

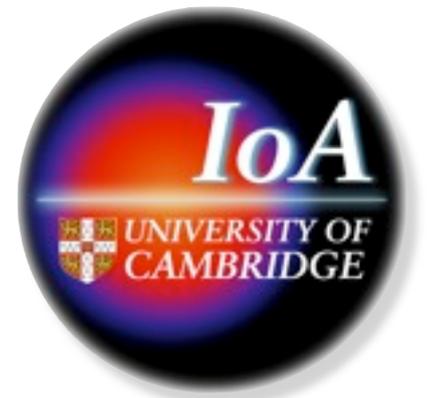
# Transients classification for the Gaia Science Alerts

- status and ideas

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*(or just lucas)*



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*mini-Workshop on Computational AstroStatistics*  
*CfA, Cambridge, MA, 25 August 2010*

# Gaia in brief

## ■ GAIA is a scanning mission

- ◆ no pointing, no change in the schedule, uniform coverage of the sky

## ■ Simultaneous astrometry, photometry and spectroscopy

### ■ Astrometry ( $V < 20$ ):

- ◆ completeness to 20 mag (on-board detection)  $10^9$  stars
- ◆ parallax accuracy: 7  $\mu\text{as}$  at  $<10$  mag; 12–25  $\mu\text{as}$  at 15 mag 100–300  $\mu\text{as}$  at 20 mag

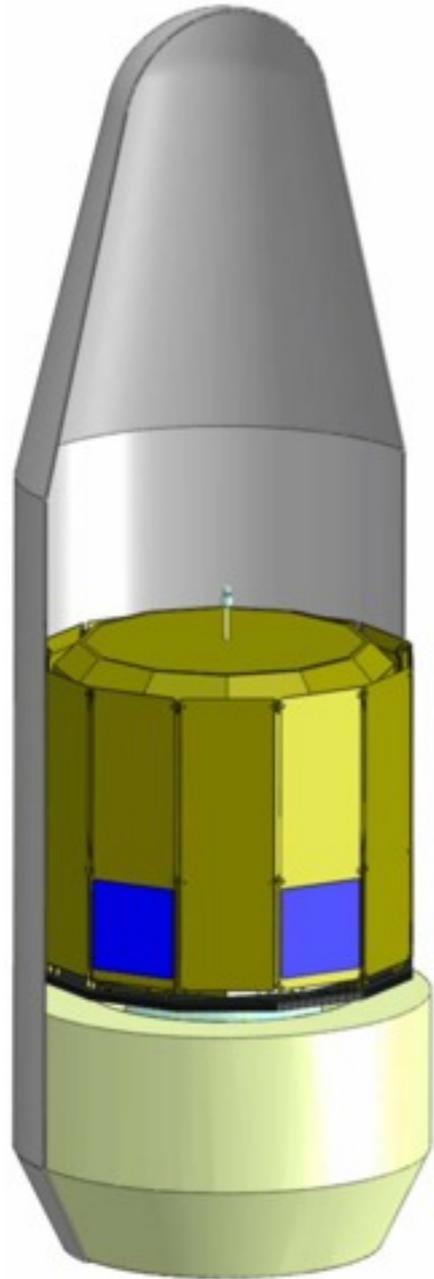
### ■ Photometry ( $V < 20$ ):

- ◆ low-dispersion spectro-photometry
- ◆ 8–20 mmag at 15 mag:  $T_{\text{eff}} \sim 200$  K,  $\log g$ ,  $[\text{Fe}/\text{H}]$  to 0.2 dex, extinction

### ■ Radial velocity ( $V < 16.5\text{--}17$ ):

- ◆ Third component of space motion, perspective acceleration
- ◆  $<1$  km/s at 13–13.5 mag and  $<15$  km/s at 16.5–17 mag

# Satellite



ESA-only mission

Launch date: **spring 2012**

Lifetime: 5 years (1 year potential extension)

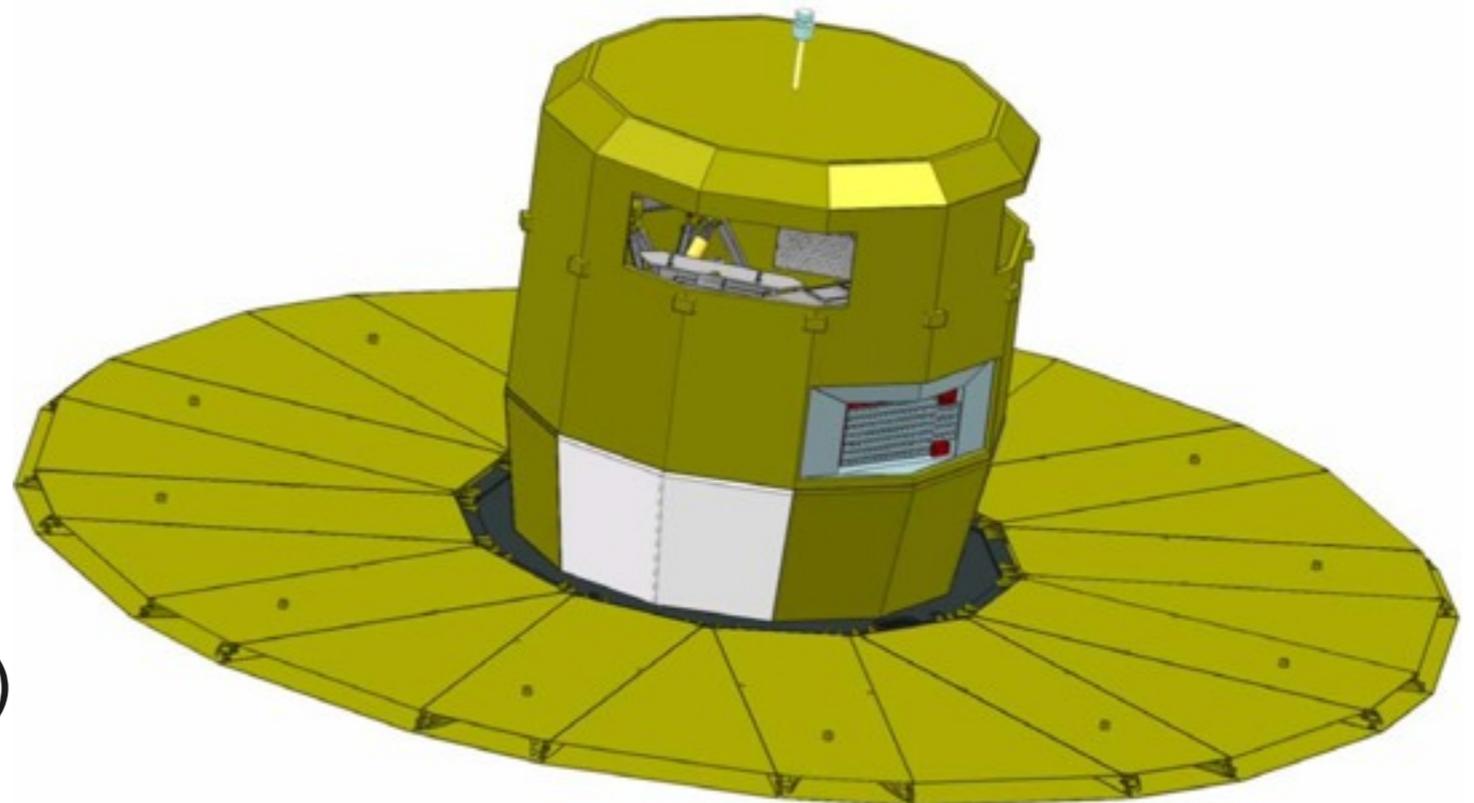
Launcher: Soyuz–Fregat from CSG

Orbit: L2 Lissajous orbit

Ground station: Cebreros and New Norcia

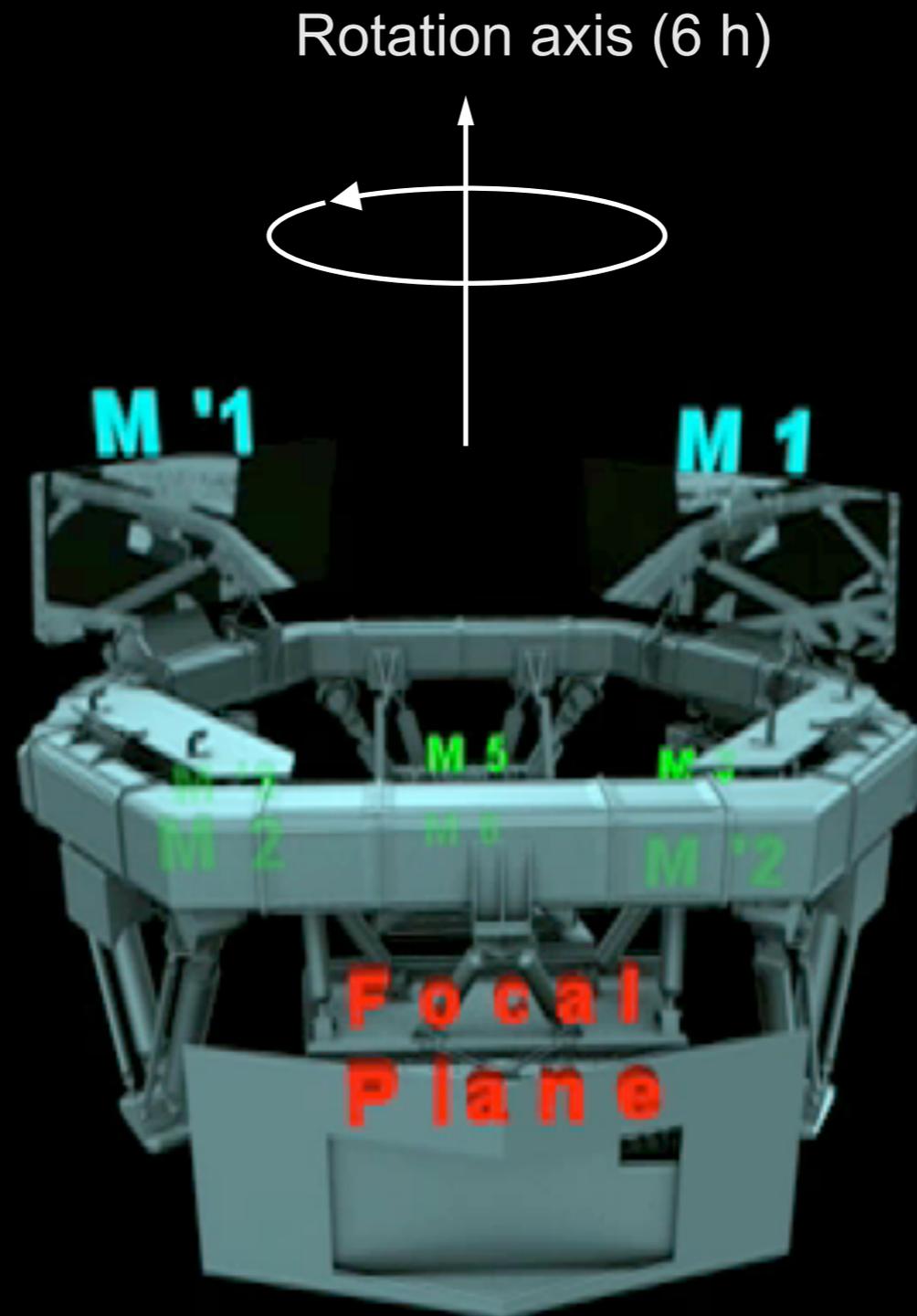
Downlink rate: 4–8 Mbps

- Mass: 2120 kg (payload 743 kg)
- Power: 1631 W (payload 815 W)



# Payload and Telescope

Two SiC primary mirrors  
 $1.45 \times 0.50 \text{ m}^2$  at  $106.5^\circ$



SiC toroidal  
structure  
(optical bench)

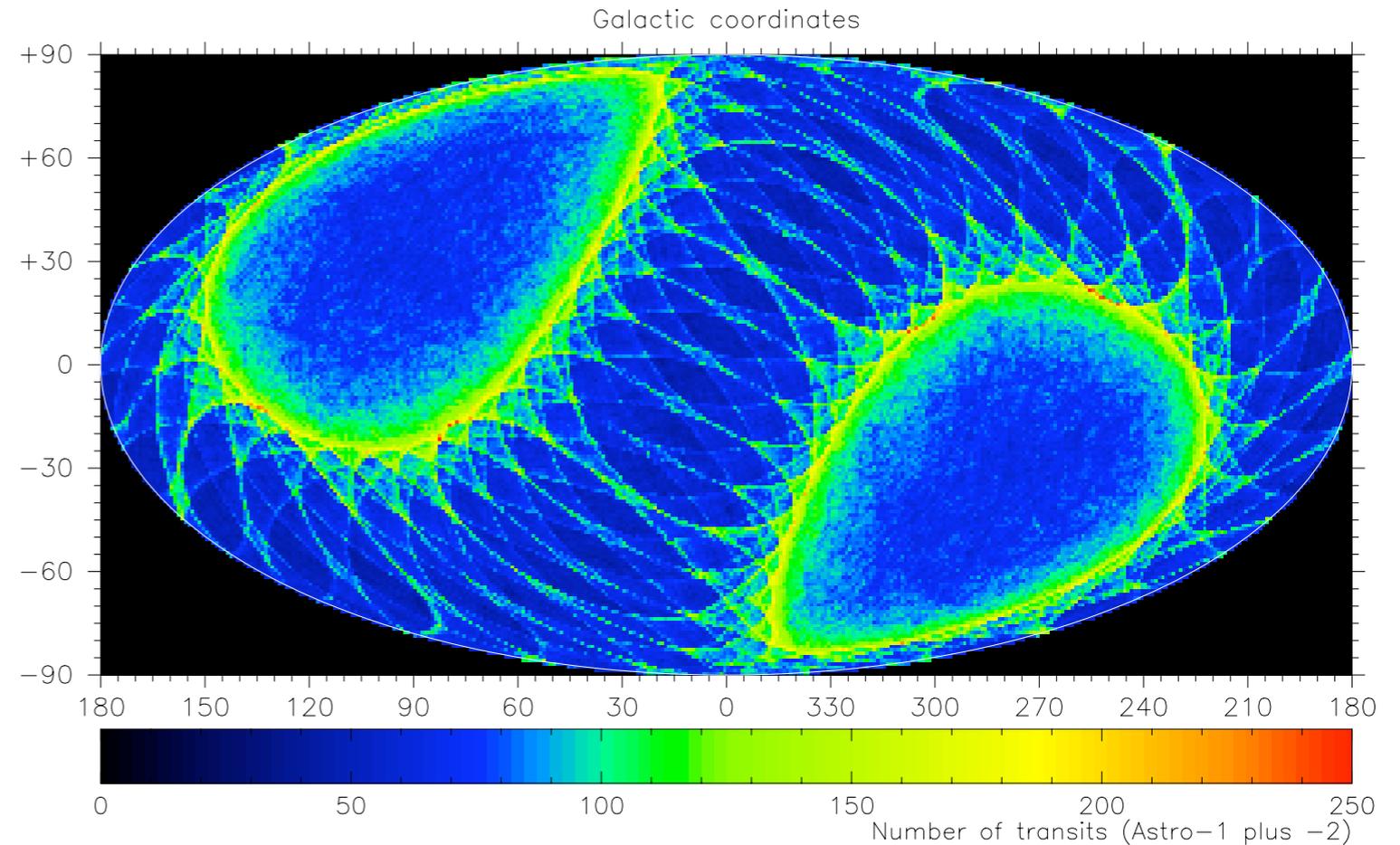
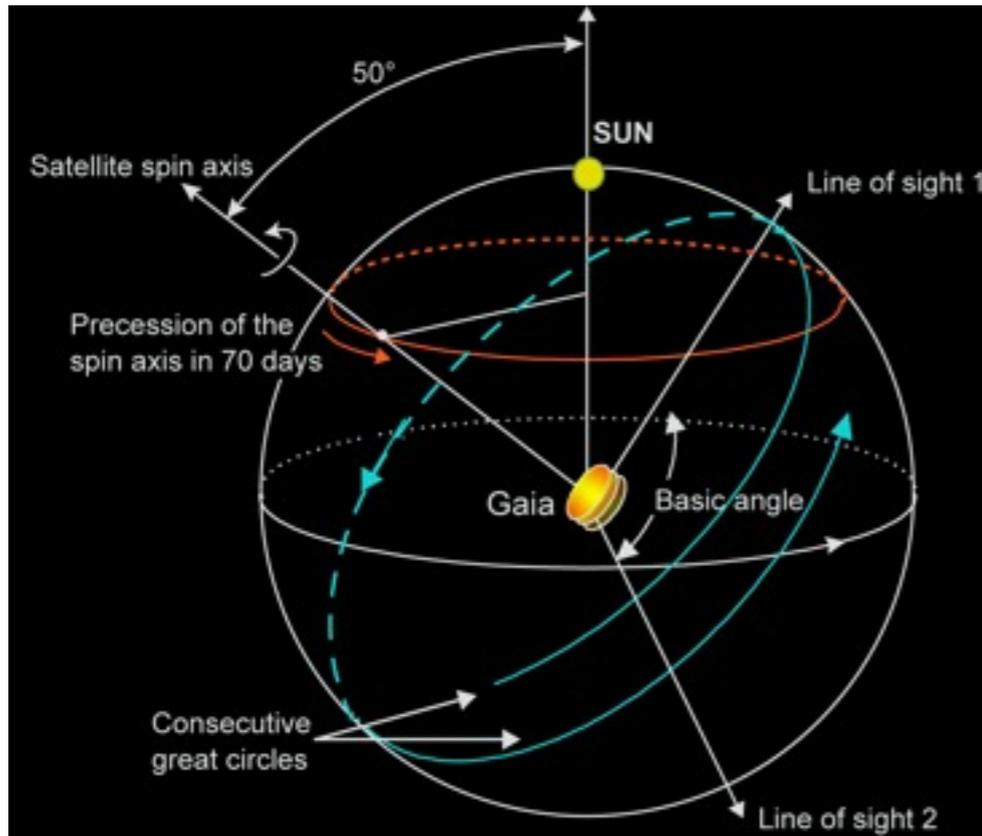
Combined  
focal plane  
(CCDs)

