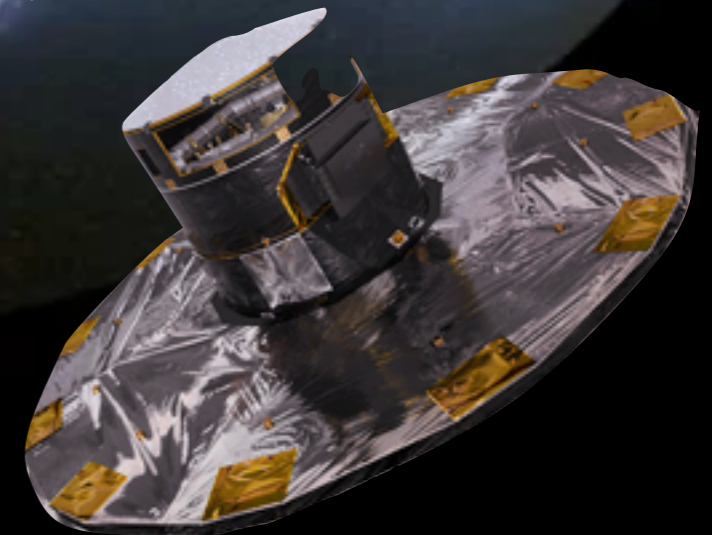
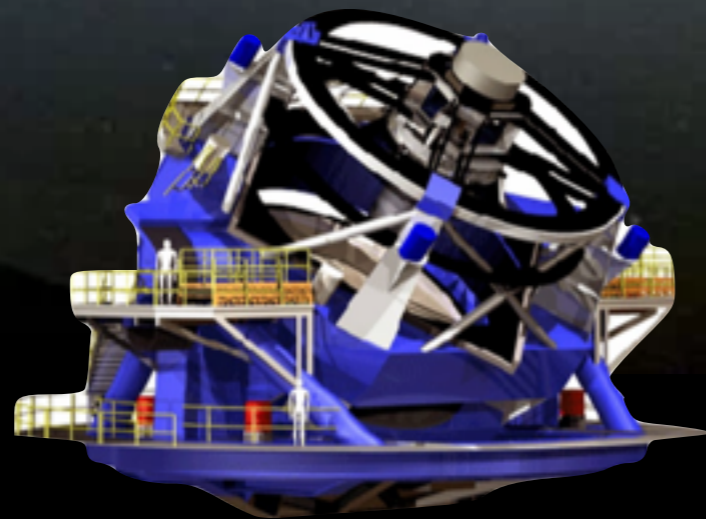


TRANSIENT SKY IN THE BIG DATA ERA



ŁUKASZ WYRZYKOWSKI (*pron: Woocash Vizhikovsky*)

WARSAW UNIVERSITY OBSERVATORY

with:

*S.Hodgkin, M.Gromadzki, A.Hamanowicz, K.Rybicki, J.Klencki,
Z.Kostrzewa-Rutkowska,, OGLE and Gaia Teams.*

EWASS 2017, Prague
S14-Astroinformatics

TRANSIENT SKY

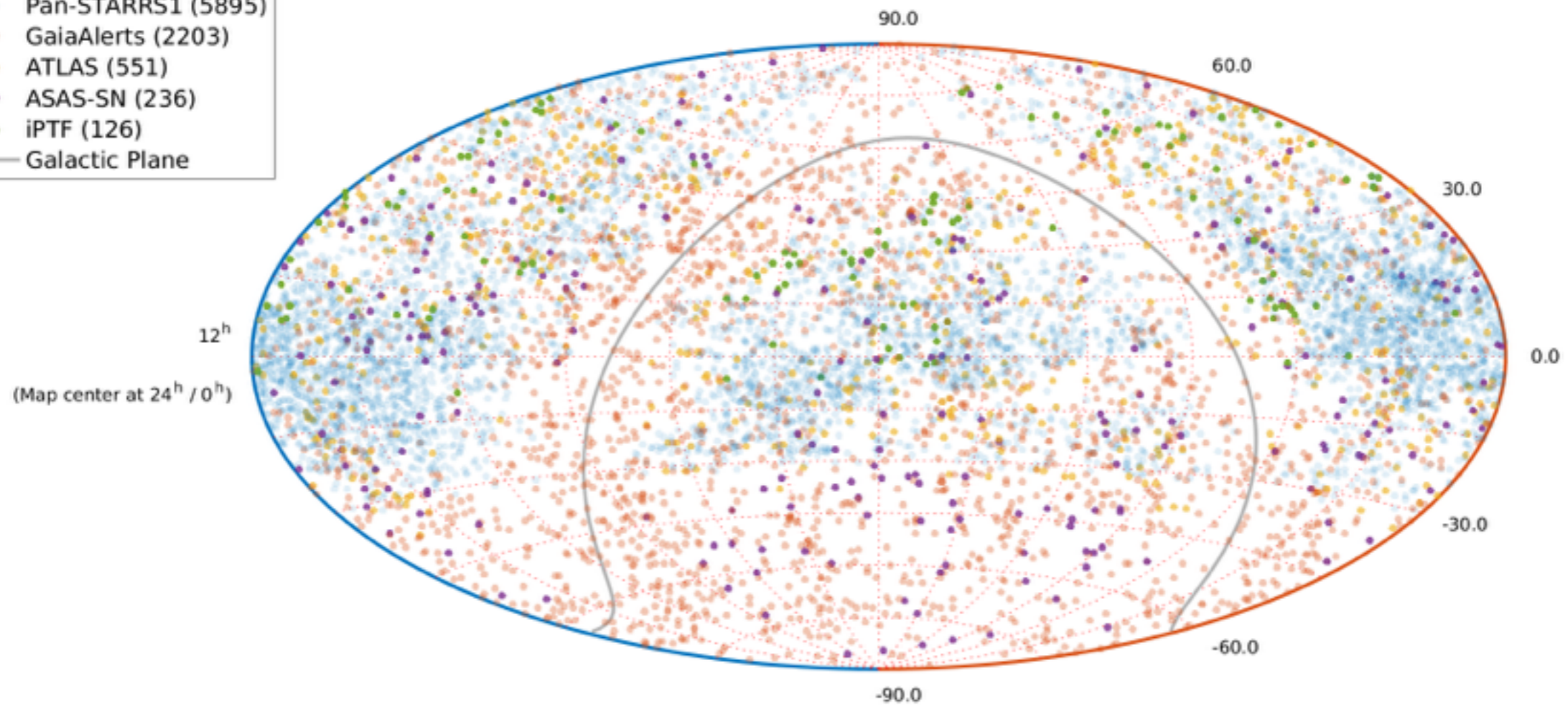


TNS Full-Sky Map by Source Group

Source Groups Plotted: Top 5 by Transient Count

Types Plotted: All SNe, ATs

- Pan-STARRS1 (5895)
- GaiaAlerts (2203)
- ATLAS (551)
- ASAS-SN (236)
- IPTF (126)
- Galactic Plane

