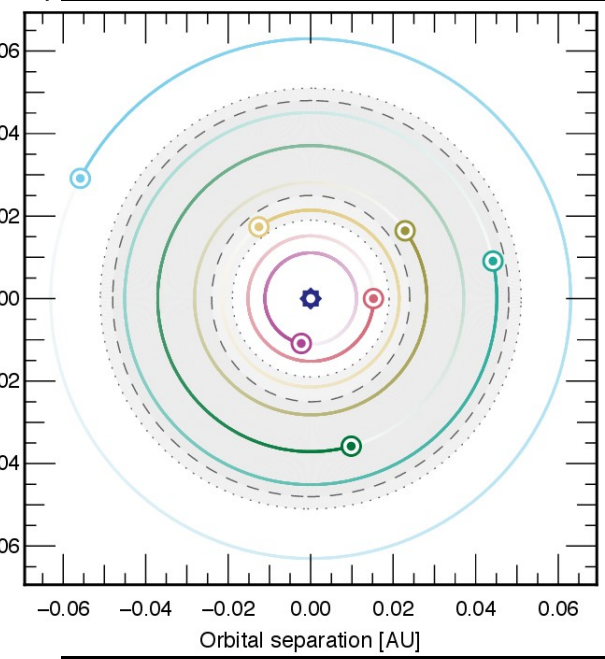
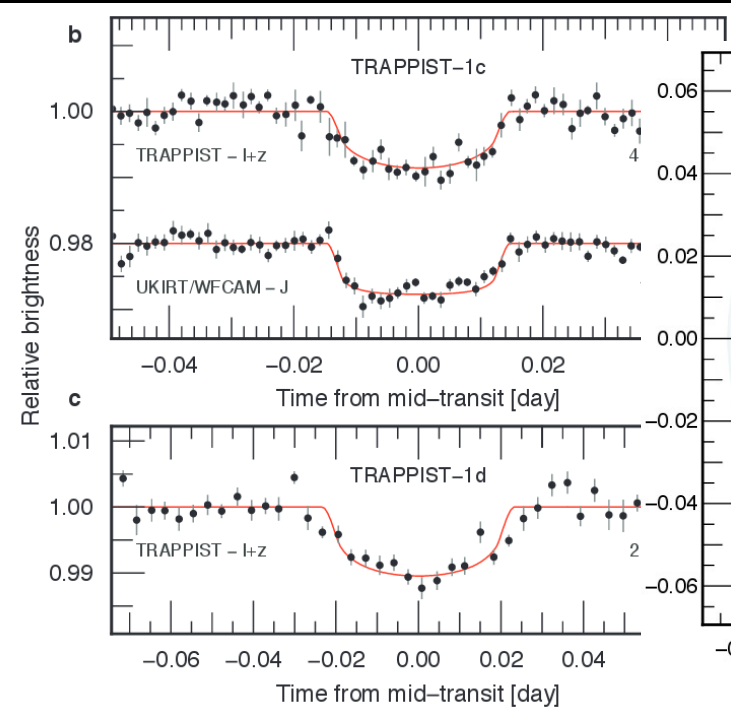
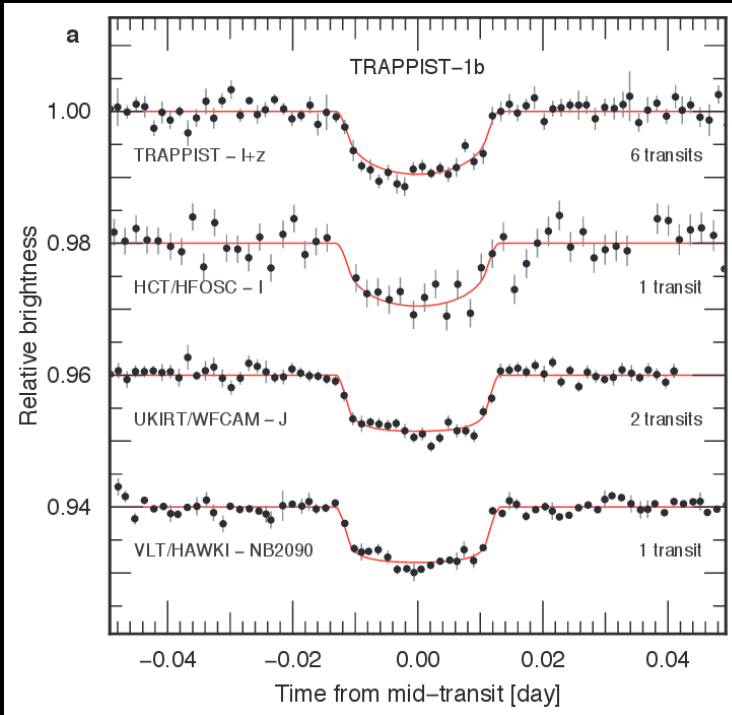
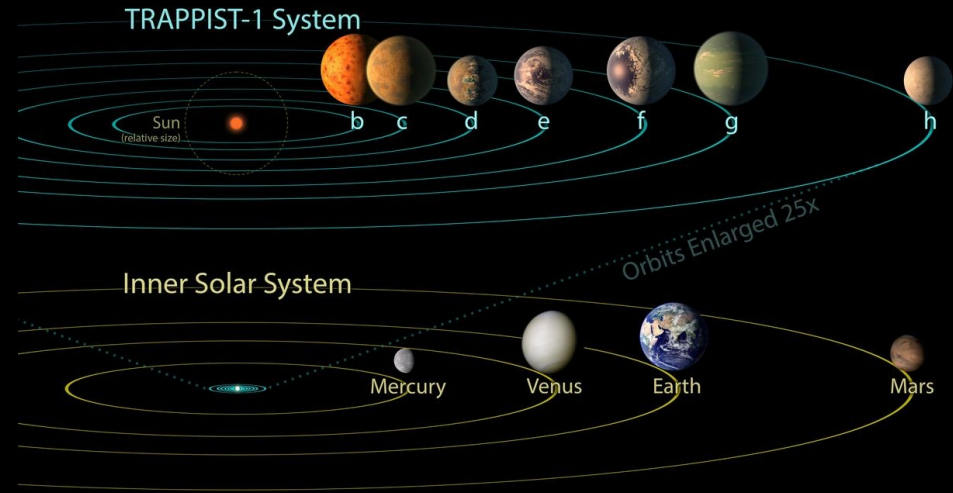
→ high risk - high gain



