



# M-dwarf flares in the Zwicky Transient Facility data and what we can learn from it

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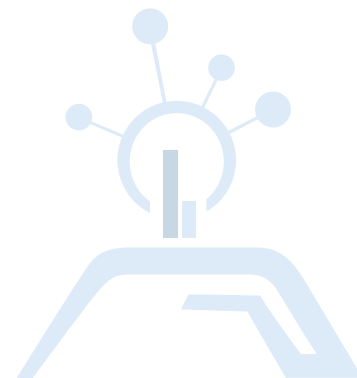
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# M-Dwarfs

Temperature: **2500 K to 3800 K**

Lifetime: **10's billion to 10's trillion years**

Luminosity: **0,0001  $L_{\odot}$  to 0,075  $L_{\odot}$**

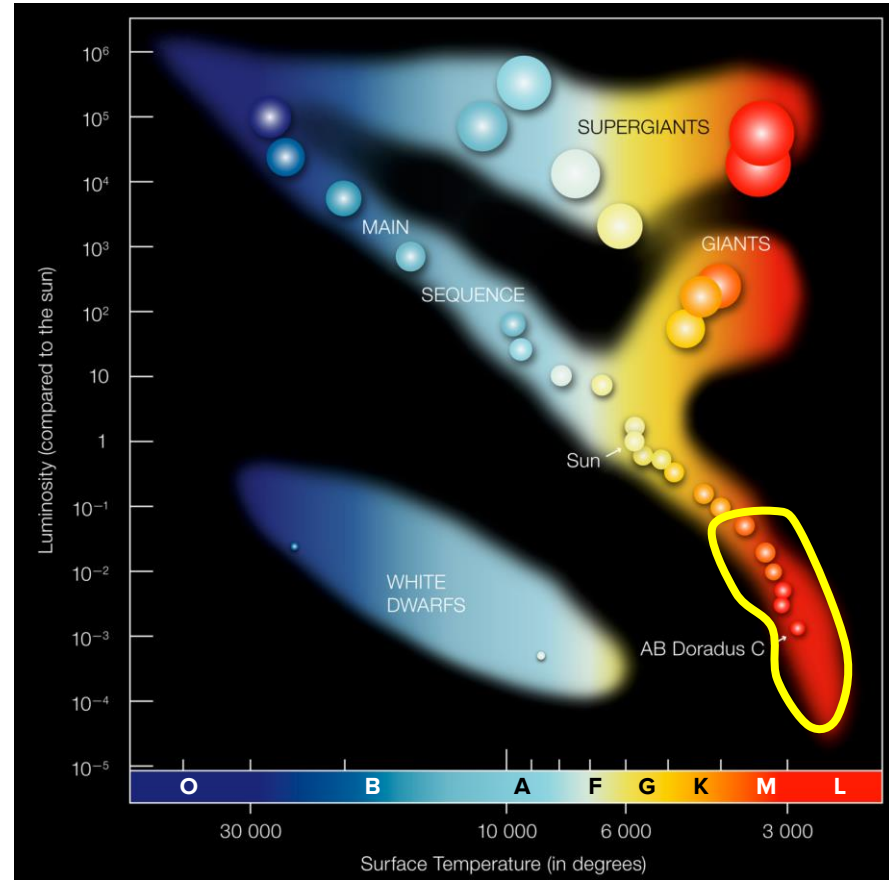
Mass: **0,075  $M_{\odot}$  to 0,47  $M_{\odot}$**



The closest star to the Earth, Proxima Centauri is an M dwarf!