Superposition of two  
Fields of View (FoV)

# Sky Scanning Principle



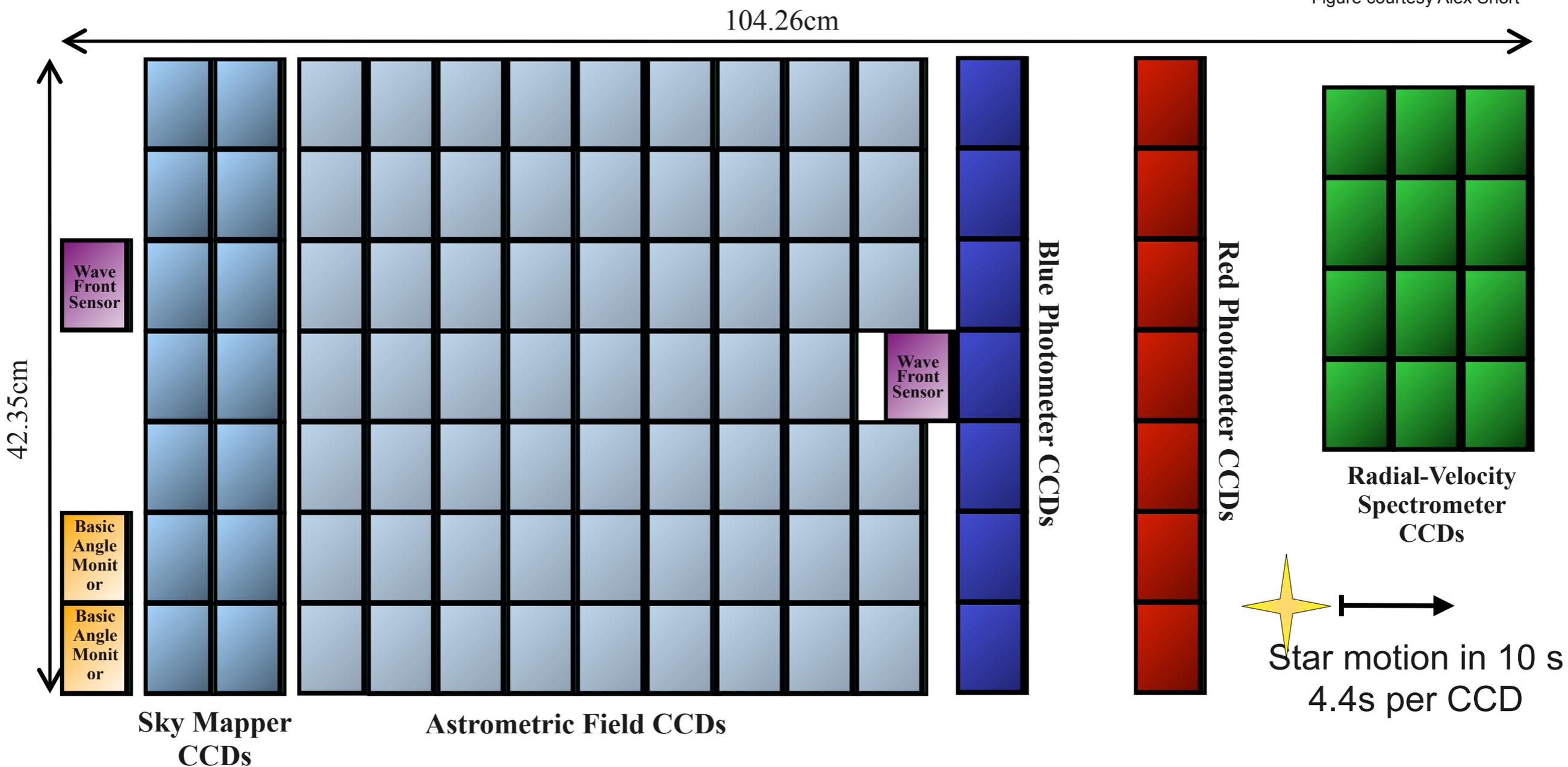
# Sky Scanning Principle



- Two telescopes - time between subsequent FOVs: **106.5m**
- Time between successive scans: **6 h**
- Field revisited every **~70 days**
- Each object measured **~80** times (200 at the nodes)

# Focal Plane

Figure courtesy Alex Short



## Total field:

- active area: 0.75 deg<sup>2</sup>
- CCDs: 14 + 62 + 14 + 12
- 4500 x 1966 pixels (TDI)
- pixel size = 10 μm x 30 μm
- = 59 mas x 177 mas

## Sky mapper:

- detects all objects to 20 mag
- rejects cosmic-ray events
- FoV discrimination

## Astrometry:

- total detection noise: ~6 e<sup>-</sup>

## Photometry:

- spectro-photometer
- blue and red CCDs

## Spectroscopy:

- high-resolution spectra
- red CCDs

# Timeline for the data flow

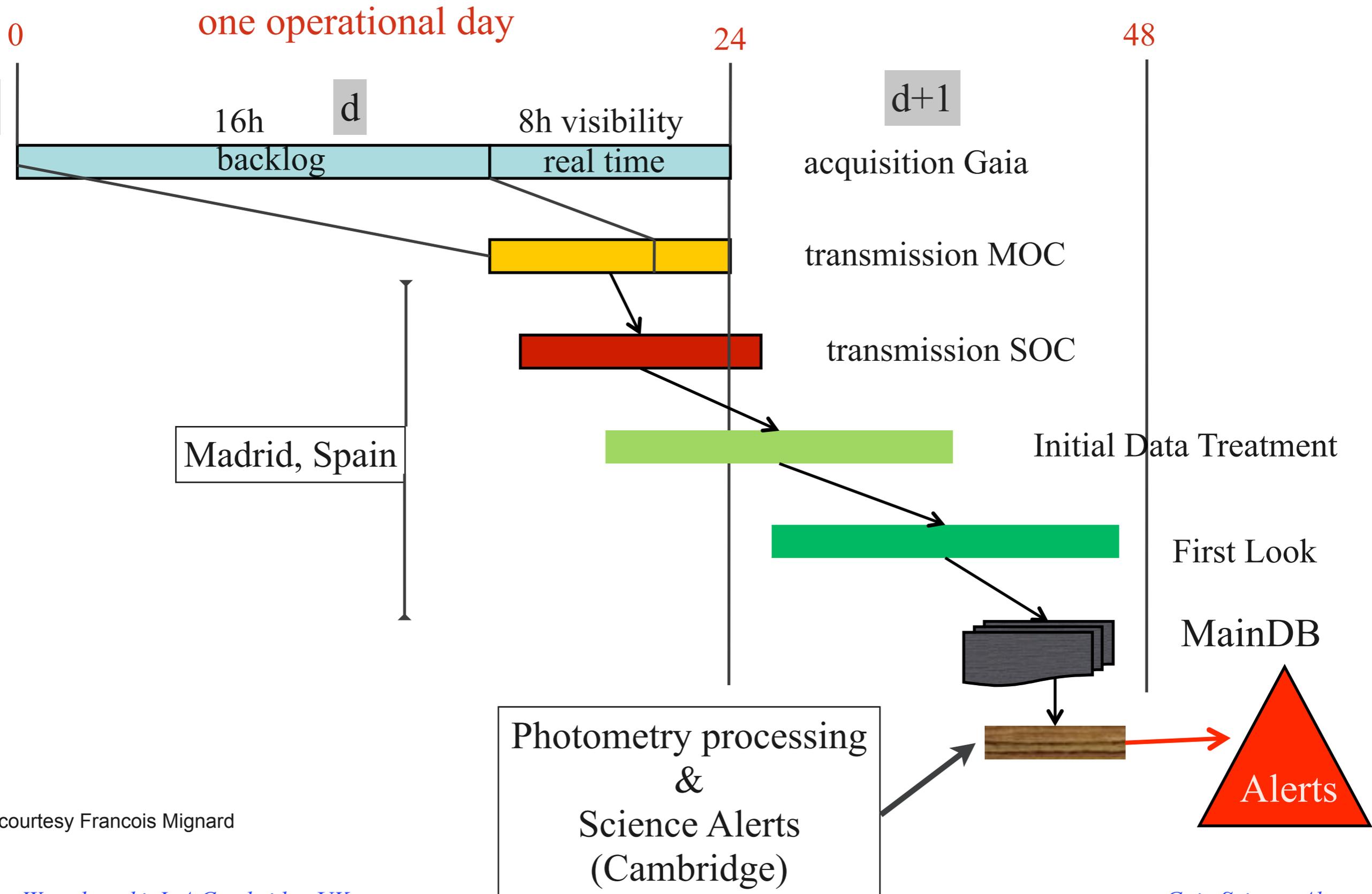
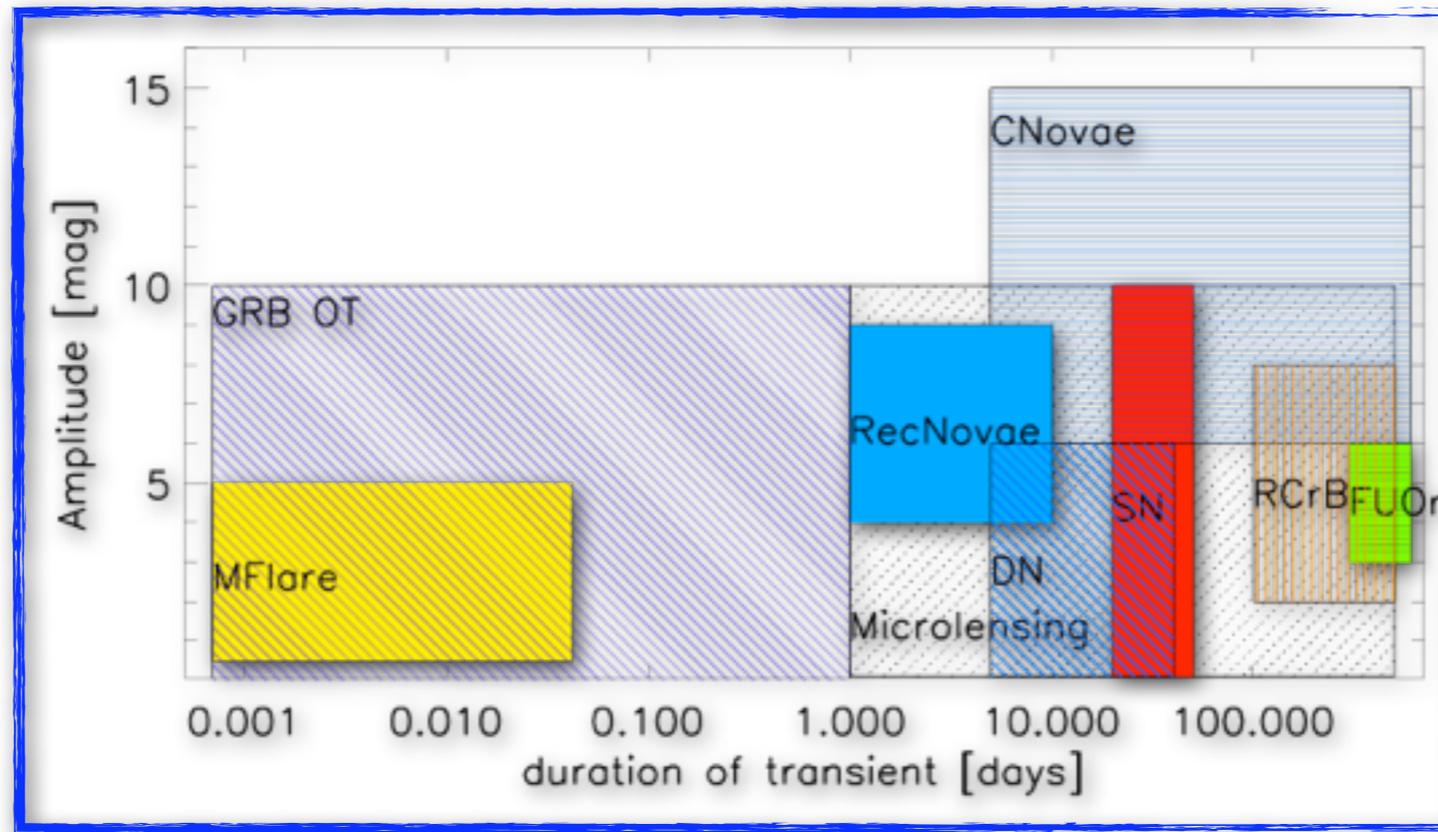
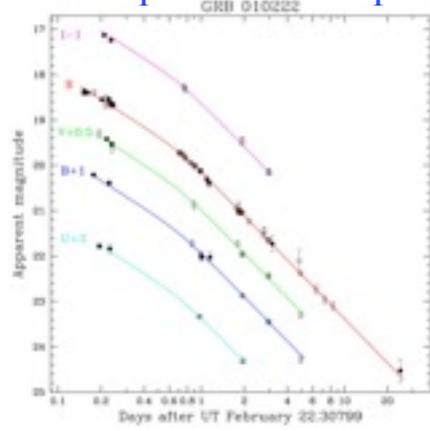


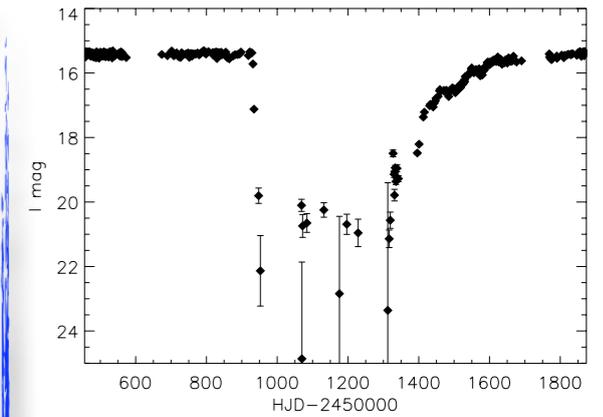
Figure courtesy Francois Mignard

# Potential Triggers

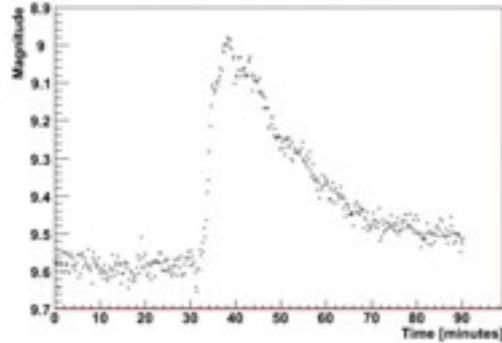
GRBs optical counterparts



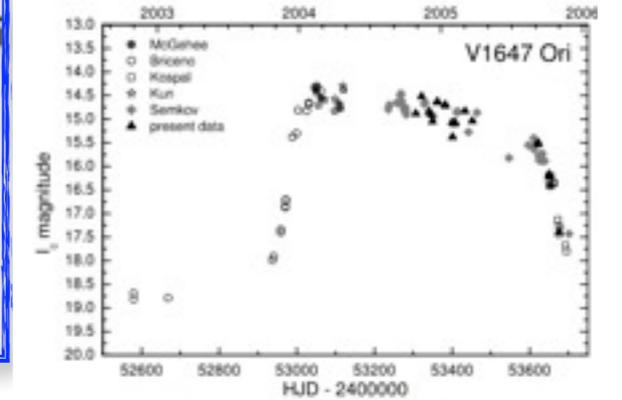
R Coronae Borealis



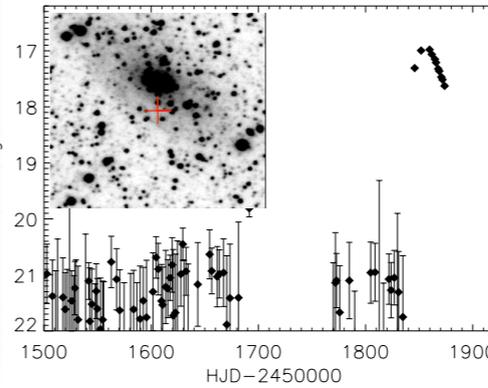
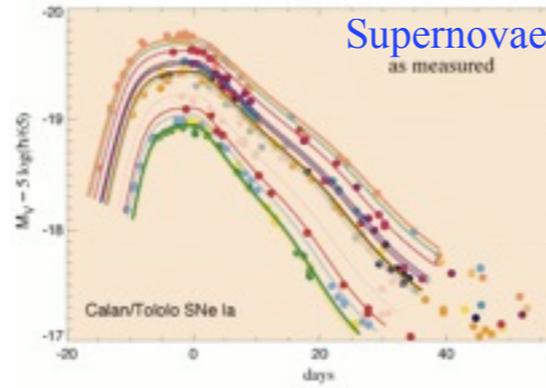
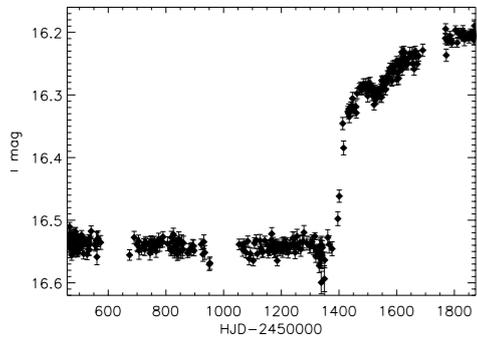
M-dwarf flares



