

How to build a TraP

An image-plane transient-finding pipeline

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Outline

'Slow' radio transients

How TraP works

How do I use it?

Future work

Summary

What are we missing?

Image surveys are best for finding

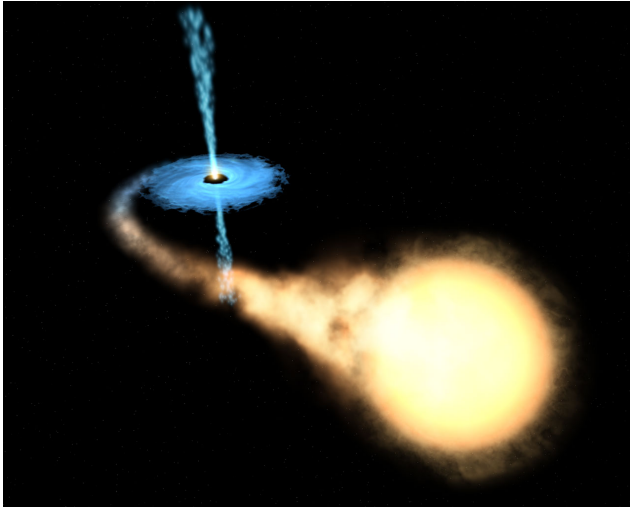
'slow' transients

i.e. > 1 second timescale —
excludes regular pulsars, etc.

Such as...

What are we missing?

Accretion flares



Artist's impression of the microquasar GRO J1655-40. Image credit: NASA/STScI

What are we missing?

'Orphan' gamma-ray burst afterglows

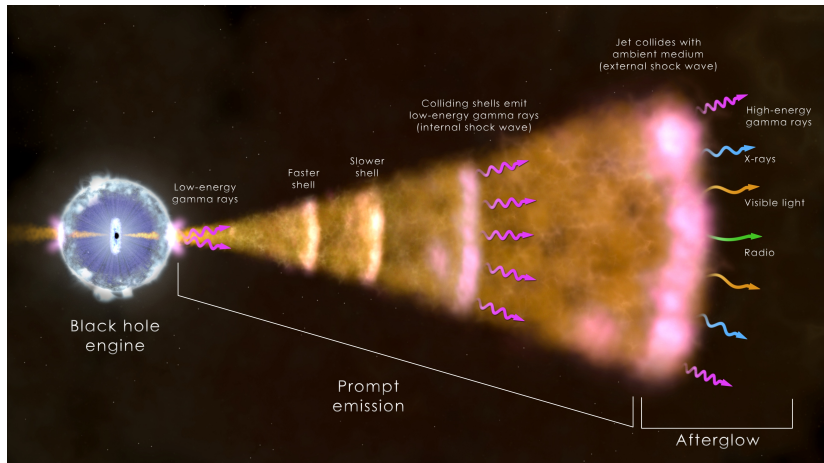


Image credit: NASA's Goddard Space Flight Center

e.g. *Ghirlanda 2014*, <http://adsabs.harvard.edu/abs/2014PASA...31...22G>

What are we missing?

Flare-star events

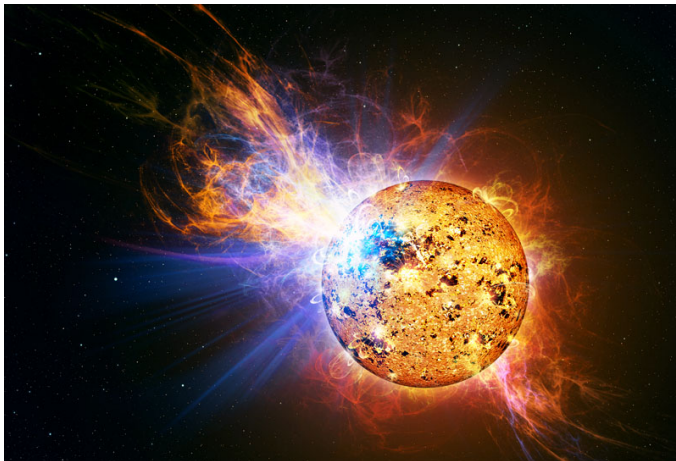


Image credit: Casey Reed/NASA

e.g. *Osten 2010*, <http://ukads.nottingham.ac.uk/abs/2010ApJ...721..7850>

What are we missing?