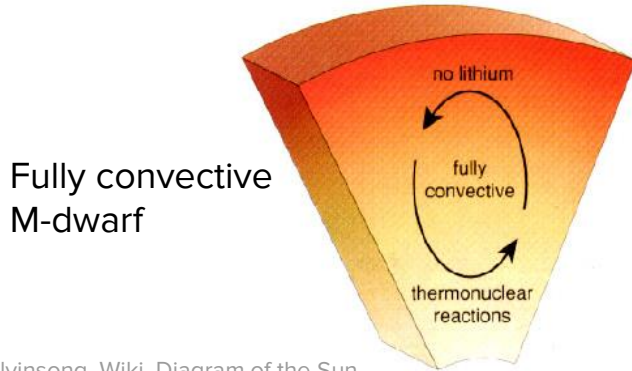
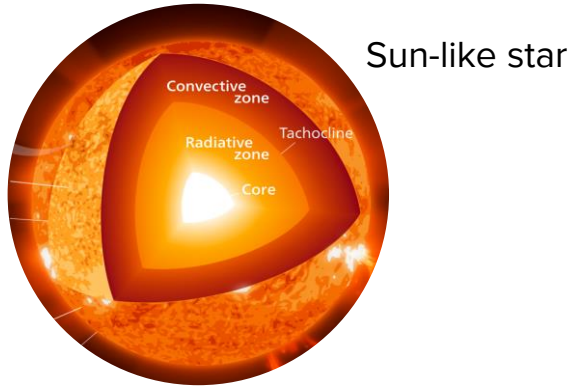
Spectral class represents the temperature of the star.

## Hertzprung-Russell diagram

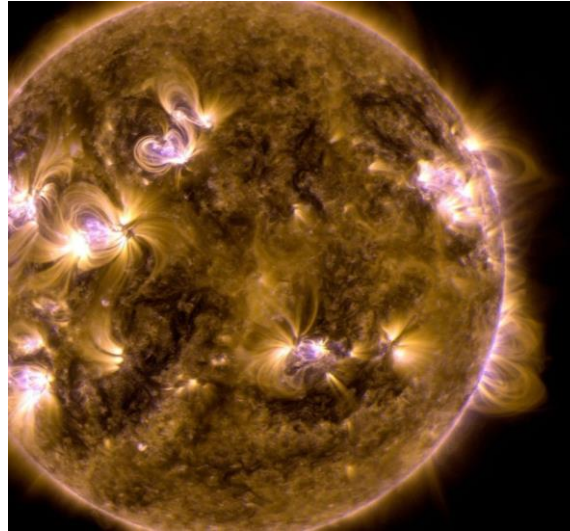


Red, dim, cold, small stars that live extremely long

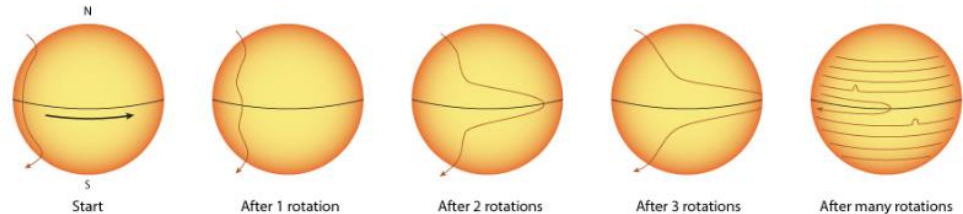
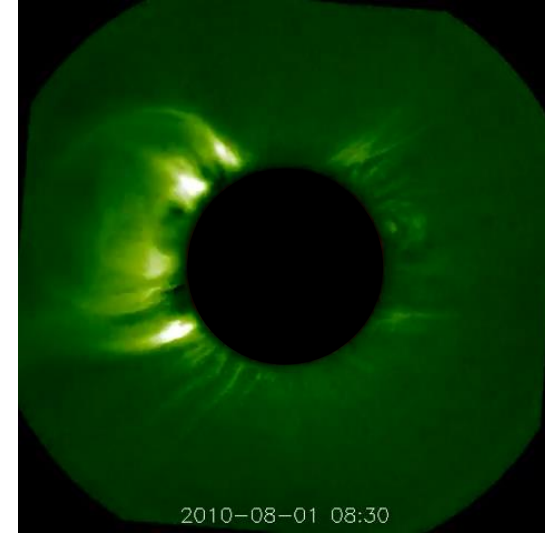
# Magnetic activity



Magnetic activity cause...