# Surveys

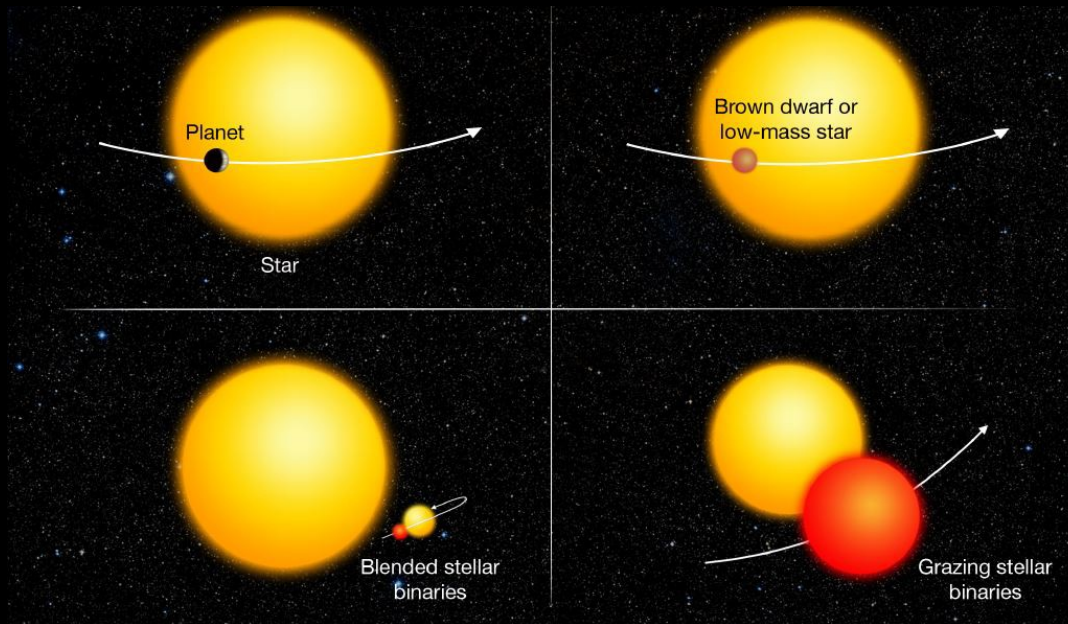
Point-and-stare surveys

→ high risk - high gain



# Binary Stars

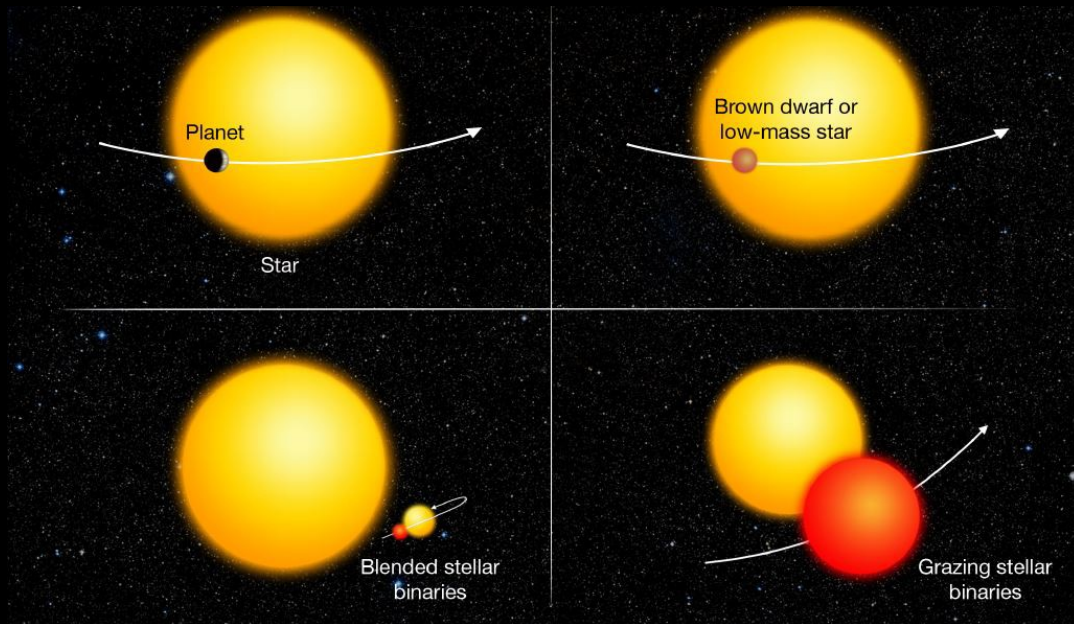
High number of eclipsing binaries found in transit surveys



