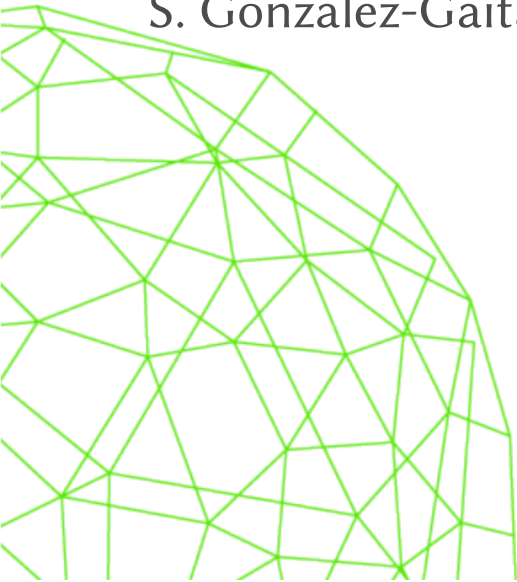





HITS: High cadence Transient Survey at CMM / MAS

F. Förster, J.C. Maureira, J. San Martín, M. Hamuy, P. Estévez, R.C. Smith, K. Vivas, P. Huijse, G. Cabrera, S. Flores, J. Littín, J. Anderson, F. Bufano, Ll. Galbany, Th. de Jaeger, S. González-Gaitán, G. Pignata, J. Martínez, G. Medina, R. Muñoz, E. Vera, C. Pérez



CMM
Center for
Mathematical
Modeling

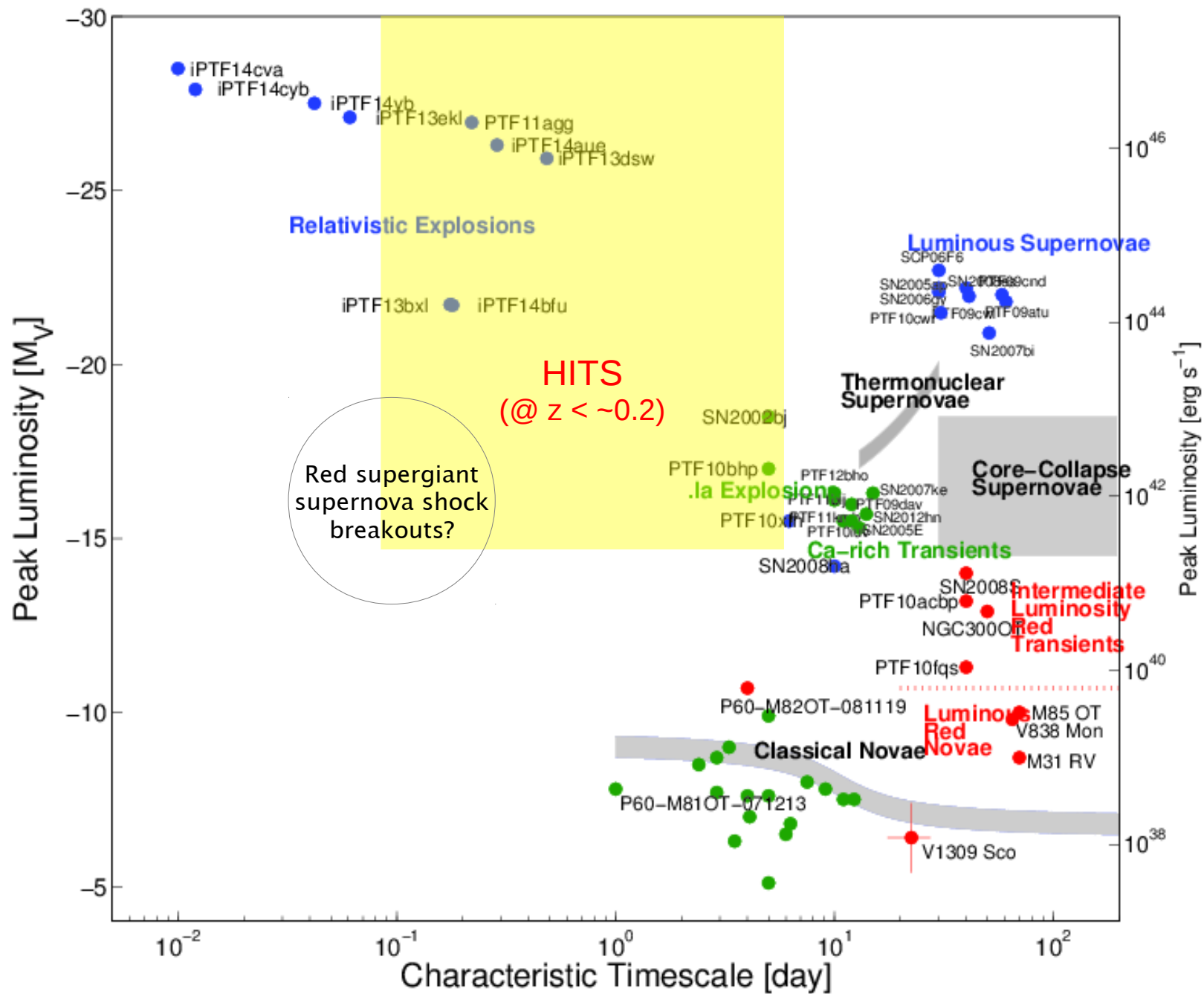
 **NLHPC**
National Laboratory
for High Performance
Computing
Chile


MILLENNIUM
INSTITUTE OF
ASTROPHYSICS

 **CONICYT**
Ministerio de
Educación

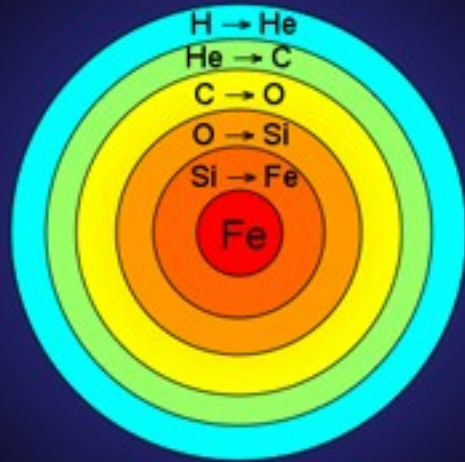
Gobierno de Chile

Optical transient sky



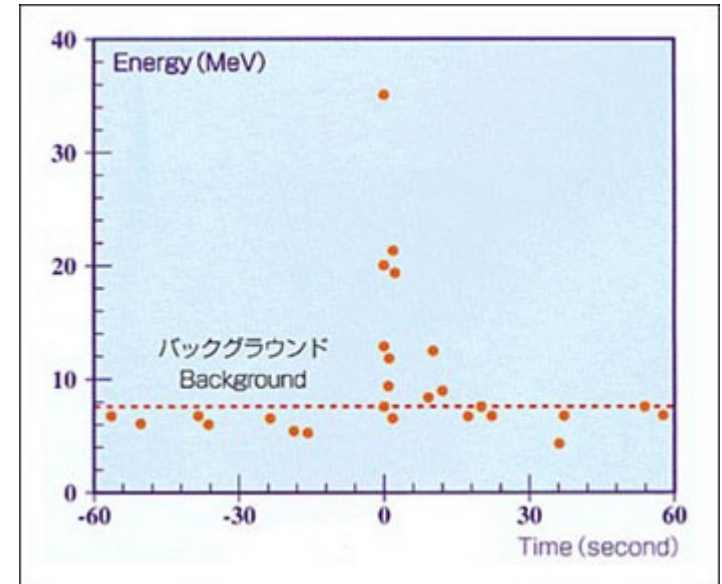
Credit: Mansi Kasliwal

Life and death of a massive star



For a 25 solar mass star:

Stage	Duration
H → He	7×10^6 years
He → C	7×10^5 years
C → O	600 years
O → Si	6 months
Si → Fe	1 day
Core Collapse	1/4 second



Formation of a neutron star and shock formation (~sec)

Shock emergence (~hrs)

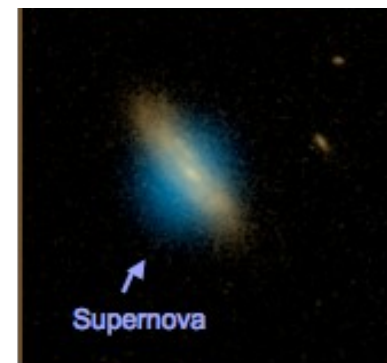
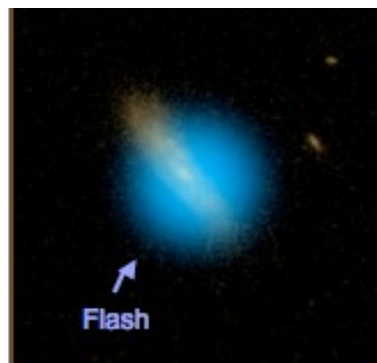
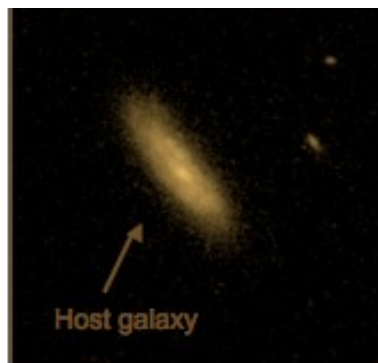
Star's free expansion (~day)

Fast expanding ($\sim 0.1 c$), glowing ejecta (~weeks, months)

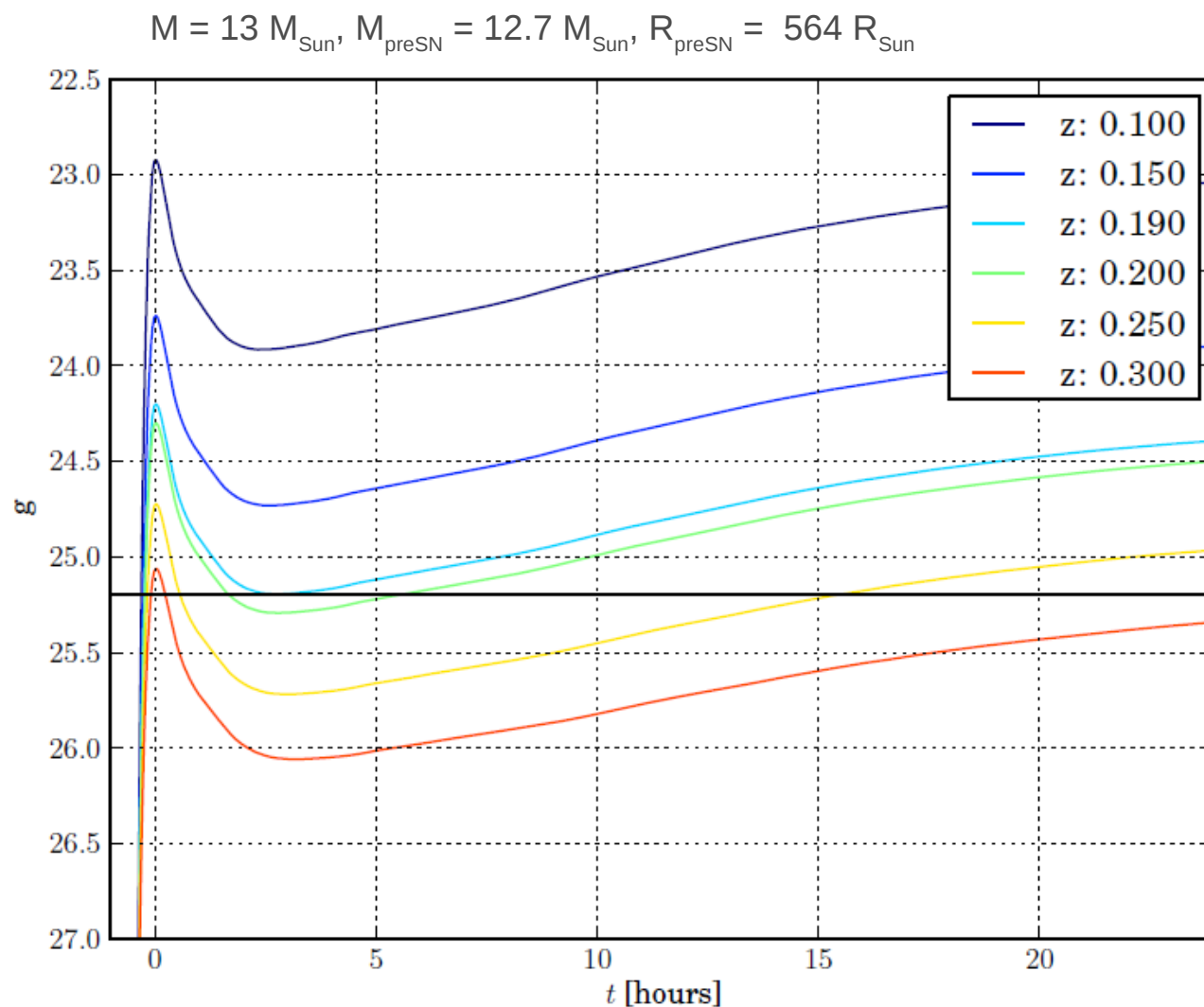
Remnant diffusion into the interstellar medium (kyr)