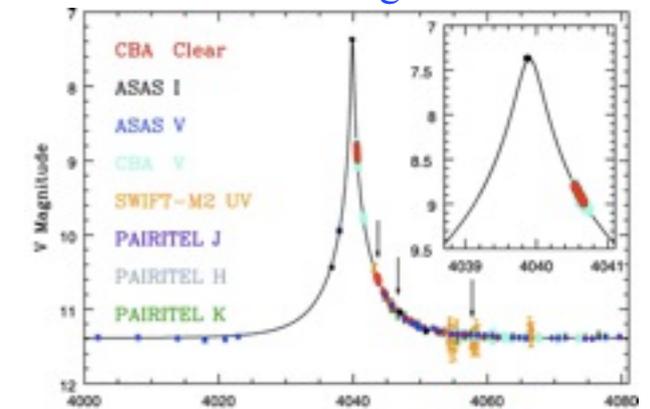
FU Orionis and similar



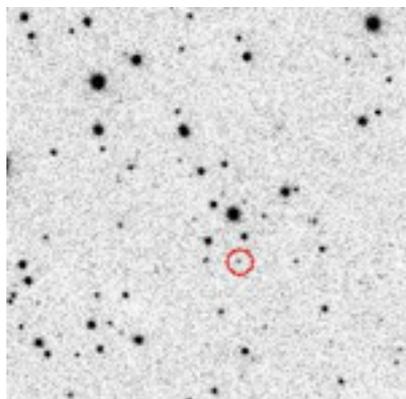
Be stars



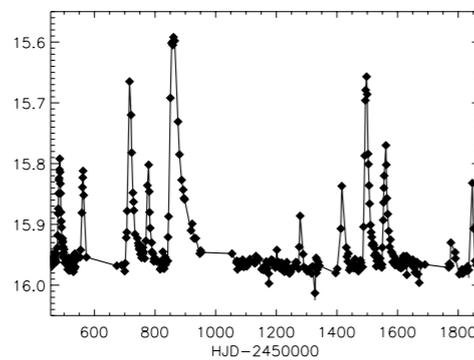
Microlensing events



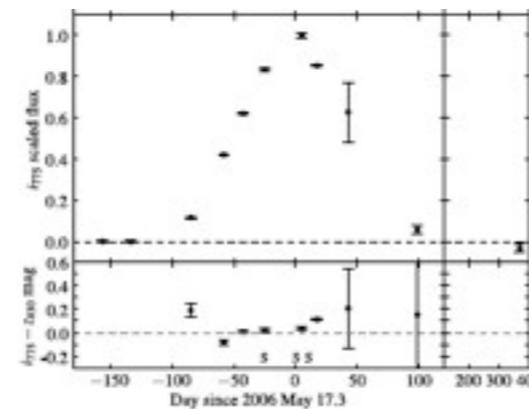
Asteroids



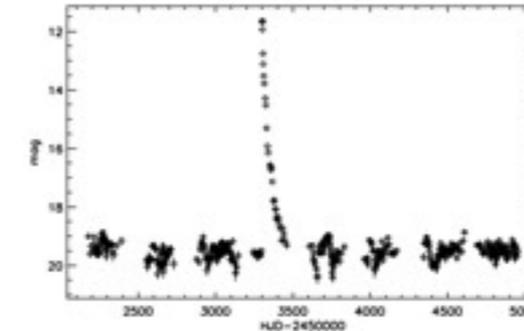
Dwarf novae



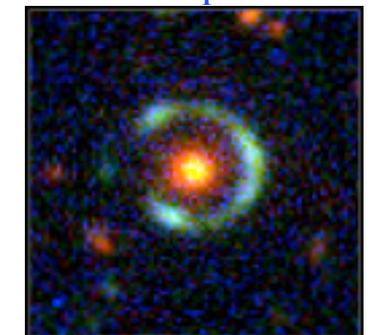
NEW THINGS??



Classical novae

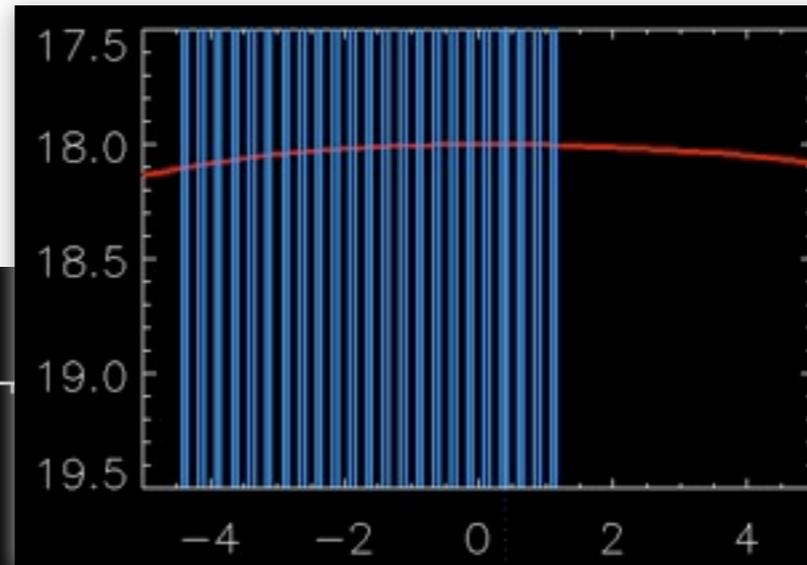


Lensed supernovae

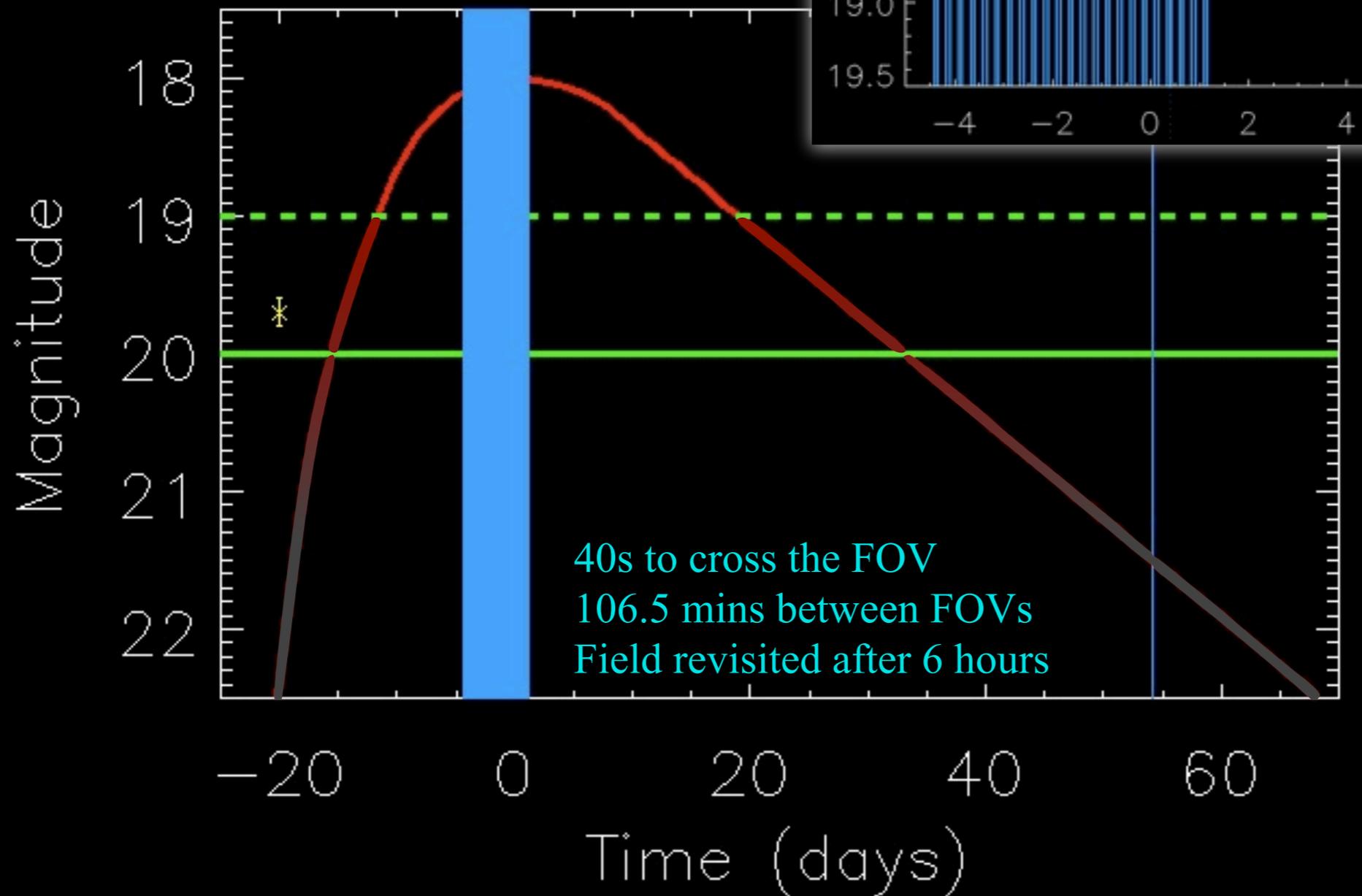


# Supernovae

- 6000 SNe to G=19
- Around 1/3 before maximum



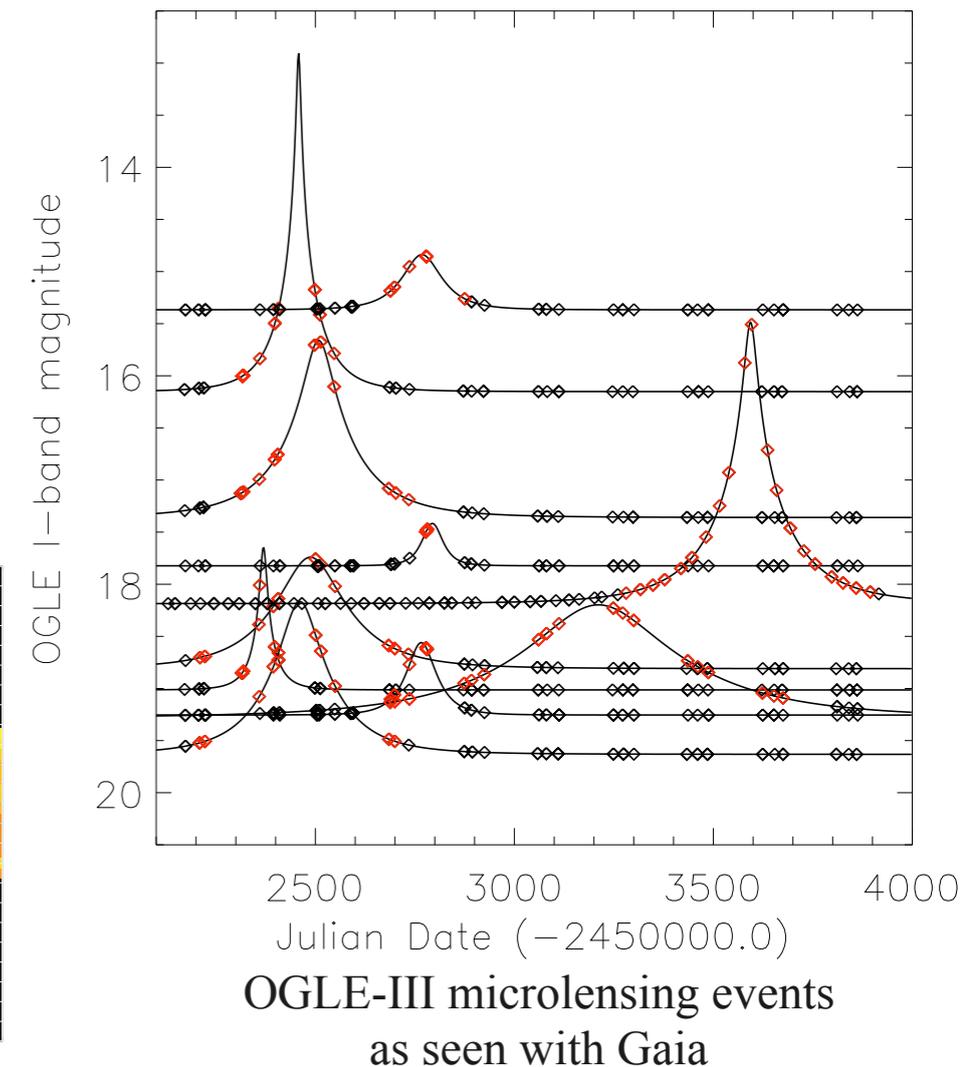
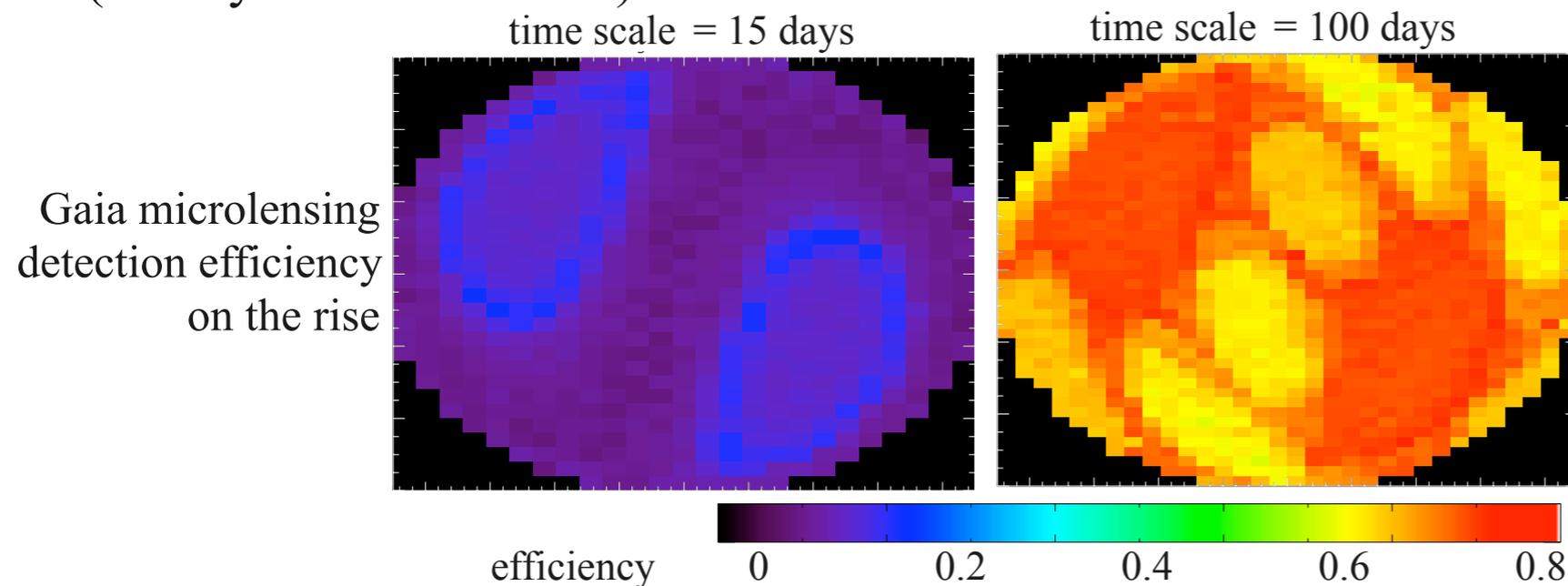
- Successive transits will measure consistency and slope.



- Host galaxy contribution determines whether source is new to Gaia.

# Microensing Events

- **>3000** events expected to occur towards the bulge, but many lost due to **crowding** (exception: **Baade's Window**)
- **~ 700** events expected over all sky
- photometric alerts on **1000+** events
- **~100%** long events detected - the most interesting ones (nearby or massive lens)



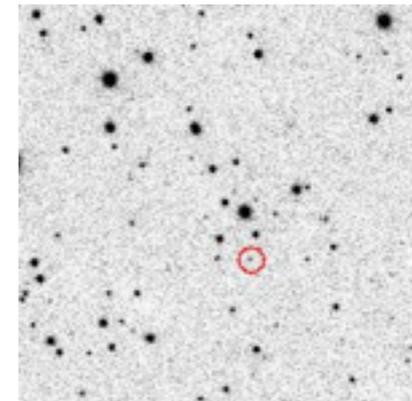
When alerted in time and followed-up:

- ★ luminous and dark mass distribution in the Galaxy
- ★ dark matter in compact objects
- ★ extra-solar planets

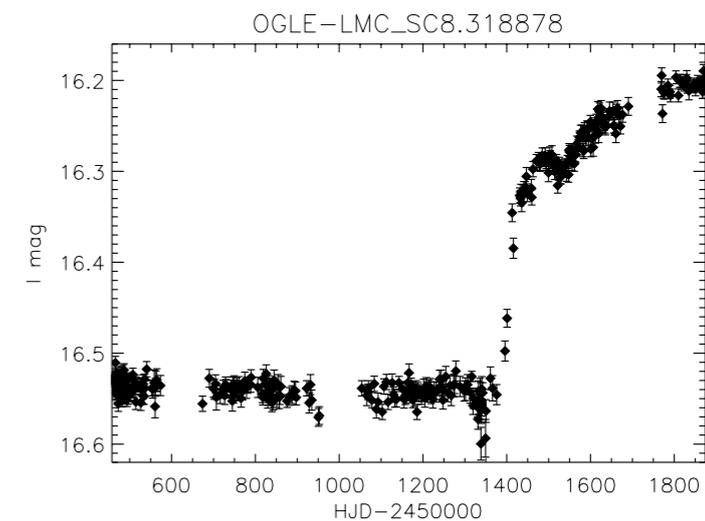
# Common and not interesting(?)