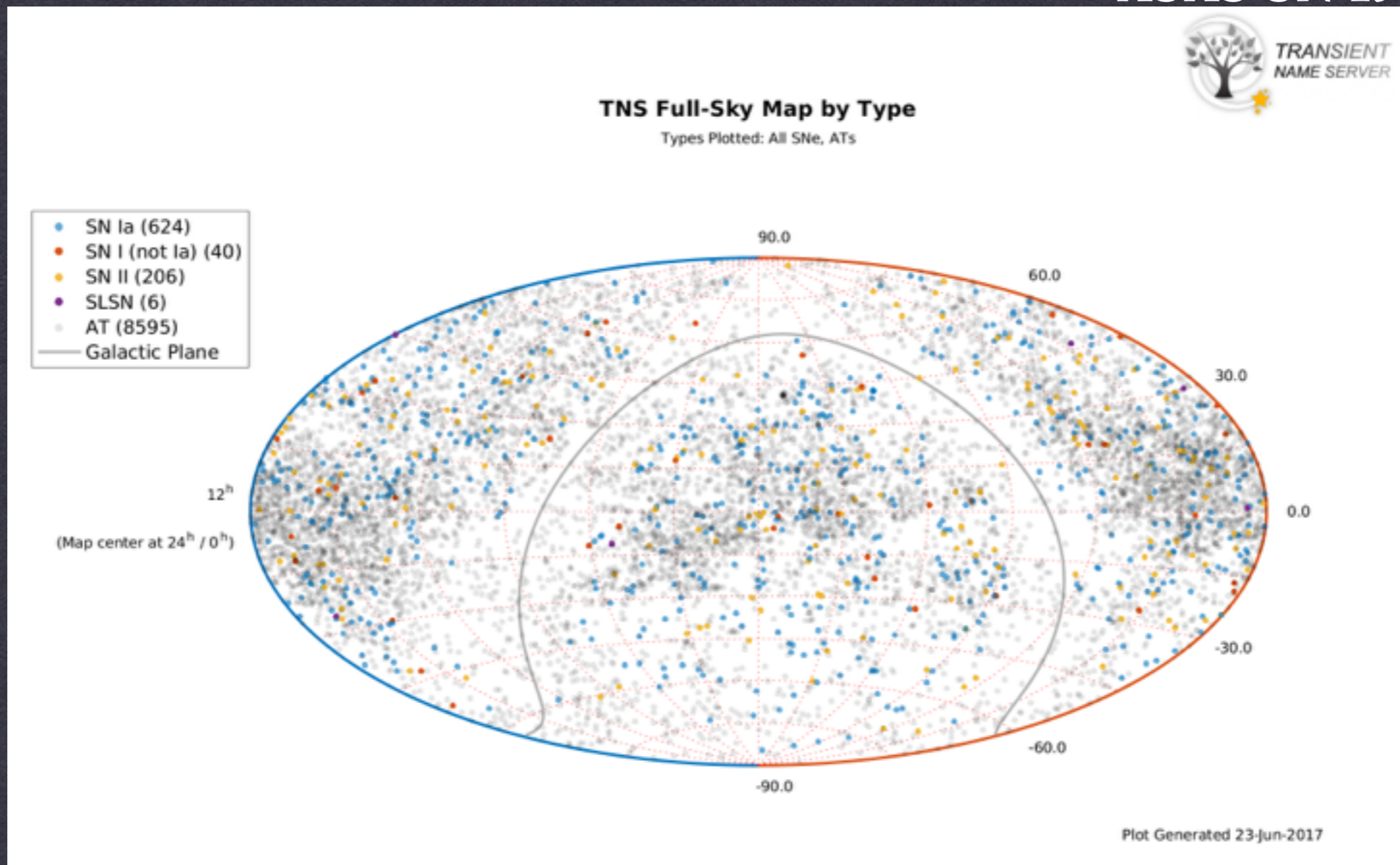


Plot Generated 22-Jun-2017

STATS

TNS since Jan 1, 2016
Reported : 9547
classified : 879 <10%

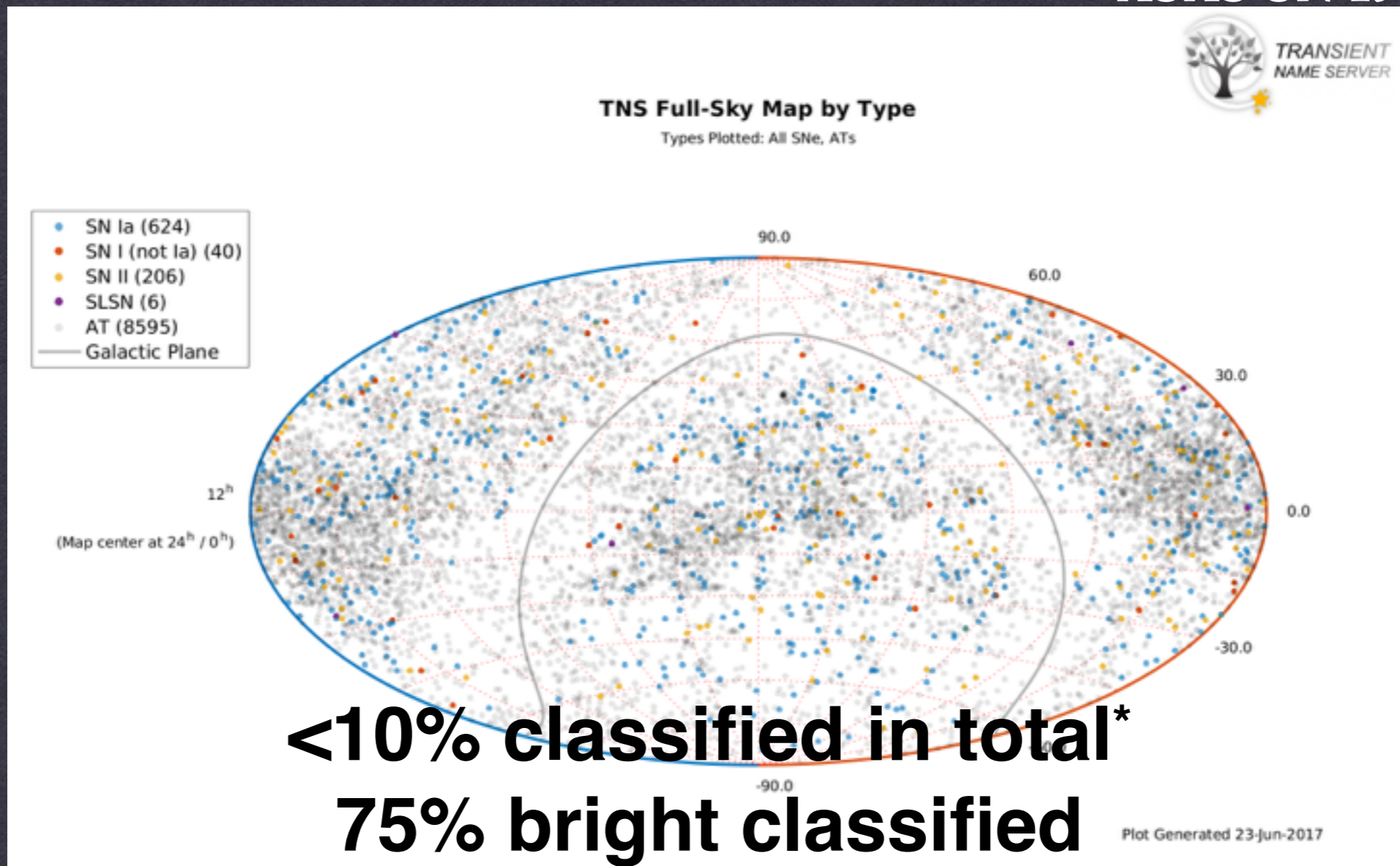
ratio classified:
Pan-STARRS1 136/5908
GaiaAlerts 116/2224
ATLAS 143/574
ASAS-SN 190/254



STATS

TNS since Jan 1, 2016
Reported : 9547
classified : 879 <10%

ratio classified:
Pan-STARRS1 136/5908
GaiaAlerts 116/2224
ATLAS 143/574
ASAS-SN 190/254



* not all classifications reported to TNS yet

GO BRIGHT?

bright is good:

- easy to detect
- easy to follow-up for long time until late epochs
- studies of detailed aspects of explosions

GO BRIGHT?

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should we go bright only?

No!

GO BRIGHT?

bright is good:

- easy to detect
- easy to follow-up for long time until late epochs
- studies of detailed aspects of explosions

should we go bright only?

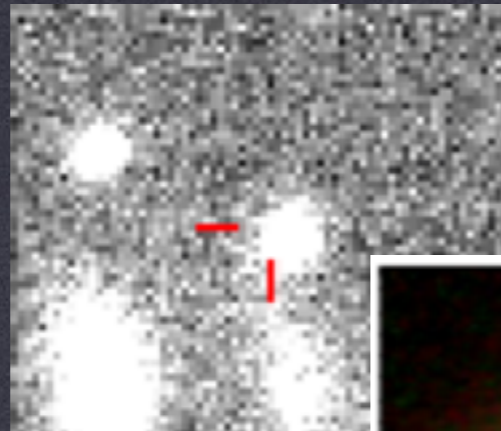
No!

GO FAINT!

- many interesting transients are faint!
- distant SN Ia - Dark Energy and cosmology
- lensed supernovae - Dark Matter distribution
- SN impostors - SN physics
- faint and fast - new rare explosions
- the unknown!