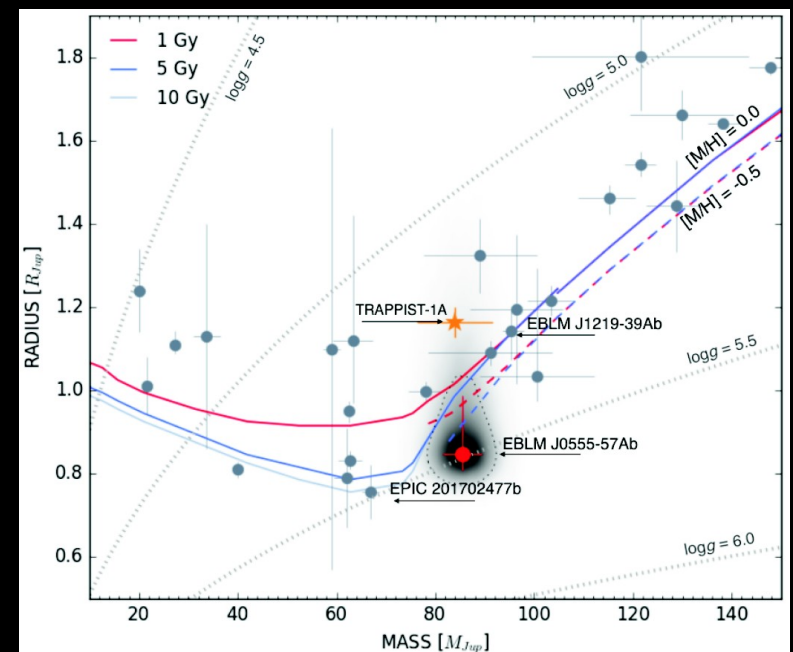
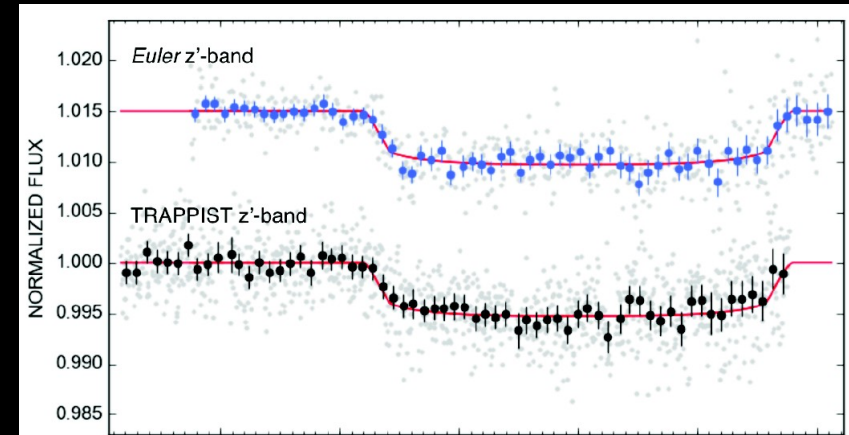
- Tightly constrain stellar mass/radius
- Constrain stellar evolutionary models
- Many low-mass systems

# Binary Stars

High number of eclipsing binaries found in transit surveys



- Tightly constrain stellar mass/radius
- Constrain stellar evolutionary models
- Many low-mass systems