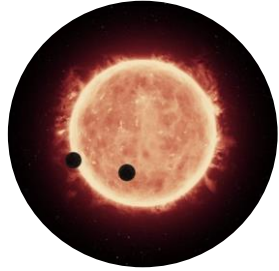
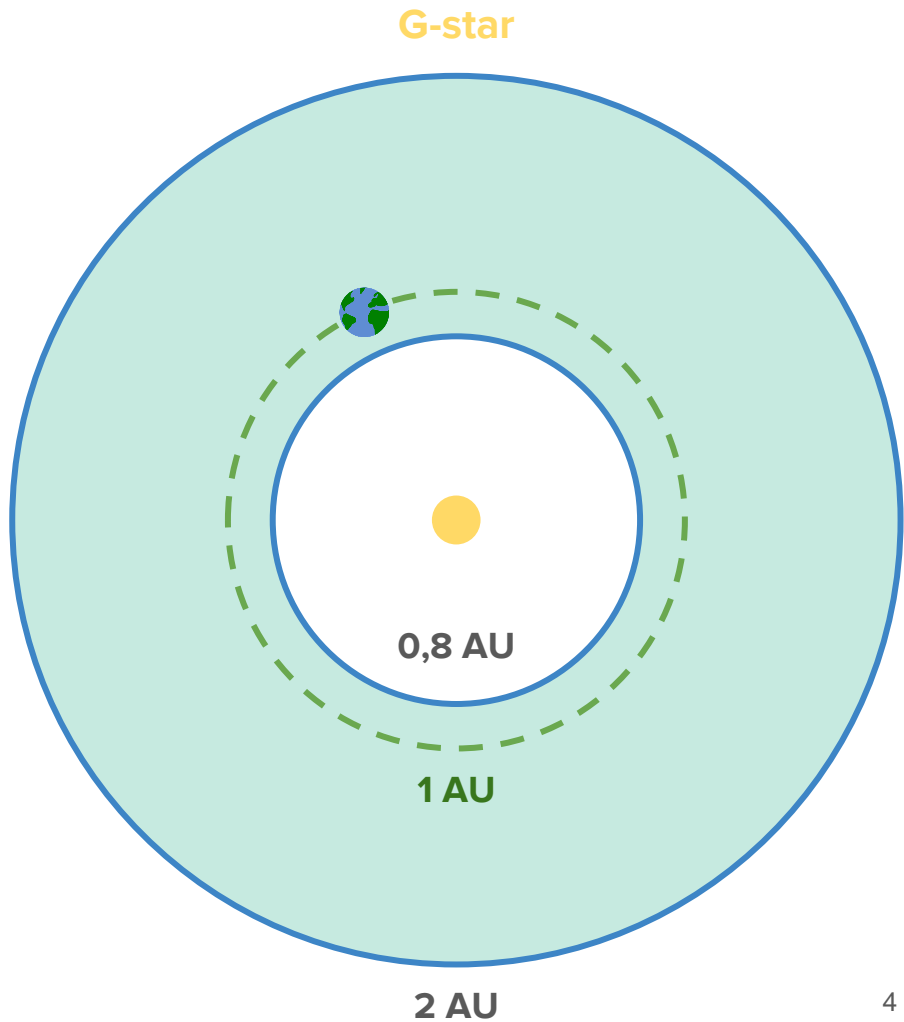
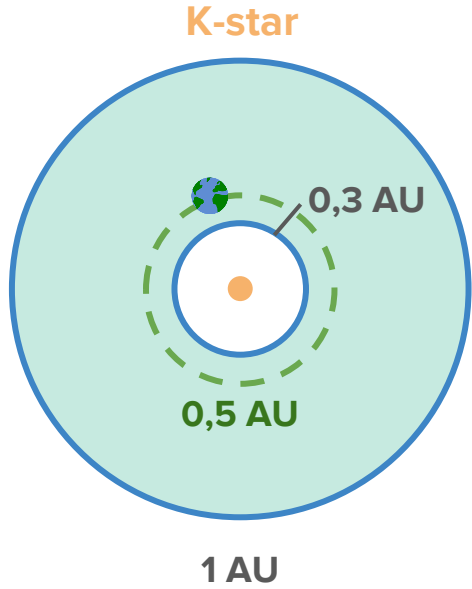
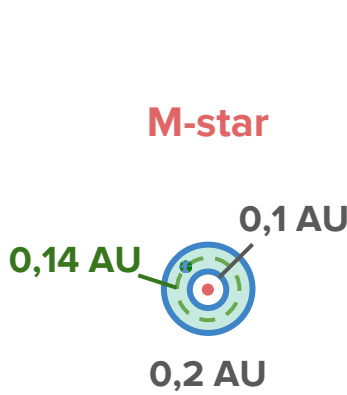
... flares!