Image surveys are best for finding 'slow', i.e. > 1 second timescale transients (excludes regular pulsars, etc).

- ▶ AGN tidal disruption events
- ▶ Compact-object binary flares
- ▶ Orphan gamma-ray bursts
- ▶ Flare stars
- ▶ Nulling and eclipsing pulsars (e.g. J. Broderick et al, in press)
- ▶ (The unknown?)

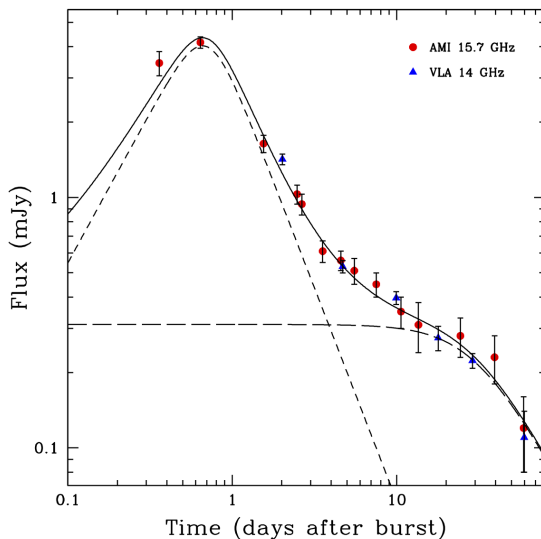
Proof of concept: ALARRM

AMI-LA Rapid Response Mode



Staley 2013, <http://ukads.nottingham.ac.uk/abs/2013MNRAS.428.3114S>

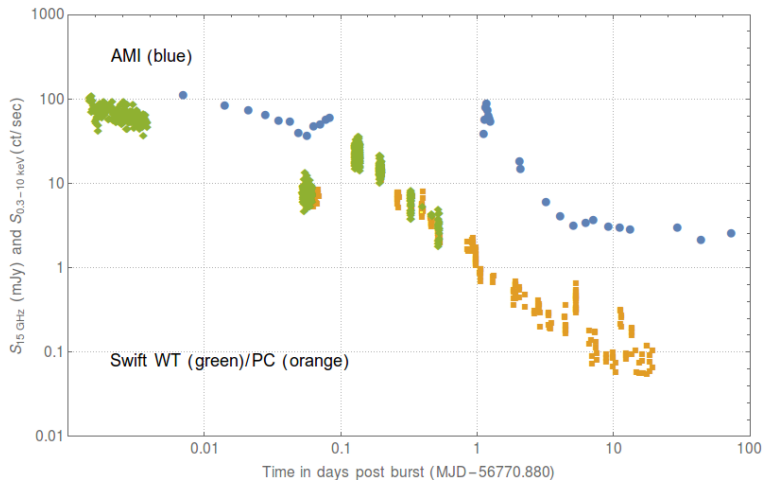
GRB140327A



Anderson 2014, <http://adsabs.harvard.edu/abs/2014MNRAS.440.2059A>

van der Horst 2014, <http://adsabs.harvard.edu/abs/2014MNRAS.444.3151V>

DG CVn M-dwarf superflare



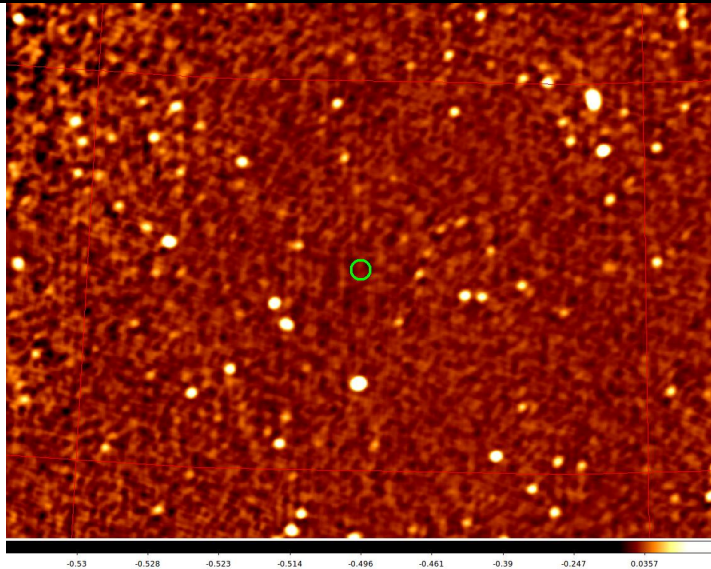
Fender 2014, <http://adsabs.harvard.edu/abs/2014arXiv1410.1545F>