Supernova shock breakout

Main supernova light curve



Supernova shock breakouts with DECam



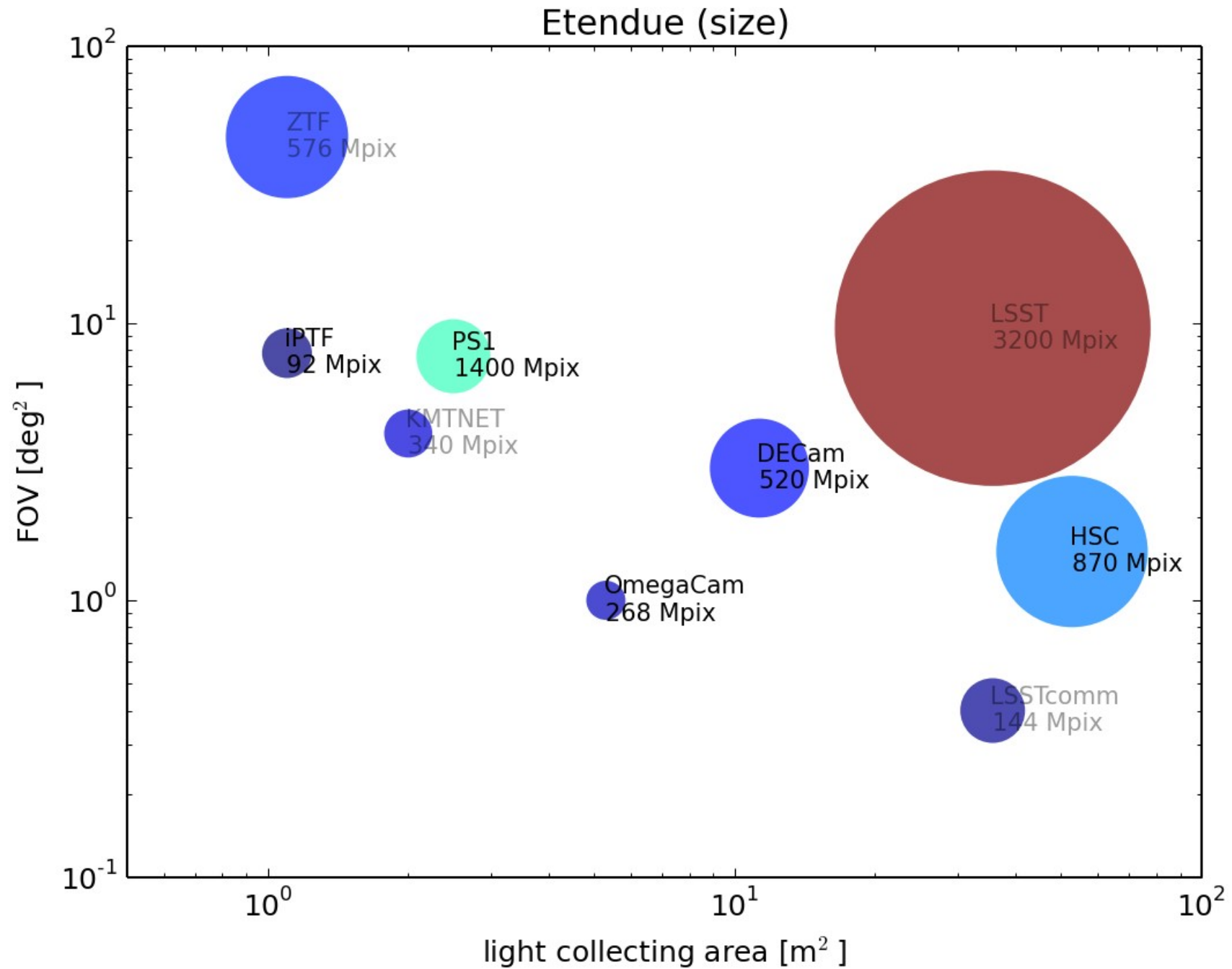
N. Tominaga



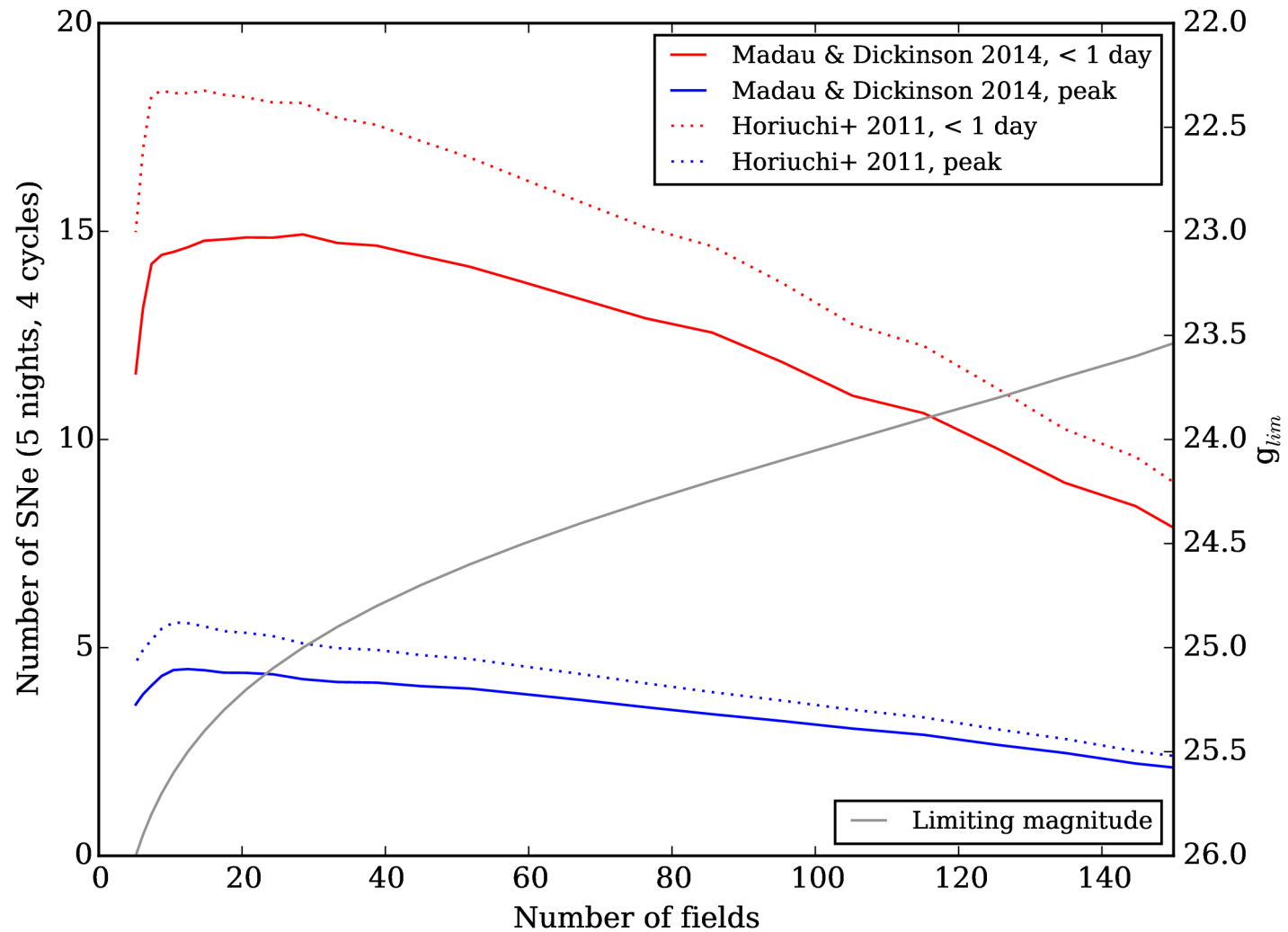
M. Hamuy



Etendue and number of pixels



Expected number of young supernovae (SNR ~ 8)