Kelvinsong, Wiki, Diagram of the Sun  
SDO Gallery, Sun

NASA video, coronal mass ejections captured by the STEREO COR1  
NASA / IBEX

# Habitable Zone



# Resume:

- M-dwarfs are **red, dim, cold, small** stars that **live extremely long**
- Their **magnetic activity is surprisingly efficient** (sunlike) for their size, and it is driven by another mechanism, so it has to be fully studied
- **Flares** – one of the markers of magnetic activity
- Flares are **transients**, that last from a few minutes to several hours
- To study **magnetic activity** of M-dwarfs and **potential habitability** of their systems we should collect **big statistics** (different spectral subtypes, rotational periods, ages, positions, distances) and find **extreme cases** (brightest, shortest, etc. flare events).

# ZTF

The Zwicky Transient Facility

## Wide sky astronomical survey

Uses a 1.22 m telescope

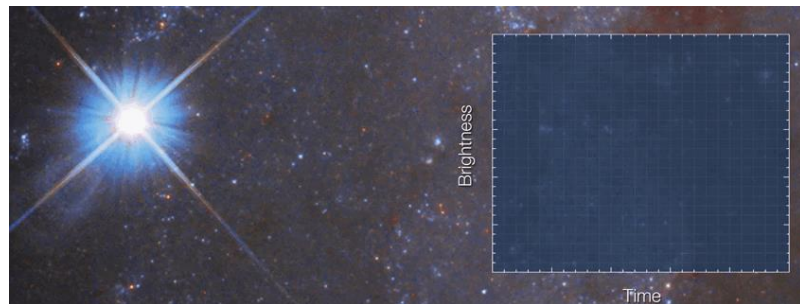
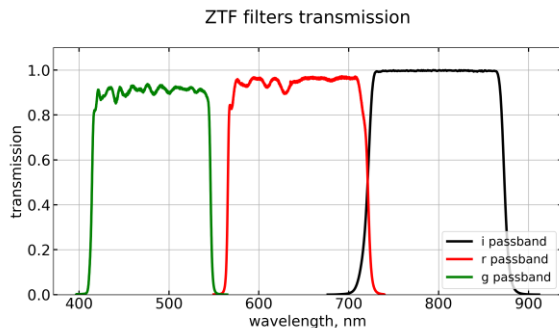
Field of view: 47 sq. degrees