Osten et al (in prep)

So:

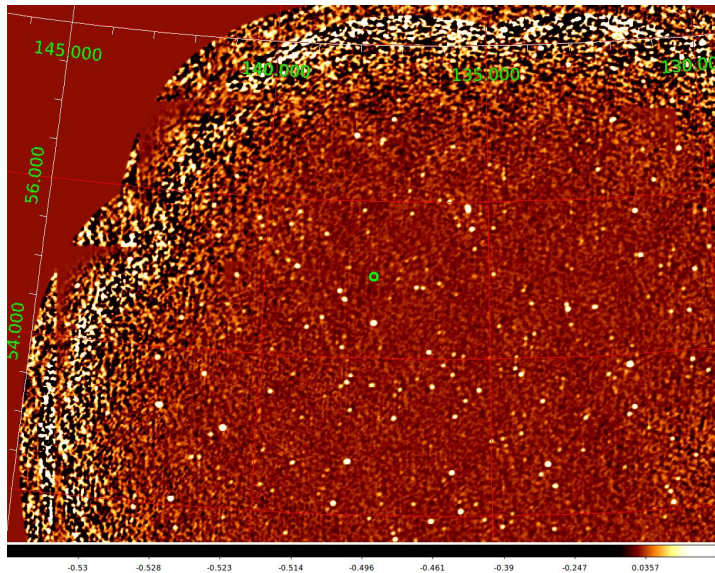
Radio transients are out there.
How do we find them directly?

Bigger fields of view



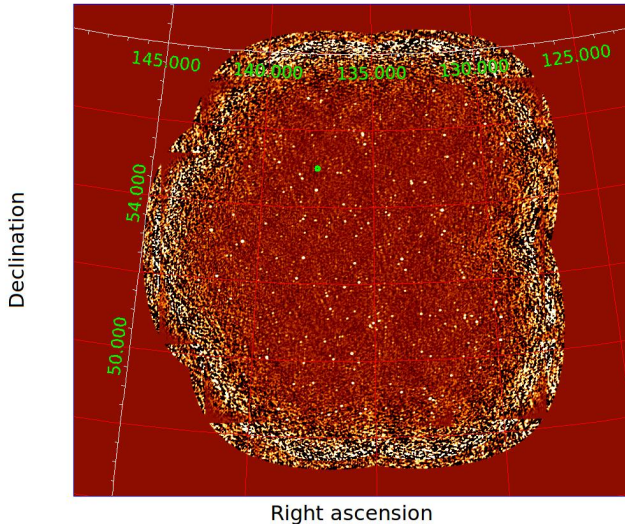
(Green = AMI-LA FoV)

Bigger fields of view

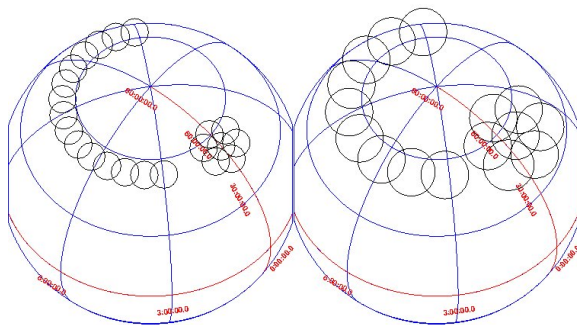


Bigger fields of view

LOFAR-RSM footprint



The LOFAR 'Radio Sky Monitor'



Eight 7-beam tiles in LBAs tiles out entire zenith strip
($\sim 1800\text{deg}^2$ / $\sim \frac{1}{4}$ hemisphere)

Sixteen 7-beam tiles in HBAs for a narrower strip
($\sim 1000\text{deg}^2$)

Mini-summary

- ▶ There are interesting radio-transients waiting.
- ▶ Radio sensitivity / field of view is increasing by orders of magnitude.