PRE-CLASSIFICATION

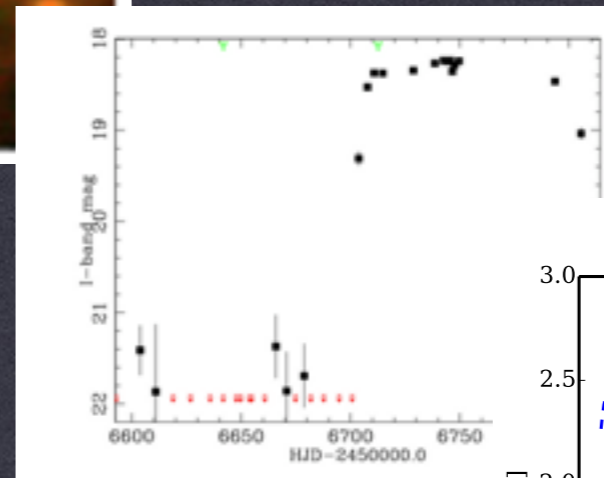
pixel level



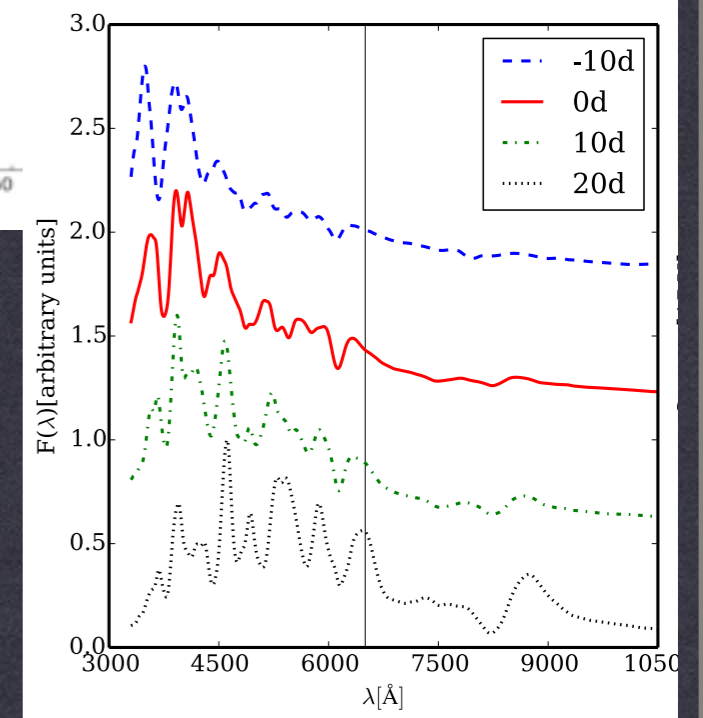
context level



light curve level



spectrum level



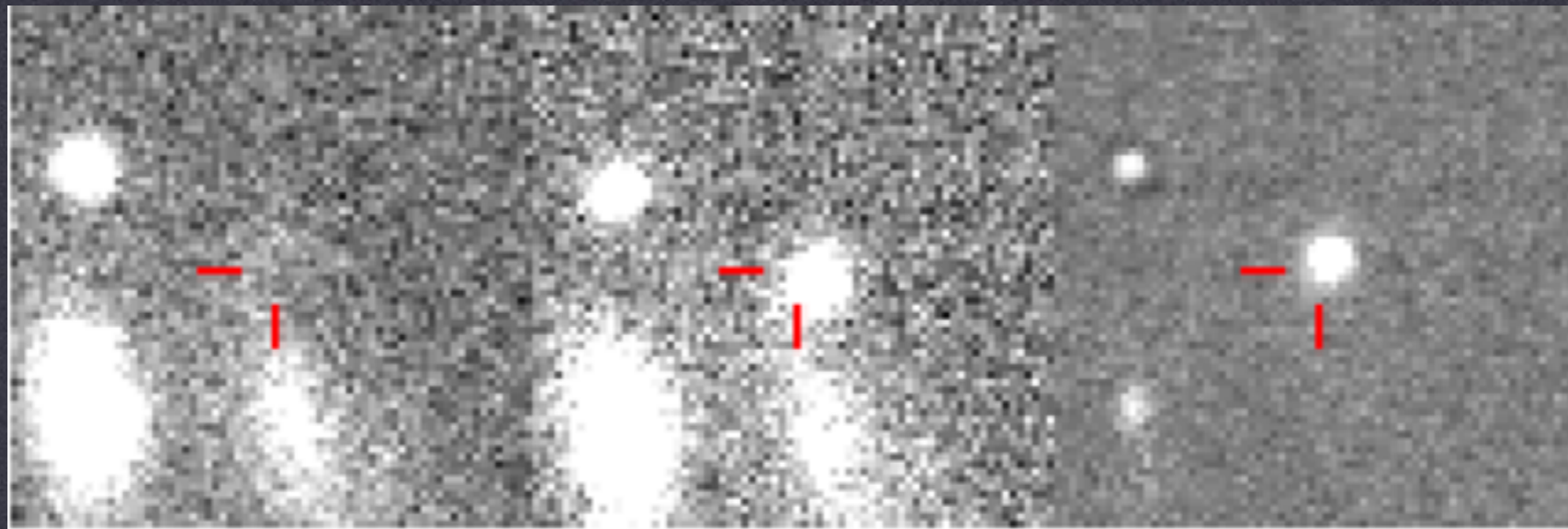
PIXELS

easy examples

reference image

current image

difference image



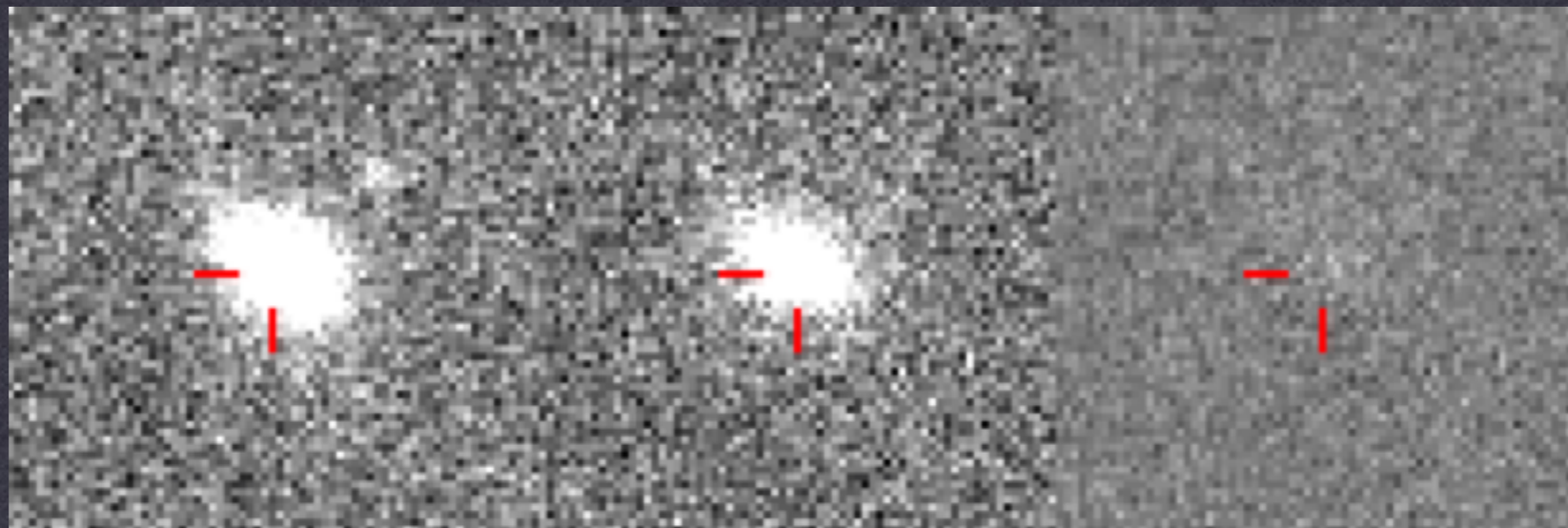
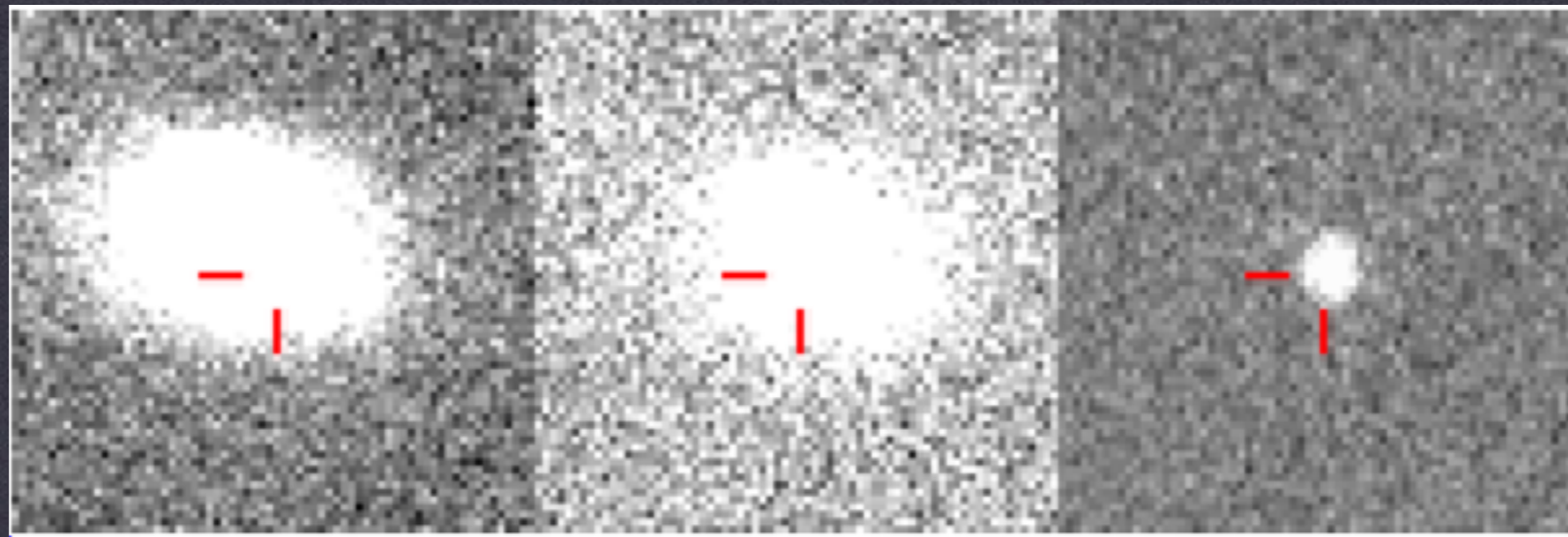
PIXELS