## → Asteroids - loads!

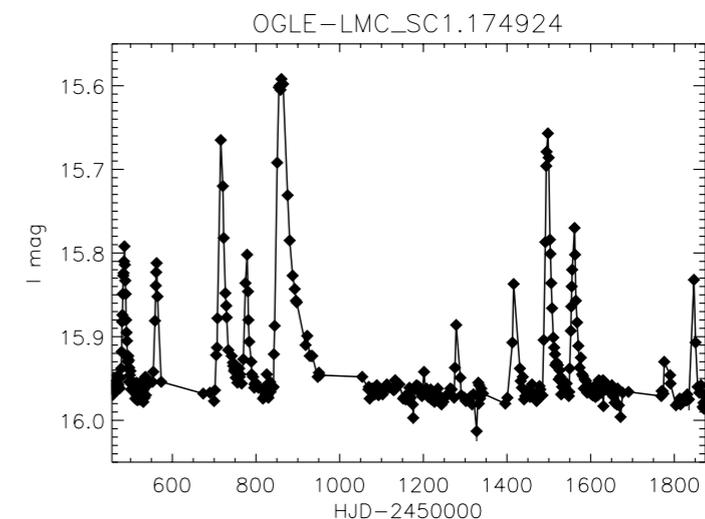
- faster ones can be removed after second FOV transit
- predominantly known asteroids
- the orbits will be calculated and new objects will be cross-matched



## → Be stars - low amplitudes, blue colours



## → Dwarf Novae - low amplitudes, repeating



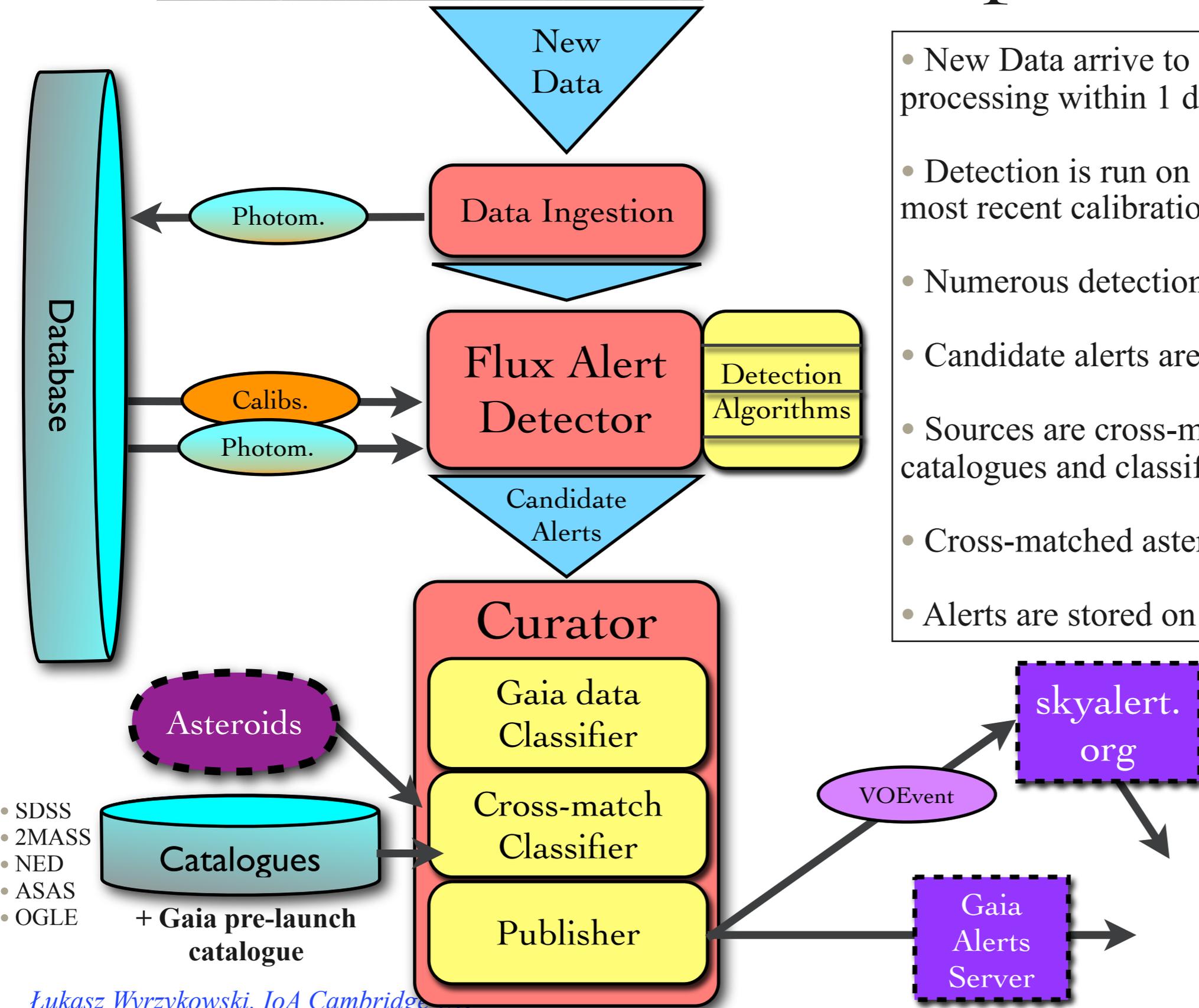
## → and many more...

# Methods



# Science Alerts operation scheme

- New Data arrive to Cambridge after basic pre-processing within 1 day and are stored
- Detection is run on data calibrated with the most recent calibration available
- Numerous detection algorithms are used
- Candidate alerts are classified using Gaia data
- Sources are cross-matched with available catalogues and classified further
- Cross-matched asteroids are removed
- Alerts are stored on the Server and released

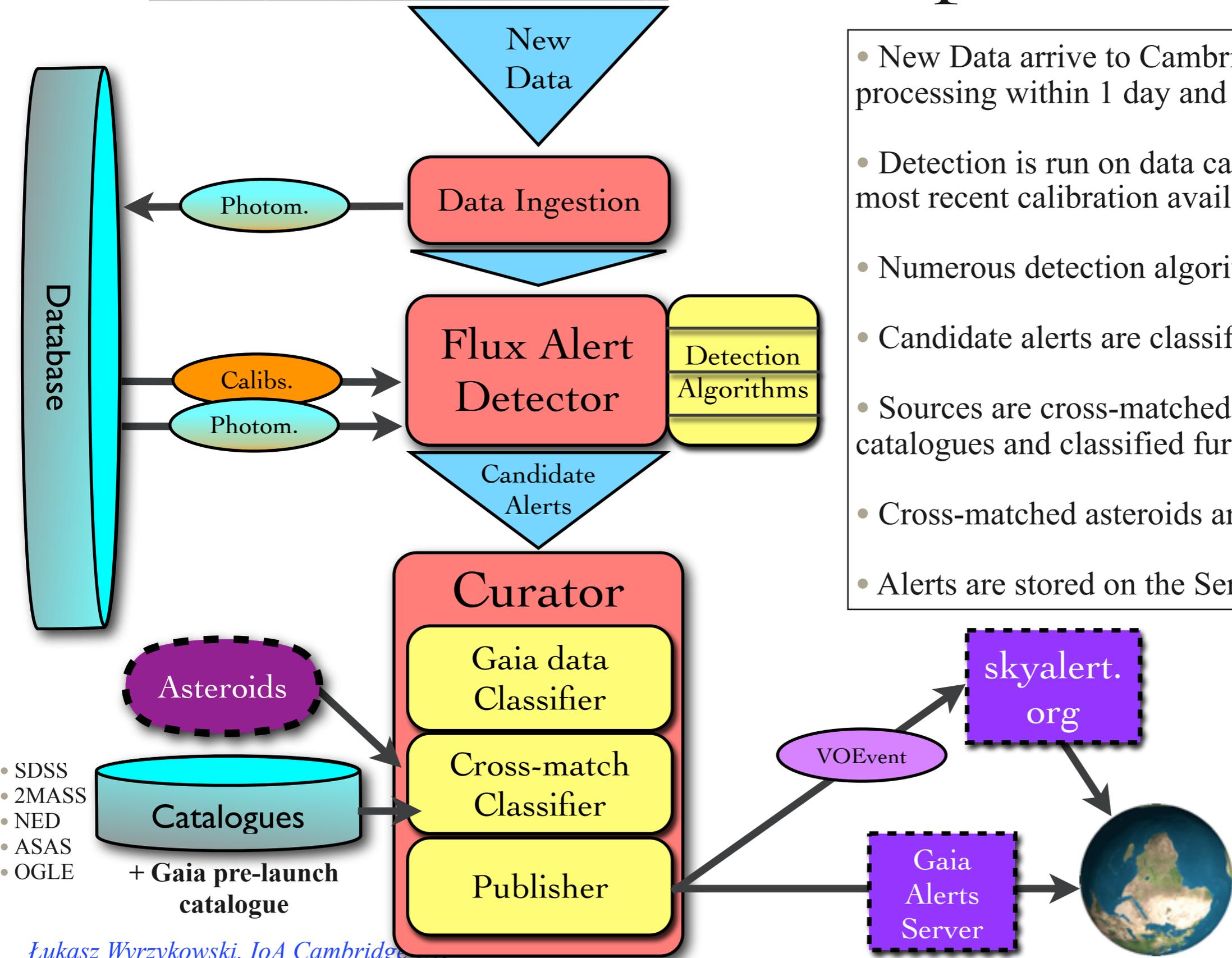


- SDSS
- 2MASS
- NED
- ASAS
- OGLE



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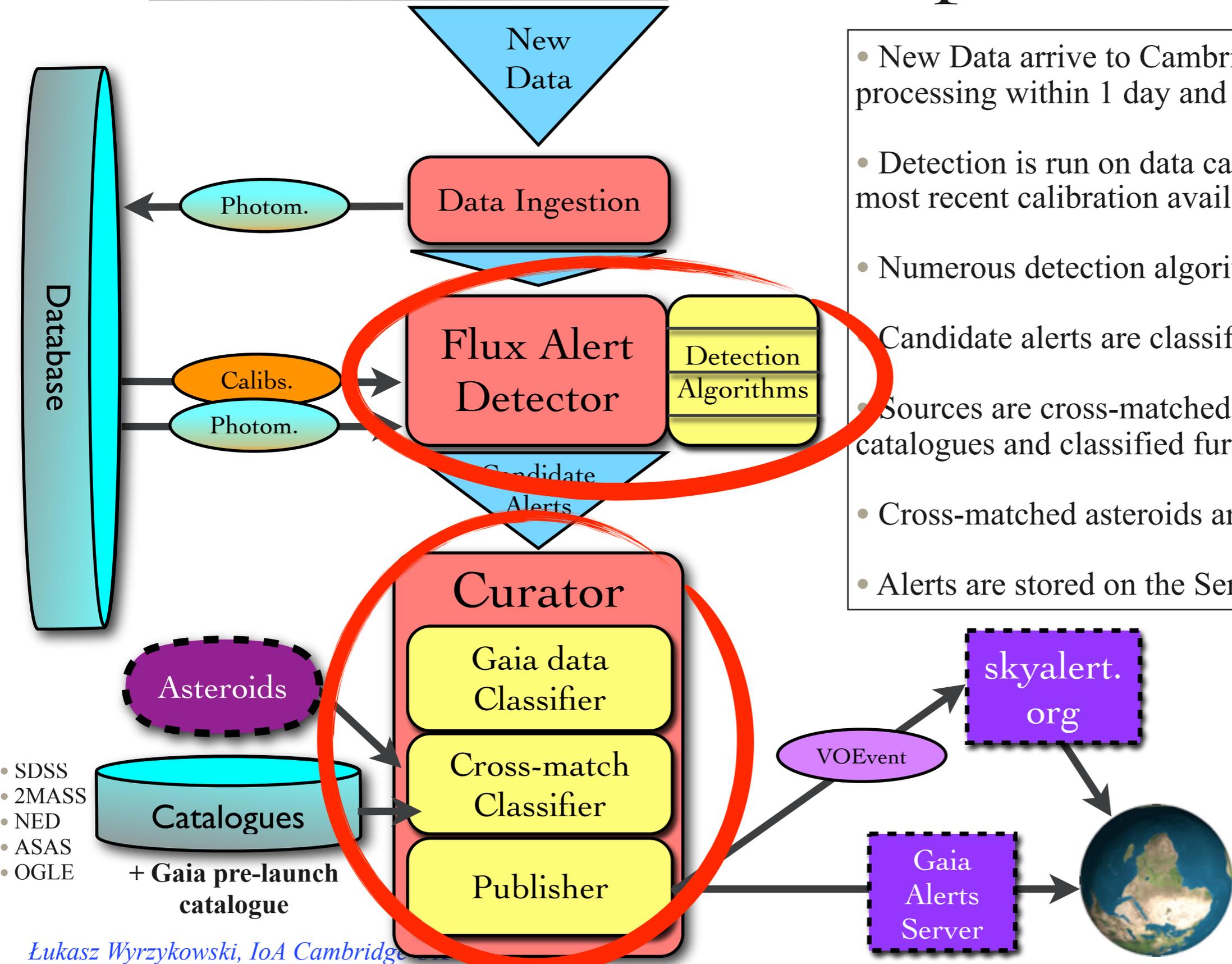