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- ▶ There are interesting radio-transients waiting.
- ▶ Radio sensitivity / field of view is increasing by orders of magnitude.
- ▶ \implies Many uninteresting pixels, and a few exciting rare events.
- ▶ \implies We need tools to search this data.

Outline

'Slow' radio transients

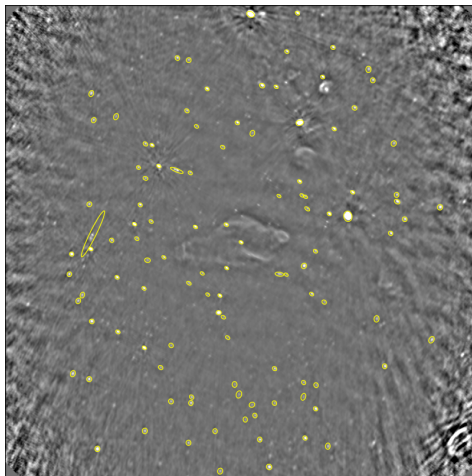
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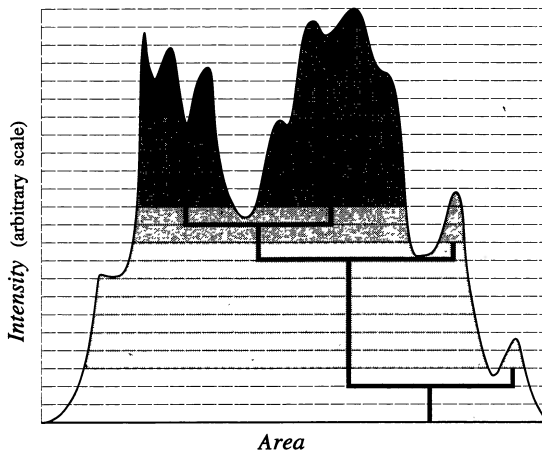
Summary

Step 1: PySE



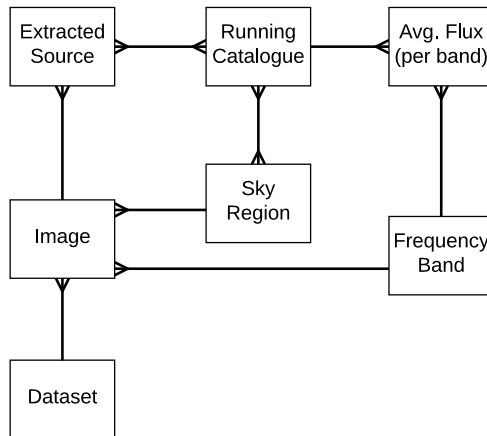
Python Source Extractor - Loosely based around S-Extractor algorithms, but tuned for radio data. Written solely in Python (extensive use of Numpy).

Sourcefinding algorithms



An illustration of the island deblending method pioneered by *S-Extractor* (Bertin et al 1996).

Step 2: Load 'extractedsources' into SQL database



NB: Store extractions without cross-matching initially.

Brief aside on SQL

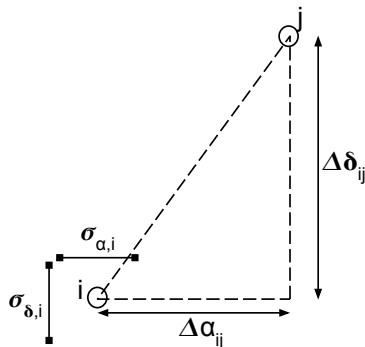
Brief aside on SQL

- ▶ SQL is almost always *the* most efficient tool for searching large, well-parsed datasets.
- ▶ Are astronomers missing out?

