



# Identifying Microlenses in Large, Non-Uniformly Sampled Surveys



adrn@astro.columbia.edu

Adrian M. Price-Whelan<sup>1</sup>, Marcel Agüeros<sup>1</sup>, Amanda Fournier<sup>2</sup>, Rachel Street<sup>3</sup>, Eran Ofek<sup>4</sup>, David Levitan<sup>5</sup>, and the PTF collaboration

<sup>1</sup>Columbia University, <sup>2</sup>UC Santa Barbara, <sup>3</sup>LCOGT, <sup>4</sup>Weizmann Institute, <sup>5</sup>Caltech

The number of observed microlensing events will increase as the next generation of photometric, time-domain surveys comes online.

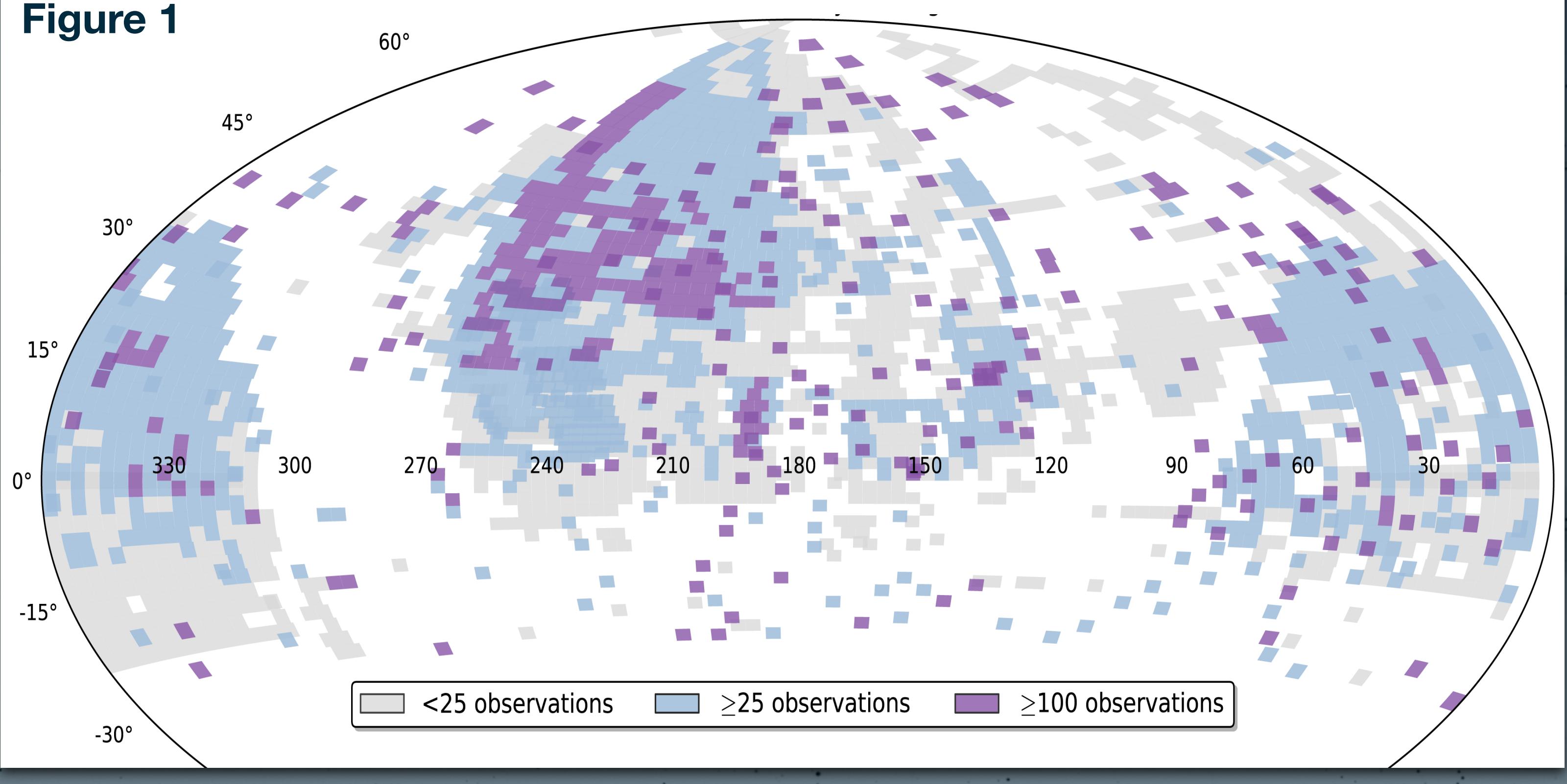
Using the Palomar Transient Factory (PTF) archive, we have developed a new method for searching for such events in large, non-uniformly sampled data.