Scans the entire northern sky

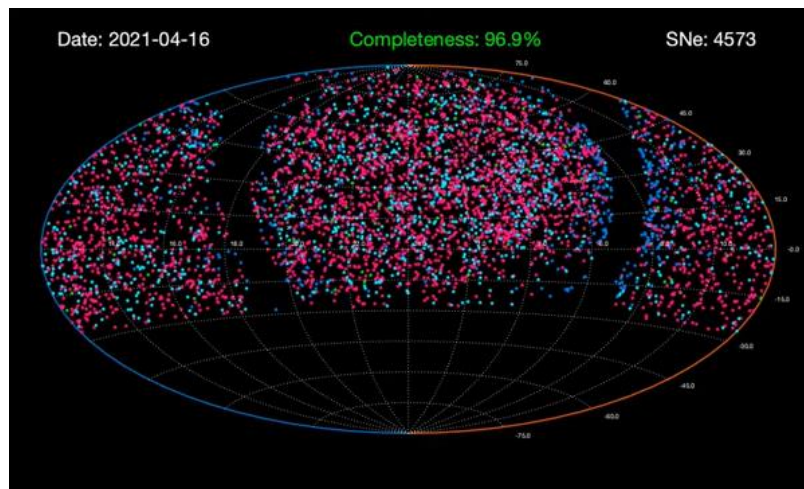
## DR8

March 17, 2018 – September 3, 2021

Cadence: 1-3 days, ~ 40 sec

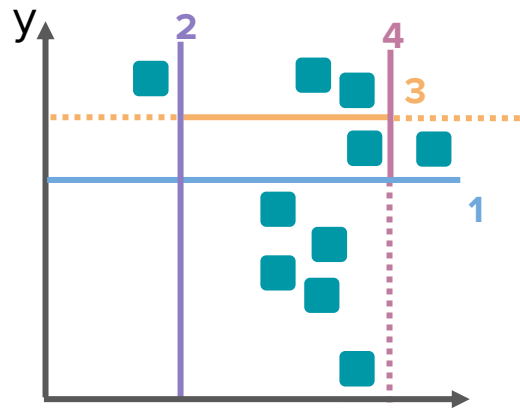


Example of a transient



Night sky coverage

# Active Anomaly Discovery

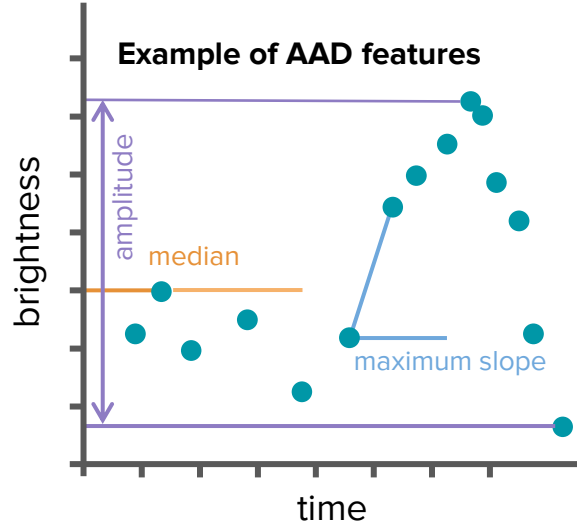
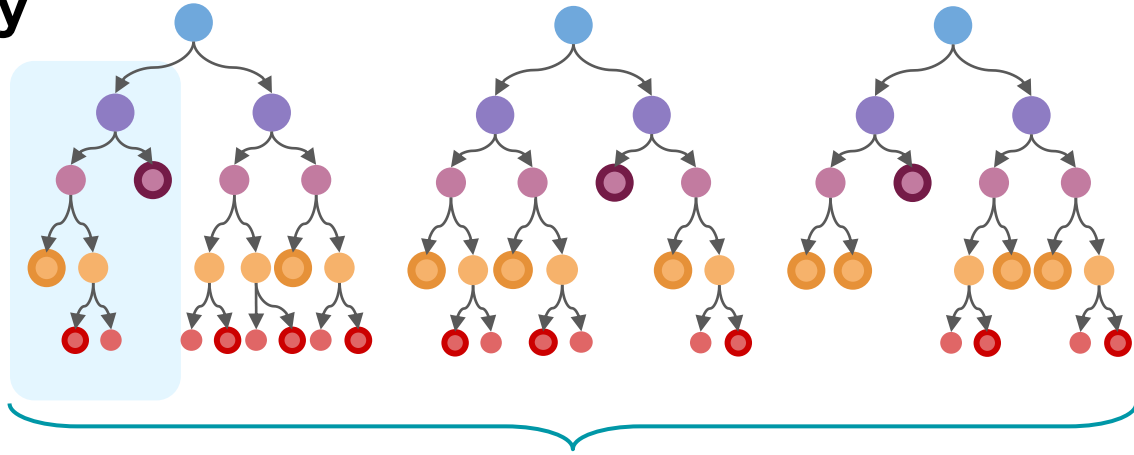


N° of features = 2



**AAD**

N° of features = 40



**Isolation forest**

“YES”  
“NO”