hard examples

reference image

current image

difference image



TDE

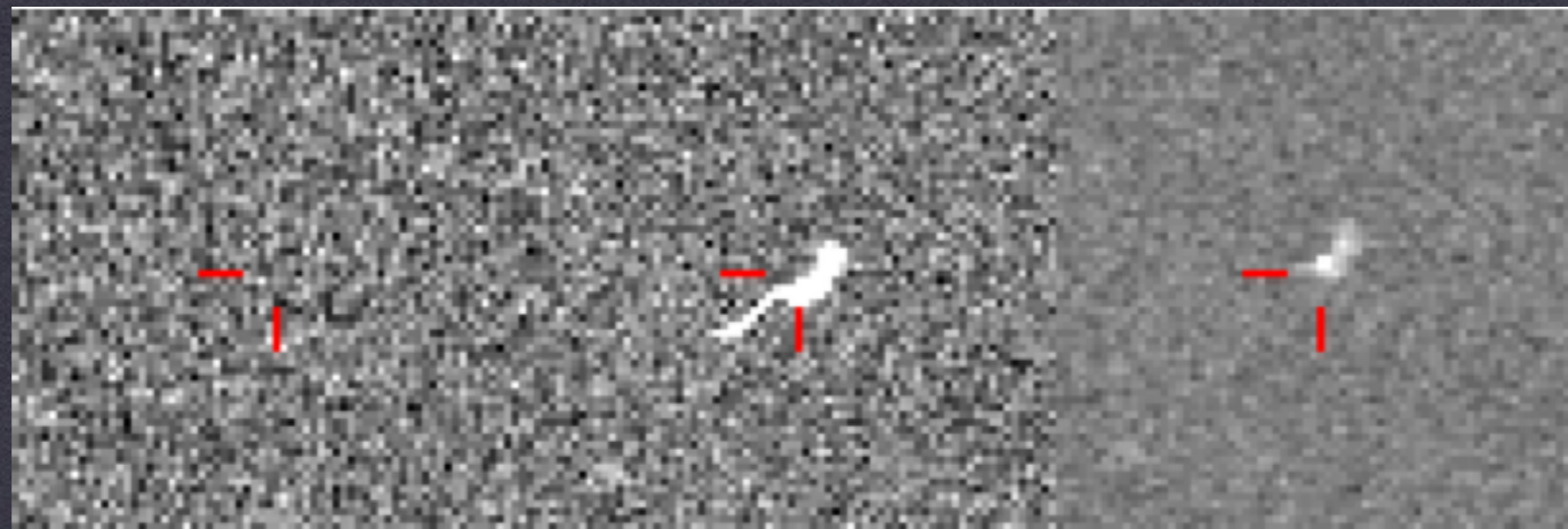
PIXELS

bogus examples

reference image

current image

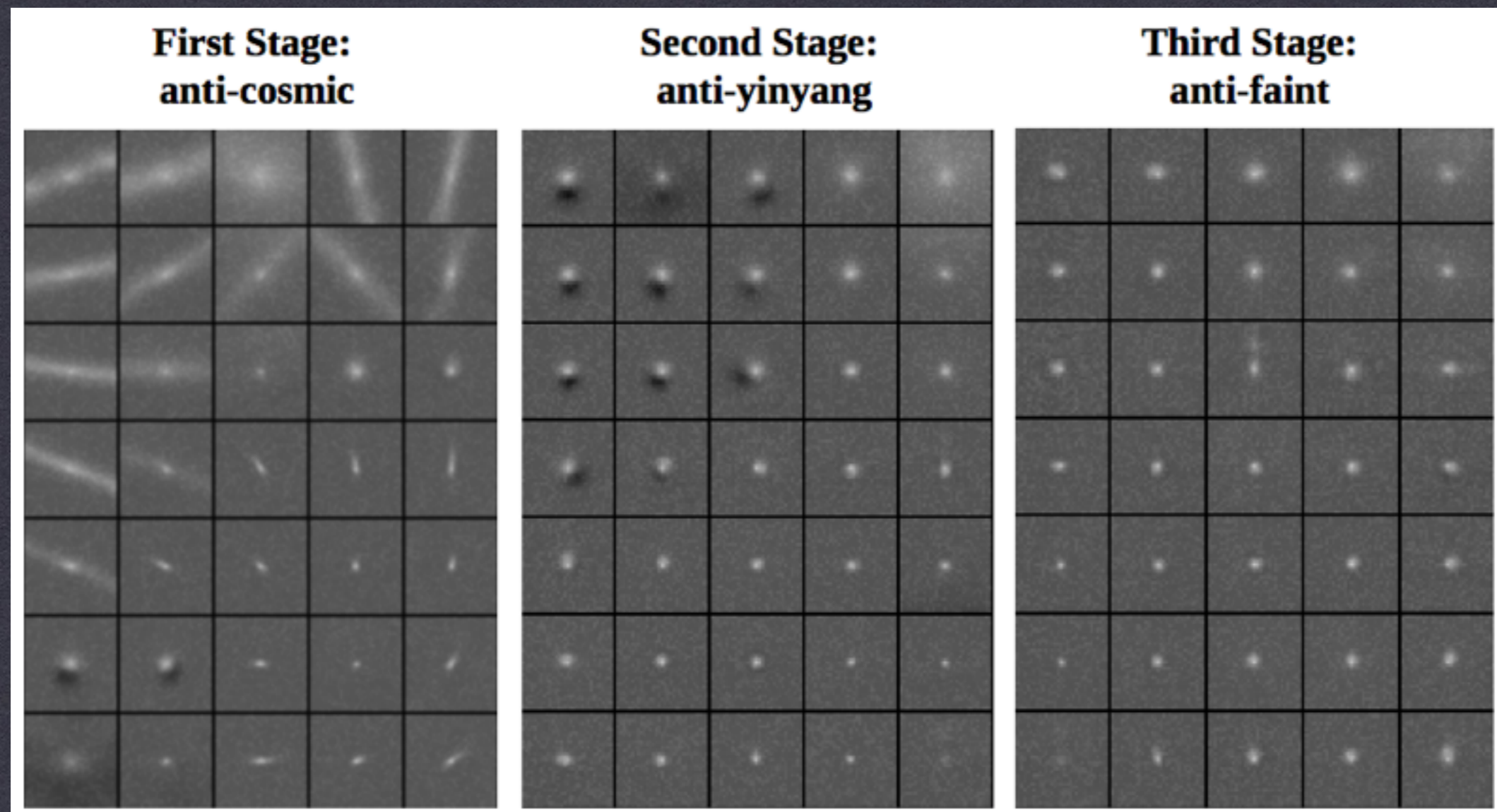
difference image



PIXELS

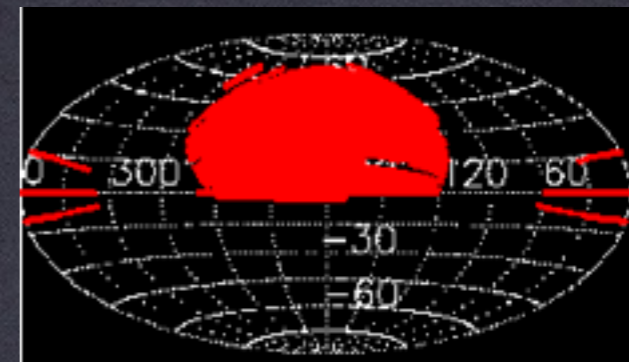
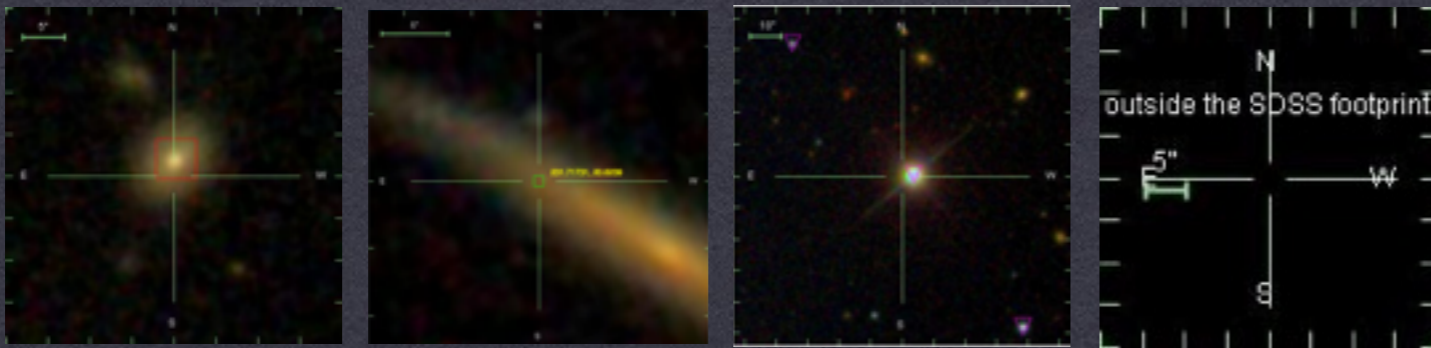
real-bogus classification

- Self-Organizing Maps on difference images
- single image used only - allows rapid detections of transients!
- 3% false positive rate



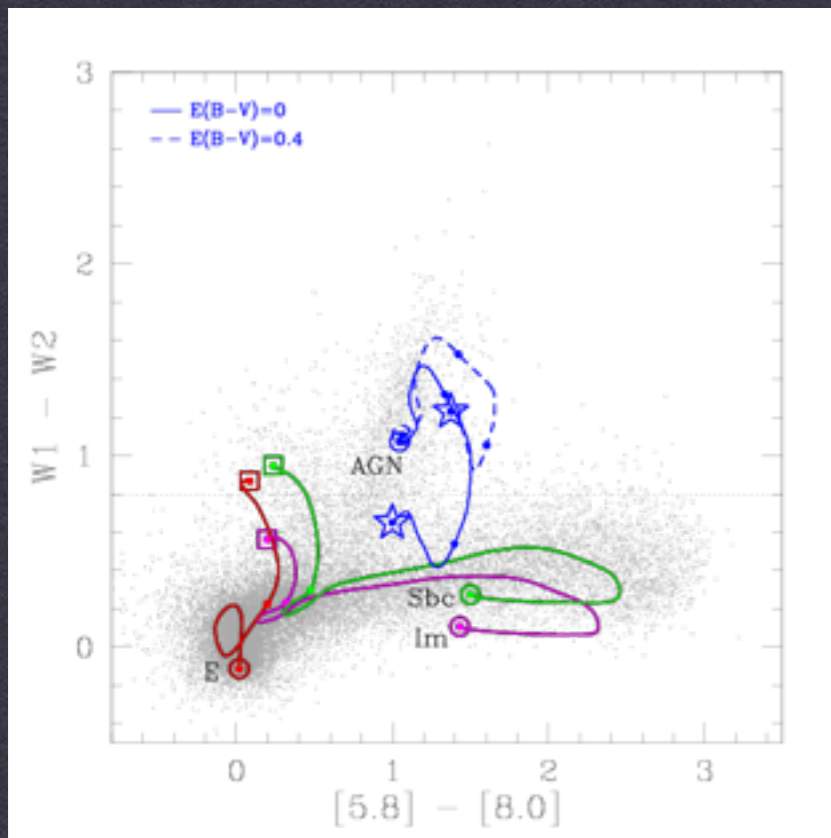
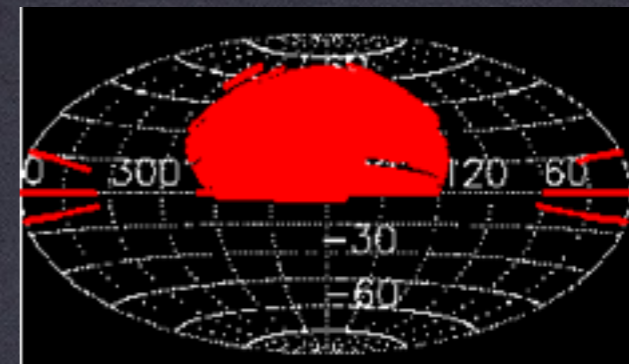
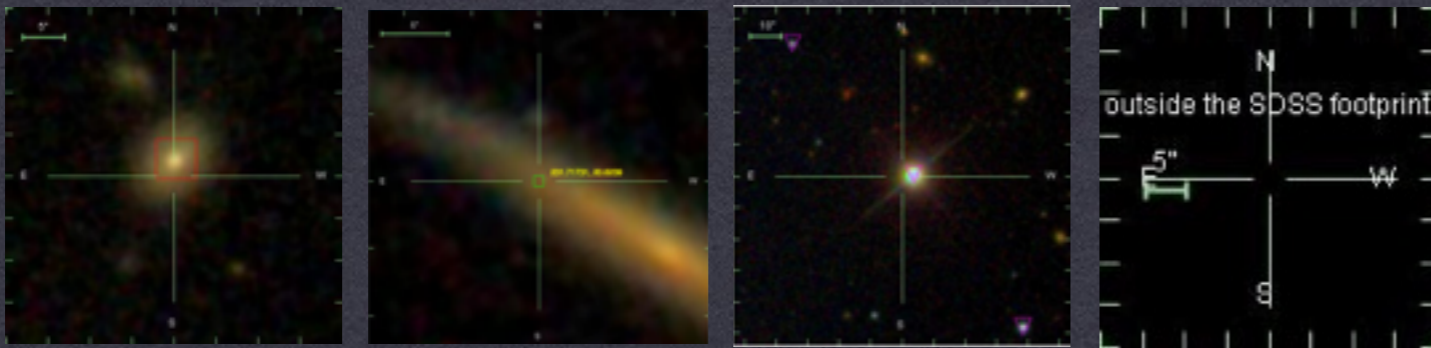
CONTEXT

- wealth of archives with imaging and catalogues
- problem: missing data (e.g., SDSS imaging only in the North)
- Decision Trees, Fuzzy SVM

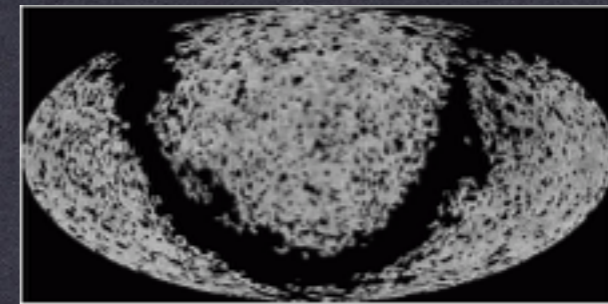


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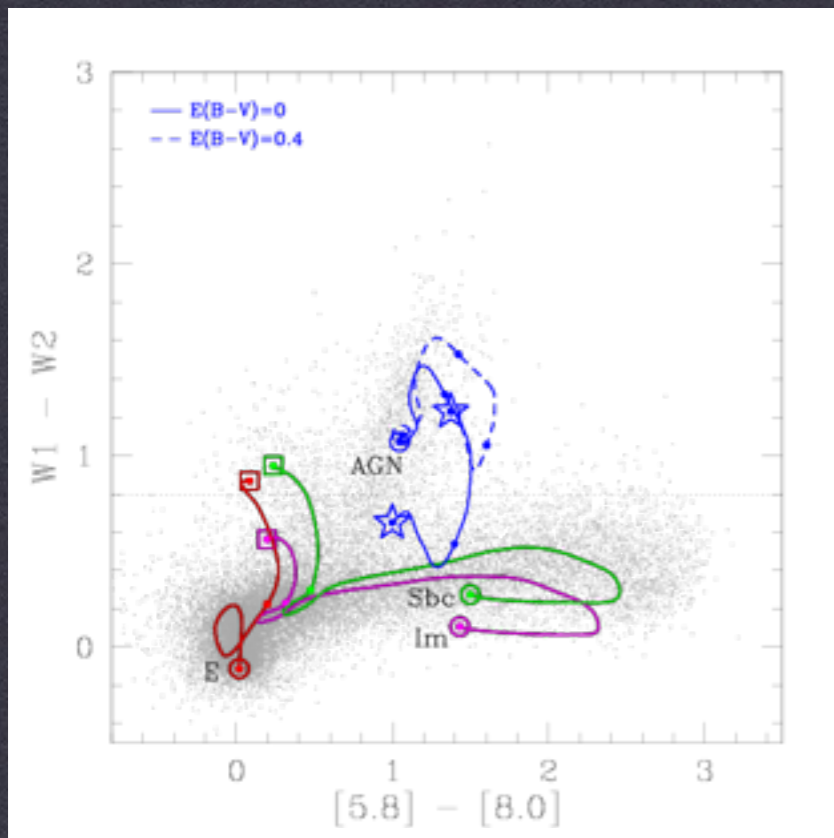
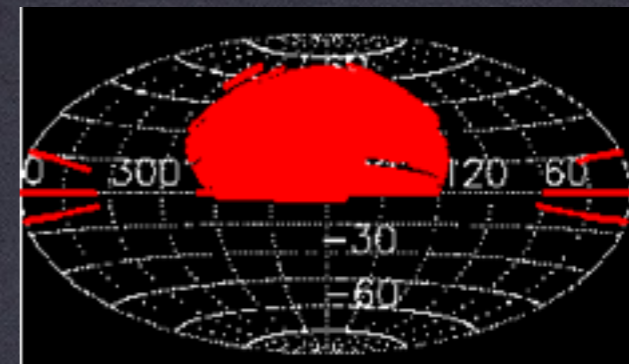
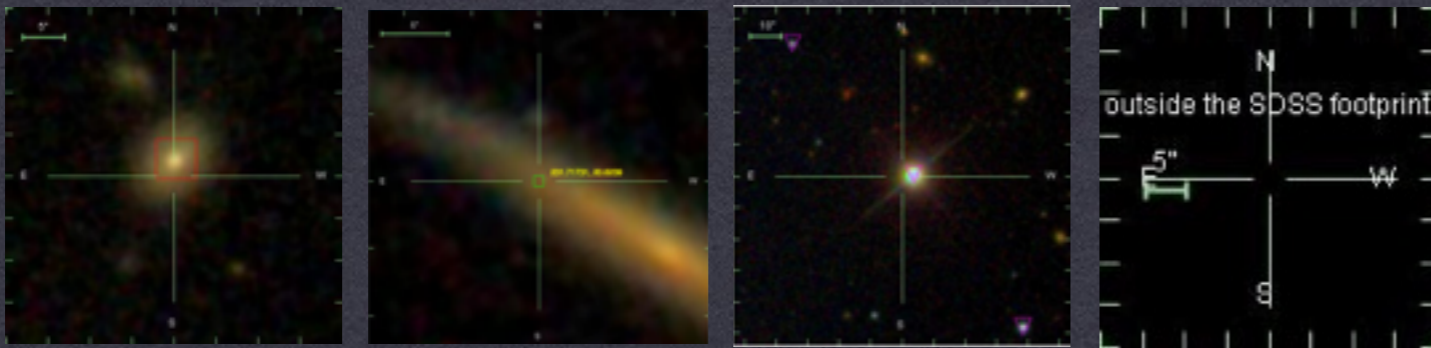