Step 3: Cross-match with known sources

a.k.a. 'association'

First calculate DeRuiter radius for candidate associations:

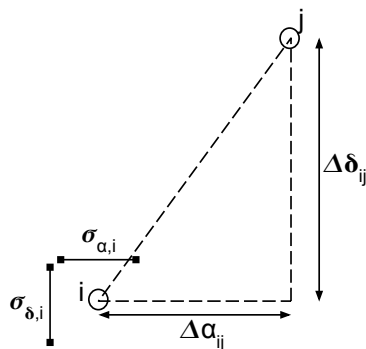


$$r_{ij} = \sqrt{\frac{(\Delta\alpha_{ij})^2}{\sigma_{\alpha,i}^2 + \sigma_{\alpha,j}^2} + \frac{(\Delta\delta_{ij})^2}{\sigma_{\delta,i}^2 + \sigma_{\delta,j}^2}}$$

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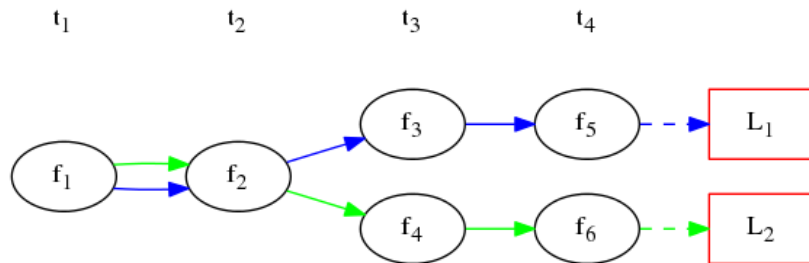
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Handling meridian-wrap, celestial poles, left as exercise to reader.

Step 3: Cross-match with known sources

a.k.a. 'association'

Mostly we just pick the closest match, and everything works out fine. But we also try to deal with some variable-PSF issues:



Step 4: Identify bright new transients

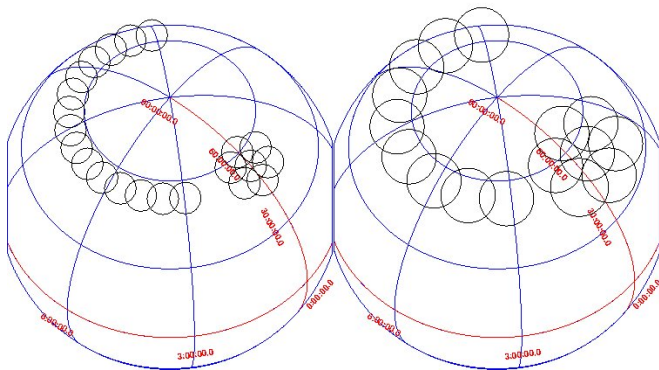
The problem:

One of the neat features of TraP is that we can tell immediately when a bright new source appears. This may sound trivial initially, but...

Step 4: Identify bright new transients

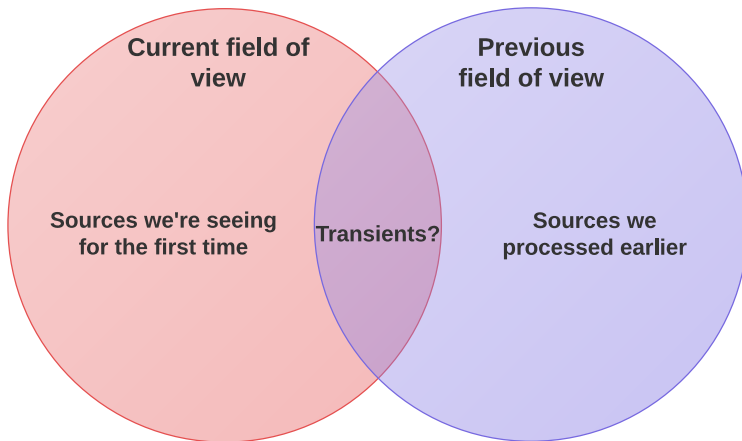
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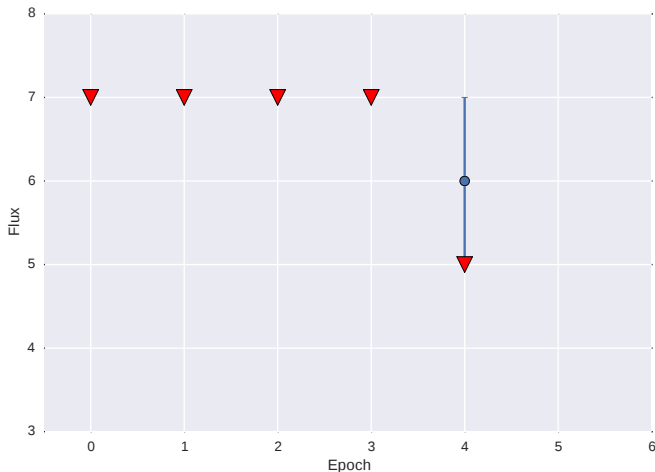
Step 4: Identify new sources