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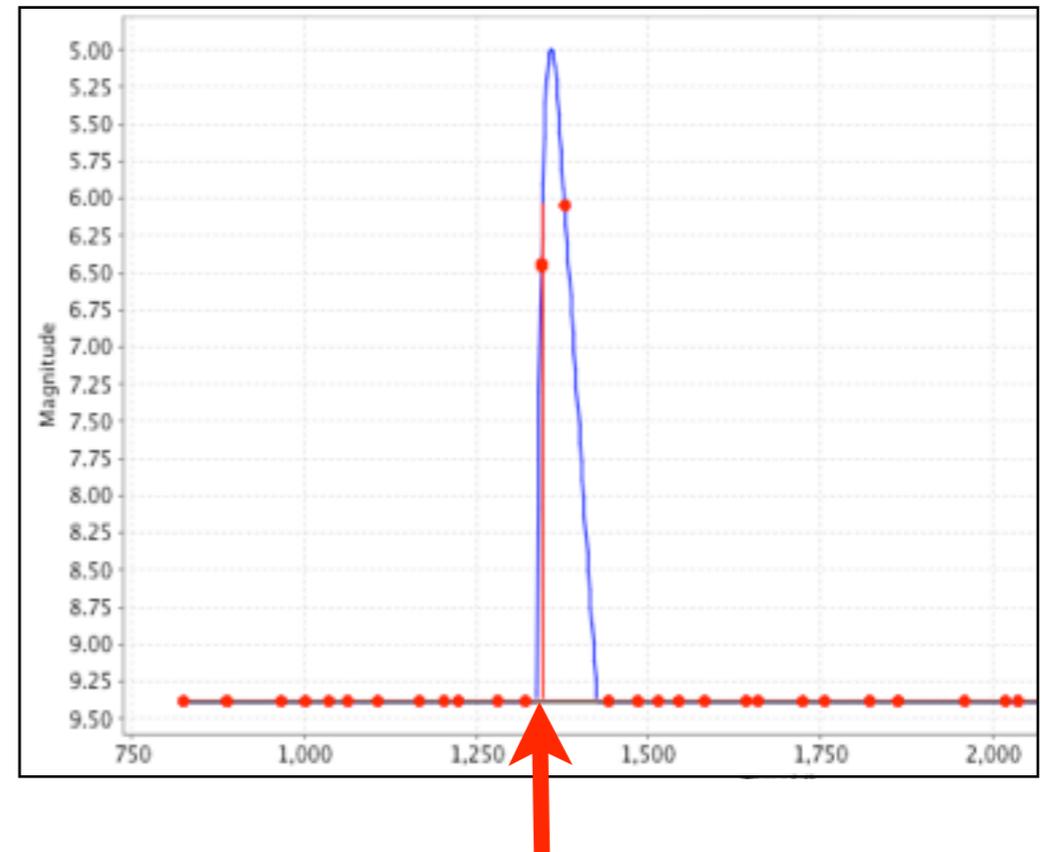
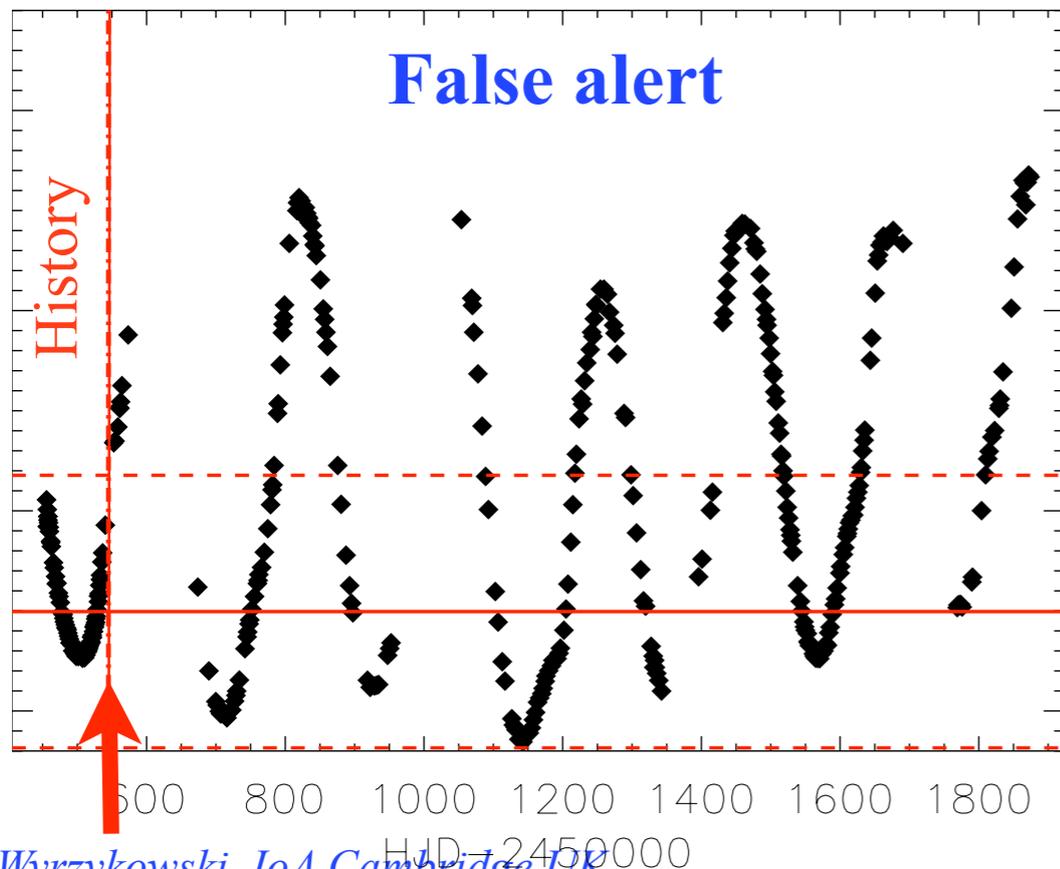
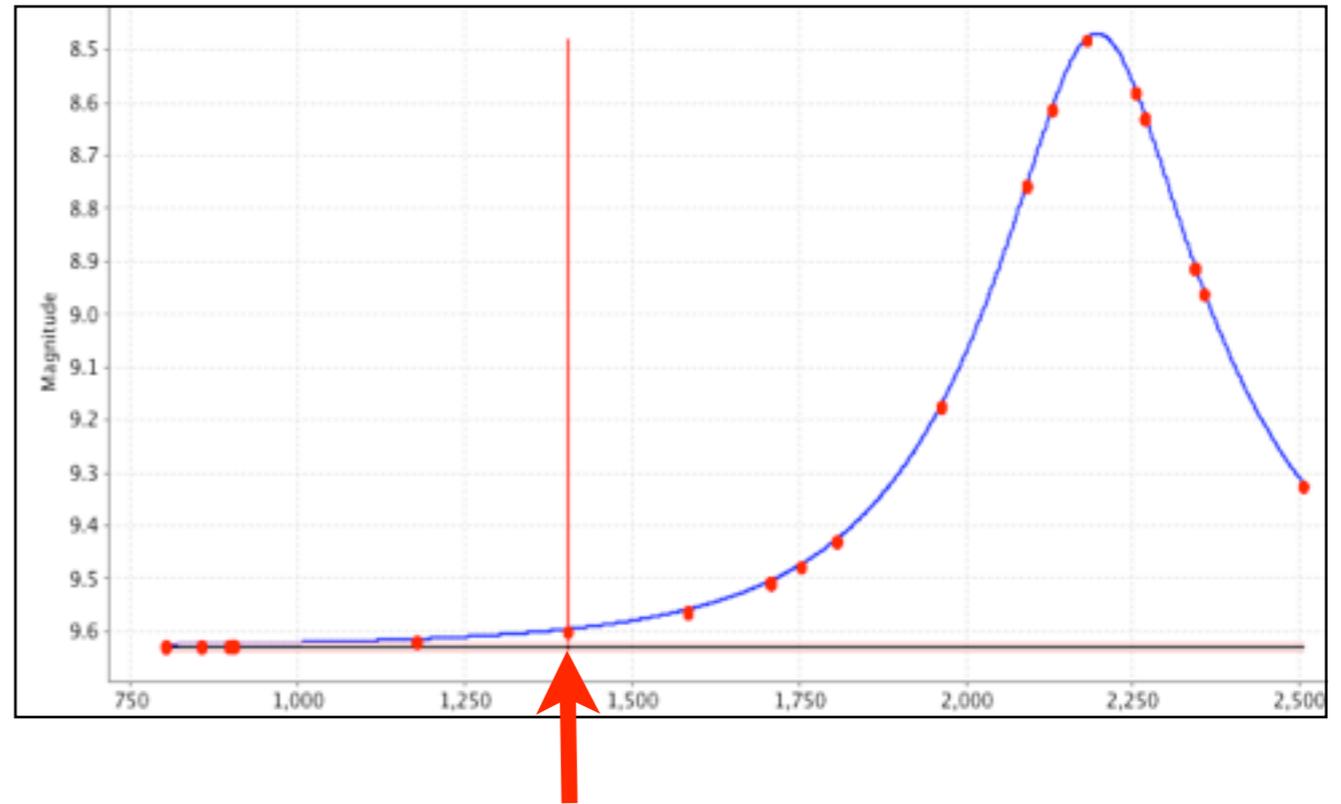
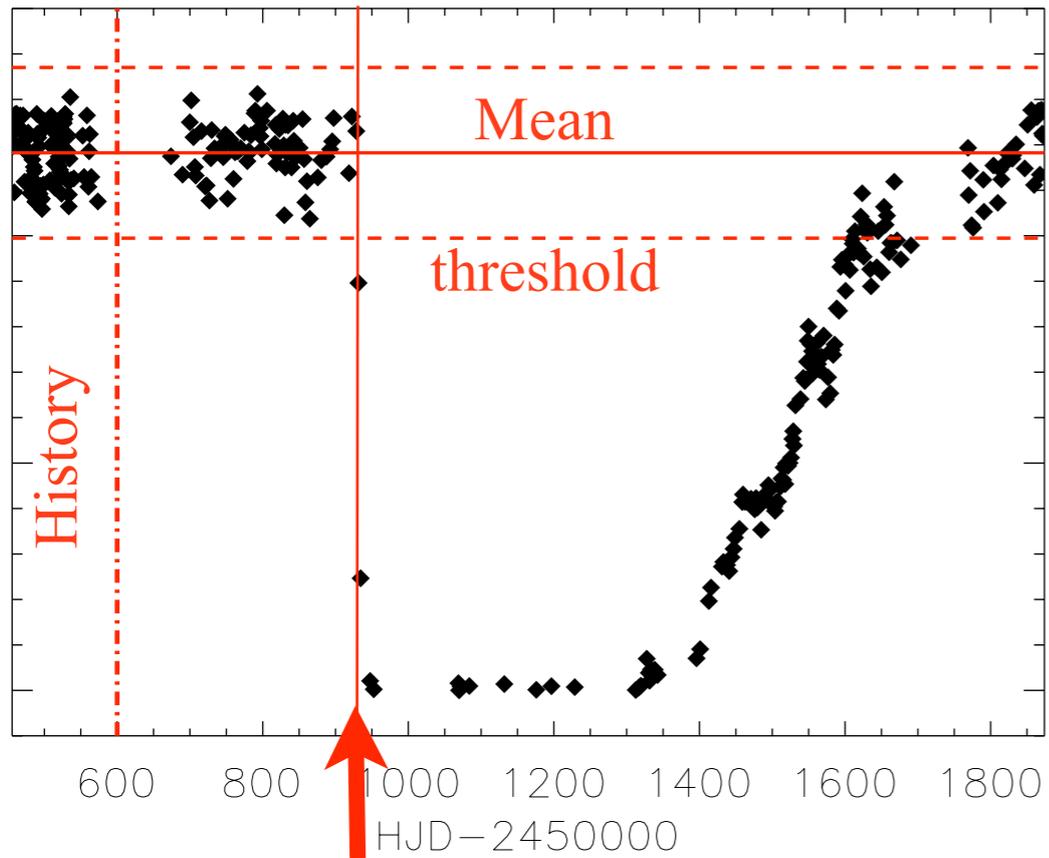
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# Detection algorithm



# Curation - Gaia Classification: data available

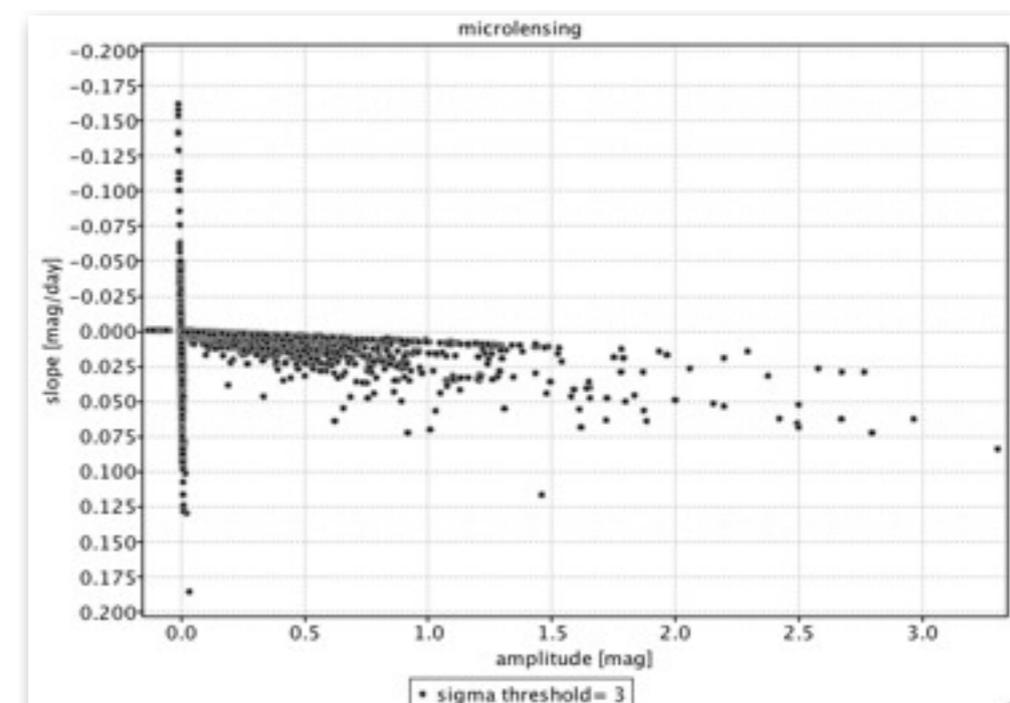
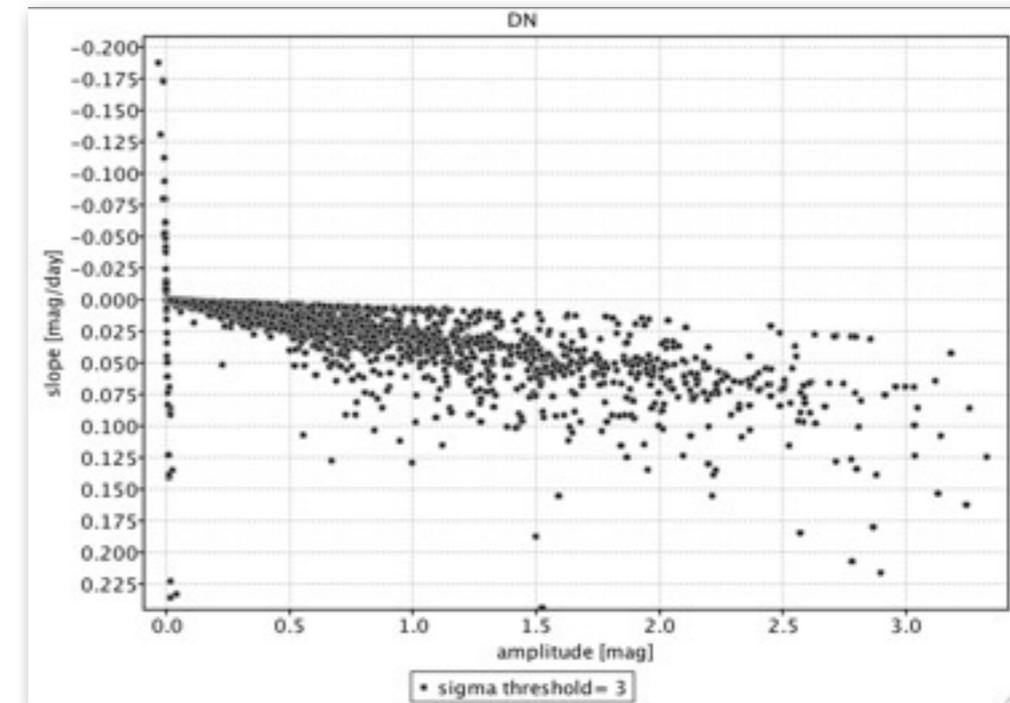
- G-band photometry (light curve)
- BP/RP colour
- raw BP and RP spectra
- morphology of the source (galaxy/star)
- source motion flags (fast asteroid?)
- Gaia catalogues (later in the mission)
  - galaxies
  - variable stars classified into types
  - astrophysical parameters, e.g.  $T_{\text{eff}}$ , spectral type

# Transient light curves classification - challenges

- Transients differ from general variable stars
- Deviations to be alerted in real-time will usually have one/two data points
- Baseline (“History”) will be accumulated in the first 6m of the mission
- Classification of “old sources” may rely solely on the baseline
- Classification of “new sources” is almost impossible on light curve level - need to rely on other parameters

# Transient light curves classification - proposed method

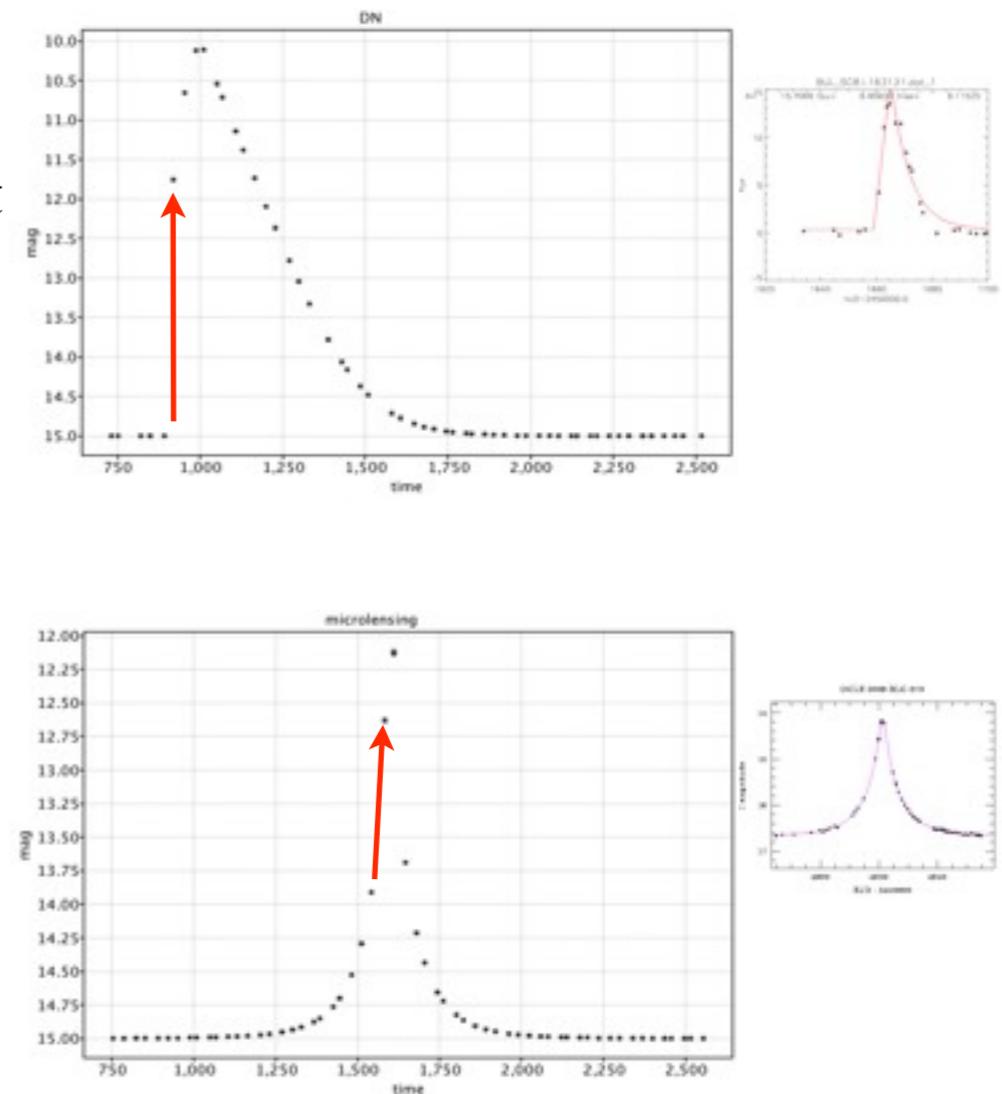
- Gaussian Mixture Classifier (Debosscher et al. 2007)
- part of Gaia variability package classification - uses e.g. Fourier decomposition of a l.c. as input parameters
- simple parameters:  
*amplitude* and *slope* at detection



# Transient light curves classification

## - first attempt

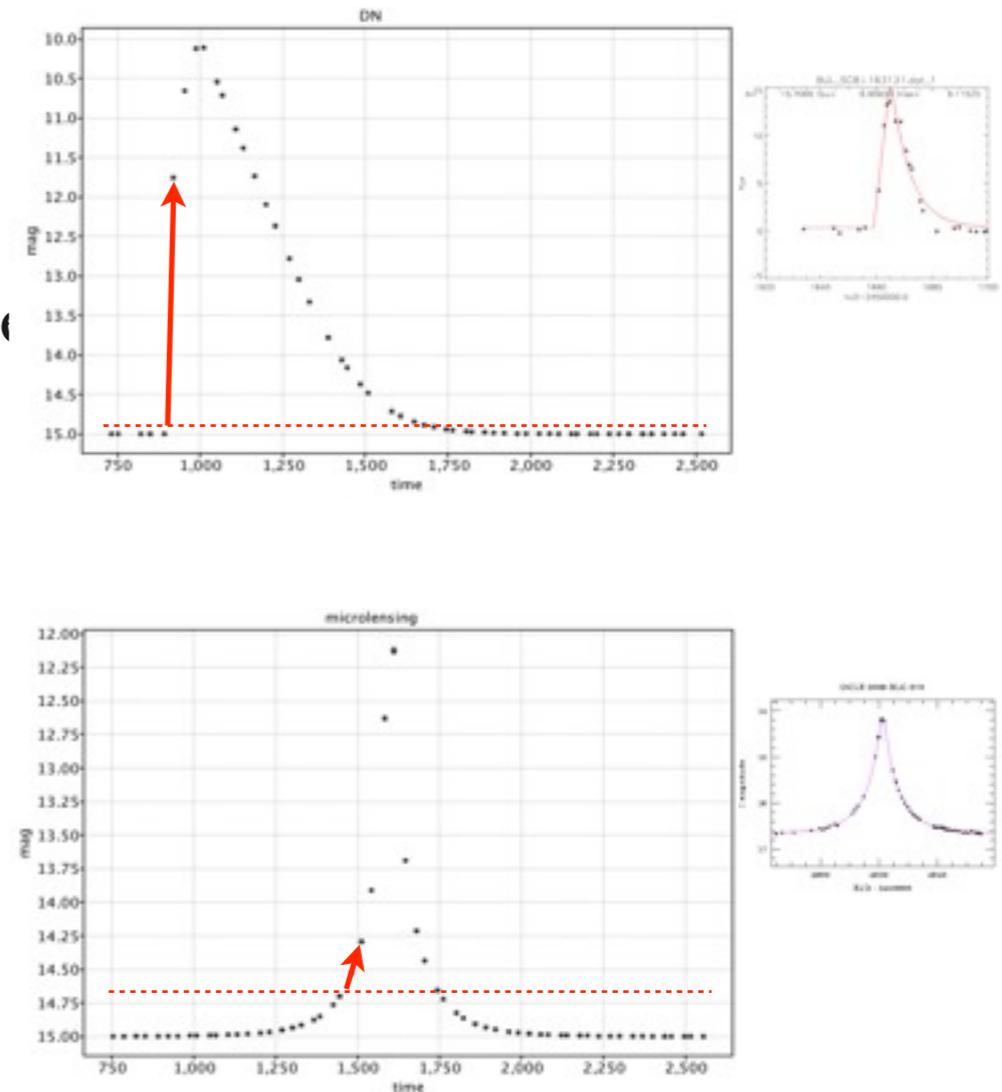
- **Dwarf Nova vs. Microlensing**
- Simple detector:  
deviation by 0.2 mag from previous point  
(not always baseline!)
- Training set:  
realistic parameters distributions from  
OGLE data
- Results:  
**63% classified correctly** (with  $P > 0.5$ )  
(56% DN, 70% microlensing)