multi-wavelength surveys:
Rosat (X)
GALEX (UV)
Wise (IR)
2MASS (NIR)
large fraction of the sky!

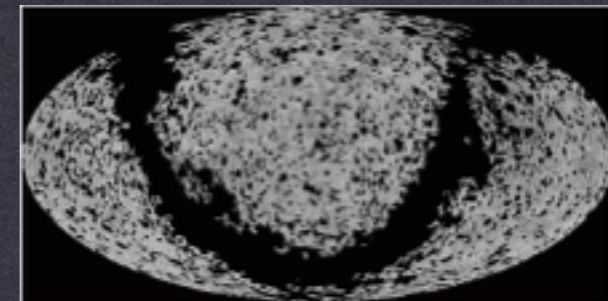


CONTEXT

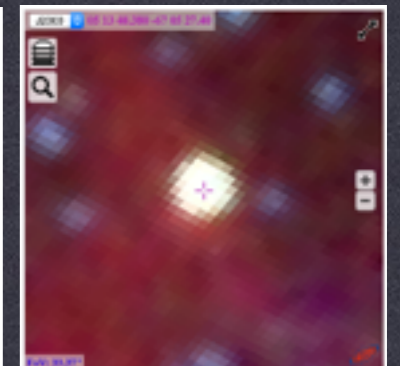
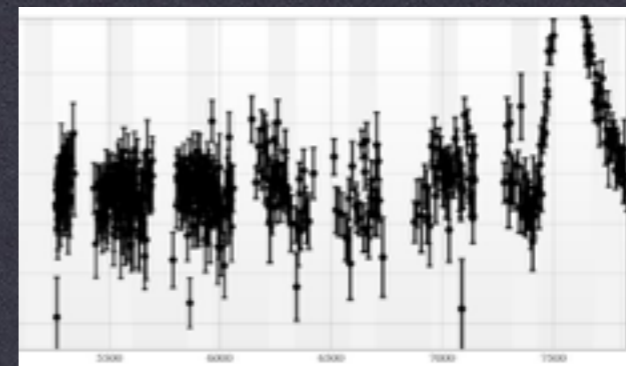
- wealth of archives with imaging and catalogues
- problem: missing data (e.g., SDSS imaging only in the North)
- Decision Trees, Fuzzy SVM



multi-wavelength surveys:
Rosat (X)
GALEX (UV)
Wise (IR)
2MASS (NIR)
large fraction of the sky!



large flare missed in a
known AGN $z=0.324$



CONTEXT

VERON_AGN (<3")

good match to known AGN?

GSC_STAR (<3")

USNO_STAR (<3")

SDSS_STAR (<3")

star very nearby?

GCVS_VARSTAR (<3")

known variable star?

LEDA_GALAXY (<3")

SDSS_GALAXY (<3")

2MASS_GALAXY (<3")

very close to galaxy core?

LEDA_GALAXY (3"-60")

SDSS_GALAXY (3"-15")

2MASS_GALAXY (3"-15")

galaxy nearby?

Decision

LIGHT CURVE

- simple parameters:
 - last non-detection
 - rising slope
 - max magnitude
- training set: 90 spectroscopically classified supernovae
- classifier: Random Forest
- correct answers: 84%

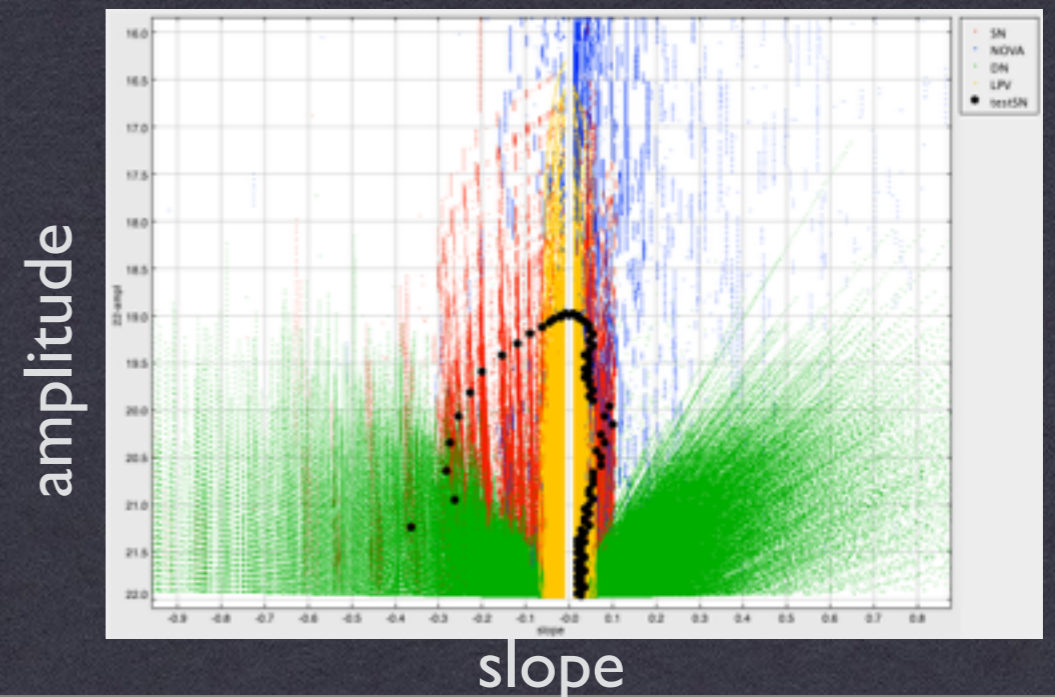
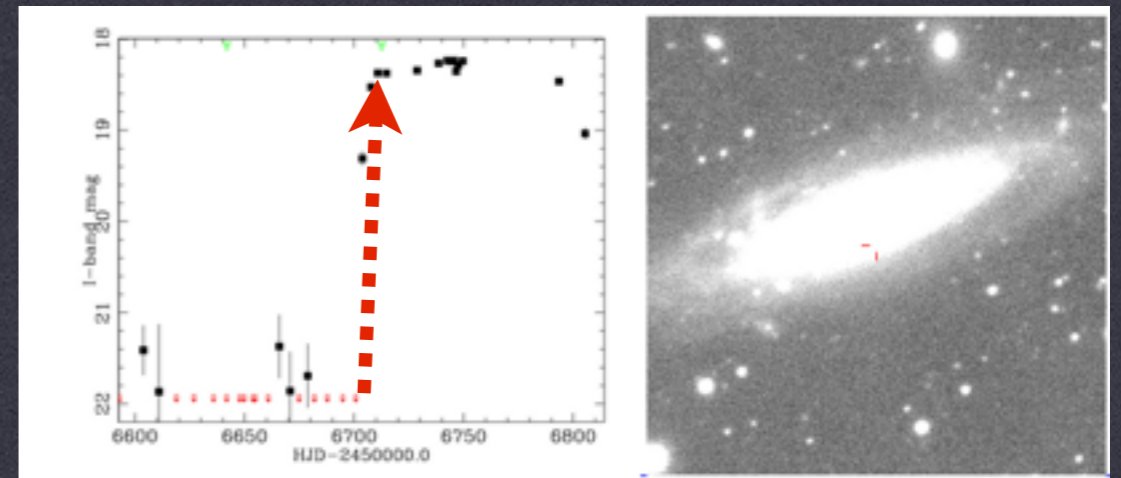
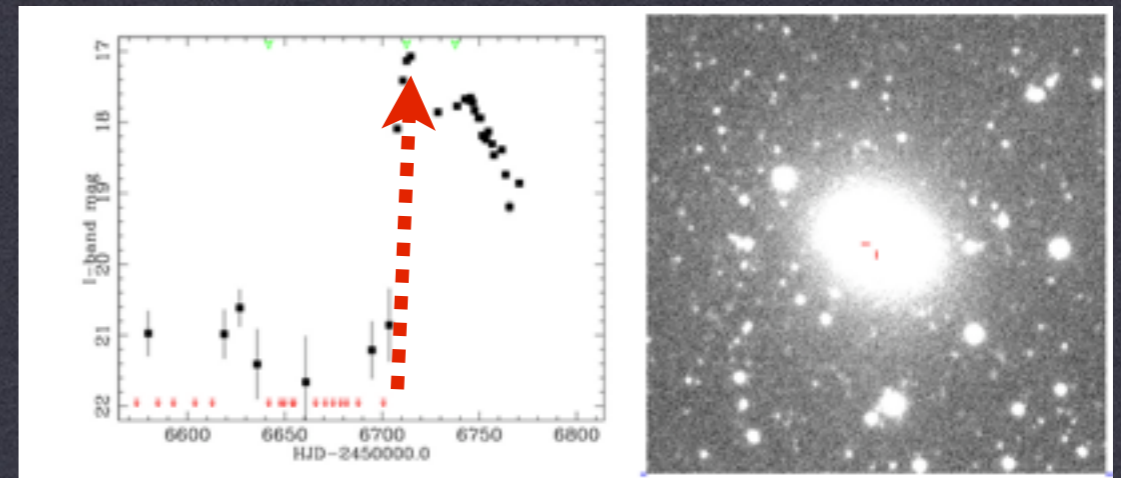
SN Ia