EBLM0555-57, von Boetticher+ 2017

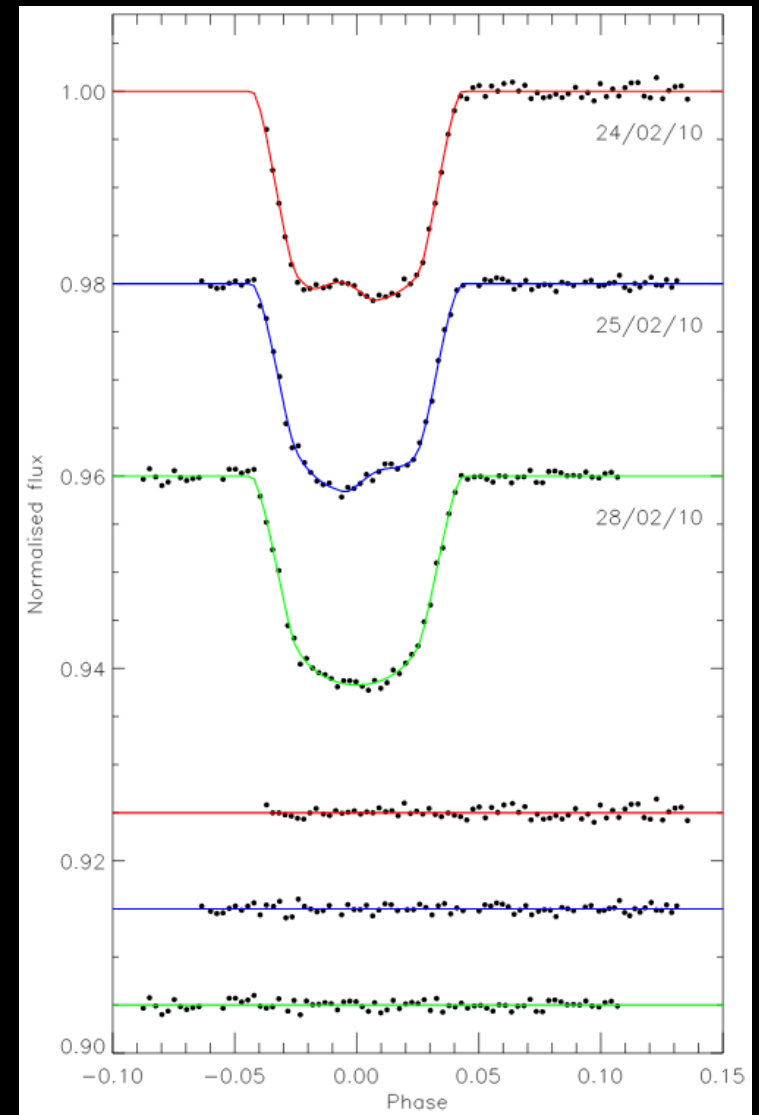


# Stellar activity and rotation

Light curve shape anomalies,  
long-term monitoring

→ Irregularities on stellar surface:  
spots (or faculae)