**Anomaly score**

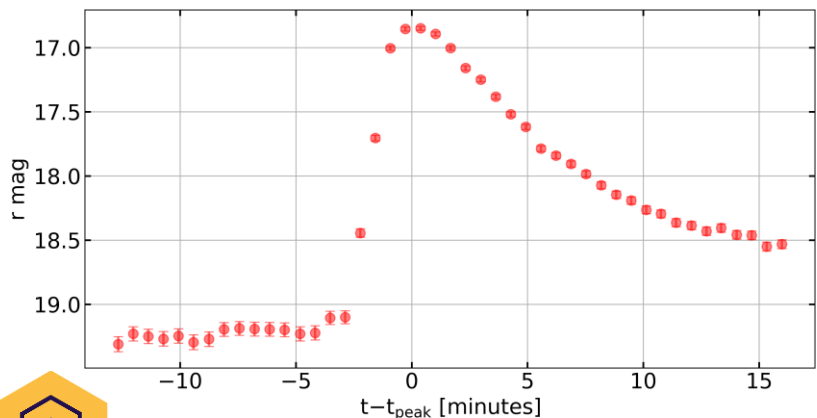


**Shows to the expert**

# AAD flare search

An expert considered as anomaly light curves like this, taking into account the image of the object, the cross-match with other catalogs, and said “YES” only to objects like this

ZTF OID 542214100014895



MJD t<sub>peak</sub>: 58671.3297



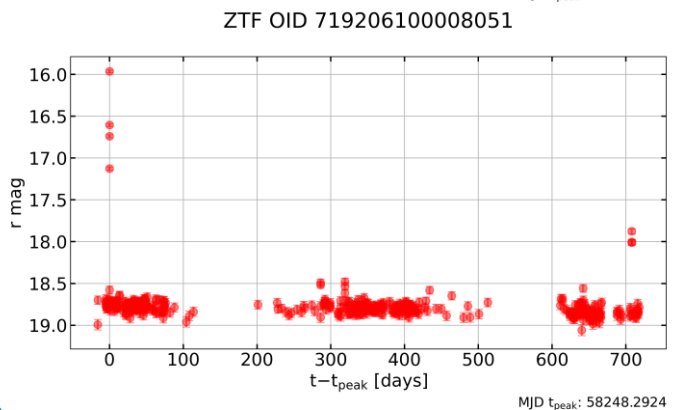
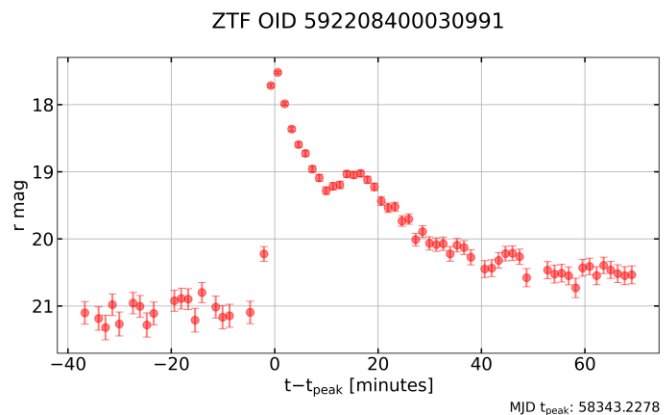
Initial data set: **21.5 million objects**  
Visually inspected: **860 objects**  
Expert said “YES”: **35 objects**

The screenshot shows a web browser window displaying the ZTF search results for ZTF OID 542214100014895. The page includes a list of search criteria on the left, a search bar, and a table of results. The table has columns for 'Yes', 'Description', 'Changed by', and 'Changed at'. Below the table is a 'SUBMIT' button and a 'RESET' button. A light curve plot is visible in the bottom left, and a zoomed-in image of the object is shown in the bottom right. The interface also includes a sidebar with various search filters and a footer with download options.

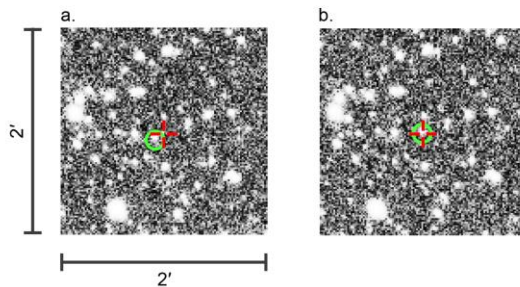
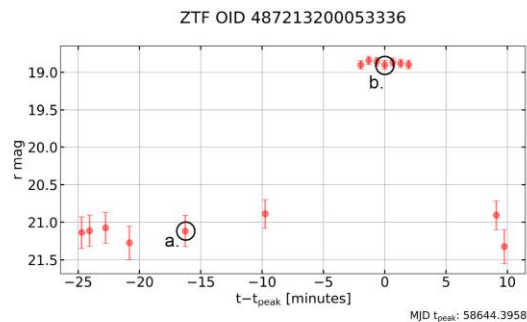
Example of the work of an expert: he said “NO”