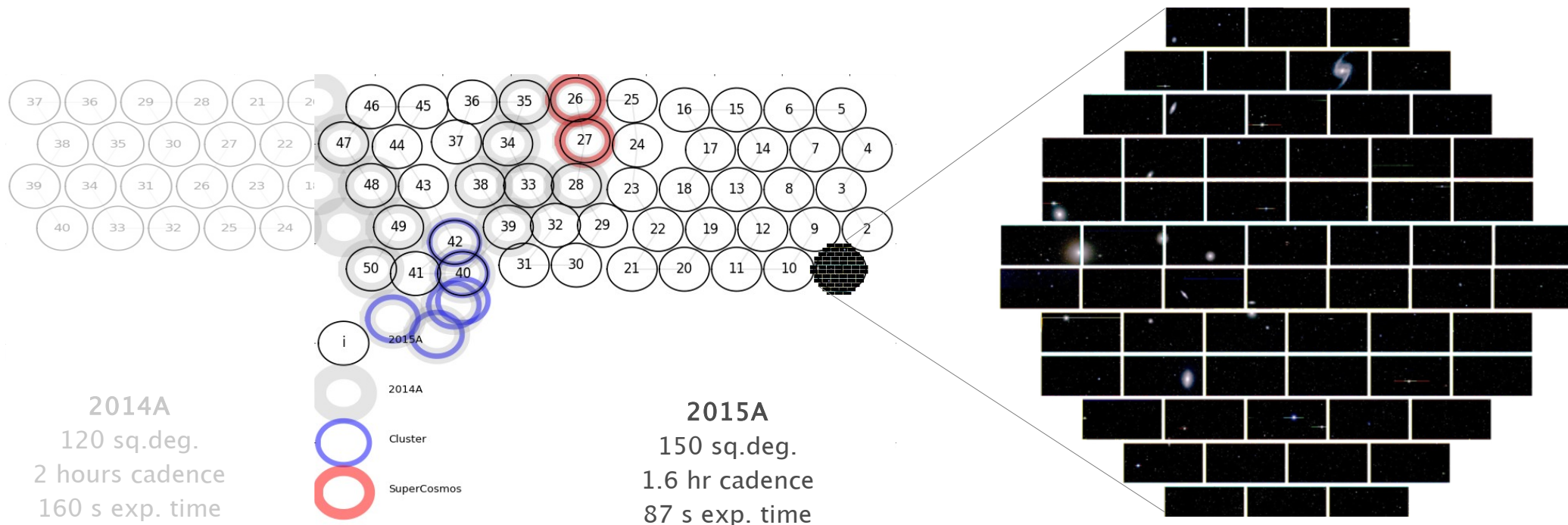
More difficult to follow up



Faster file transfer/pipeline required

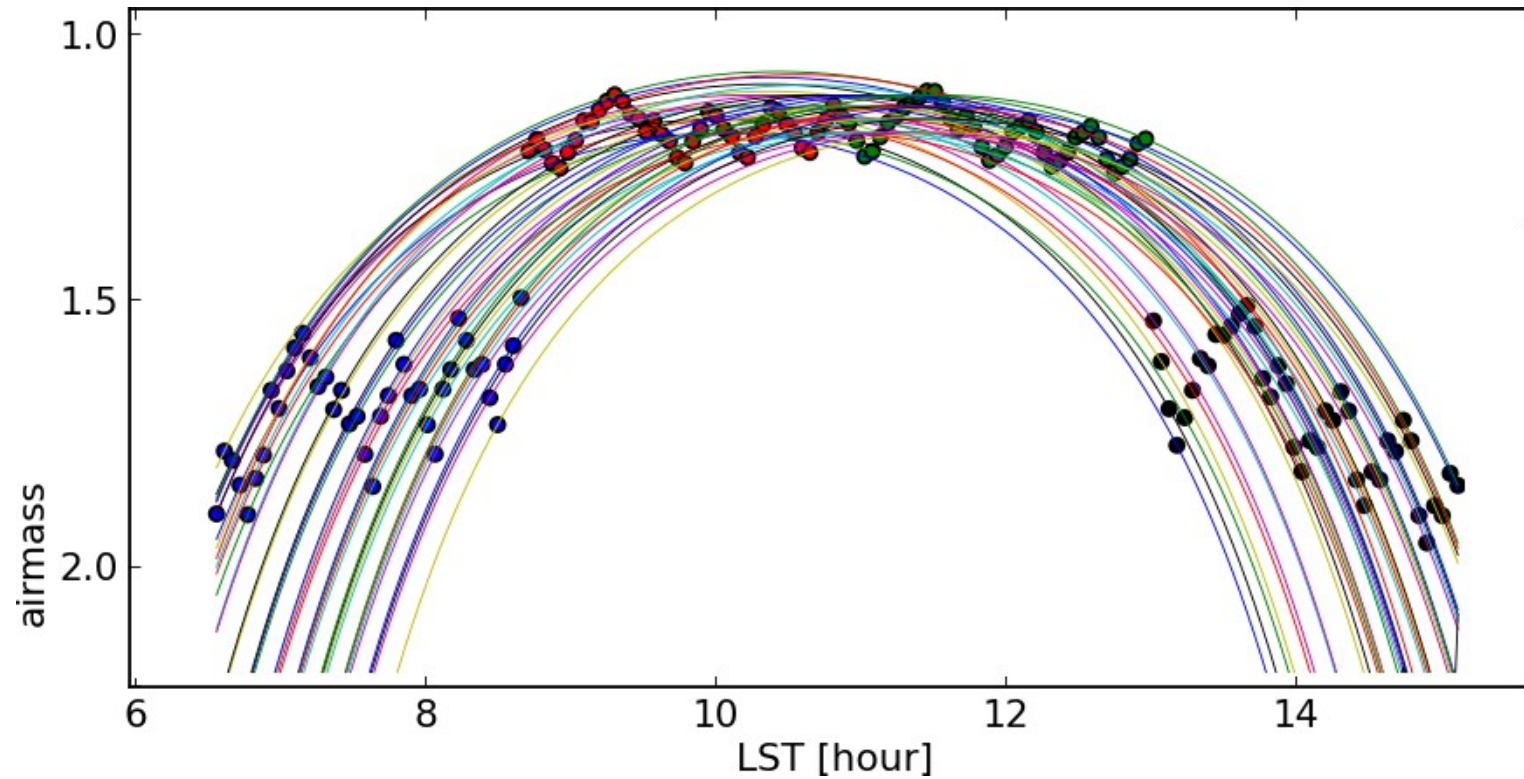


HITS challenges (2014A/2015A)



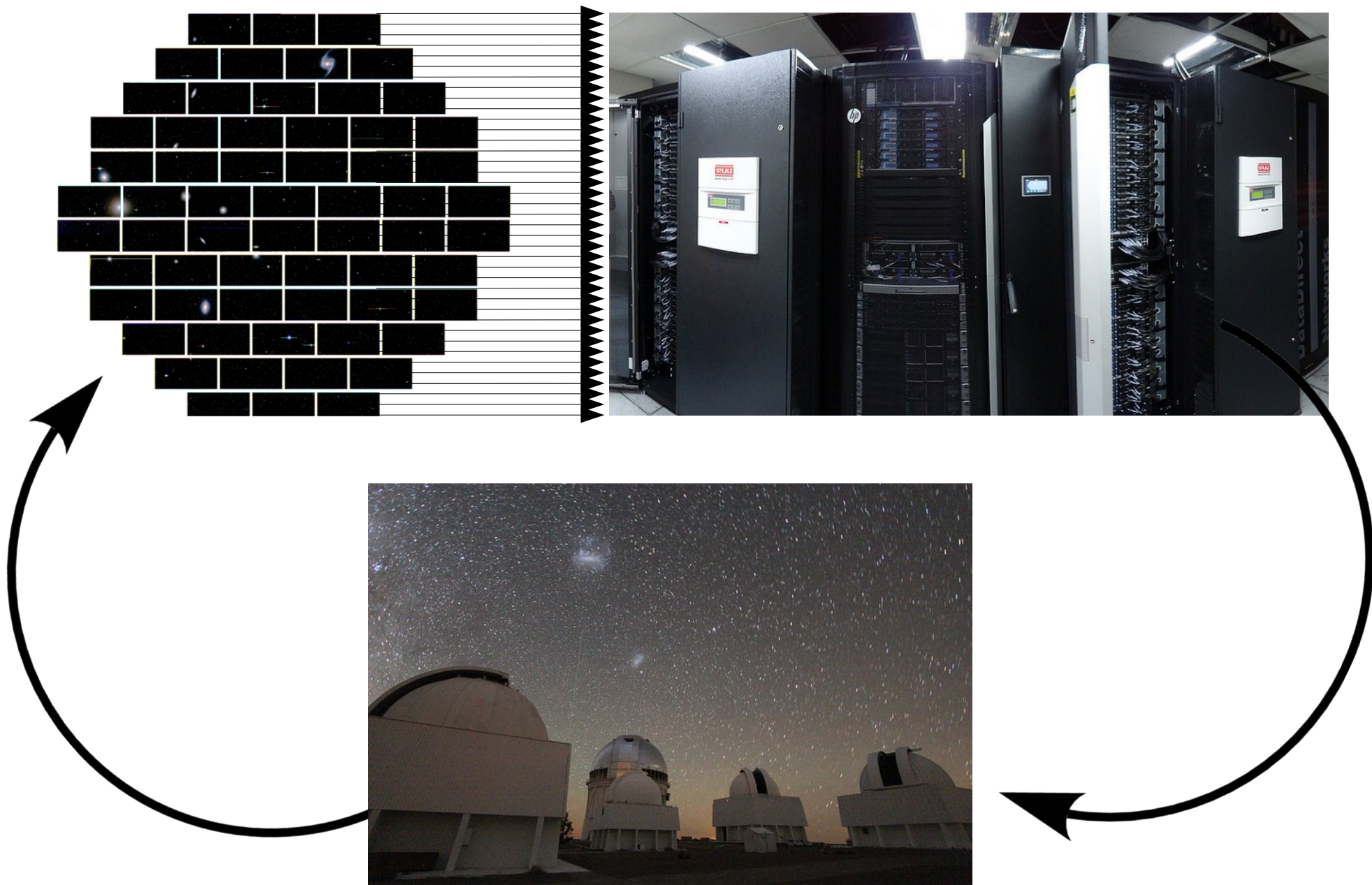
- Observe **40/50 DECam fields** every **2/1.6 hr** for **5/6 consecutive nights** (**Done**)
- CTIO → La Serena → CMM file transfer faster than one exposure time (**Done**)
- Run preprocessing pipeline in 60 CCDs in less than one exposure time (**Done**)
- Run image subtraction pipeline in 60 CCDs in less than one exposure time (**Done**)
- Filter false positives keeping efficiency high in real-time (**Done**)
- Trigger follow up observations in real time (**1 day/3.2 hr reaction possible**)

Observing strategy

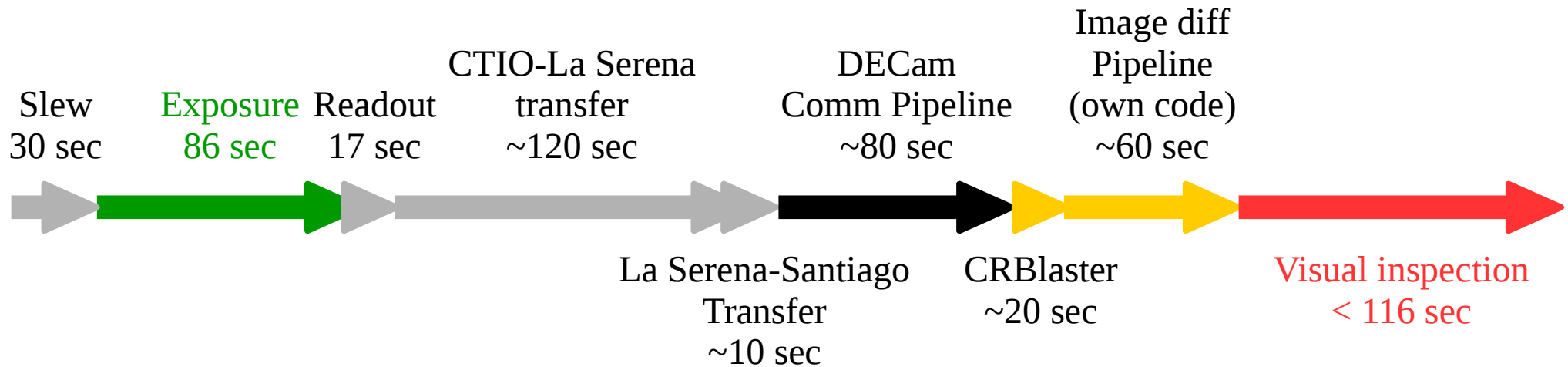


- RA chosen to guarantee full night visibility
- DEC chosen to minimize combined atmospheric + galactic extinction
- $2 \times 40 \times 5 = 400$ **triplets** with a cadence of 2 hours
- $3 \times 50 \times 6(4) = 900(600)$ **triplets** with a cadence of 1.6 hours