Tracking fields of view



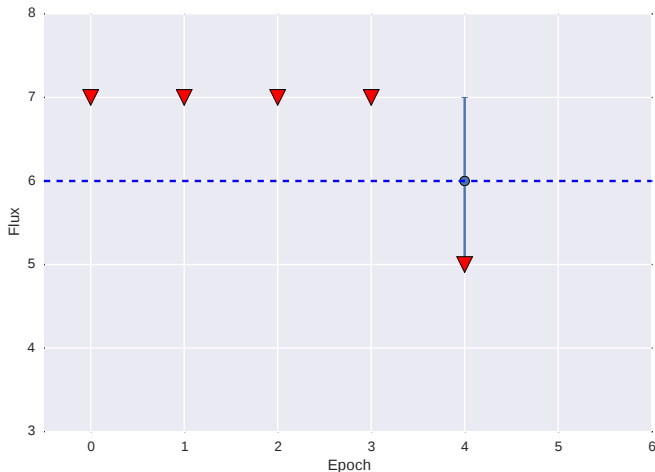
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Tracking detection limits



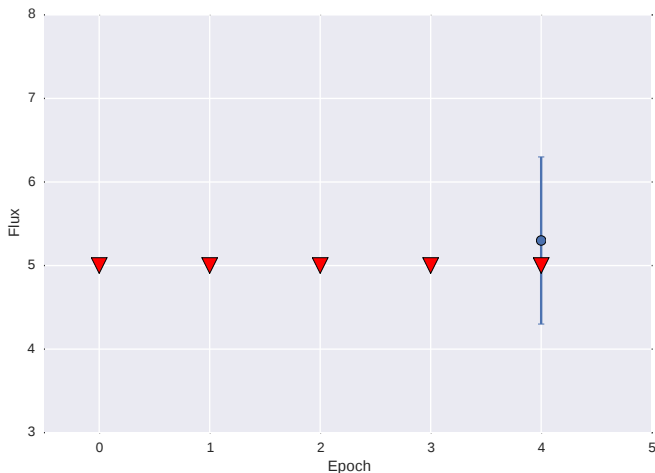
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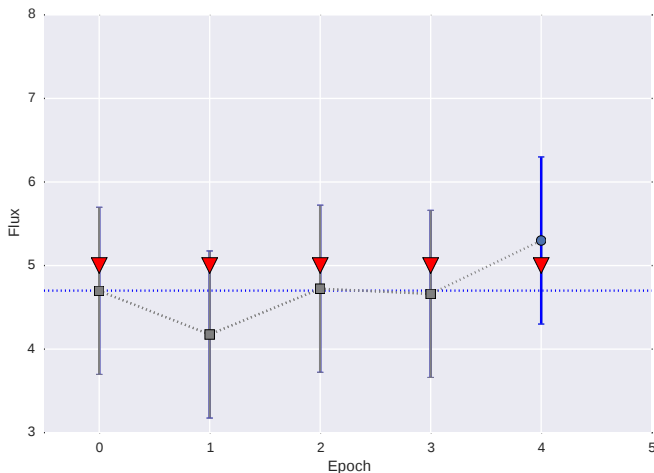
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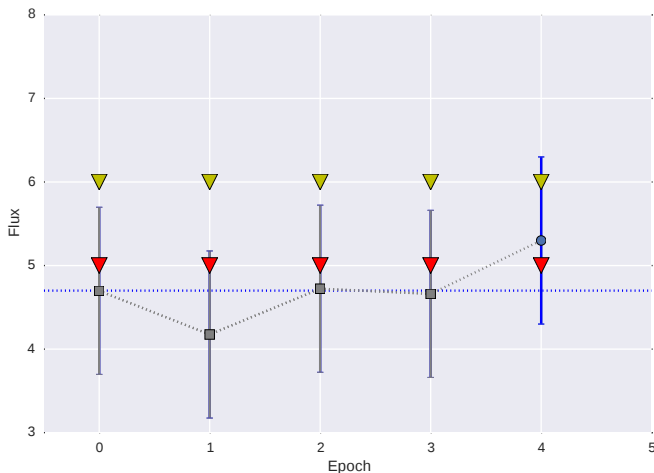
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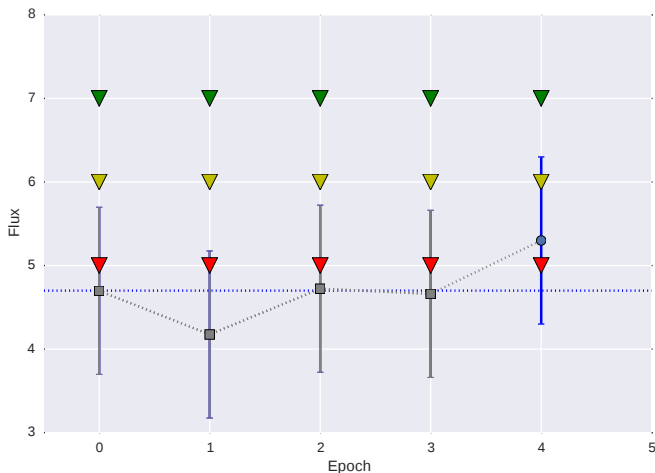
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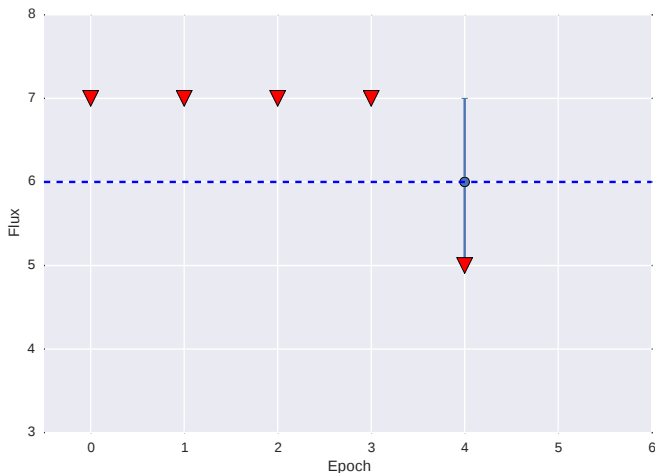