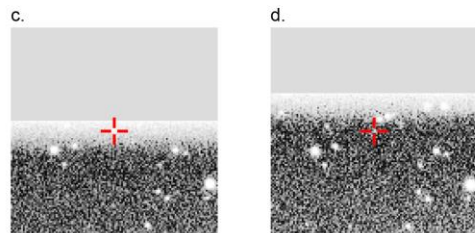
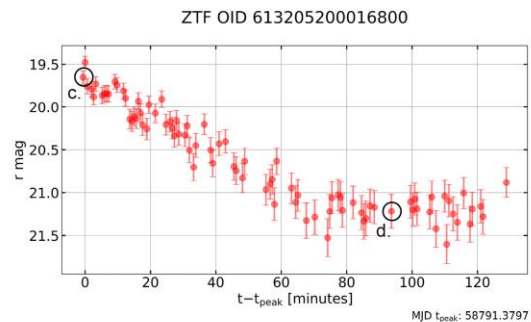
# Examples



## Other types of “transients”



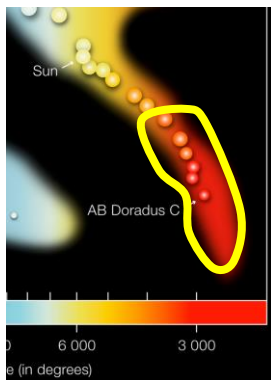
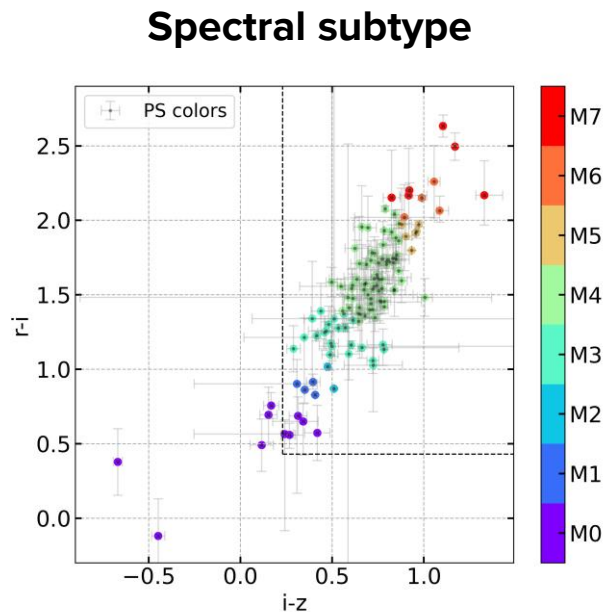
**Asteroid**



**Edge of the frame**

Expert said “YES”

# Physical parameters



Proves that these stars are M-dwarfs.  
 This estimations can be used to study their distribution over Spectral classes, galactic latitude etc.

# Flare energy

oid	$E \times 1e33$ [erg]
257209100009778	$45.19^{+13.37}_{-7.14}$
385209300066612	$26.31^{+14.40}_{-14.96}$
412207100011243	$57.73^{+11.83}_{-8.70}$
436207100033280	$19.13^{+4.52}_{-3.88}$
437212300061643	$162.62^{+15.15}_{-14.06}$
540208400015276	$11.57^{+4.09}_{-2.59}$
542214100014895	$10.90^{+0.42}_{-0.42}$
592208400030991	$10.49^{+0.91}_{-0.81}$
615214400005704	$464.87^{+139.97}_{-107.99}$
726209400028833	$28.16^{+0.82}_{-0.76}$
768202400043820	$4.48^{+1.81}_{-1.10}$
768211400063696	$10.17^{+3.20}_{-4.16}$
771216100033044	$122.91^{+14.89}_{-14.79}$

**Table 1.** Bolometric energy estimations for the subsample of 13 candidates for the flaring events. The upper and lower uncertainties of the bolometric energies are defined according to the uncertainties of estimation of photogeometric distances in Gaia EDR3.