We find that  $\eta$  outperforms standard matched filtering ( $\Delta\chi^2$ ) in detecting simulated events and use it to identify nine candidate events from  $10^9$  light curves.

## 1 Will wide-field surveys aid microlens discovery?

- Microlensing is used to discover exoplanets, infer Galactic structure, and search for compact stellar remnants.
- Microlensing surveys usually use high-cadence observations of dense stellar fields.
- However, wide-field synoptic surveys such as PTF often avoid dense regions to prevent e.g., blending (Figure 1).

Figure 1



- The event rate away from the Bulge is not well-constrained, but such events are potentially extremely interesting () .
- We have developed a new method for searching for microlensing events in large, non-uniformly sampled data sets.
- We apply this method to the PTF data and identify 9 candidate microlensing events.

## 2

- The PTF database contains  $\sim 10^9$  light curves with  $>10 R$ -band observations.
- These light curves have non-uniform sampling: Figure 2 shows six different PTF fields observed over one year. Darker points indicate that more exposures were taken that night; the total number of observations for each field is indicated.

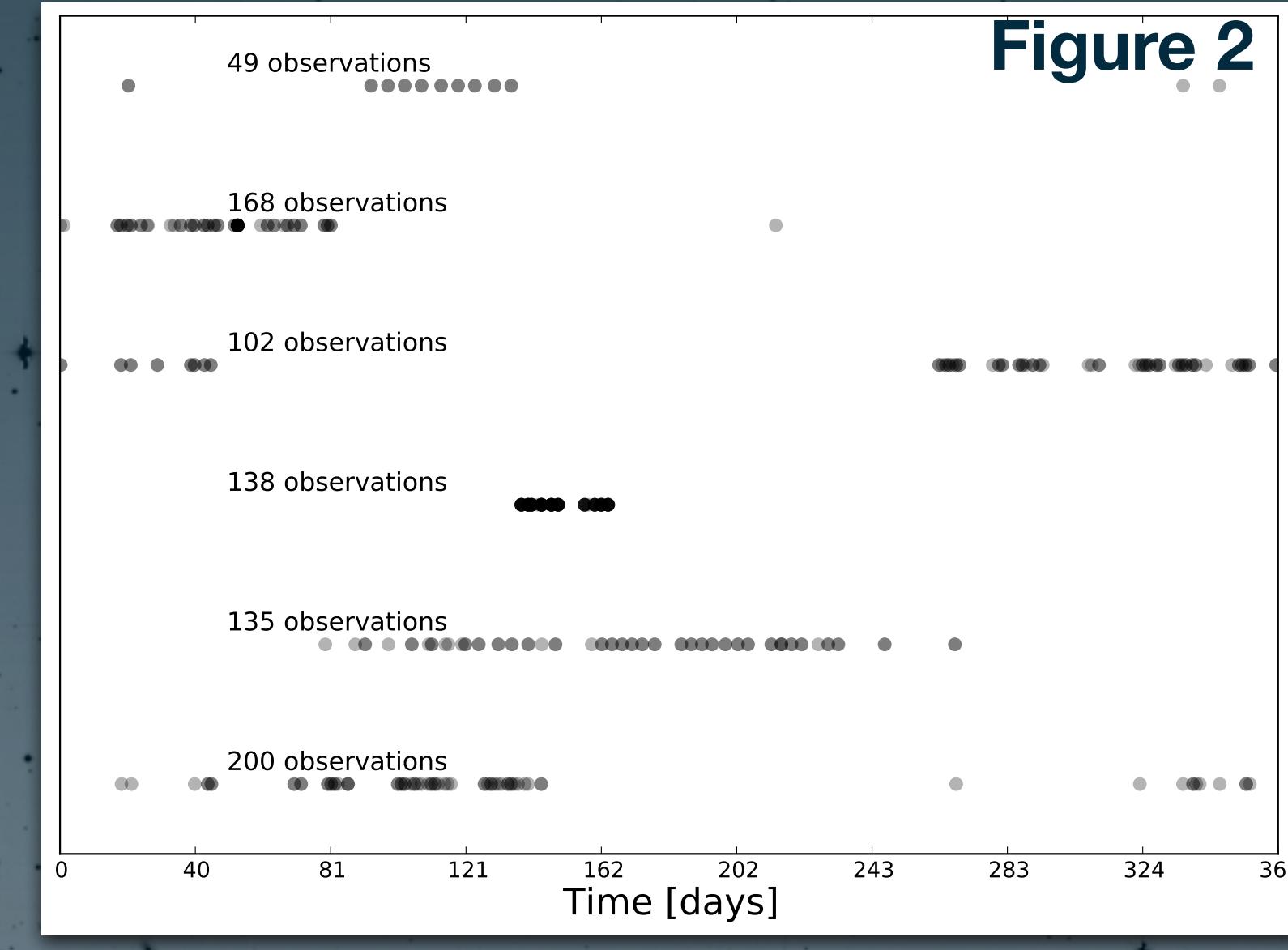


Figure 2

- A typical PTF field has  $\sim 30$  exposures, but the exposure distribution has a significant tail to larger numbers (Figure 2).
- The distribution of baselines shows more structure, with peaks around  $\sim 10$  days, 1 year, and 3 years (Figure 3).