# Transient light curves classification

## - second attempt

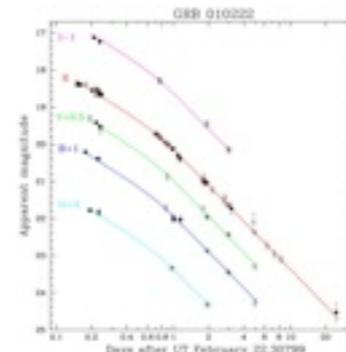
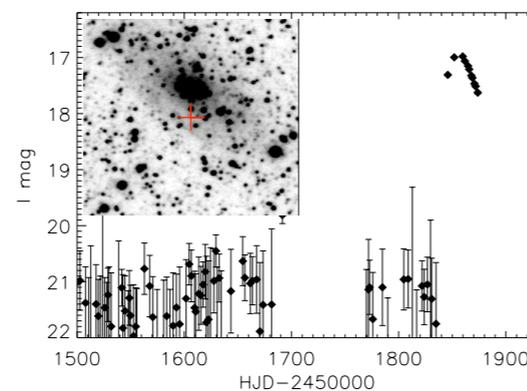
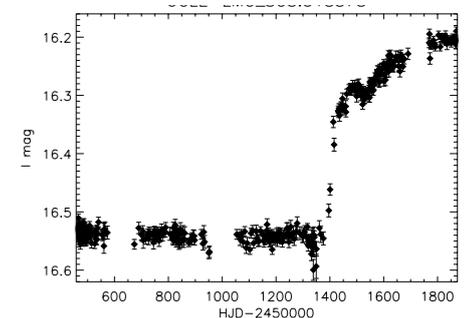
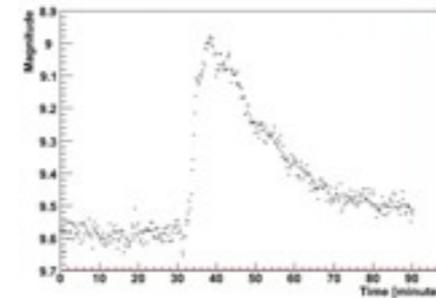
- **Dwarf Nova vs. Microlensing**
- Photometric **noise** added
- More sophisticated detector:  
deviation by 3 sigma from a noisy baseline
- Training set:  
realistic parameters distributions from  
OGLE data
- Results:  
**71% classified correctly** (with  $P > 0.5$ )  
(86% DN, 57% microlensing)



# Transient light curves classification

## - future work

- come up with other l.c. parameters available at the moment of detection
- come up with different detection algorithms
- use after-detection data points too, at least the second FoV (106min)
- add M-dwarf flares, Be-type stars and other variables to blur the picture even more...
- apply to “new objects” like SN, GRBs (use both FoVs)

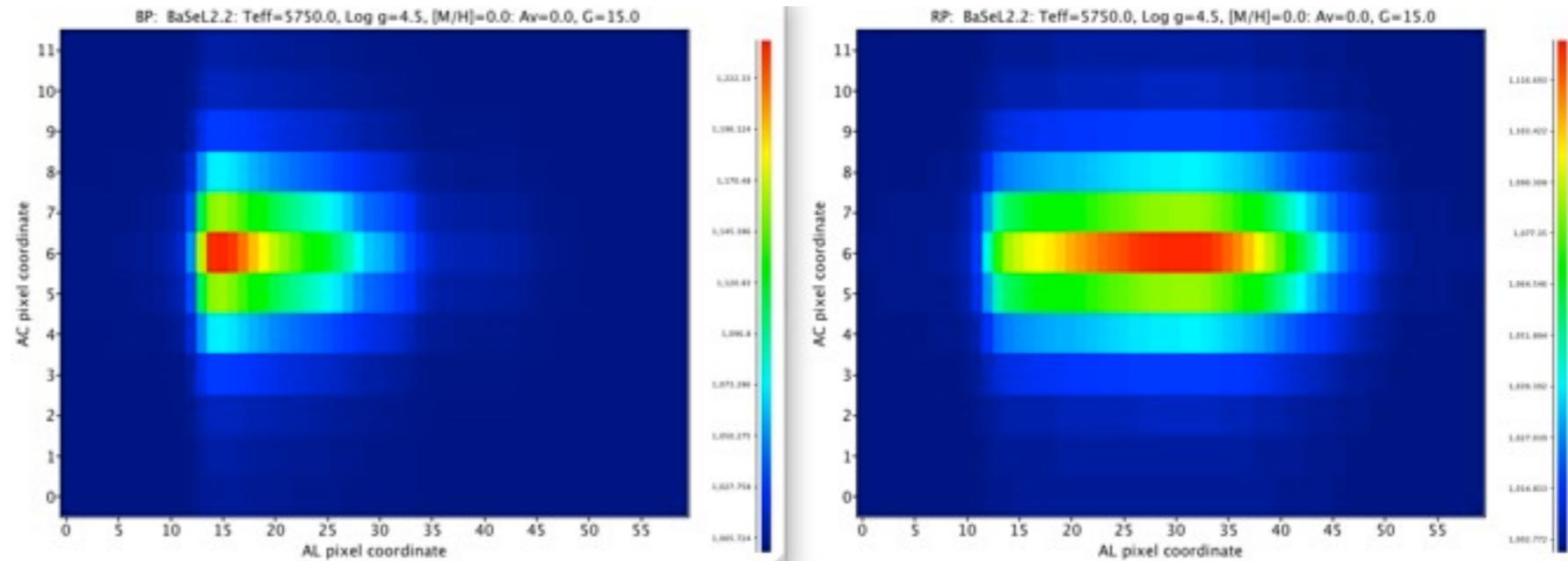


# Input spectra

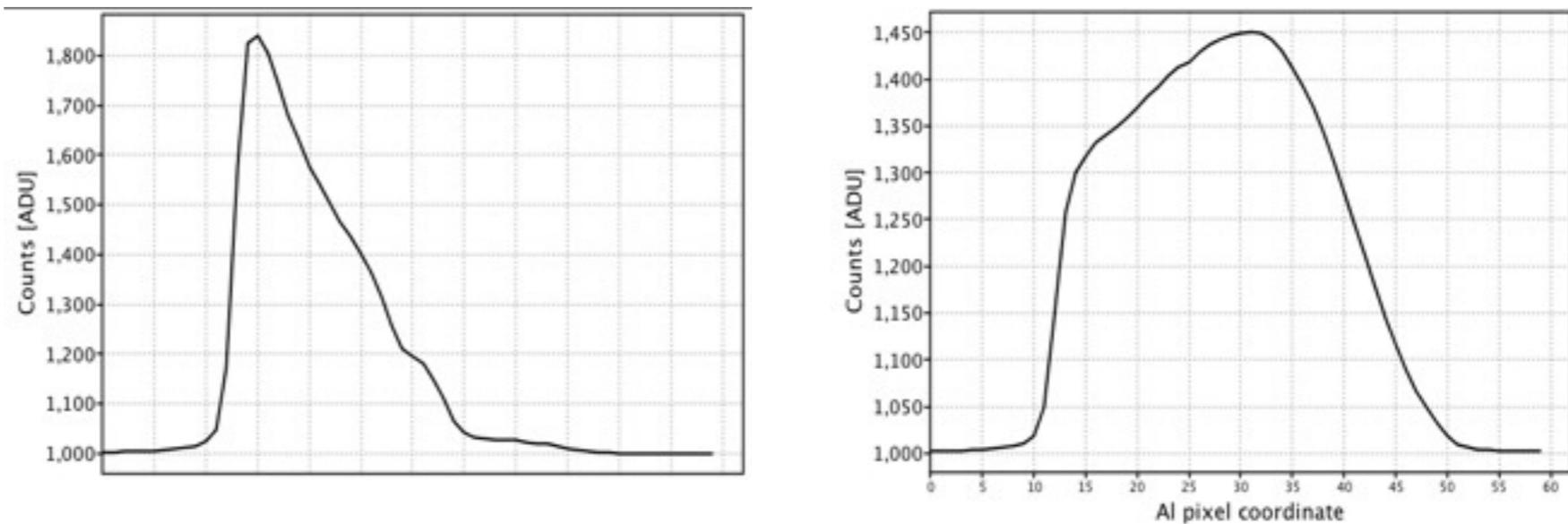
Blue photometer

Red photometer

On the CCDs



Measurements



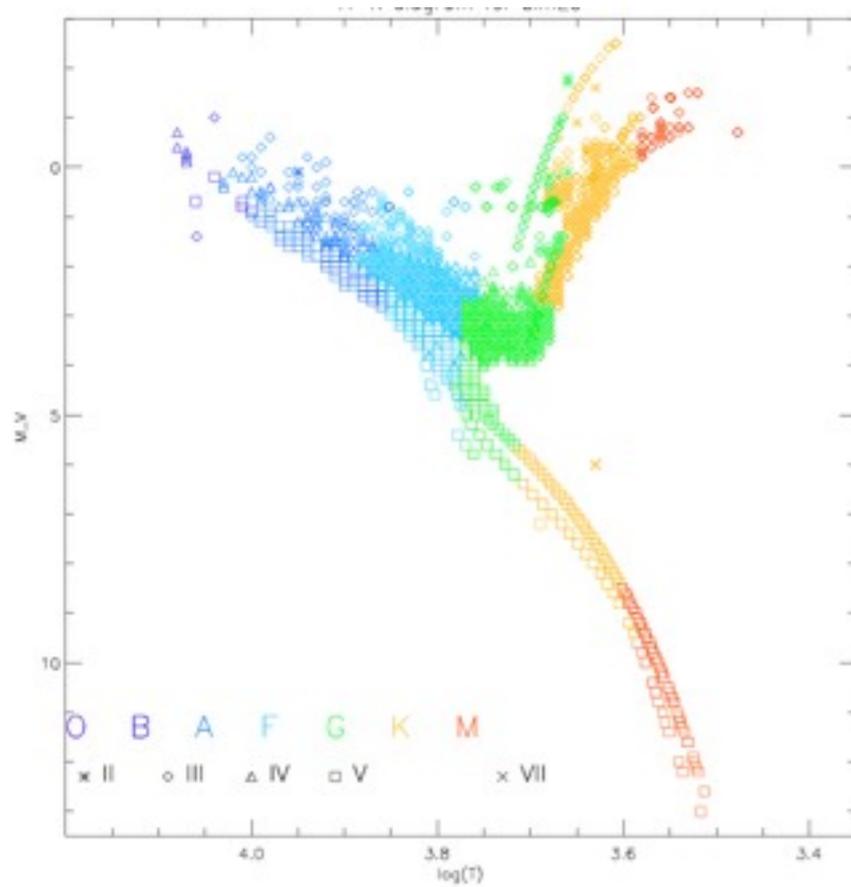
- In most cases the spectra will be 1D, only for the brightest will be 2D

# Spectra classification with SOMs

## - method

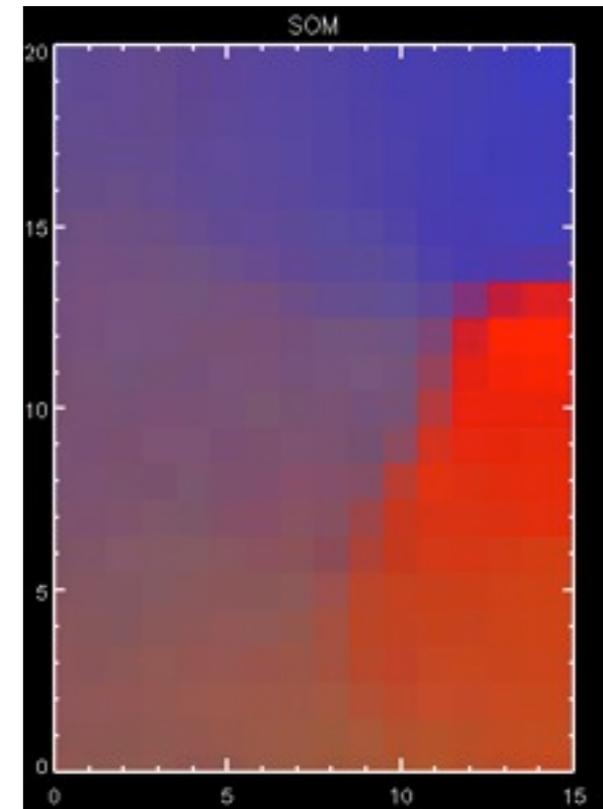
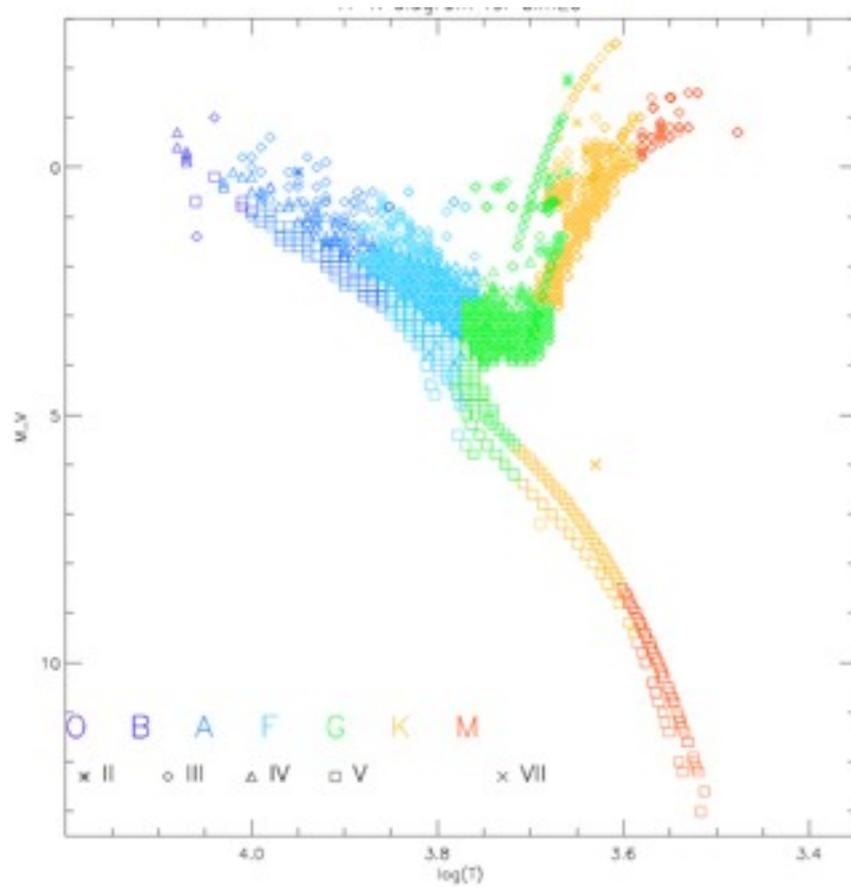
- ◉ Raw, low dispersion spectra will be available along with the photometry
- ◉ extracting spectral type of the source helps a lot in alerts classification,  
*e.g.* false-alarm: large amplitude faint Mira-type variable
- ◉ **Self Organizing Maps (SOMs) used in semi-supervised mode**
- ◉ SOM trained on either simulated data with known spectral type or real data cross-matched with ground-based classification
- ◉ *Alternative for the mission:* unsupervised mode SOM will sort spectra according to their type, but the type will not be returned.