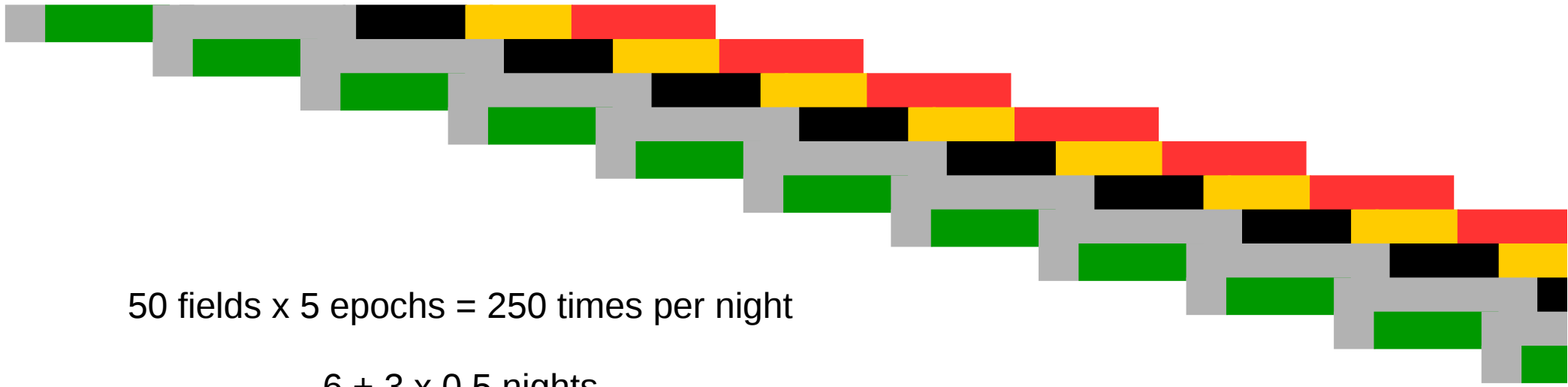
Real time processing



Pipeline flow outline



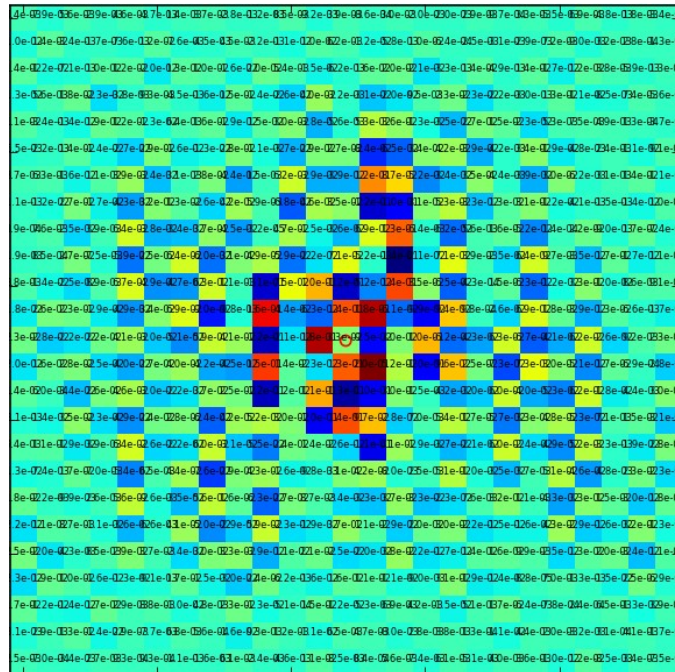
~5-6 min lag



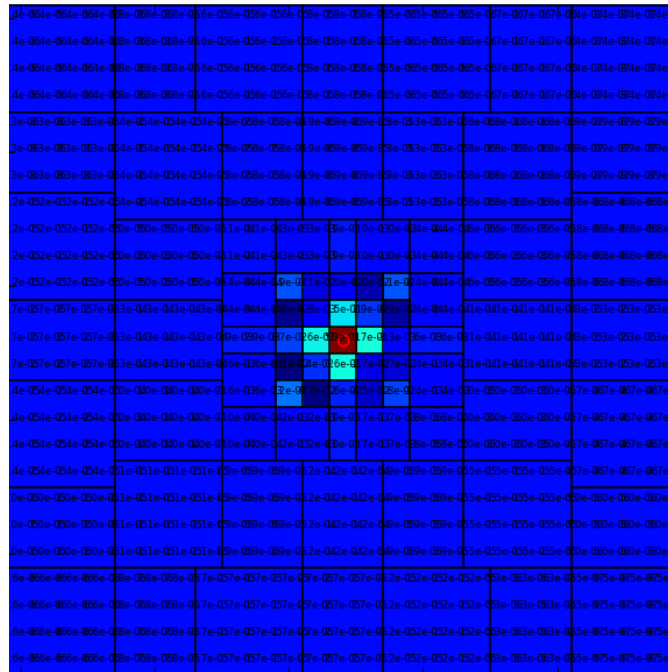
6 + 3 x 0.5 nights



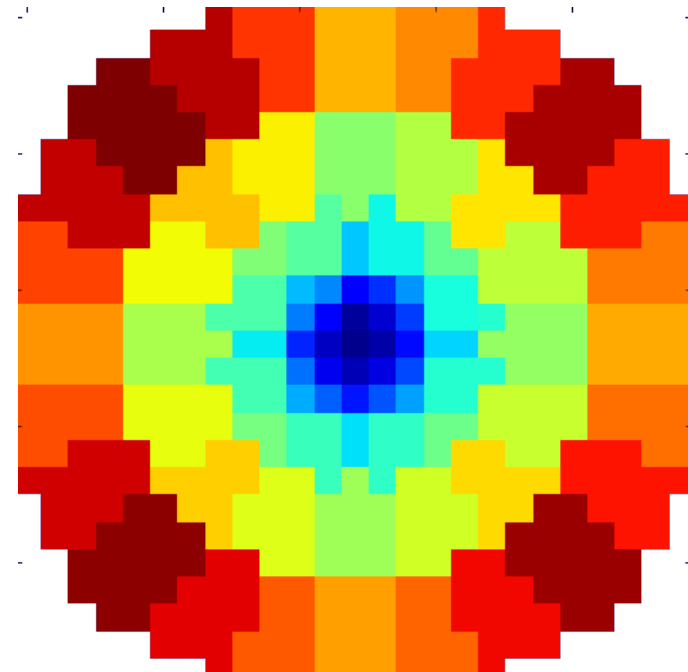
PSF matching: convolution kernel



Fixed size kernel pixels:
over-fitting produces
oscillations between pixels



Variable size kernel pixels:
no oscillations → fewer artifacts

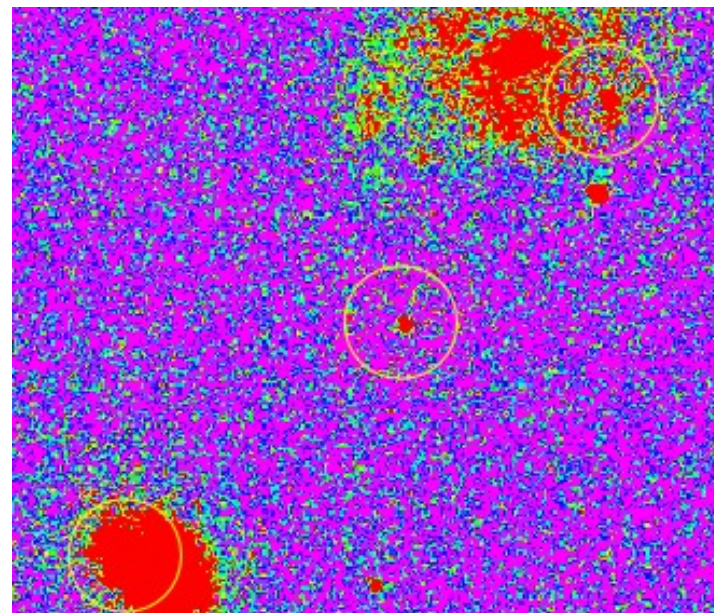
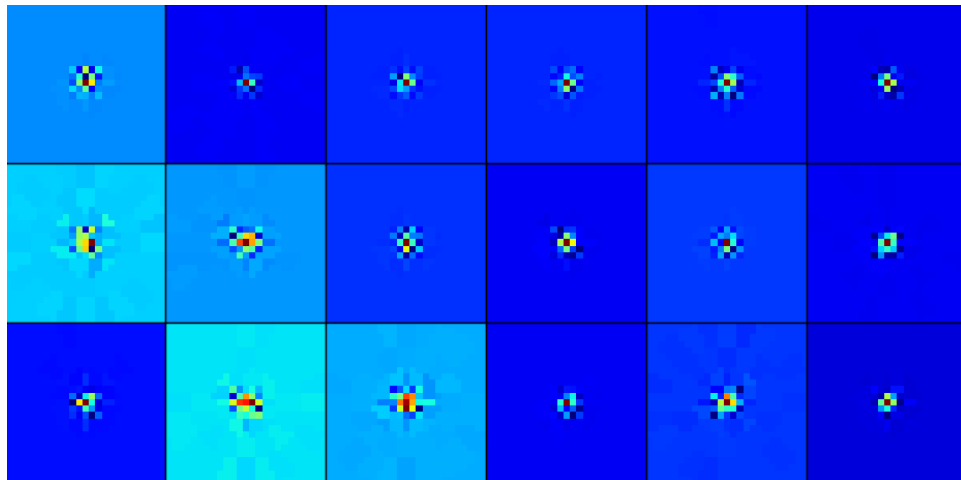


Final kernel model
25 x 25 pixels,
81 free parameters,
circular shape

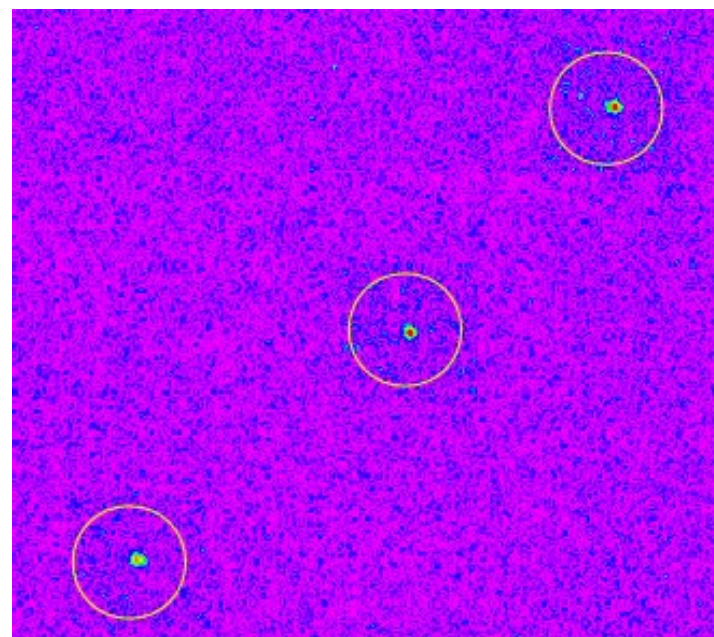
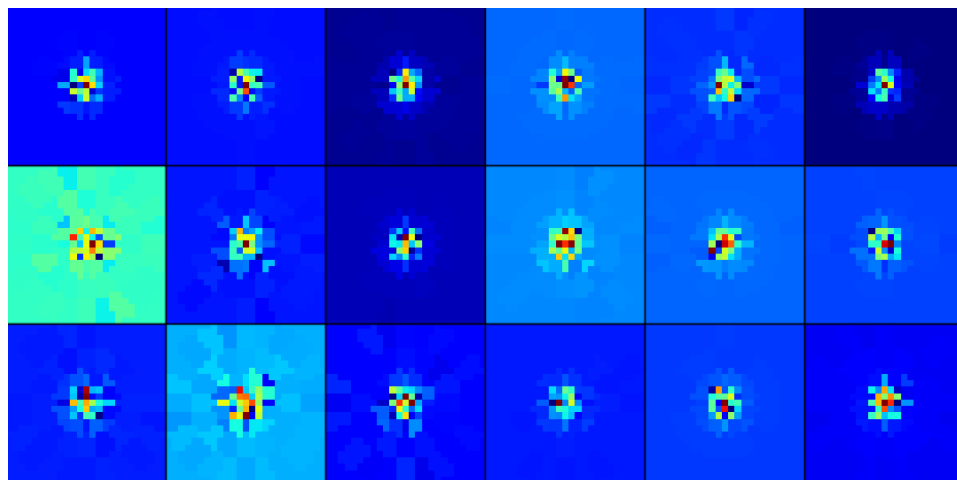
(Fortran 95 + OpenMP + F2PY)

PSF matching: convolution kernel

$\text{FWHM} \sim \text{FWHM}_{\text{ref}}$



$\text{FWHM} \sim 2 \times \text{FWHM}_{\text{ref}}$



Optimal photometry

We perform optimal photometry (Naylor 1998) centered in **every pixel** of the difference images (Fortran 95 + OpenMP + F2PY)

The diagram illustrates the equations for optimal photometry, with red arrows pointing from descriptive text to specific terms in the formulas. The terms $V_{k,l}$, $V_{i,j}$, and $V_{i,j}$ are circled in red, and a red arrow points from the text 'Variance at given pixel' to the circled $V_{i,j}$ in the denominator of the weight equation.