→ Rotational modulation

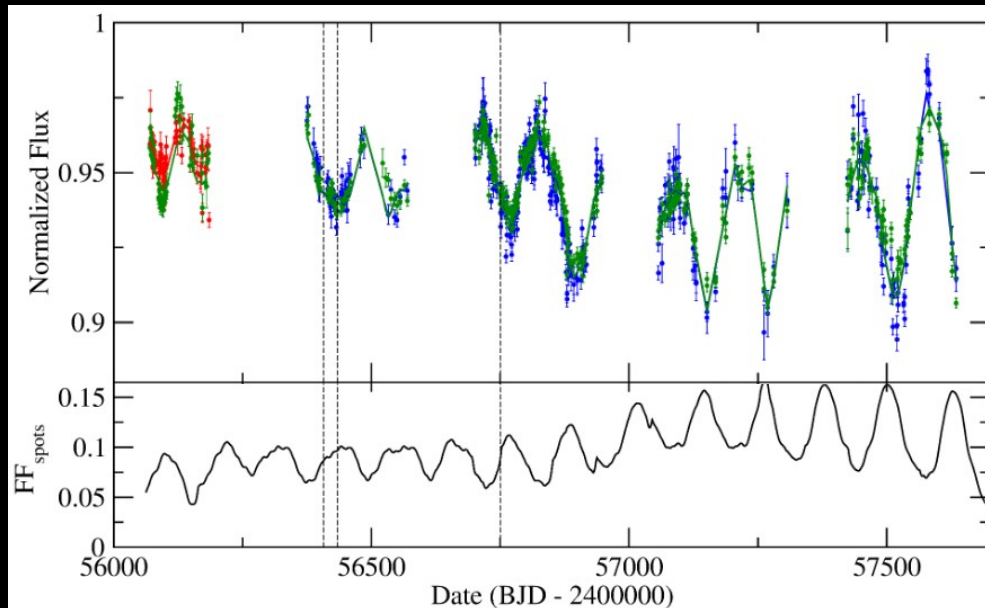


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