# Spectra classification with SOMs - results



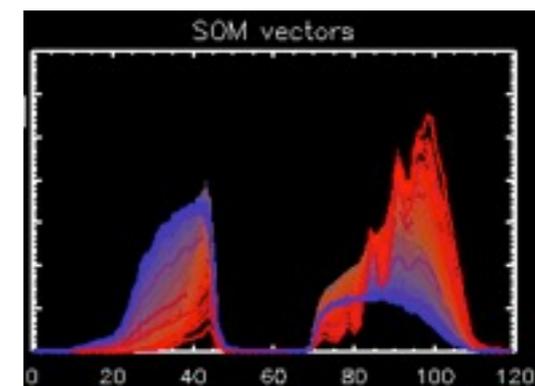
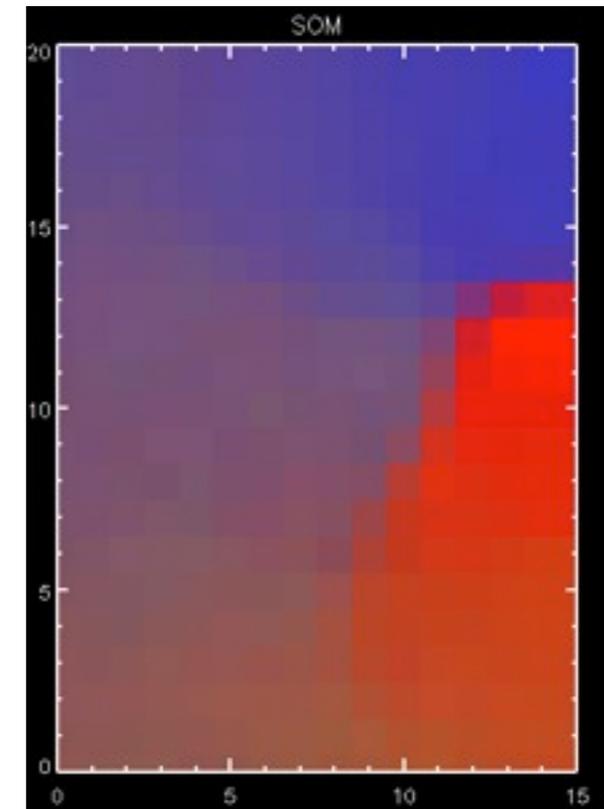
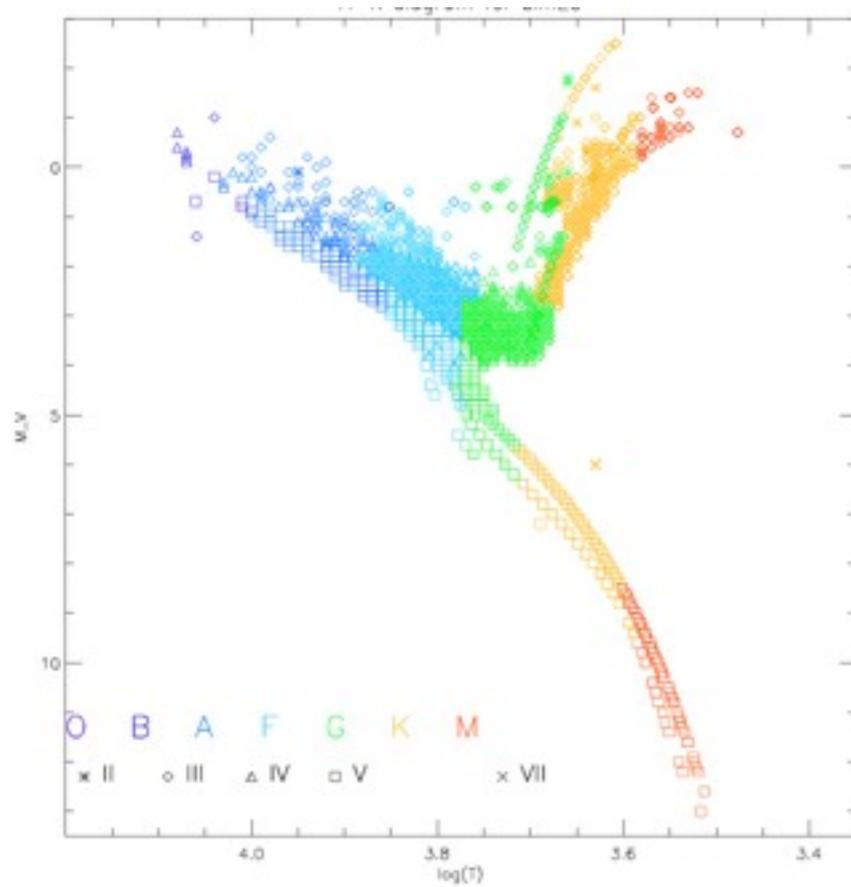
# Spectra classification with SOMs

## - results



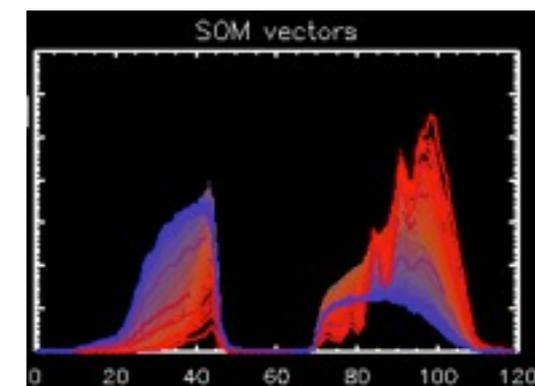
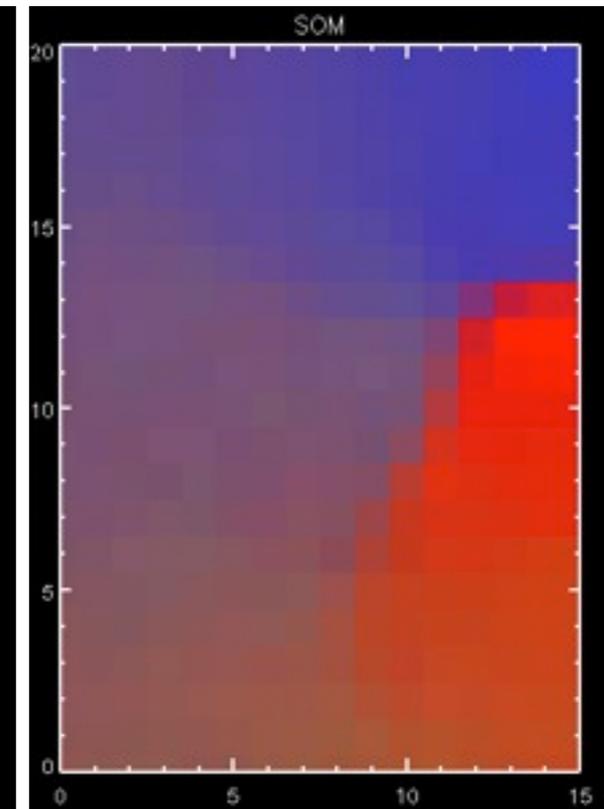
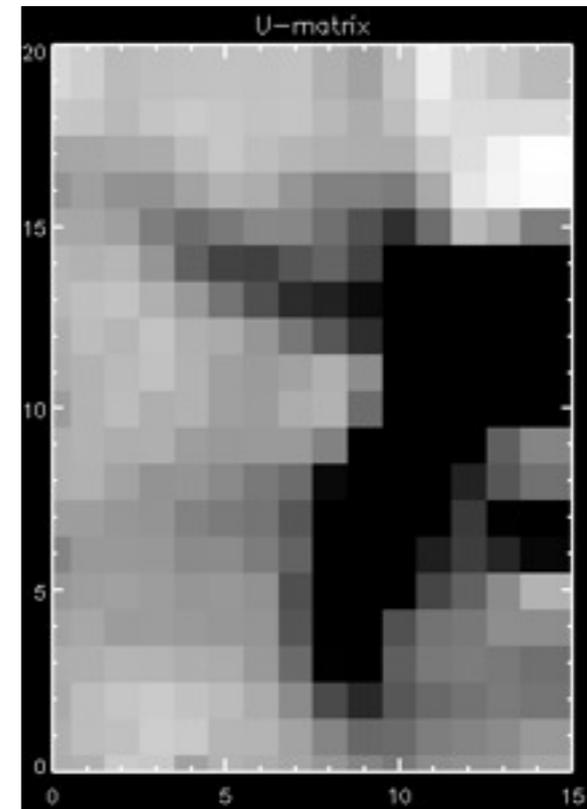
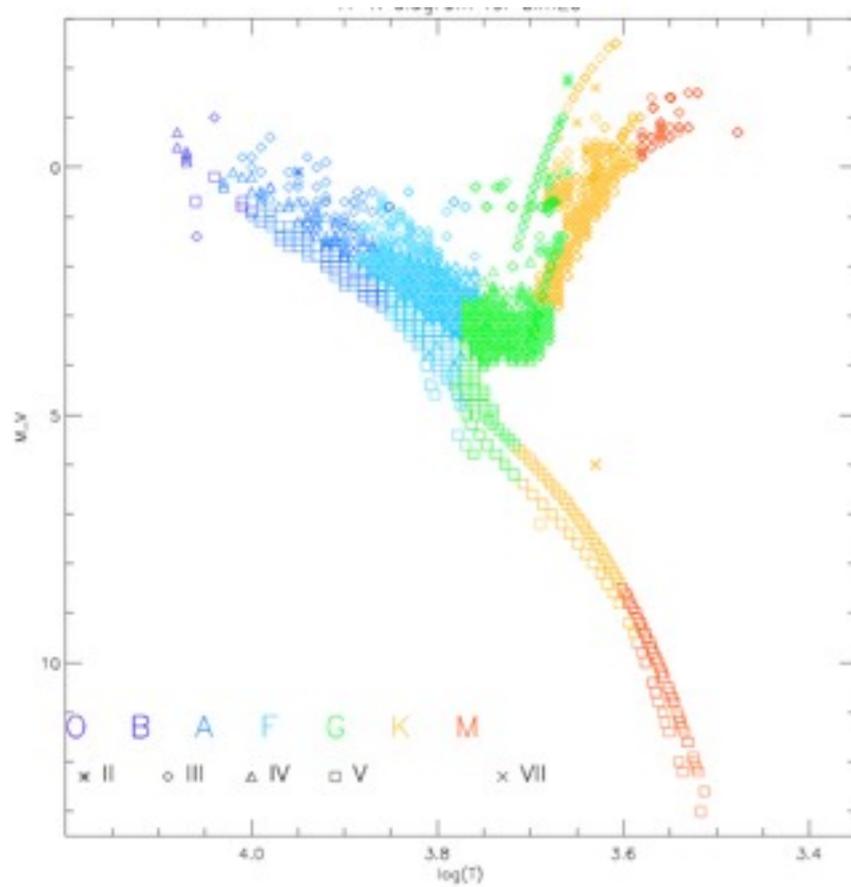
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## - results



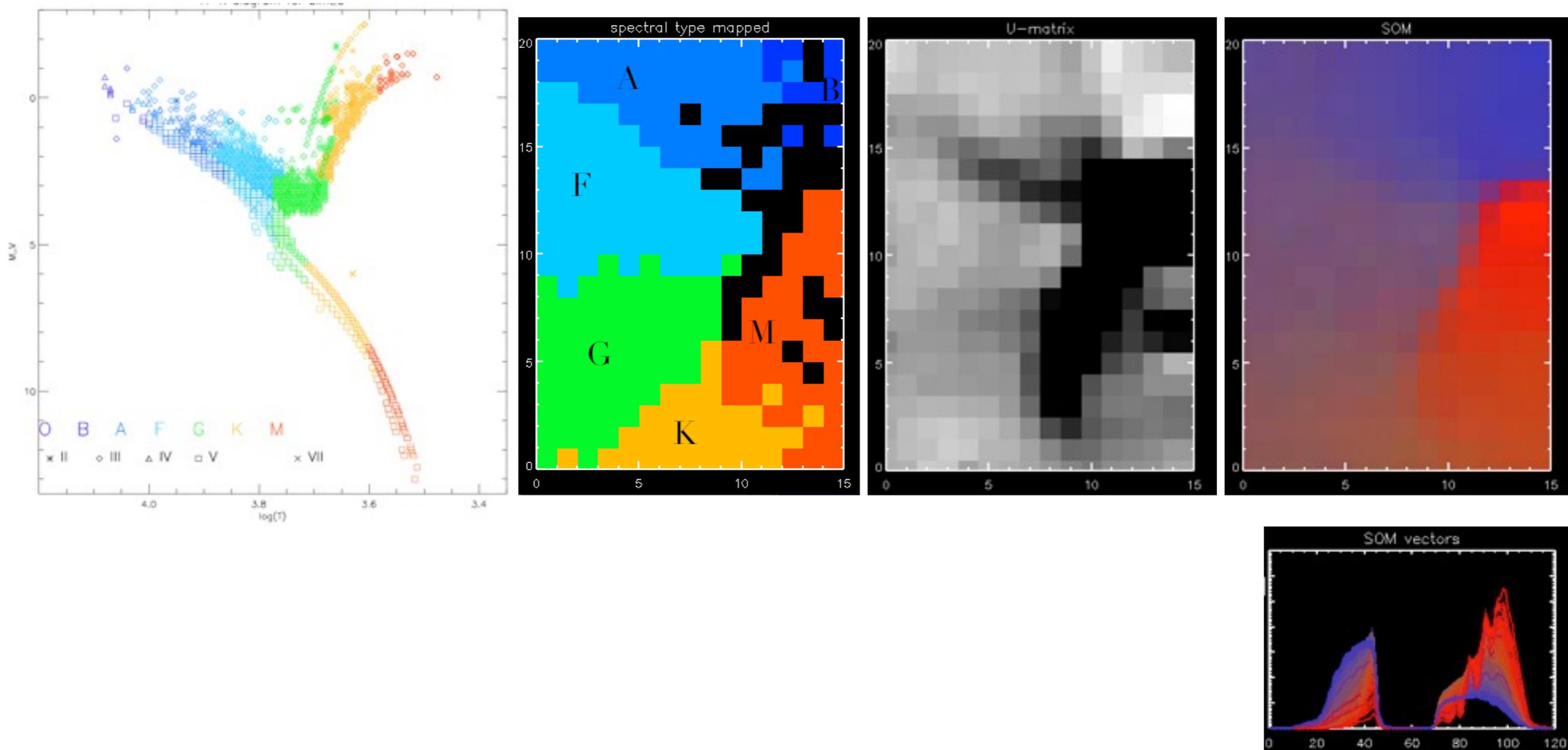
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## - results



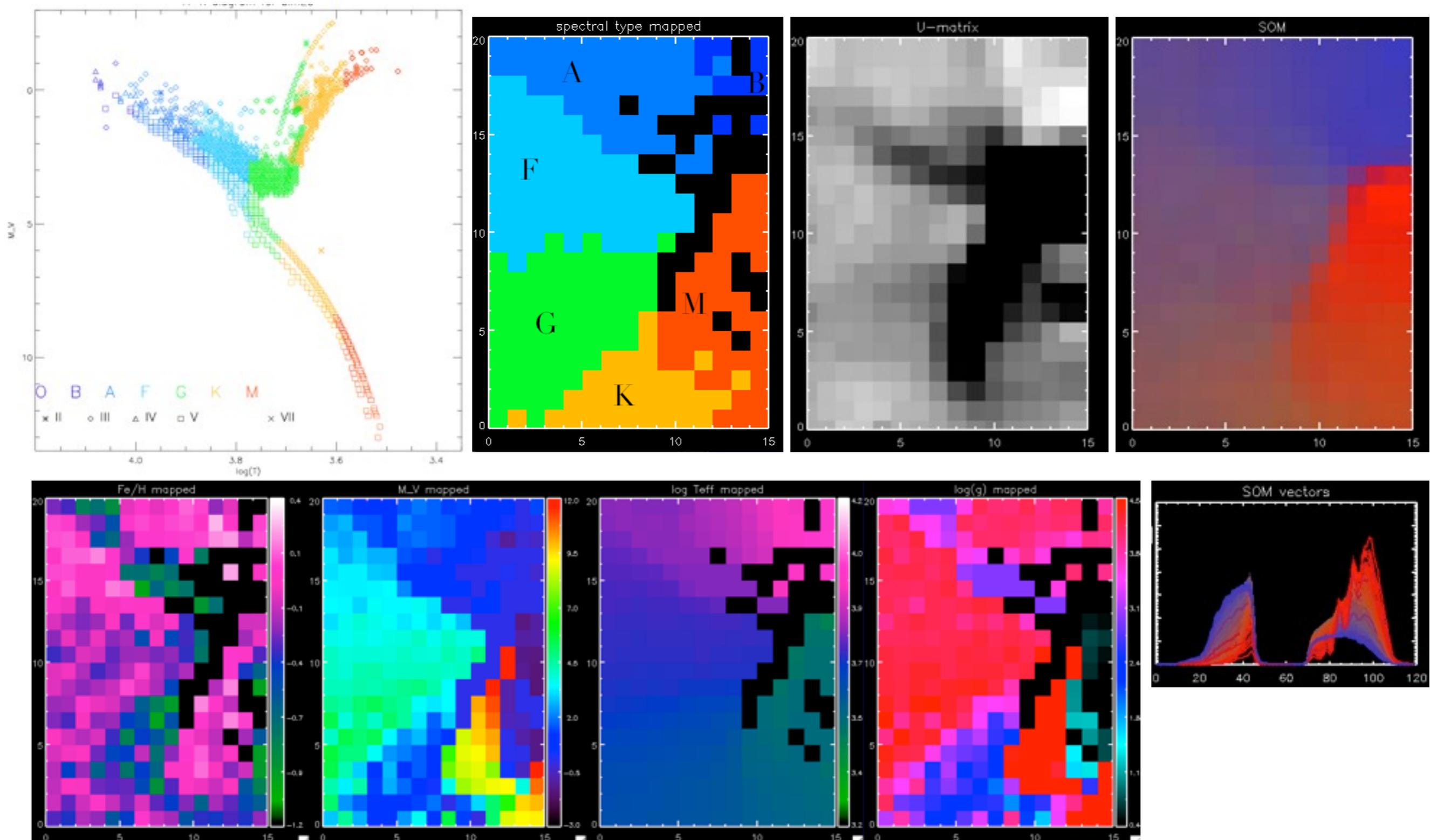
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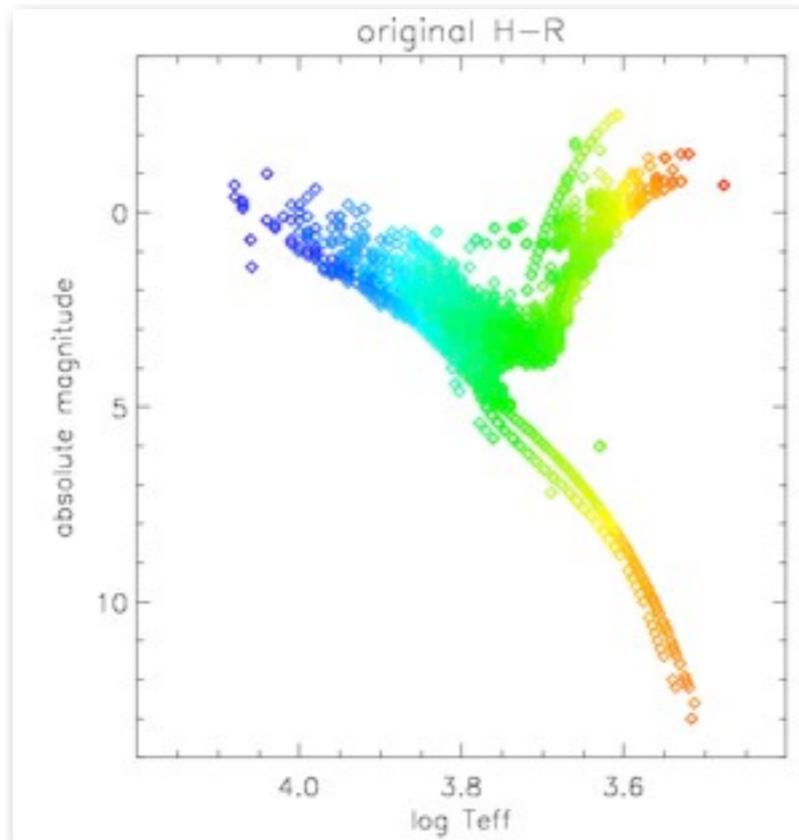
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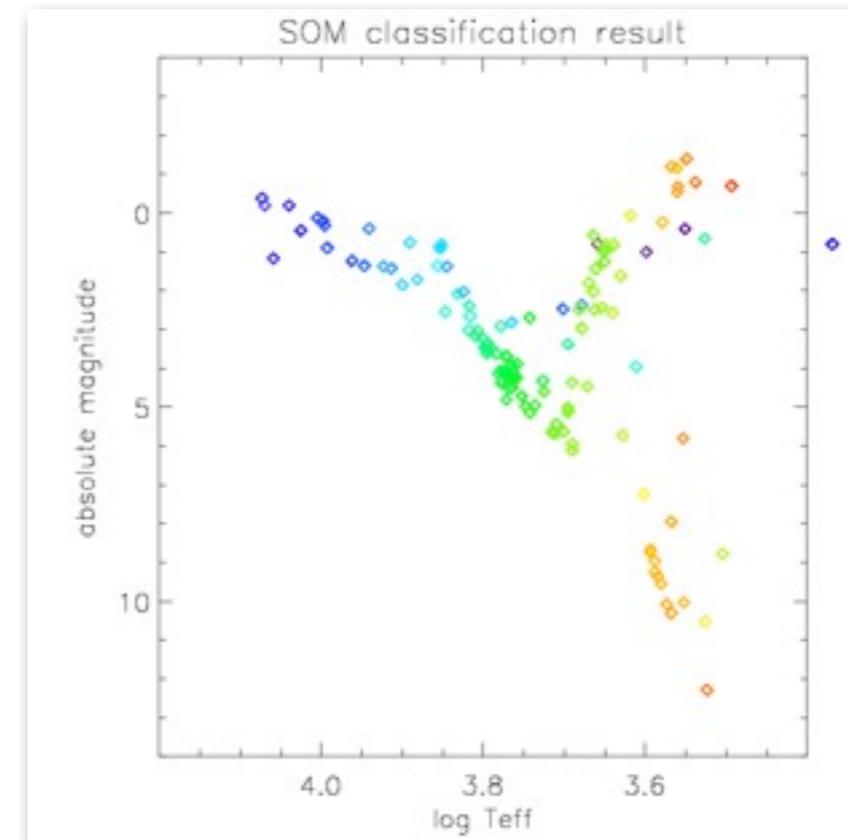