Pixel counts

Sky counts at given pixel

Flux

$$F = \sum_{i,j} W_{i,j} (D_{i,j} - S_{i,j})$$

Empirical PSF at given pixel

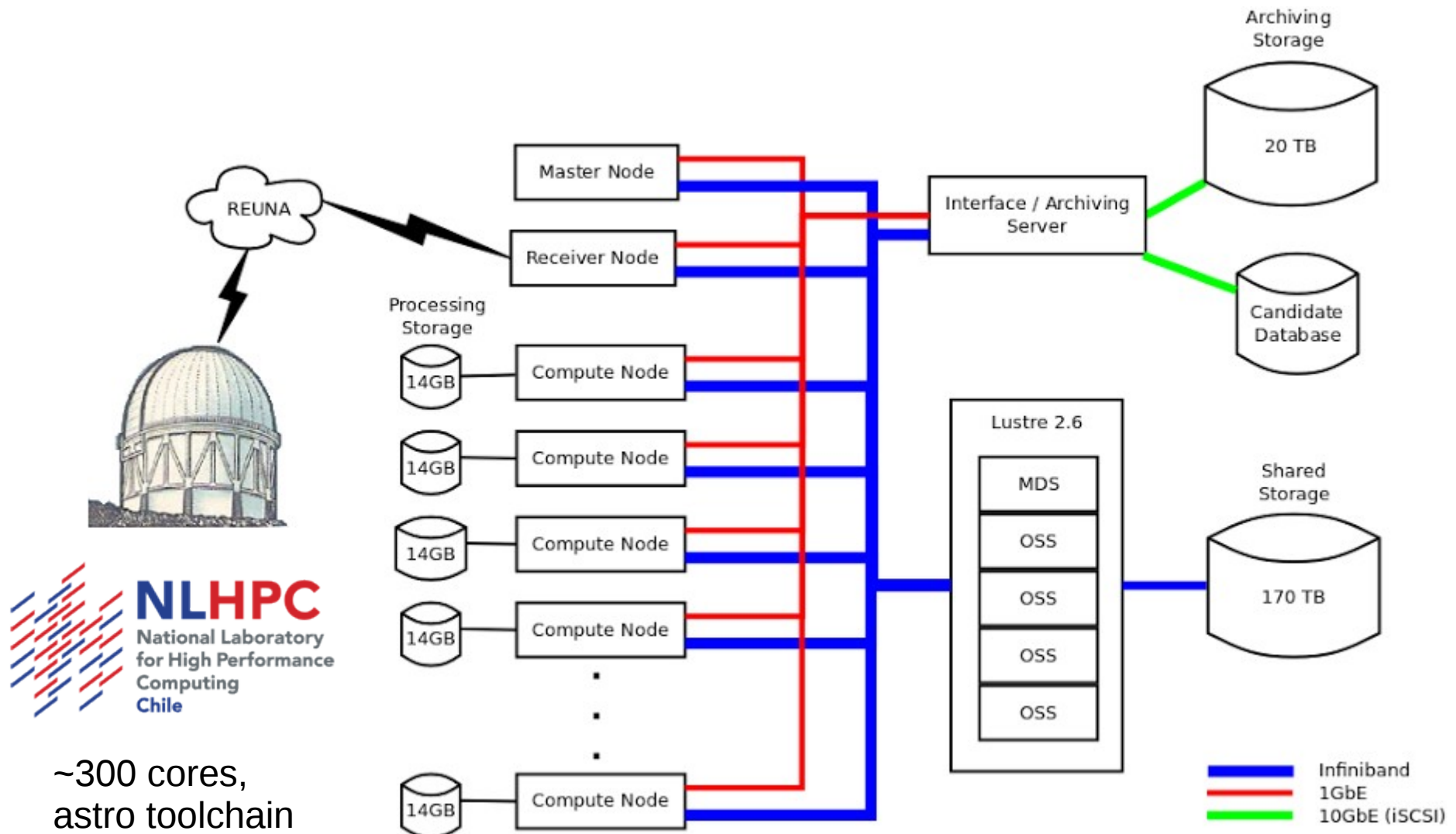
$$W_{k,l} = \frac{P_{k,l}^E / V_{k,l}}{\sum_{i,j} (P_{i,j}^E)^2 / V_{i,j}}$$

Variance at given pixel

Flux variance

$$\text{Var}(F) = \sum_{i,j} W_{i,j}^2 V_{i,j}$$

High performance computing - storage



Most important bottle necks:

2014: slow to fast storage file transfer

2015: CTIO → La Serena transfer

Candidate selection

1. SNR of integrated flux > 5

- + **not too close to flagged pixels**
- + **difference between pre and post CRBlaster in reference** smaller than a threshold
- + **candidate density** around the candidate smaller than a threshold

2. Classified as real based on selected features with **probability > 0.5**

- + **repeated at least once** in the same location
- + **positive difference** with respect to the reference.

Feature engineering



Feature engineering

Intuitively define features based on visual inspection of many candidates. Visualize features in many dimensions and fine tune them to give a better visual separation.



Test random forest (RF) classif. with real data, look at many false positives and identify their possible cause (e.g. cosmic rays in the reference, bad convolution, bad alignments).

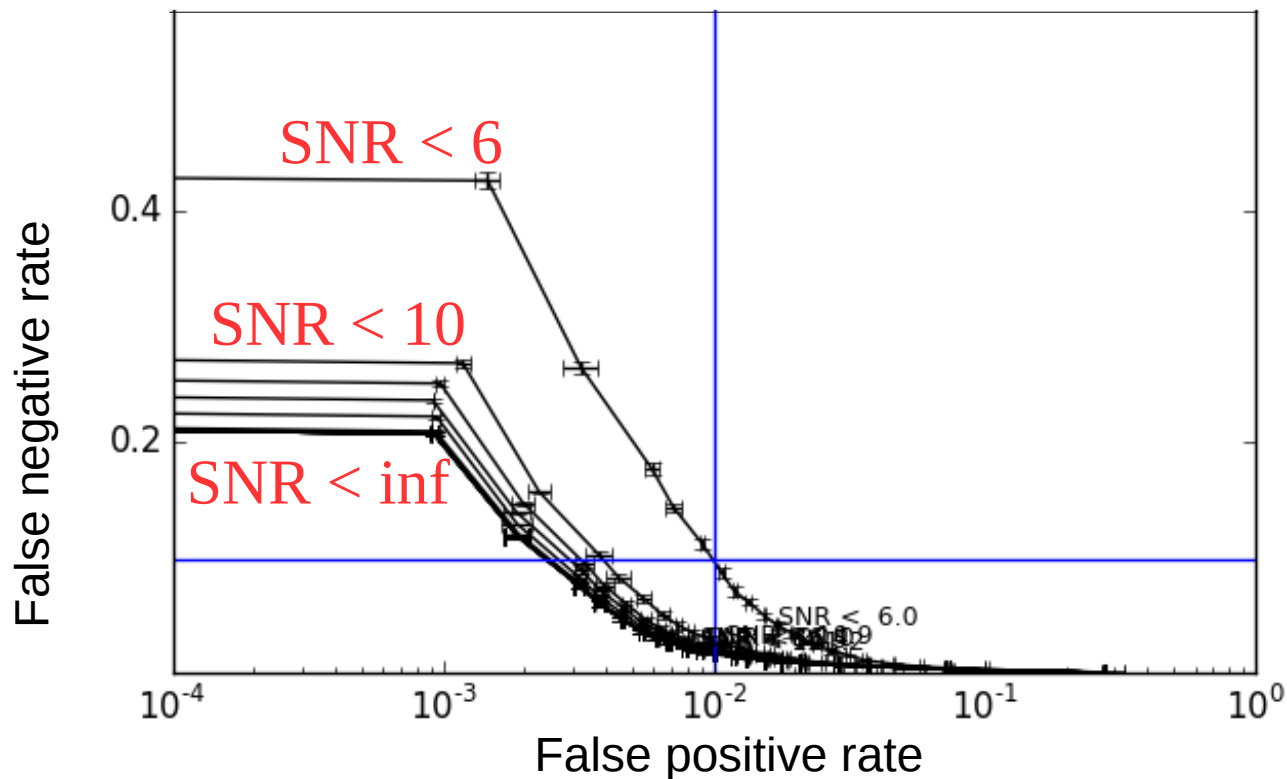
Intuitively define features that try to quantify the previous cases. Study ROC curves and the most repeated features in the RF. Check that known true cases are recovered.

Use mutual information criteria to rank features, find complementary feature groups and discard those features that are not informative on the labels.

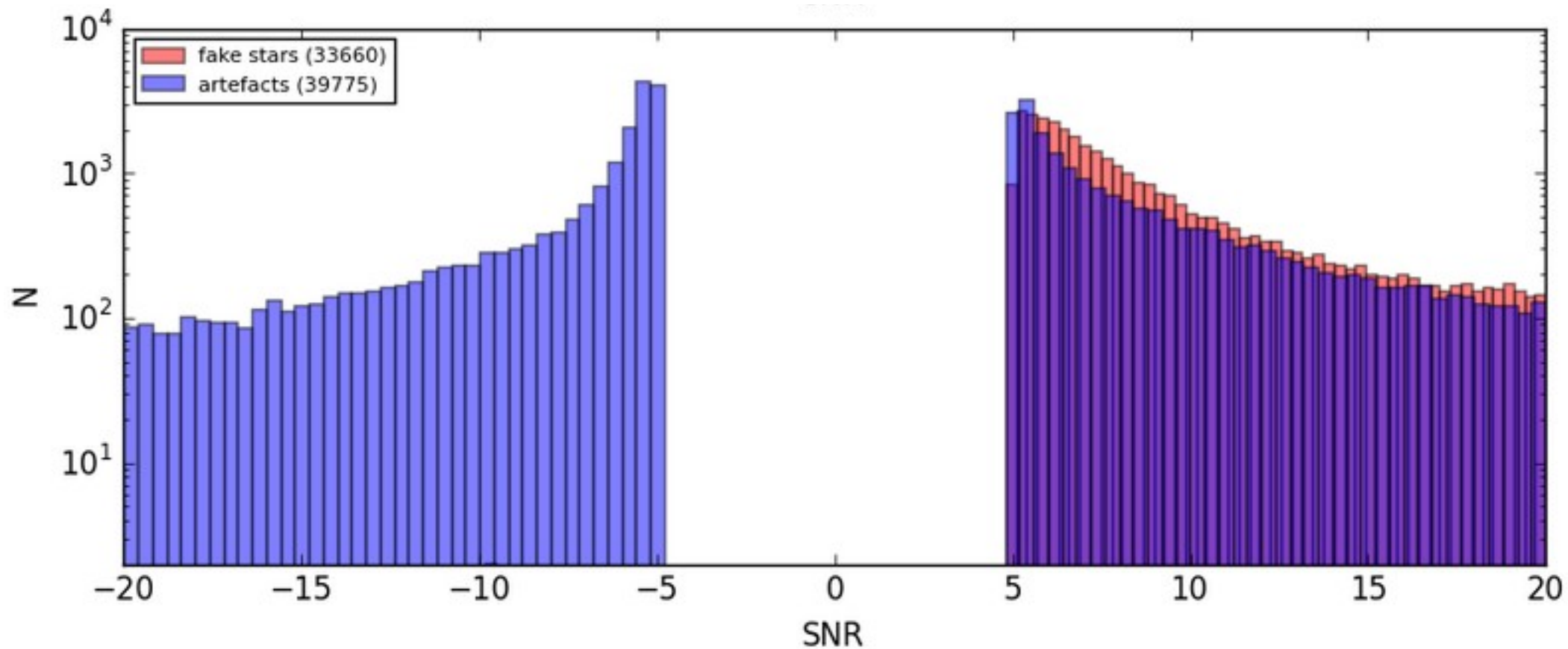
Random forest efficiency and purity

ROC curves depend strongly on the test candidate SNR.