Novae

SN II

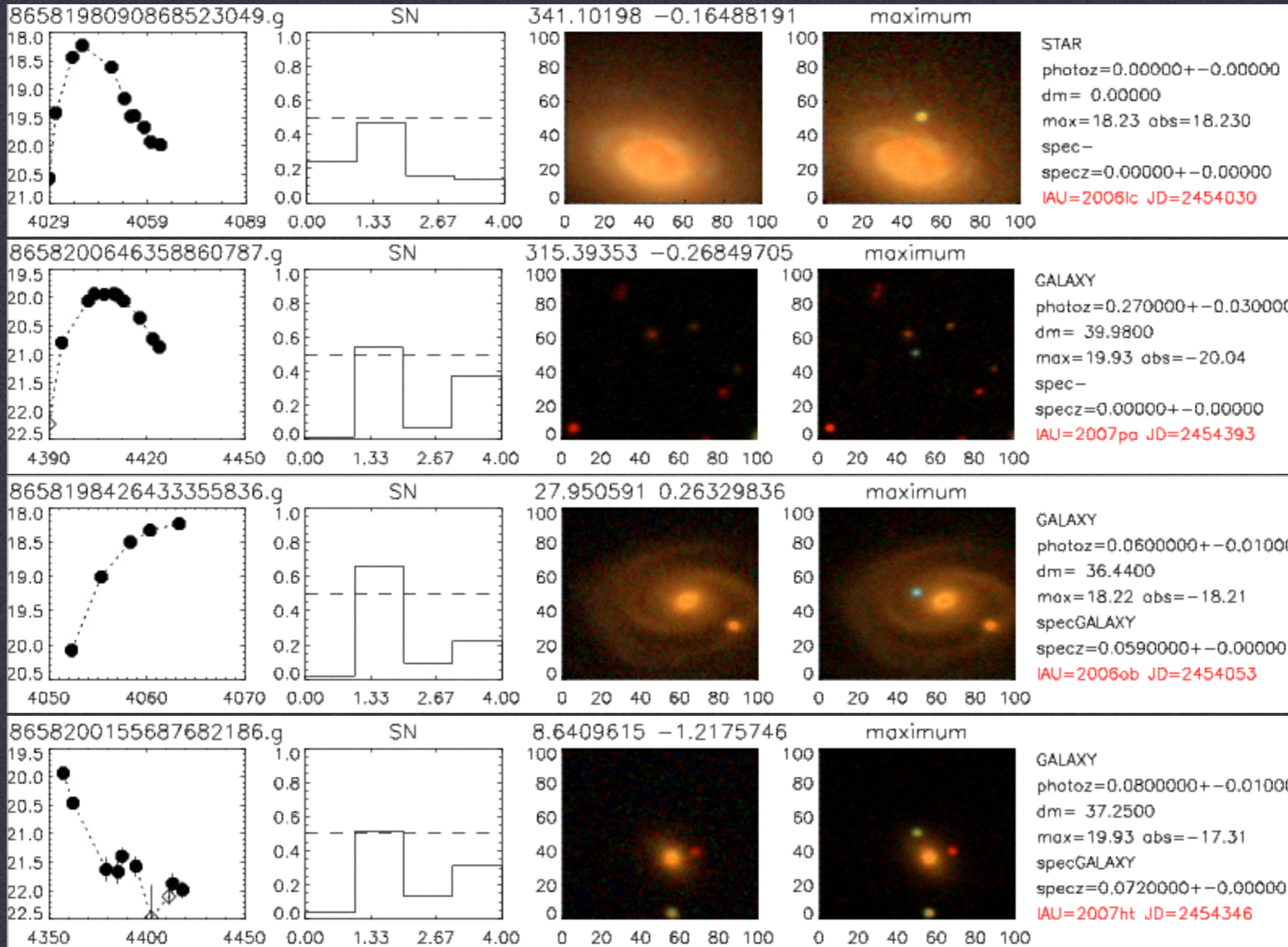
DN

LPVar



LIGHT CURVE

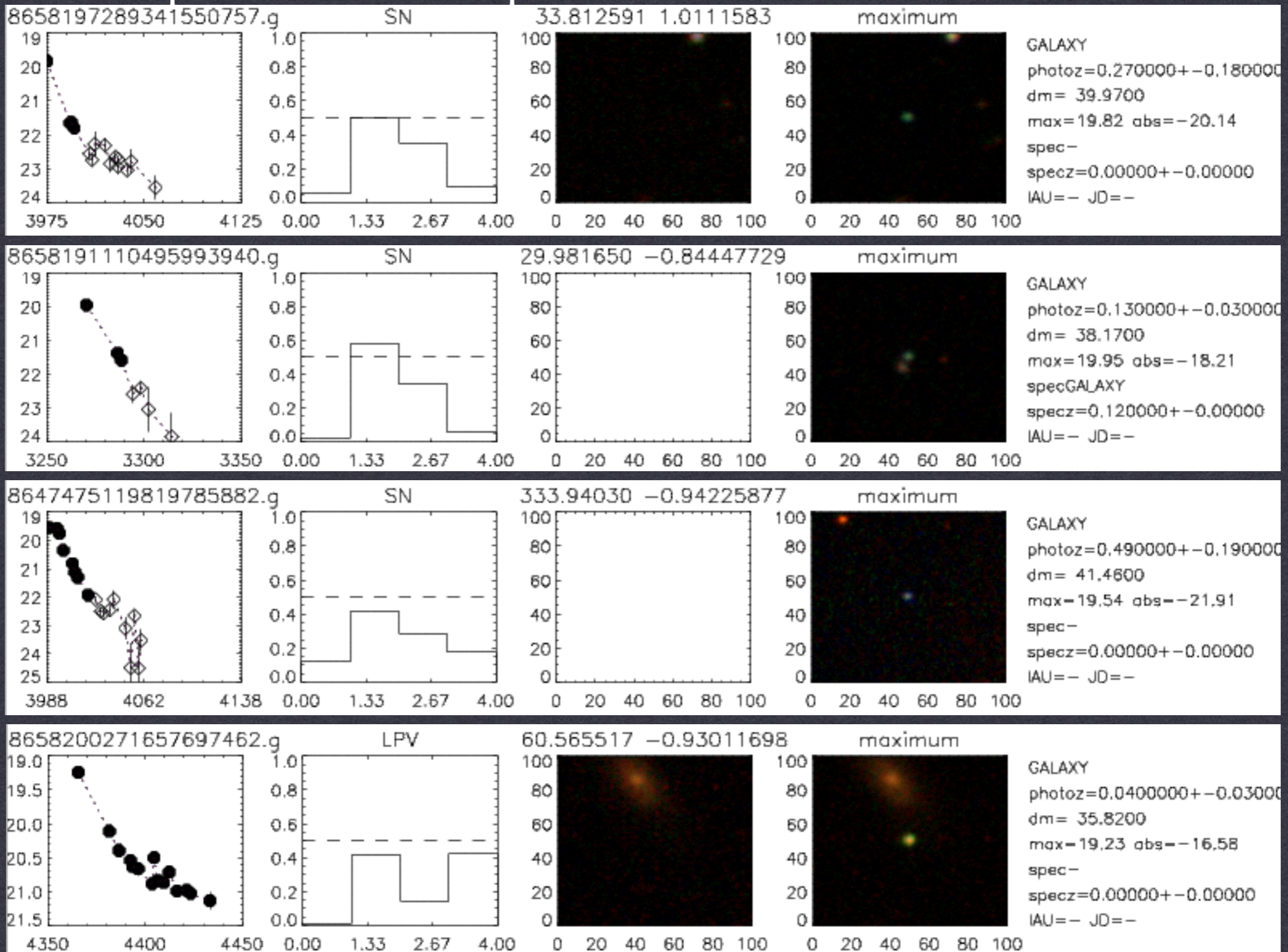
test on Stripe 82



Classifier does not know about the galaxy!