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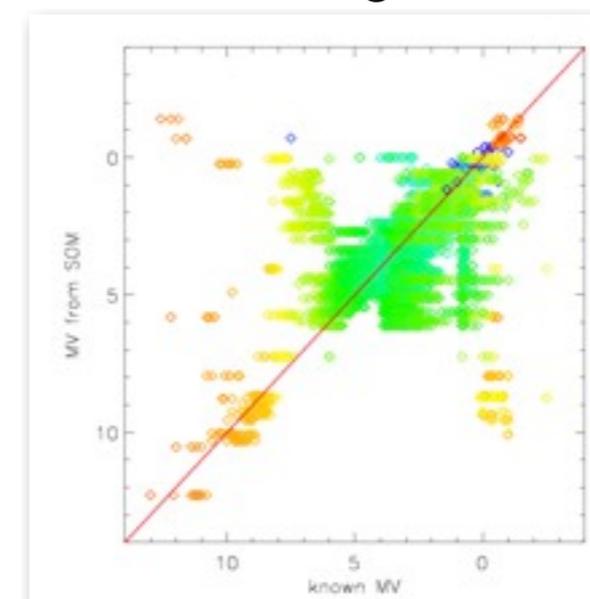
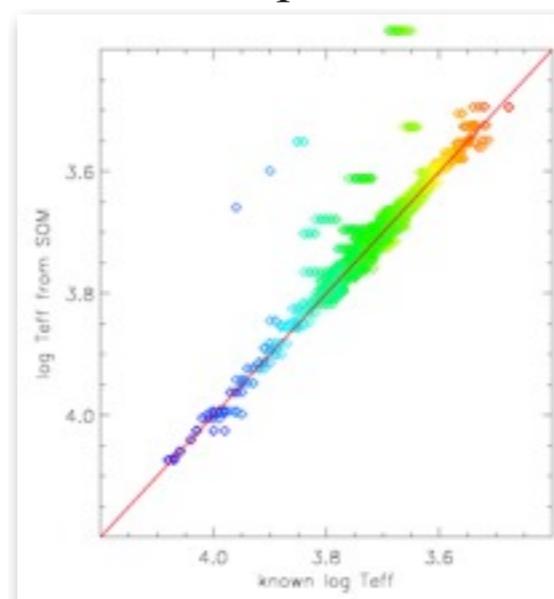
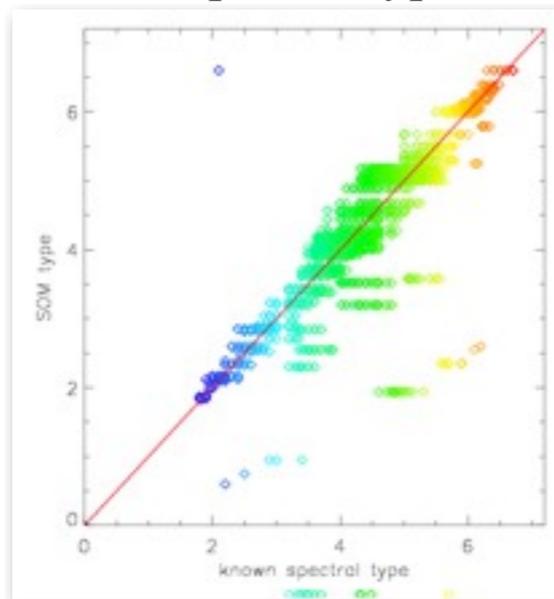


Spectral type

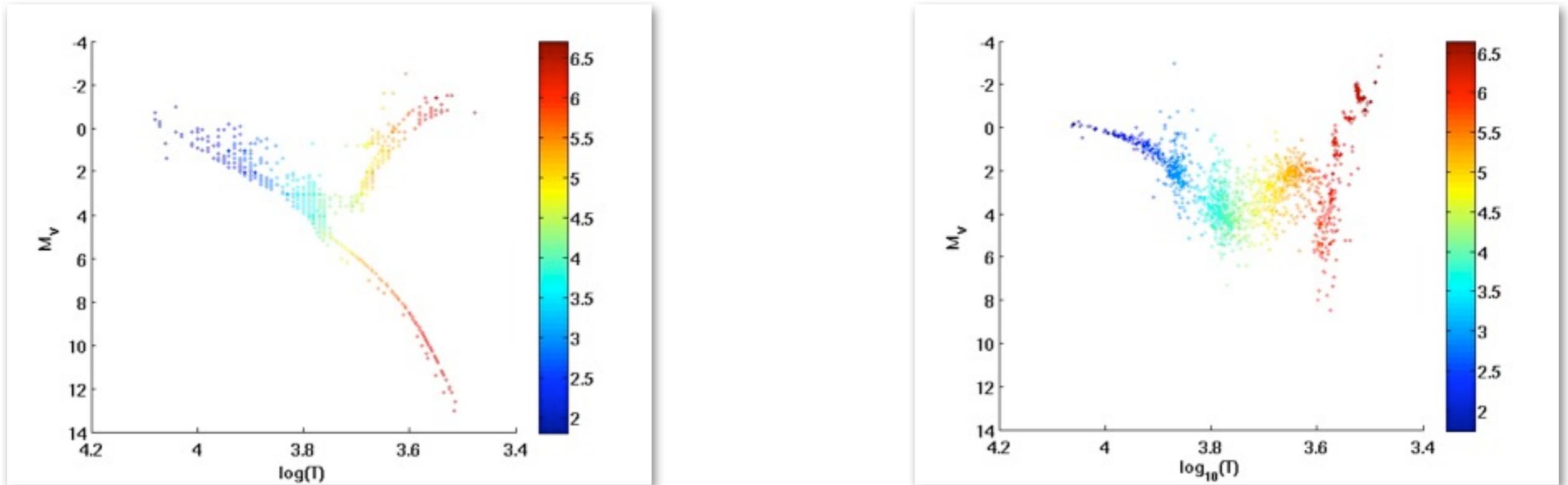


Temperature

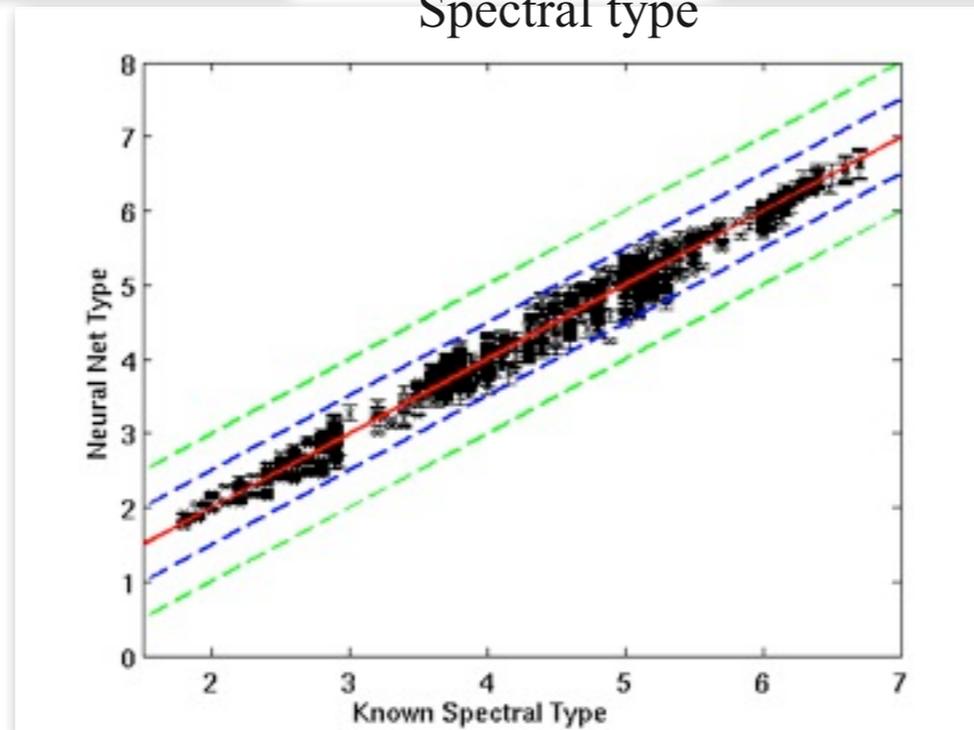
Absolute magnitude



# Spectra classification with ANN - results



Spectral type



credit: Manda Banerji, IoA

# Curation - Cross-matching

*work in progress*

*uses existing catalogues available through Virtual Observatory,  
Astrogrid or local copies, e.g. SDSS, 2MASS, NED, ASAS, OGLE*

- star, source close to galaxy or orphan new source?
- magnitudes and colours in optical and IR
- X-ray source, gamma source?
- time-domain photometry
- variability classification (*e.g.* recurrent nova, eclipsing)
- asteroids flagged by other Gaia units
- anomalies alerted by other surveys (*e.g.* GRBs alerts)



## Main Page

# Welcome to the web site of the Gaia Science Alerts Working Group!

The Science Alerts Working Group is focussed on the real-time detection of variable sources. These include supernovae, microlensing events, exploding and eruptive stars, etc.

- navigation
- Main Page
  - Links
  - People
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  - Recent changes
  - Random page
  - Help
- science
- Triggers
  - Contaminants
- alerts
- Detection System
  - Verification phase
  - Follow-up

### FU Orionis (FUors)

FU Orionis (V1647 Ori) is young pre-main sequence stars, illuminating a McNeil's nebula in the vicinity of NGC 2068 star-forming region.

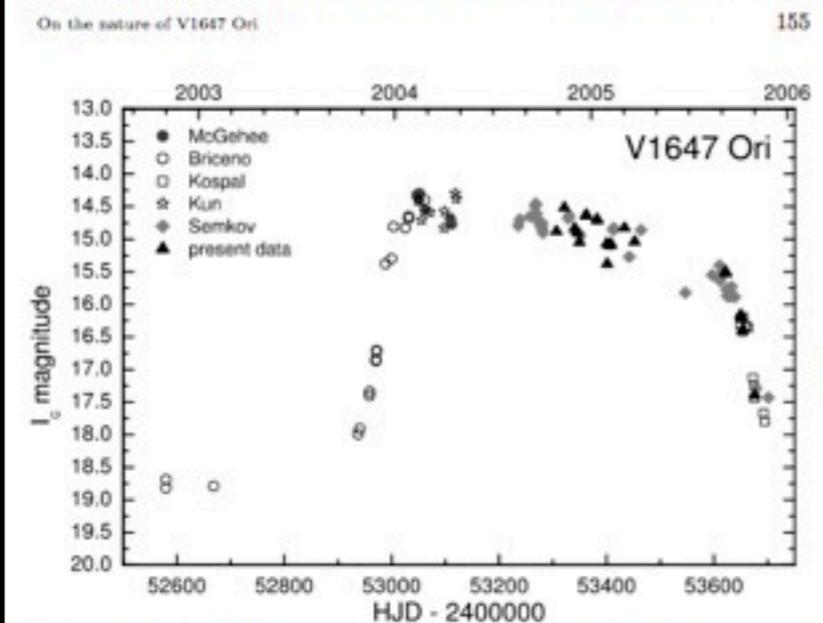


Figure 4. V1647 Ori light curve in the  $I_c$  passband. Our data and data from McGeehee et al. (2004), Briceño et al. (2004), Kospál et al. (2005), Kun et al. (2004) and Semkov (2004, 2006) were used.

#### Characteristics:

- Very rare
- Outbursts repeat with a time scale of 40 years (1978, 2003)
- Amplitude: 5 mag over 4 months
- Outbursts last for 2 years
- Spectra: F or G supergiants
- Spectrum: red, heavily veiled continuum with strong emission of  $H_{\alpha}$ ; in blue consistent with an early B spectrum
- X-ray variability present
- FU Ori and V1057 Cya rise over 1 yr, whereas V1515 Cya rise over 20 years

Plot from D.Chochol et al. 2006

### Triggers:Be

OGLE and MACHO data were studied for Be stars.

- OGLE (LMC,SMC): Sabogal et al. 2005, Mennickent et al. 2006
- OGLE (Bulge): Sabogal et al. 2008
- MACHO: Keller et al. 2002

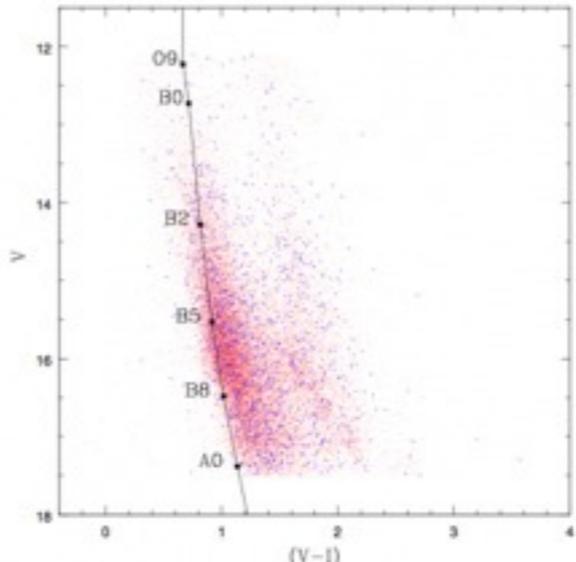


Fig. 4.  $V$  vs.  $(V - I)$  diagram for the selected Be star candidates. The track of the main sequence (MS) (Allen 2000) is shown for reference. Apparent  $V$  magnitudes for it were calculated assuming the distance modulus of the Galactic bulge (14.5 mag) and  $A_V = 2.23$  (obtained by calculating the mean of  $A_V$  values of the 48 Galactic Bulge fields).

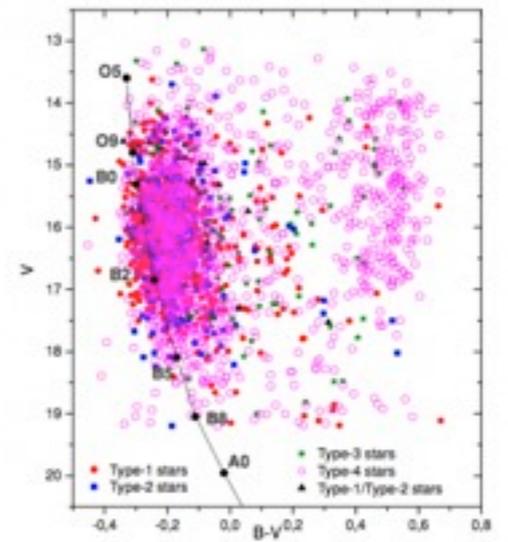


Figure 1.  $V$  versus  $B-V$  diagram for the total sample of stars of the LMC. The track of the main sequence (Allen 2000) is shown for reference.