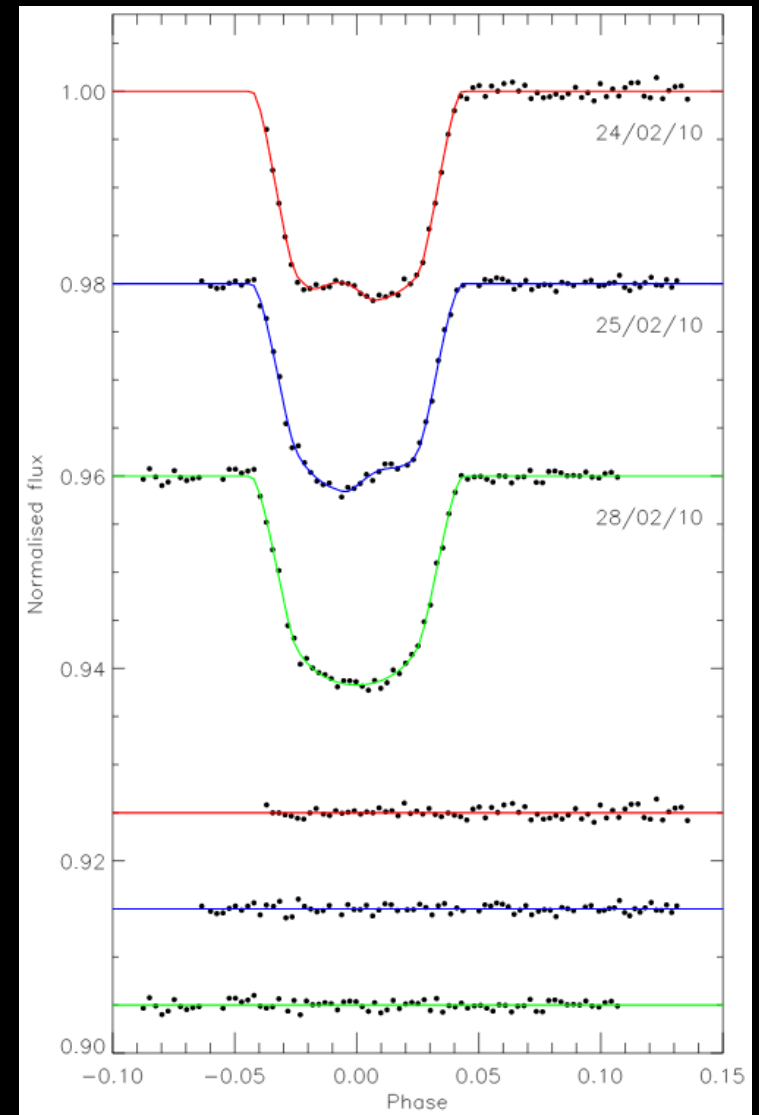
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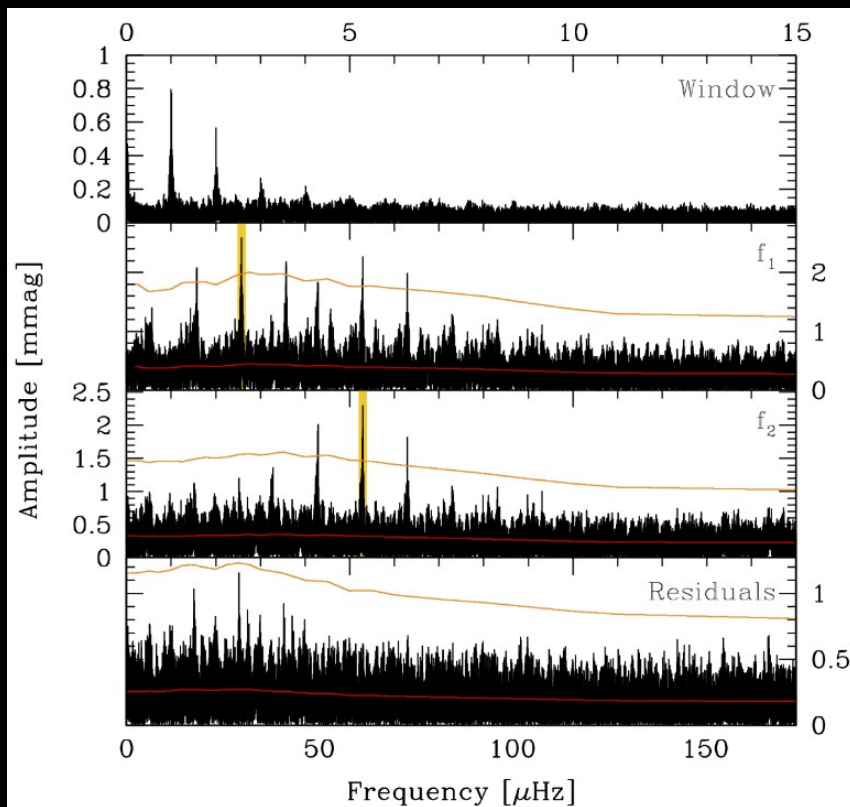
GJ1214, Mallonn+ 2018