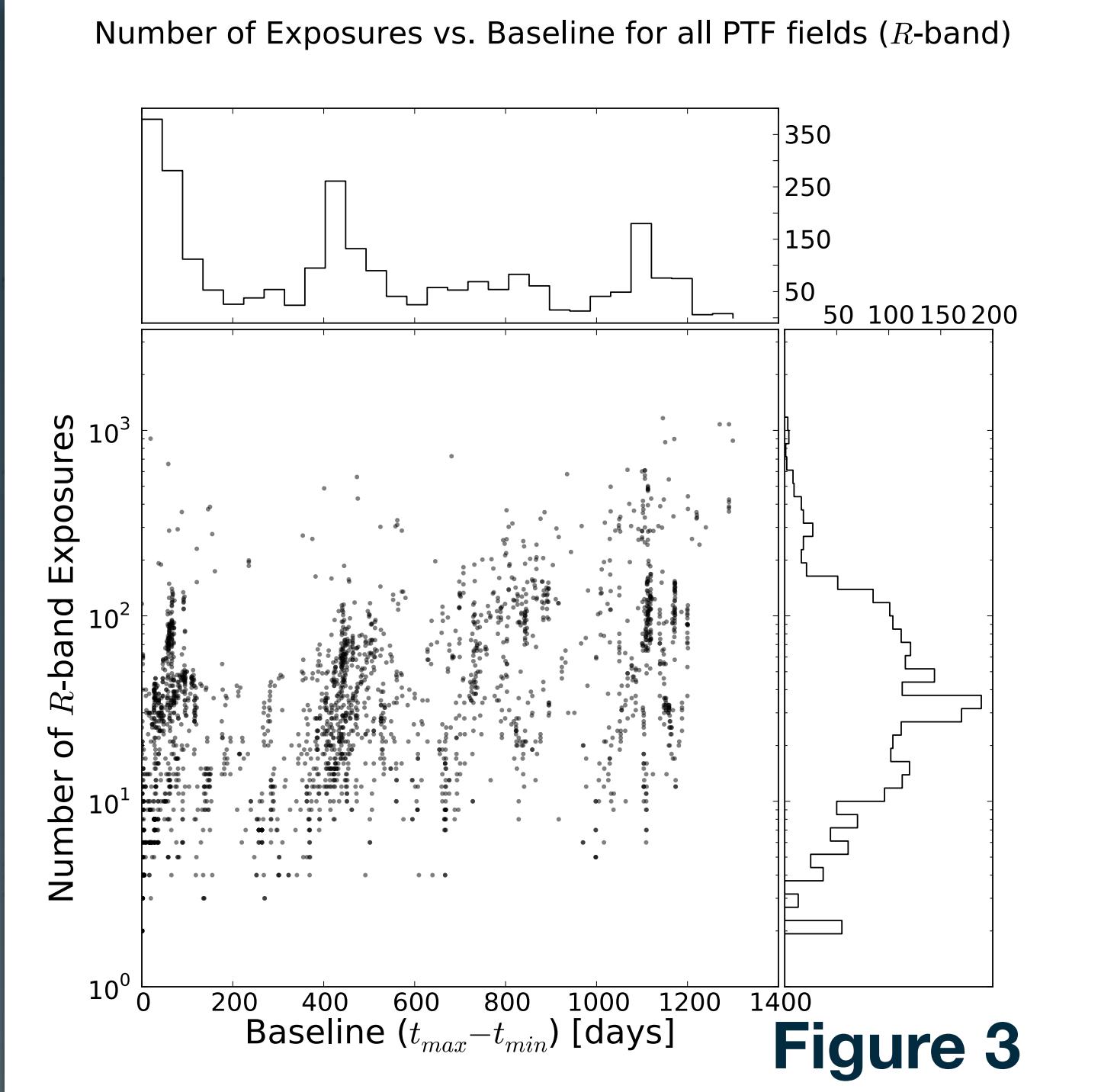


Figure 3

## PTF survey

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- These light curves have non-uniform sampling: Figure 2 shows six different PTF fields observed over one year. Darker points indicate that more exposures were taken that night; the total number of observations for each field is indicated.

## 4 Candidates

- Our procedure identifies 2377 candidates from among the initial  $\sim 10^9$  light curves. These are fed to SDSS and SIMBAD to identify and remove extragalactic objects.
- Each remaining candidate is hand-vetted and passed to an MCMC model-fitting algorithm.

- Figure 6 shows nine candidate events that passed visual inspection with microlensing models overlaid (sampled using MCMC).
- We are cross-matching these sources to existing catalogs and requesting spectroscopic follow-up from PTF to determine their nature.

## Finding microlensing events

- Microlensing searches often require that consecutive data points be brighter than a few times the scatter in the data.
- This is not appropriate for non-uniformly sampled data, but a brute-force model-fitting method will not work for LSST-scale surveys.
- We test a set of variability indices on simulated PTF light curves, setting selection boundaries such that 1% of simulated light curves are recovered.