Different SNR distributions in the training and test samples can change the ROC curve significantly



Training sample



We insert observed stars into predefined positions, scaled down to force a given SNR distribution resembling the artefact SNR distribution.

Families of features

Use dimensionless features, based on:

- difference image
- SNR image of the difference
- unsubtracted image stamps
- density of candidates
- convolution kernel properties

Most important features in RF (colors as above)

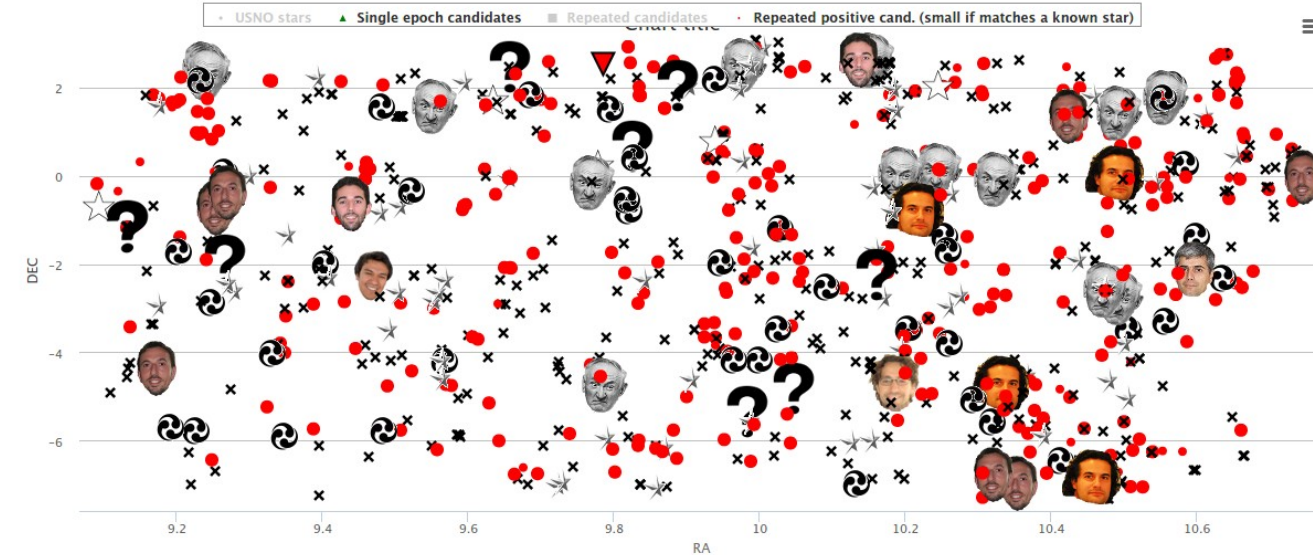
'crosscorr' 'crosscorr8' 'dCCPCA0' 'dhu2_2' 'ncand' 'offset' 'dhu3_2' 'fluxSNR' 'dhu4_2' 'dhu1_2'
'minimax' 'dhu0_2' 'SW' 'dhu1_4' 'crosscorr5' 'pixSNR' 'dhu0_4gt' 'entropy' 'bump' 'ratiomax1'
'dhu0_4' 'PCA0' 'crosscorr3' 'symmidx' 'dhu5_2' 'dhu6_2' 'std' 'diffcoeff' 'R2' 'CRmax'

... 'ratiomax2' 'dhu3_4' 'dhu1_4gt' 'nmax1' 'nmax2' 'ksupport' 'PCA3' 'dhu7_4' 'maximmin' 'kratio'
'dhu7_4gt' 'PCA2' 'PCA5' 'PCA1' 'PCA4' 'PCA6' 'dhu7_2' 'dhu4_4' 'dhu2_4' 'dhu3_4gt' 'dhu6_4'
'dhu5_4' 'dhu2_4gt' 'dhu4_4gt' 'dhu5_4gt' 'dhu6_4gt'

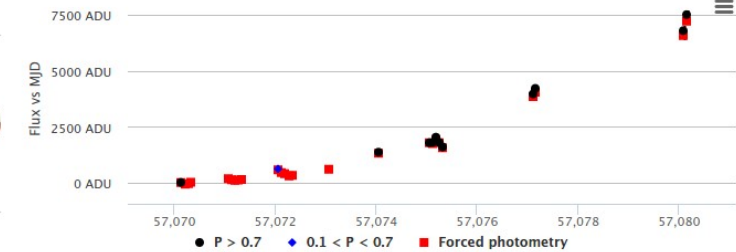
Interactive web

Semester: **Blind15A** Field: **all** CCD: **all** Reference epoch: **02** Threshold: **0.85** [getData!!!](#)

Observer : FF - [Logout](#)



Field: Blind15A_25, CCD: S14, RA: 9:47:5.68, DEC: 2:31:49.86 (avg. pixels: 1111, 1660), probpair: 0.98, diffs: 17-02t>19-02t>20-02t>21-02t>22-02t>23-02t>25-02t>26t-02>28-02t>29-02t



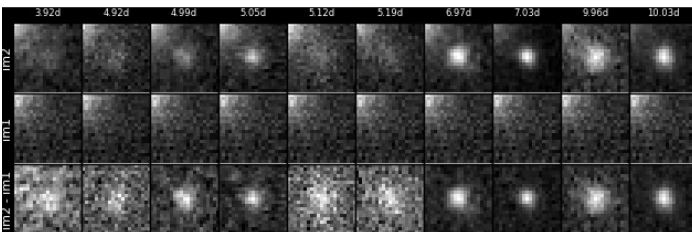
Bad Calibr.
Conv. Problem
Asteroid
SN Good Cand.
VS Good Cand.

Cosmic Ray
Bad Pixels
WTF
SN Possible Cand.
VS Possible Cand.

powered by Highcharts.

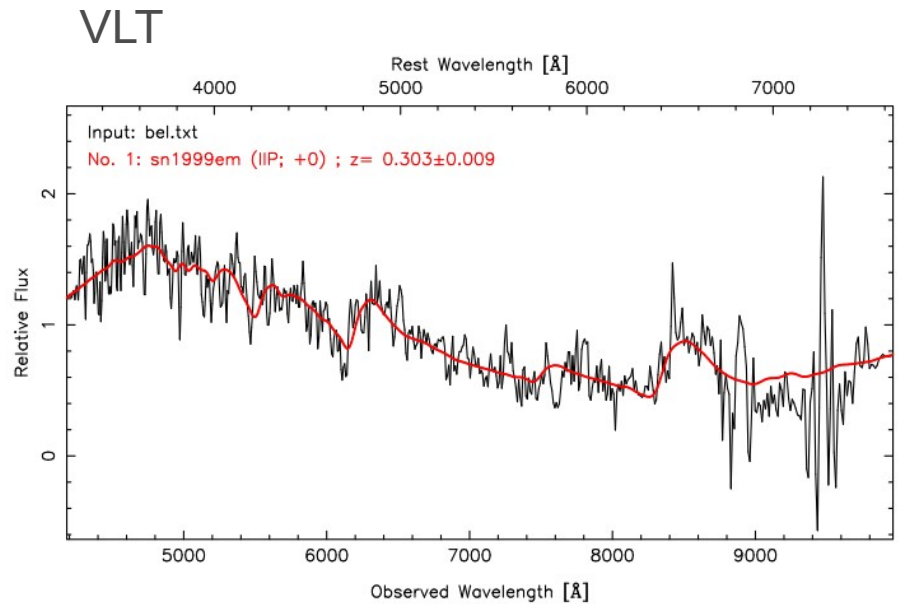
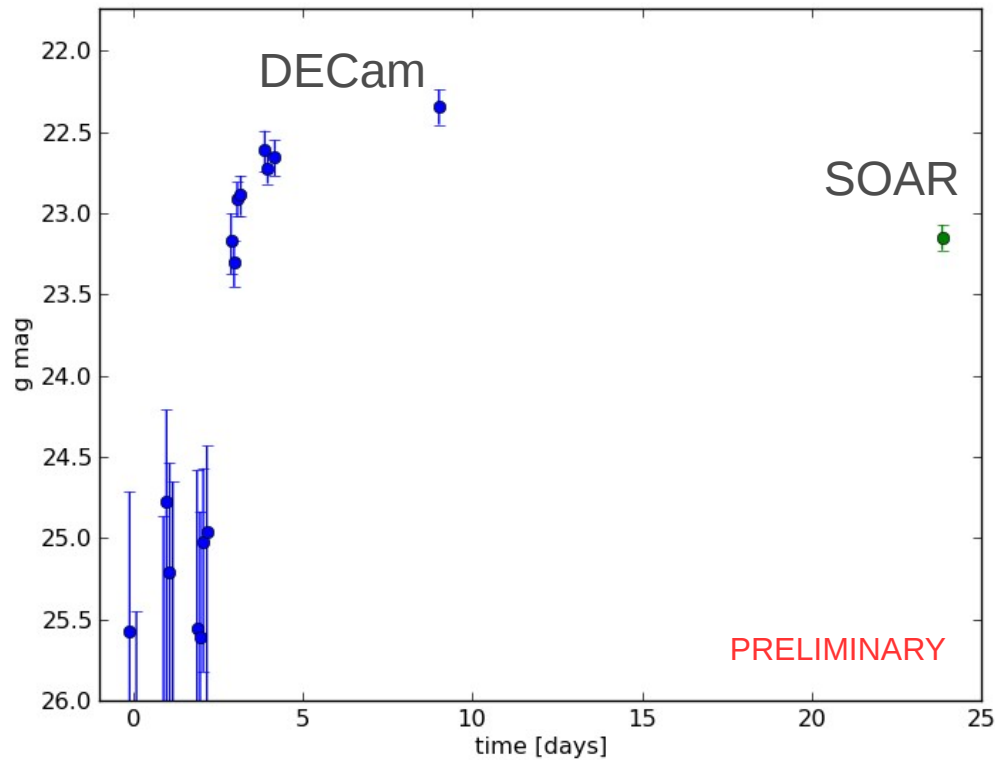
Send

Field: Blind15A_25, CCD: S14, RA: 9:47:5.68, DEC: 2:31:49.86 (pixels: 1111, 1660).. Diffs: 17-02t>19-02t>20-02t>21-02t>22-02t>23-02t>25-02t>26t-02>28-02t>29-02t. Key :146.774:2.531, [Light curve, animation and finding chart](#)