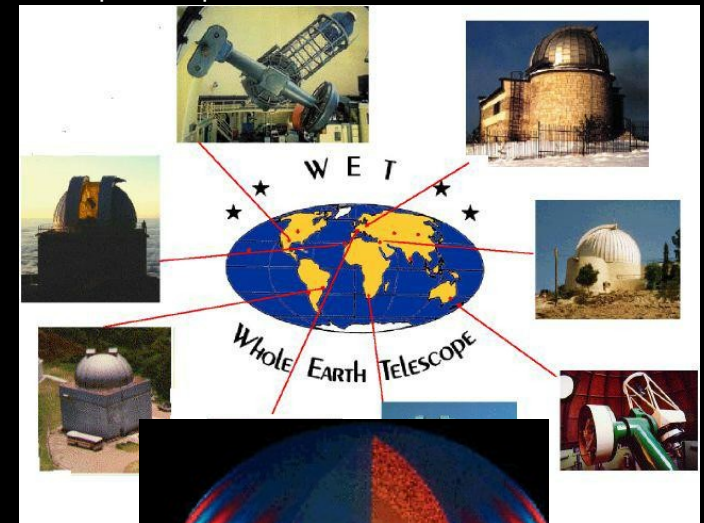
WASP-19, Tregloan-Reed+ 2013

# Asteroseismology

- Stellar oscillations directly probe stellar structure
- Similar strategy but duration and cadence of observations is critical
- Coordinated observations between facilities (e.g. “Whole Earth Telescope”)
- Long-term monitoring of specific fields