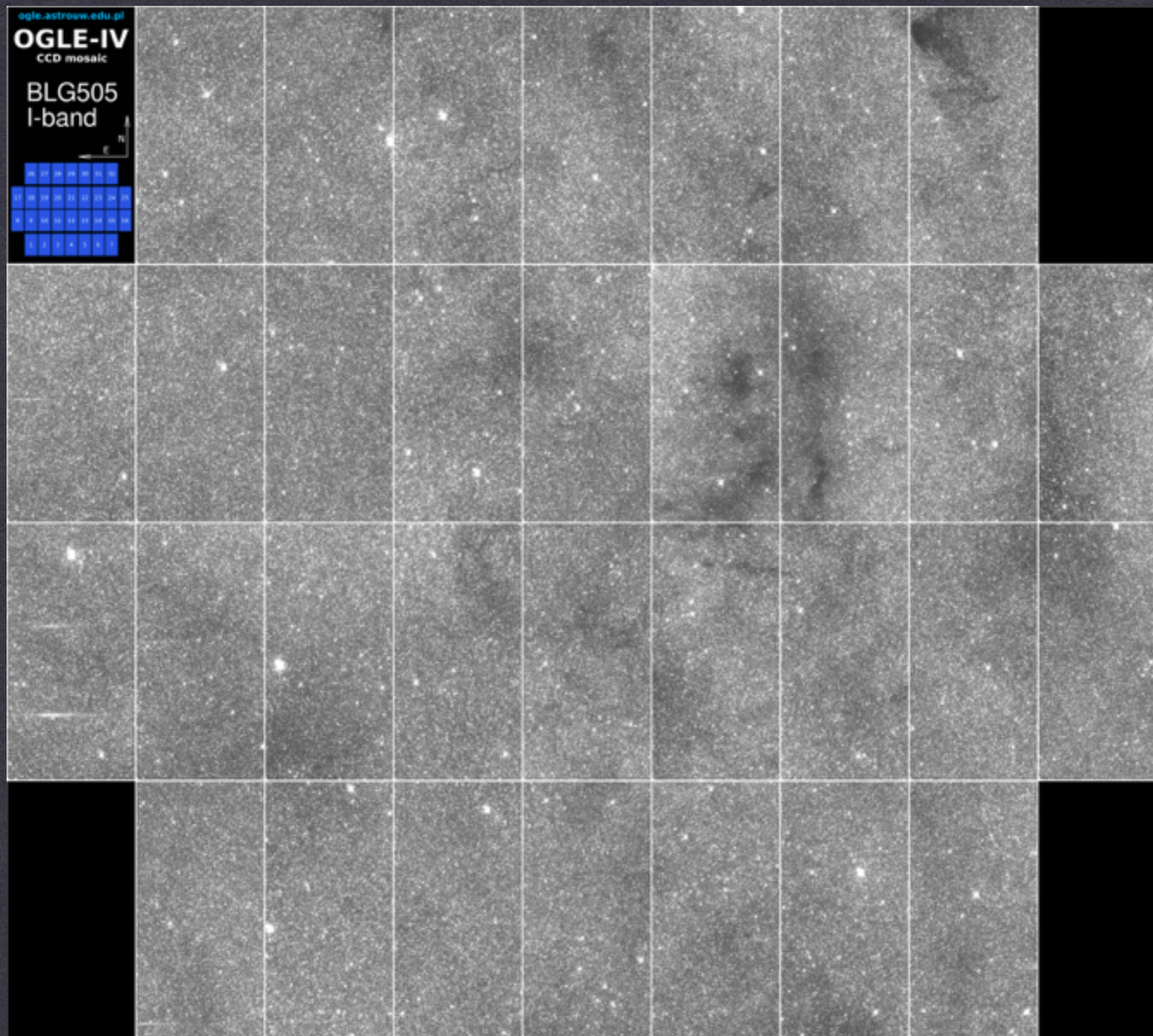
LIGHT CURVE

new supernovae in Stripe 82



overlooked super-luminous supernova found: Z.Kostrzewa-Rutkowska+2013

LIGHT CURVE - MICROLENSING

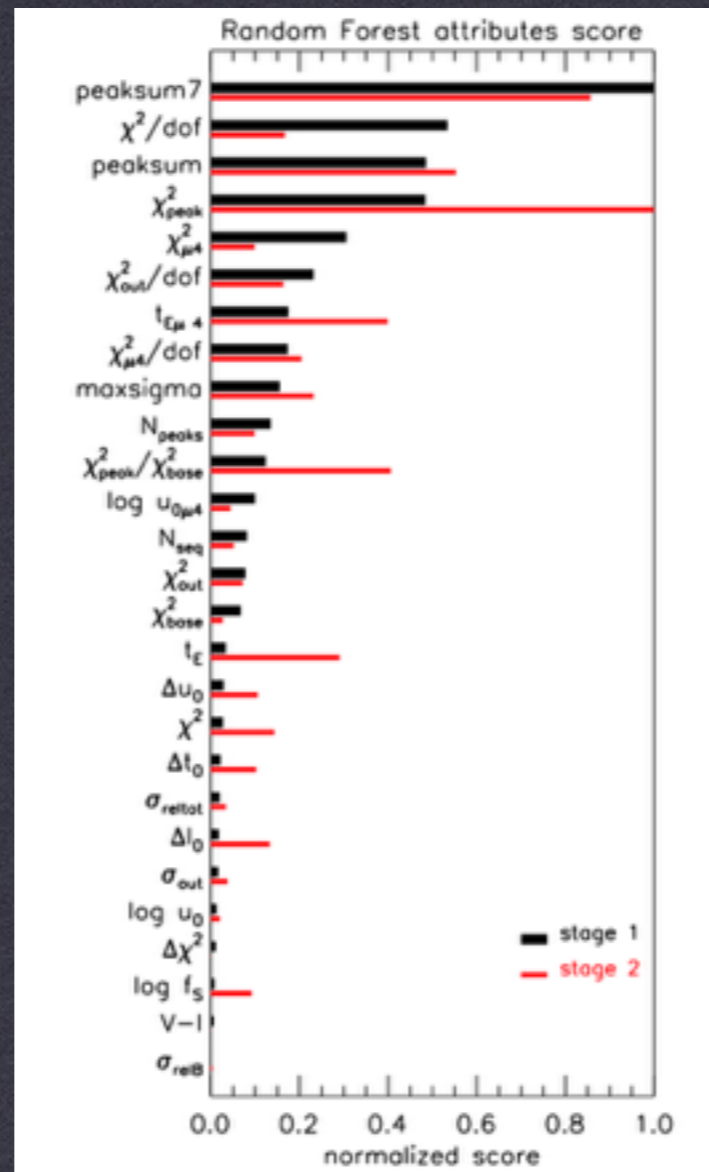
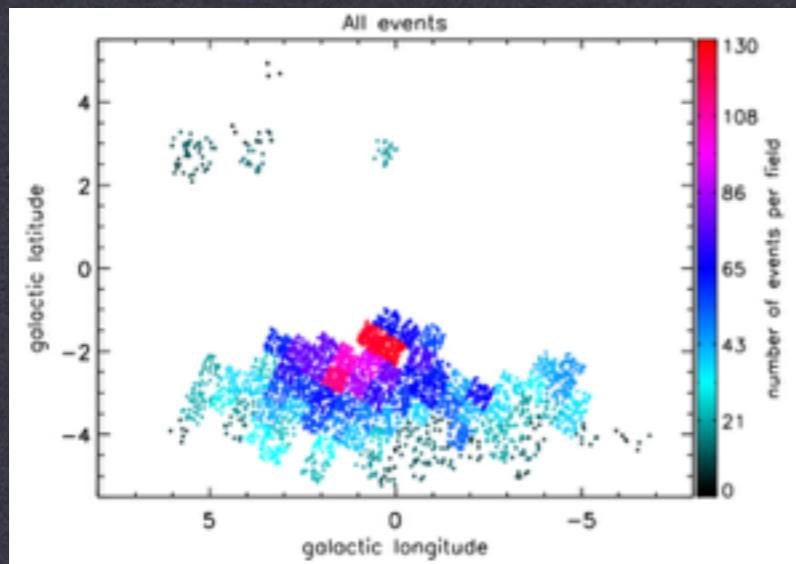


5 million objects per frame and ~ 1 star is brighter due to microlensing

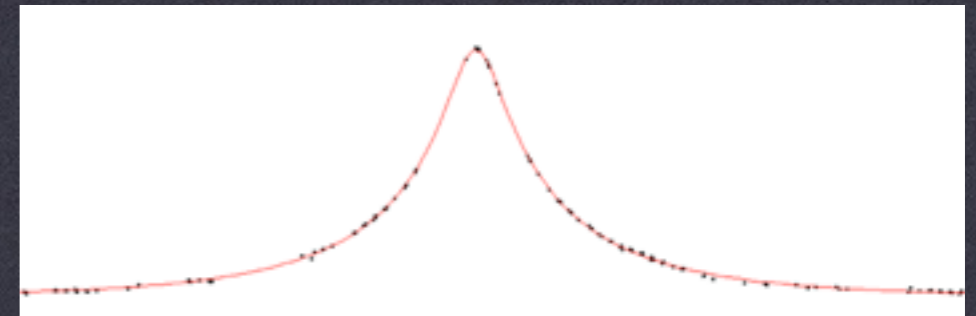
LIGHT CURVE - MICROLENSING

Supervised classification on 150 million light curves
Random Forest with 26 attributes

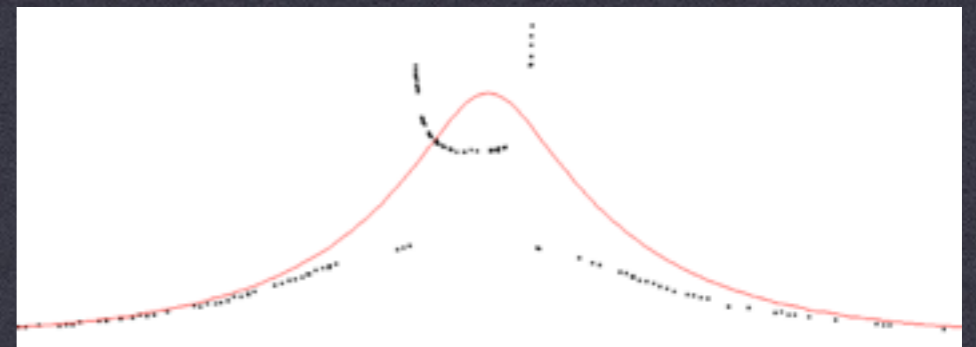
3500 standard events



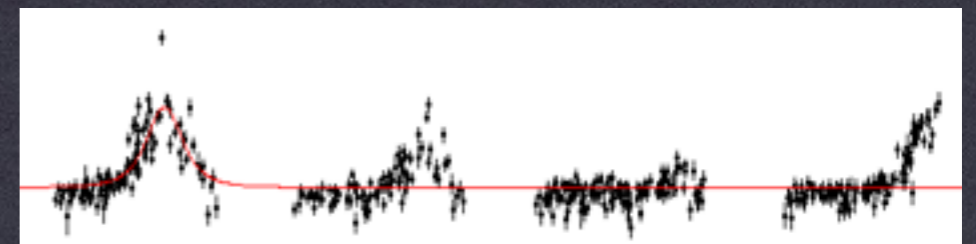
class ULENS



class EXOTIC



class OTHER

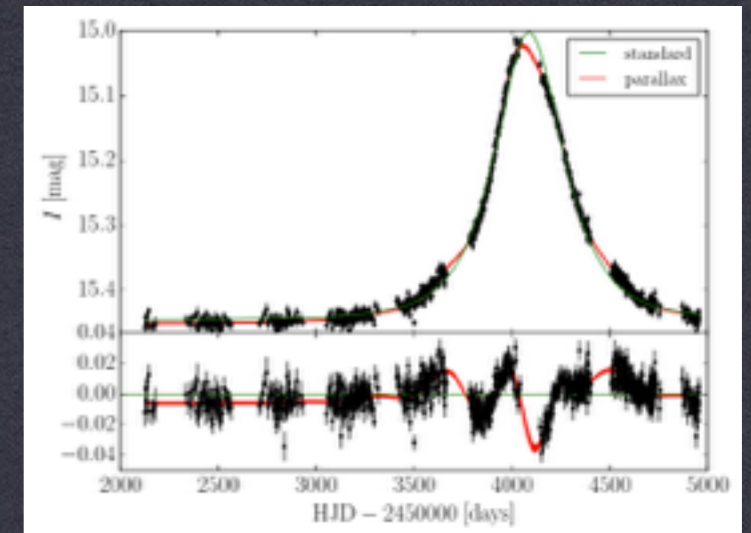
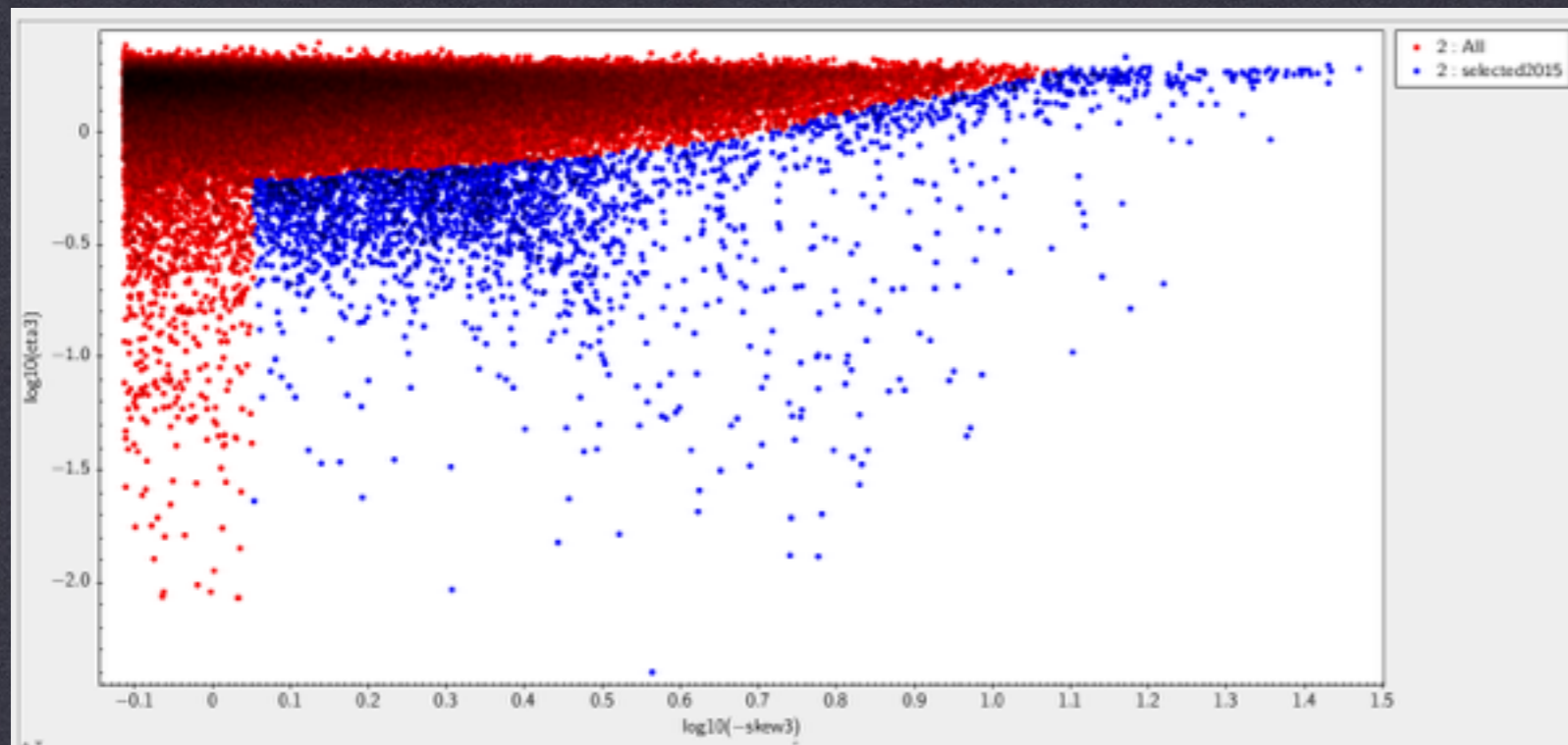