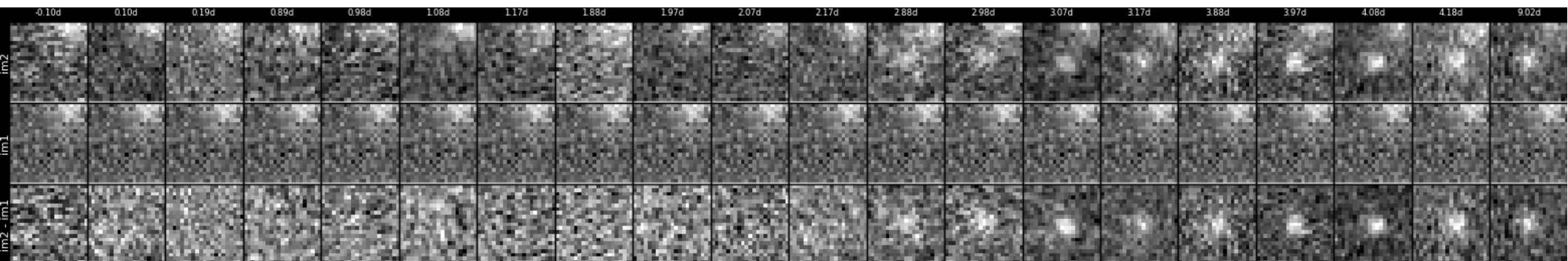


[Juan Carlos Maureira] Possible Shock Break out!
[FF] SN candidate Teahine

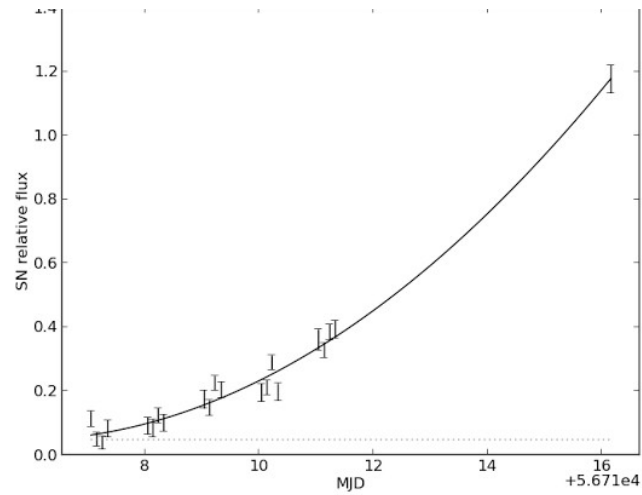
Revisit/follow up strategy



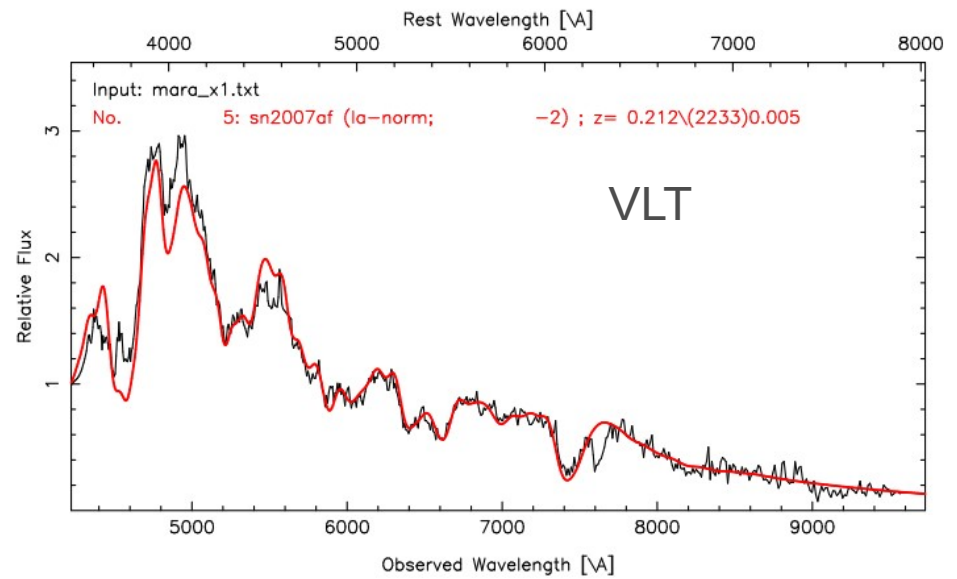
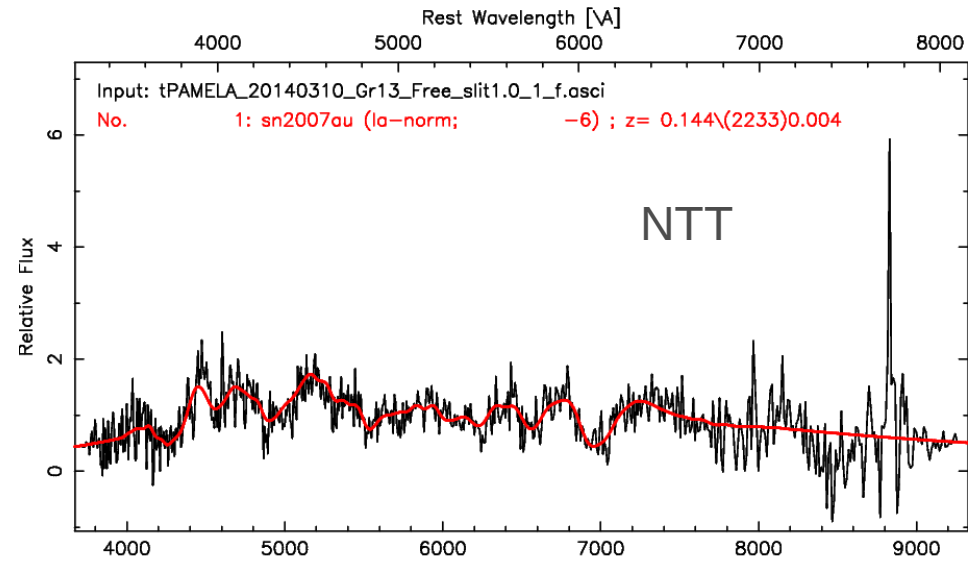
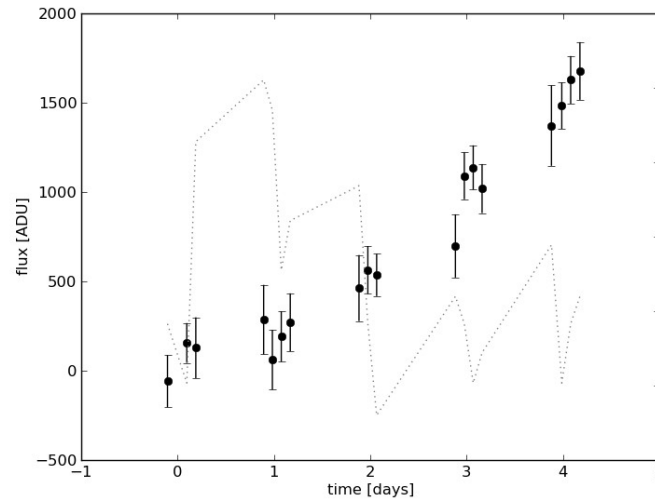
Cannot reconcile high luminosity + fast evolution + low expansion velocities (CSM interaction?)

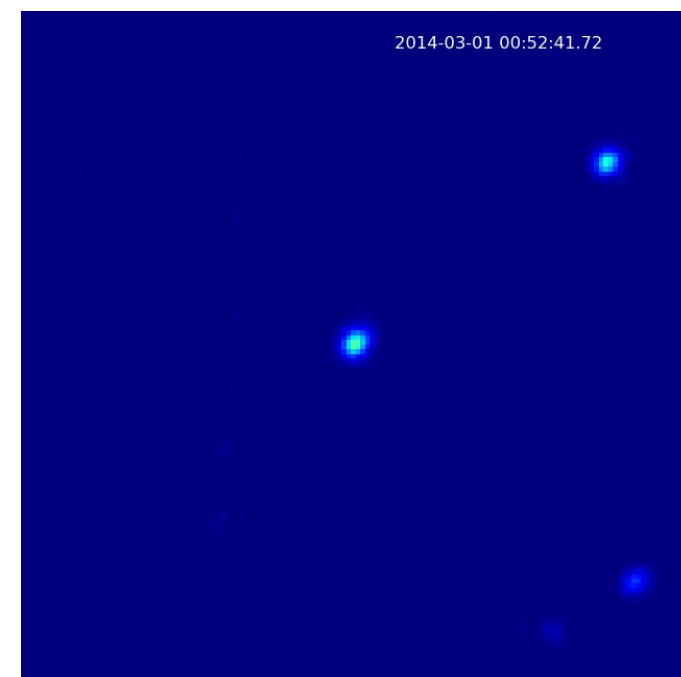
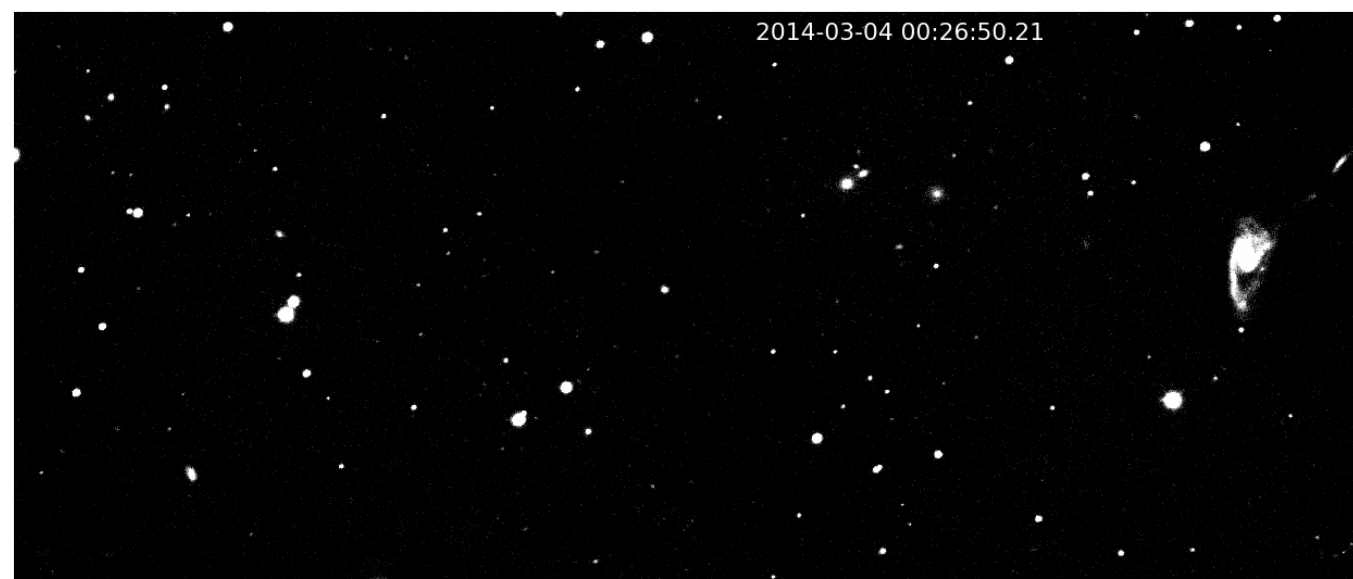
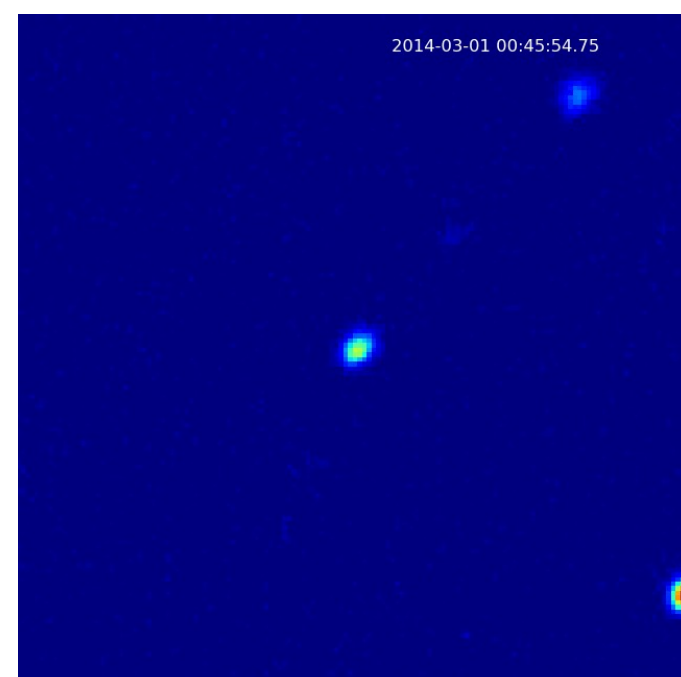
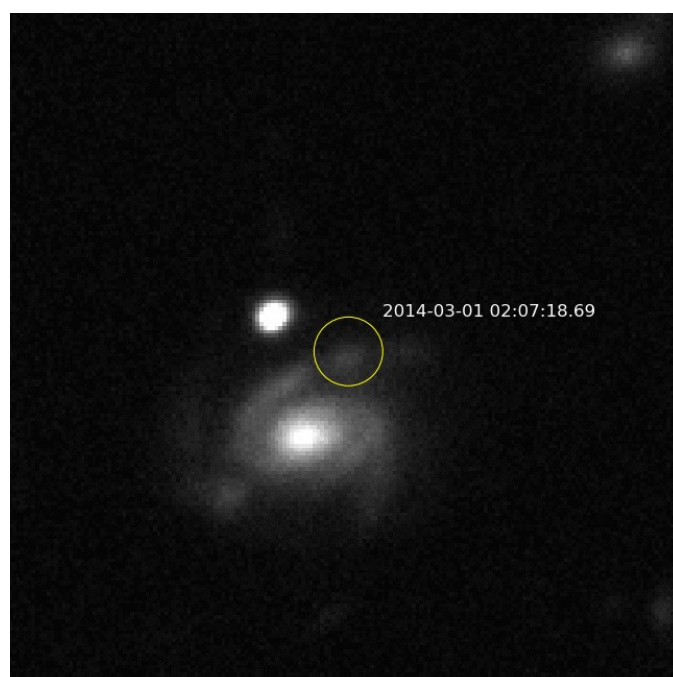
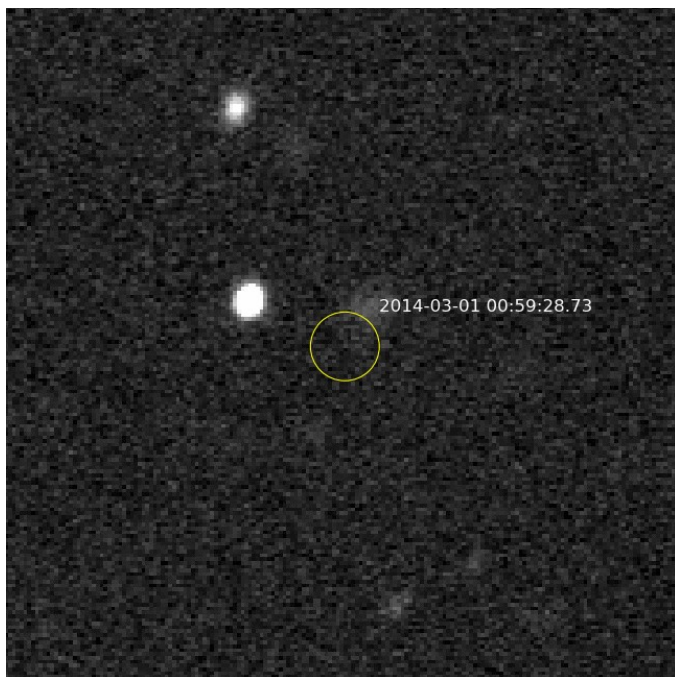