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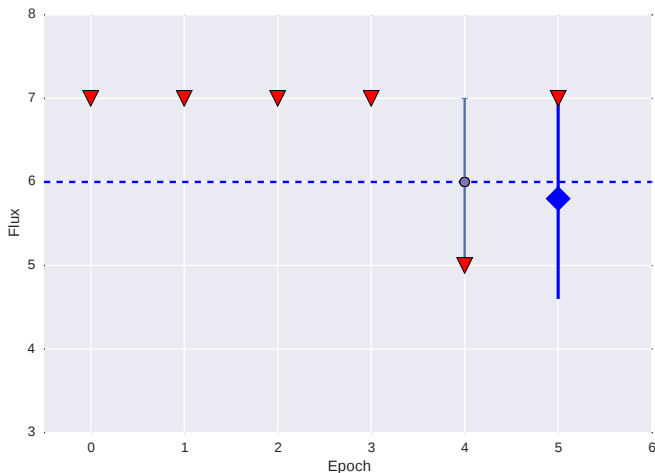
Tracking detection limits



Step 5: Force measurement of any missing known sources



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Step 6: Analyse lightcurves

We keep a running aggregate (i.e. only need to include additional data, no recalculation of previous timesteps) for:

- Regular and weighted mean fluxes, μ & ξ

$$\xi_{x_{N+1}} = \frac{W_{x_N} \xi_{x_N} + w_{x_{N+1}} x_{N+1}}{W_{x_N} + w_{x_{N+1}}} \quad (1)$$

(2)

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- ▶ 'Coefficient of variation', $V = \sigma/\mu$
- ▶ Calculate reduced χ -squared value (η), against fit to straight line at level of weighted-mean ξ .

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Installation

- ▶ TraP can be run on a laptop. But . . .
- ▶ Makes heavy use of SQL database (most astronomers not familiar)
- ▶ Expected to be run on large datasets

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- ▶ TraP can be run on a laptop. But . . .
- ▶ Makes heavy use of SQL database (most astronomers not familiar)
- ▶ Expected to be run on large datasets
- ▶ Solution: Web-interface. Displays data in user-friendly fashion, works extremely well in server-client model.