LIGHT CURVE - MICROLENSING

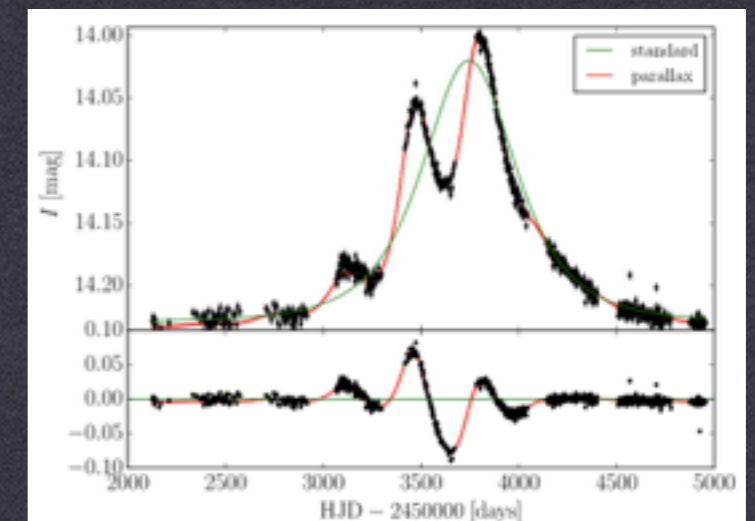
Hunt for black hole lenses - very long events

Pre-filtering for transients: **skewness-vonNeumann**

Random Forest to pick asymmetric light curves



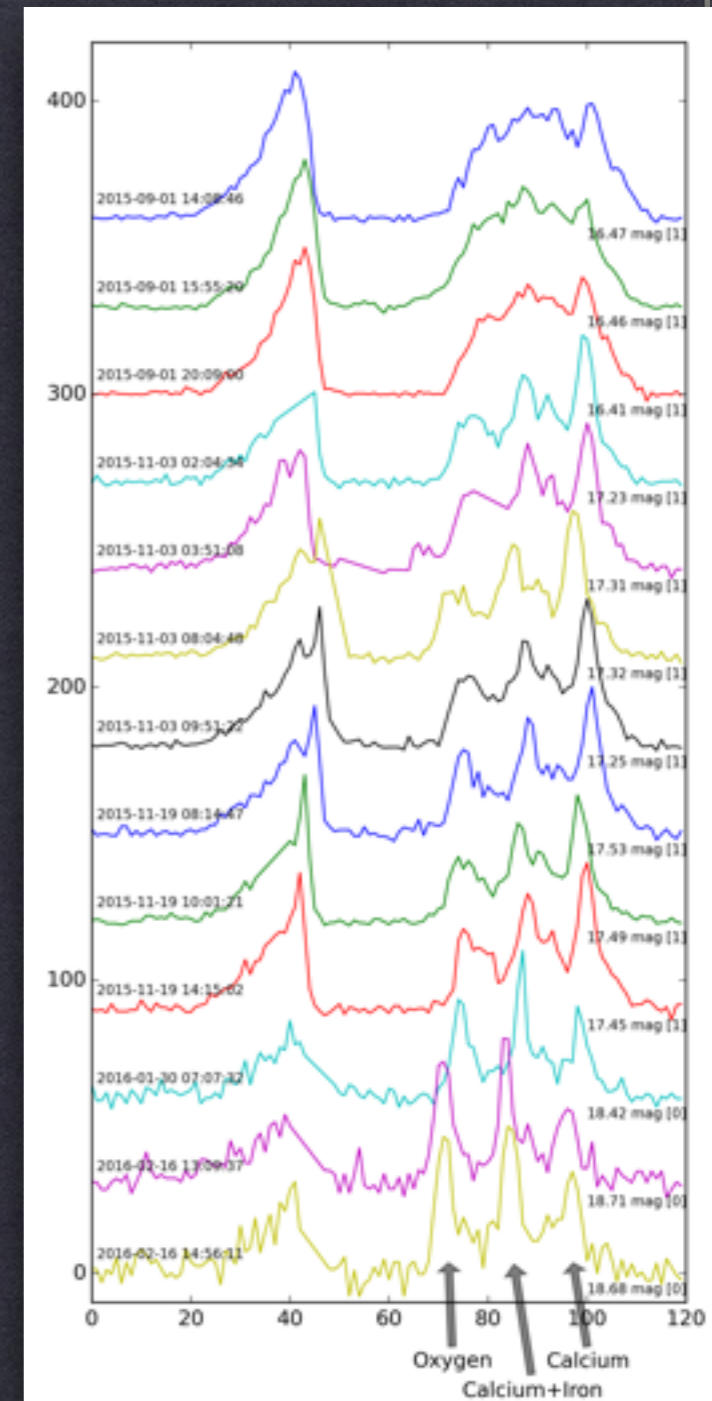
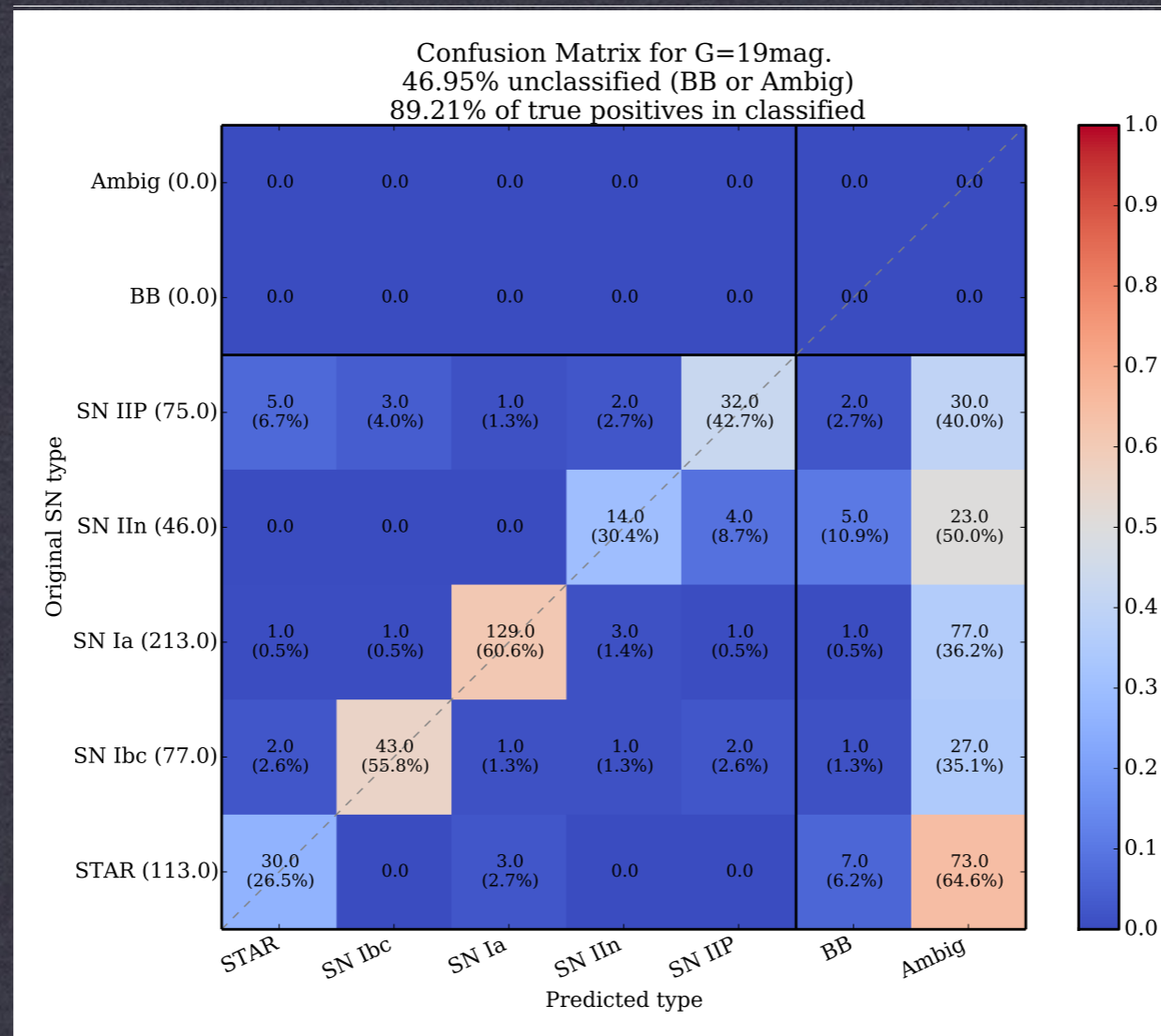
99.9% BH candidate
 $M=6.9 M_{\odot}$ $D=1.9$ kpc



nearby WD/NS/MS candidate
 $M \sim 1.3 M_{\odot}$ $D \sim 0.6$ kpc

SPECTRA (LOW RESOLUTION)

Gaia delivers low-res ($R < 100$) spectra for ALL OBSERVATIONS
 powerful to recognise SN Ia, SN II, CV, stars
 training on thousands of known transients spectra in high-res



Blagorodnova+2014

also SED machine, Blagorodnova+2017 in prep.

SUMMARY

- to exploit science with transients we **NEED** Machine Learning **NOW!**
- individual solutions and ideas exist:
 - pixel level
 - context level (archives)
 - light curve level
 - spectra level
- is there a need for a clever, self-adjusting, unified and ultimate classification tool for generic application for transients?