Follow up strategy

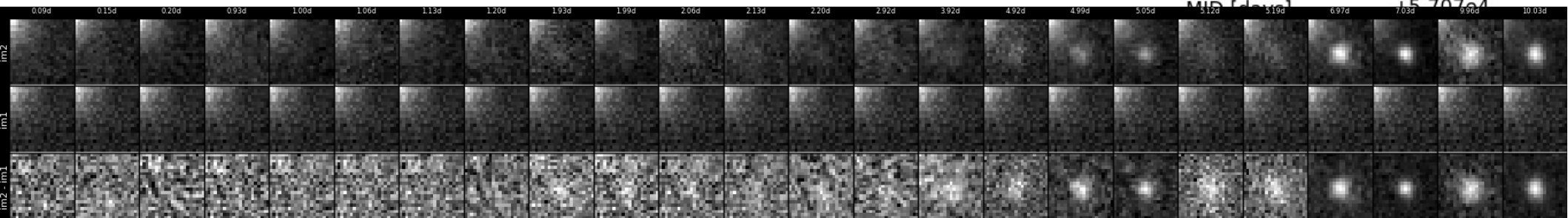
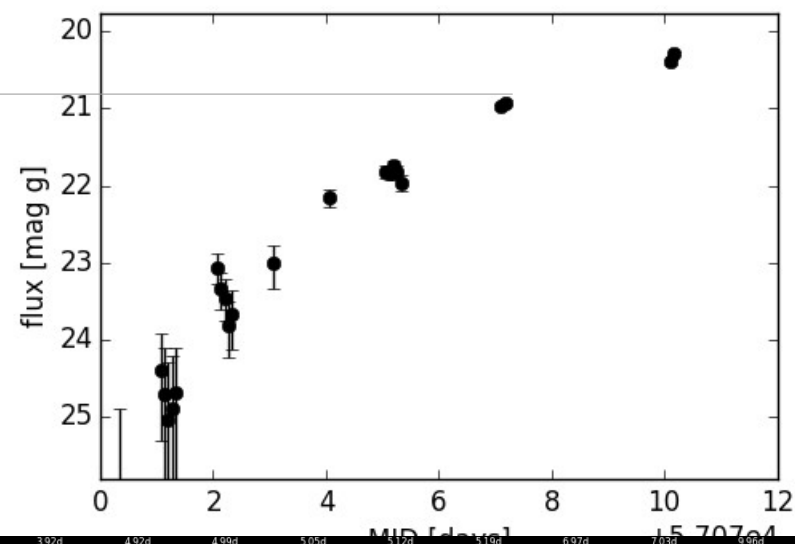
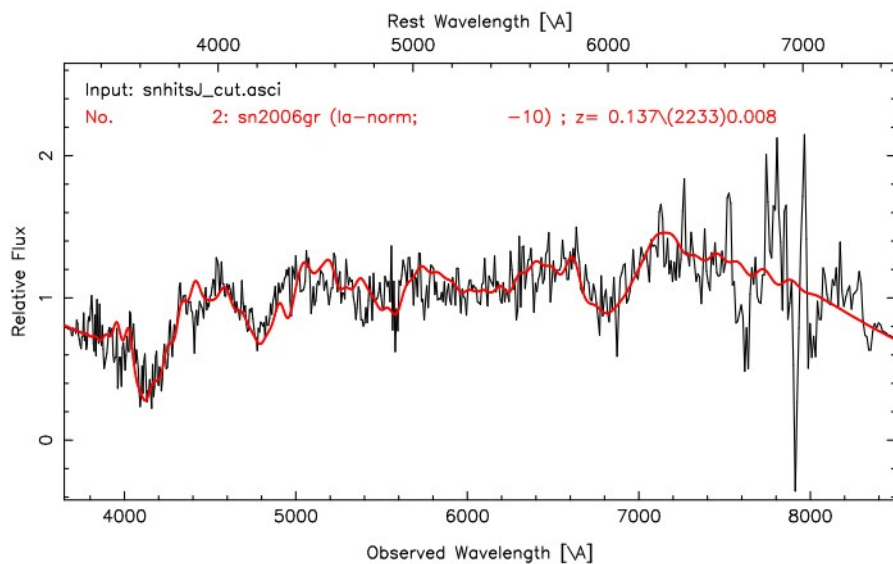
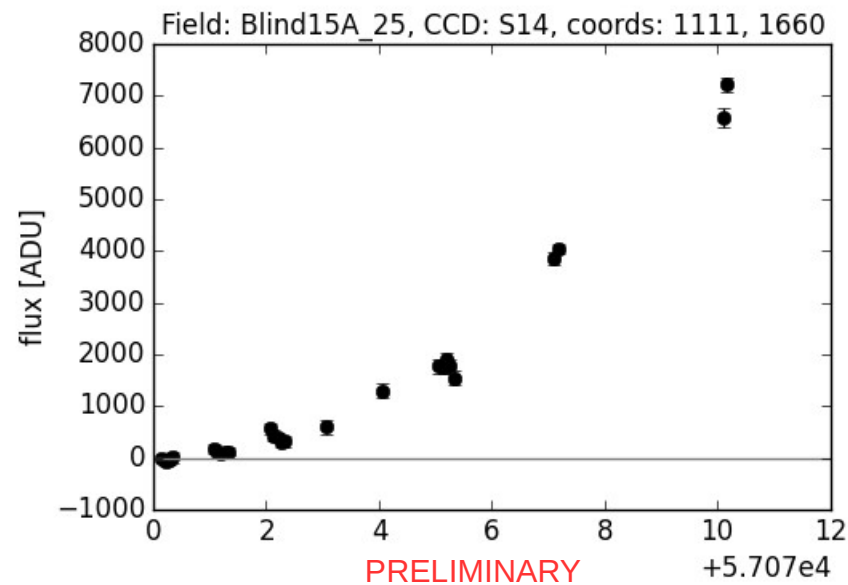
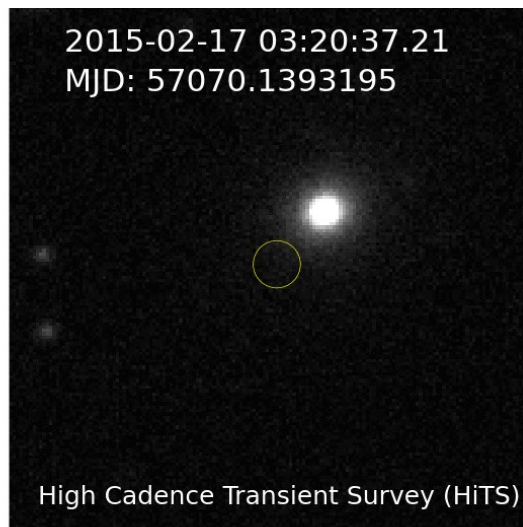
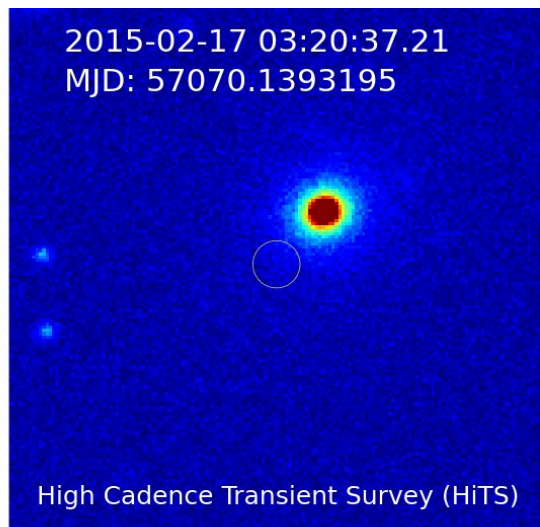


PRELIMINARY





ATELs 5949, 5956



ATELs 7099, 7108, 7115, 7122, 7131, 7146, 7148, 7149

Summary

DECam offers a unique opportunity to study the transient sky today!

First real time DECam data reduction achieved (~0.4 Tpix processed in real-time in 2014, ~1 Tpix processed in 2015, ~1.5 TB raw data, ~40 TB processed data).

SN candidates made **public** the same night of discovery.

Rapid reaction possible (<1 day reaction after explosion in 2014, <3.2 hours possible in 2015)

12 young SN candidates discovered in 2014A (**32** young SN candidates after reanalysis with new classifier), **61** young SN candidates in 2015A.

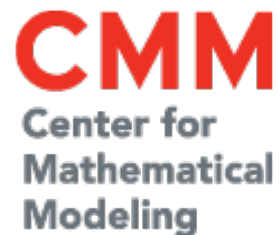
>100 new RR Lyrae stars, >1000 new asteroids, dozens of unknown objects (flares? other?)

No shock breakout events, but sample of very young SNe (< 1 day).

We need more **non-detection → detection → confirmation** triplets.

Interdisciplinary collaboration crucial for Astronomy in Big Data era

THANKS!



This project used data obtained with the Dark Energy Camera (DECam), which was constructed by the Dark Energy Survey (DES) collaborating institutions – See more at:

<http://www.ctio.noao.edu/noao/content/Acknowledgment-DECam#sthash.Z7MCPHs3.dpuf>

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AURA Campus
La Serena - Chile



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http://www.aura-o.aura-astronomy.org/winter_school/