<http://www.public.iastate.edu/~sdk/AstroIowaSt/wet.html>

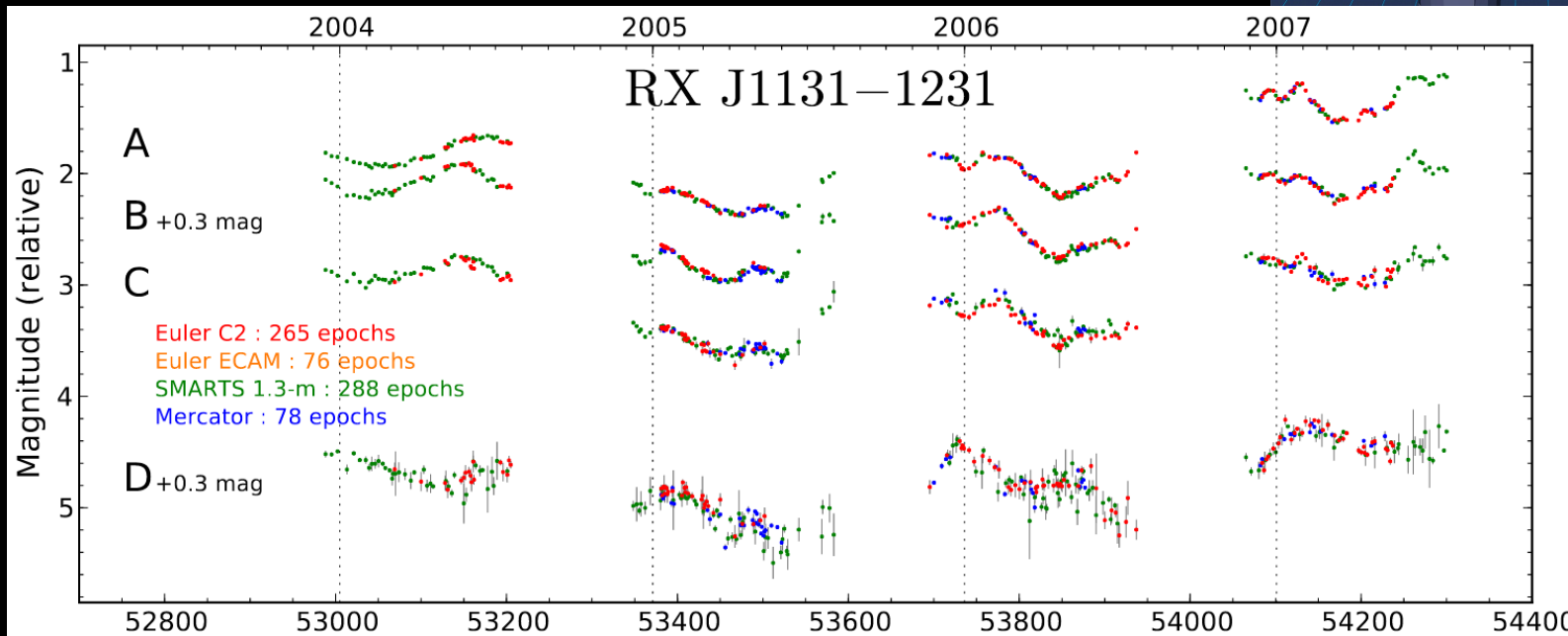
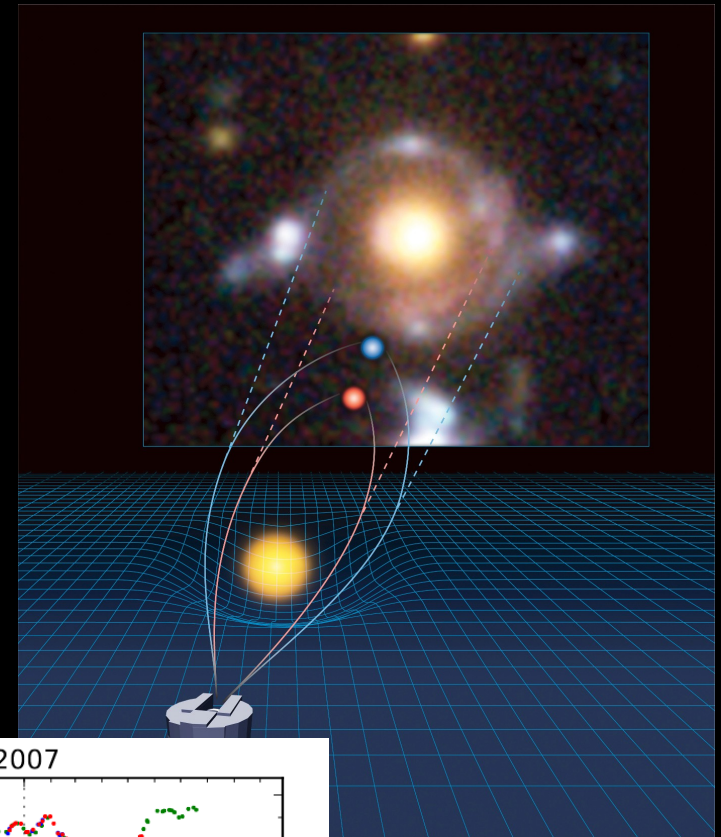


Mowlawi+ 2013

A new class of variables in NGC 3766 from 7 years of monitoring

# Gravitational lenses

- Obtain light curves for different elements of a lensed object
- Time delays between the components
- Constrain  $H_0$



Quasar RX J1131  
Tewes+ 2013



*... and a lot more!*



STELLA



Skalnate Pleso



TRAPPIST



OGLE