Demo

⇒ Demo.

Development

Facts

- ▶ ~20,000 lines of code, ~350 unit tests, 26K lines of docs
- ▶ 4 core developers, plus ~4 testers, 3 continents
- ▶ Remote, collaborative, development model
- ▶ Issue tracking
- ▶ Open (going forward)

Development

Implications

(/ Ruminations)

- ▶ Astronomy → More software intensive
- ▶ Getting anything done requires better code re-use
- ▶ Core software efforts are larger, require ongoing effort from many contributors.
(cf <http://astropy.org!>)

Development

Implications

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- ▶ Astronomy → More software intensive
- ▶ Getting anything done requires better code re-use
- ▶ Core software efforts are larger, require ongoing effort from many contributors.
(cf <http://astropy.org/>)
- ▶ You don't have to be part of it, **but**, you should be aware of it
- ▶ Get to know the latest tools, maybe submit a bugfix here and there if you can
- ▶ Do better science, faster (hopefully!)

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Different approaches

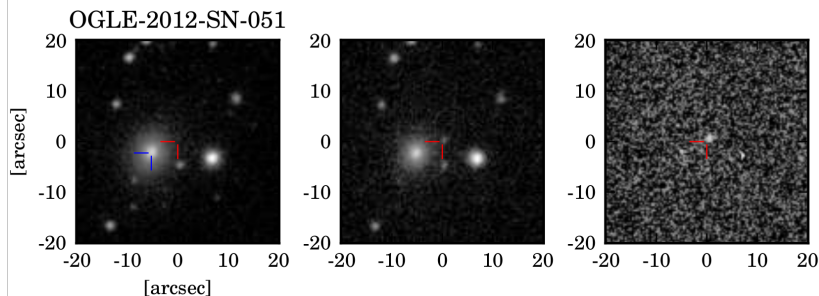
Two main approaches to image-based transient surveys:

- ▶ Cataloguing: Extract source representations, store in database, analyze lightcurve catalogue.
- ▶ Difference image analysis a.k.a. image subtraction

Lightcurve cataloguing

- ▶ Basic concept easily understood - 'just' glue together source extraction and lightcurve analysis.
- ▶ However, blind source extraction typically requires good signal to noise - will miss marginal sources.
- ▶ Crowded fields are also a problem.

Difference image analysis



- Better at picking out faint sources in clean data, *much* better in crowded fields.

Alard & Lupton 1997, <http://adsabs.harvard.edu/abs/1998ApJ...503..325A>

Wyrzykowski et al, 2014, <http://adsabs.harvard.edu/abs/2014AcA....64..197W>

Optical survey characteristics

Which technique should we employ?

Most transient surveys to date are optical:

- ▶ Fields often crowded or even confusion limited (best places to look for stellar flares, microlensing)
- ▶ PSF usually quite well behaved (smooth)
- ▶ Pixel noise usually uncorrelated / varies on a different scale to the PSF (dependent on sampling)
- ▶ \implies DIA is usually best approach.

Radio survey characteristics:

(Contrast with optical)

- ▶ Fields usually quite sparsely populated, at least with current generation of instruments.
- ▶ Noise is correlated on beam-width scale.
- ▶ Dirty beam / PSF may vary significantly from image to image. May be well modelled, but this depends on system characterisation.
- ▶ (Phased arrays e.g. LOFAR) May see artifacts due to side lobes from out-of-field bright sources.
- ▶ \Rightarrow DIA would cause many false positives, better to stick to high SNR cataloguing.

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TraP:

- ▶ Good for (wide-field) sparsely populated surveys.
- ▶ Can be used for real-time transient detection.
- ▶ Produces catalogue of all sources.

Summary

TraP:

- ▶ Good for (wide-field) sparsely populated surveys.
- ▶ Can be used for real-time transient detection.
- ▶ Produces catalogue of all sources.
- ▶ Server-based / web-interface reduction model well suited to large, challenging datasets.
- ▶ Open-source Python / SQL, with comprehensive test-suite and documentation.
- ▶ <http://ascl.net/1412.011>