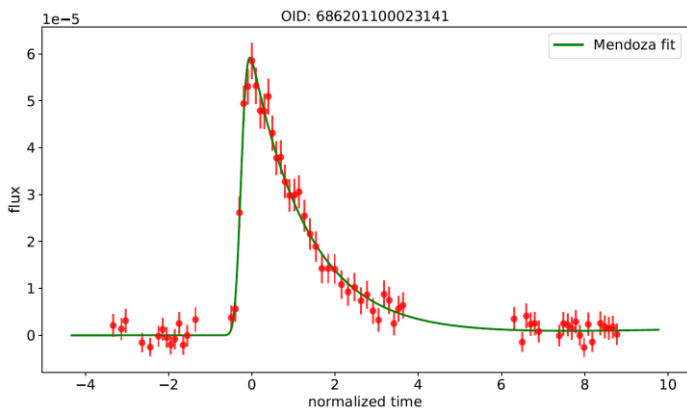
# Other methods

## Parametric fit search

$$f(t) = f^* + \frac{\sqrt{\pi}AC}{2} \times (F_1 h(t, B, C, D_1) + F_2 h(t, B, C, D_2)),$$

$$h(t, B, C, D) = \exp(\alpha CD) \times \operatorname{erfc}(\alpha),$$

$$\alpha(t, C, D) = \frac{B-t}{C} + \frac{1}{2}CD,$$

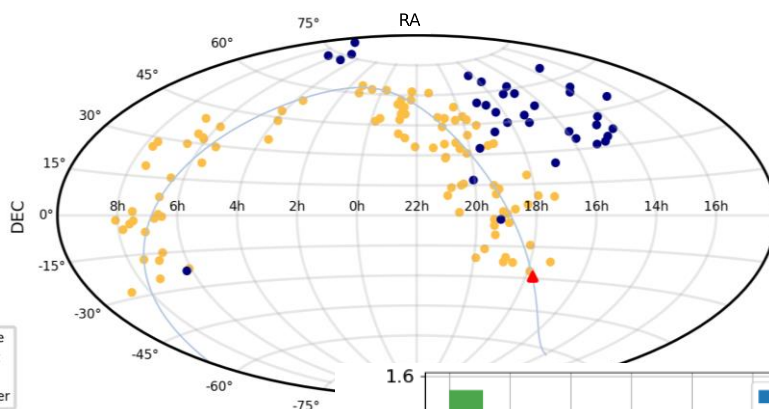


## Data cut

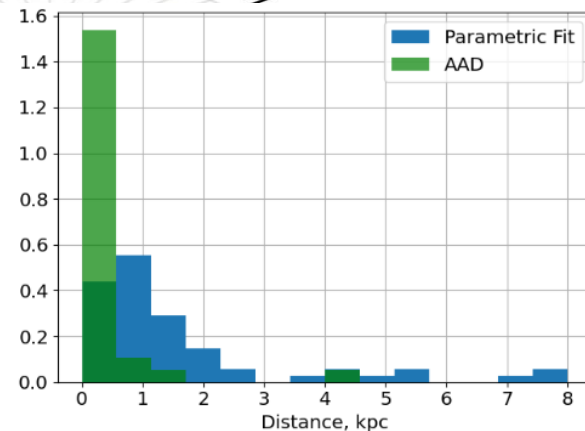
High Cadence: < 30 min between observations

Duration: > 2 hours (long duration sample)

> 30 minutes (short duration sample)



The spatial distribution of flaring M dwarfs



Normalized histogram of distances to M dwarfs

- Different methods – different sky zones
- AAD let us find short distant flares, recurrent flares, the brightest one
- Parametric fit let us find dim, long-distance flares

# Summary

- 126 flaring M-dwarfs were found using both, AAD and Parametric Fit methods
- Active Anomaly Discovery algorithm can be used in astronomical studies, and allows to find the chosen class of astronomical objects, if we consider them as “anomalies”
- It covers the amount of objects, that haven’t been found by standard astronomical method, and have different features such as distance, recurrence, brightness
- ZTF survey has a potential to discover a large amount of new flaring events which will have a great impact on the current research of flares’ distribution depending on evolutionary stage