- Figure 4 shows selection boundaries (red lines / regions) for three indices and distributions of light curves without (left) and with (right) simulated microlensing events.
- Figure 5 shows the detection efficiency curves for the best three indices on PTF field 4327.  $\eta$ , the Von Neumann ratio, outperforms standard matched filtering ( $\Delta\chi^2$ ) and the Stetson J index.

$$\eta = \sum_{n=1}^{N-1} (M_{R,n+1} - M_{R,n})^2 / (N-1) / \sigma_R^2$$

(von Neumann 1941)

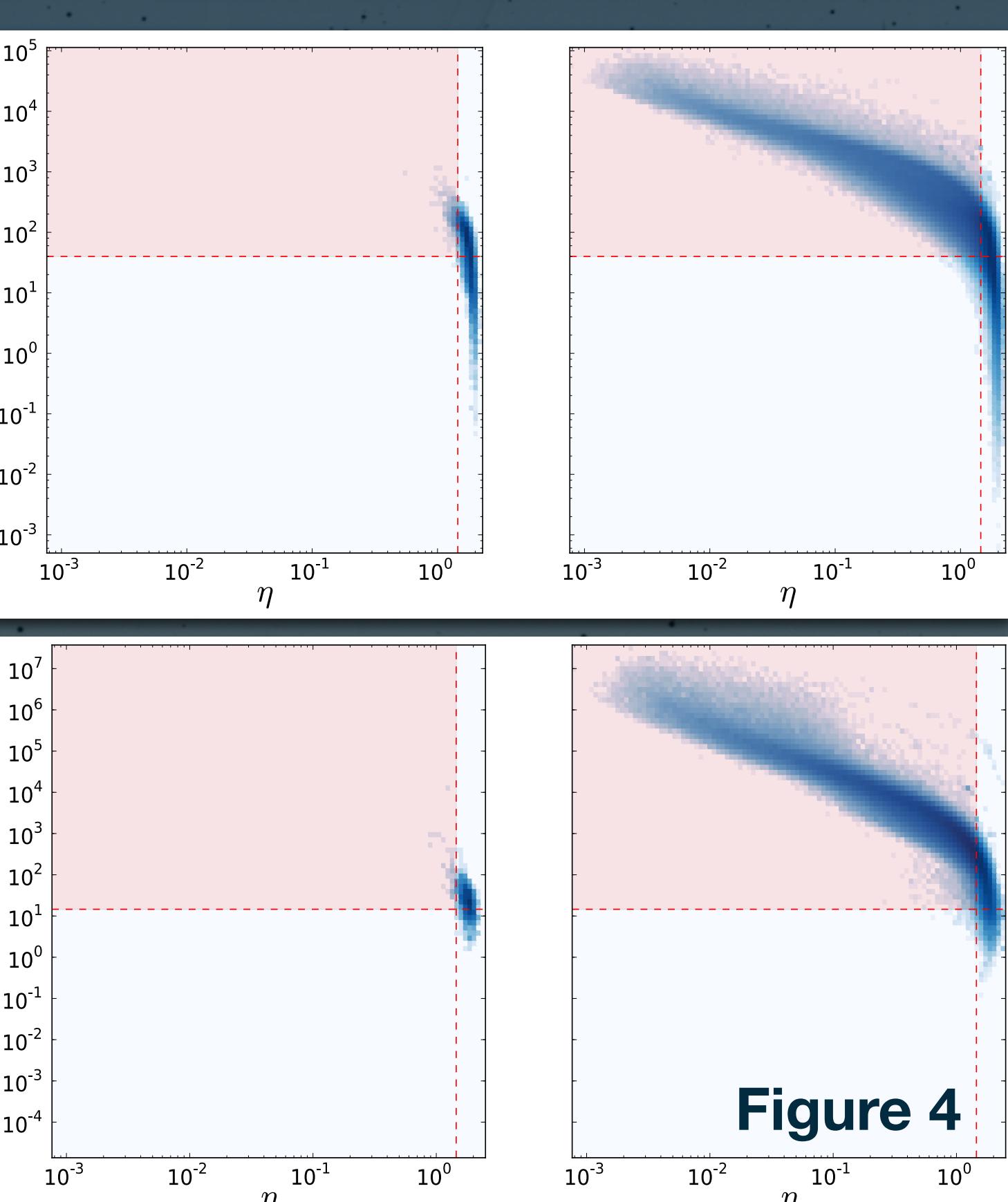


Figure 4

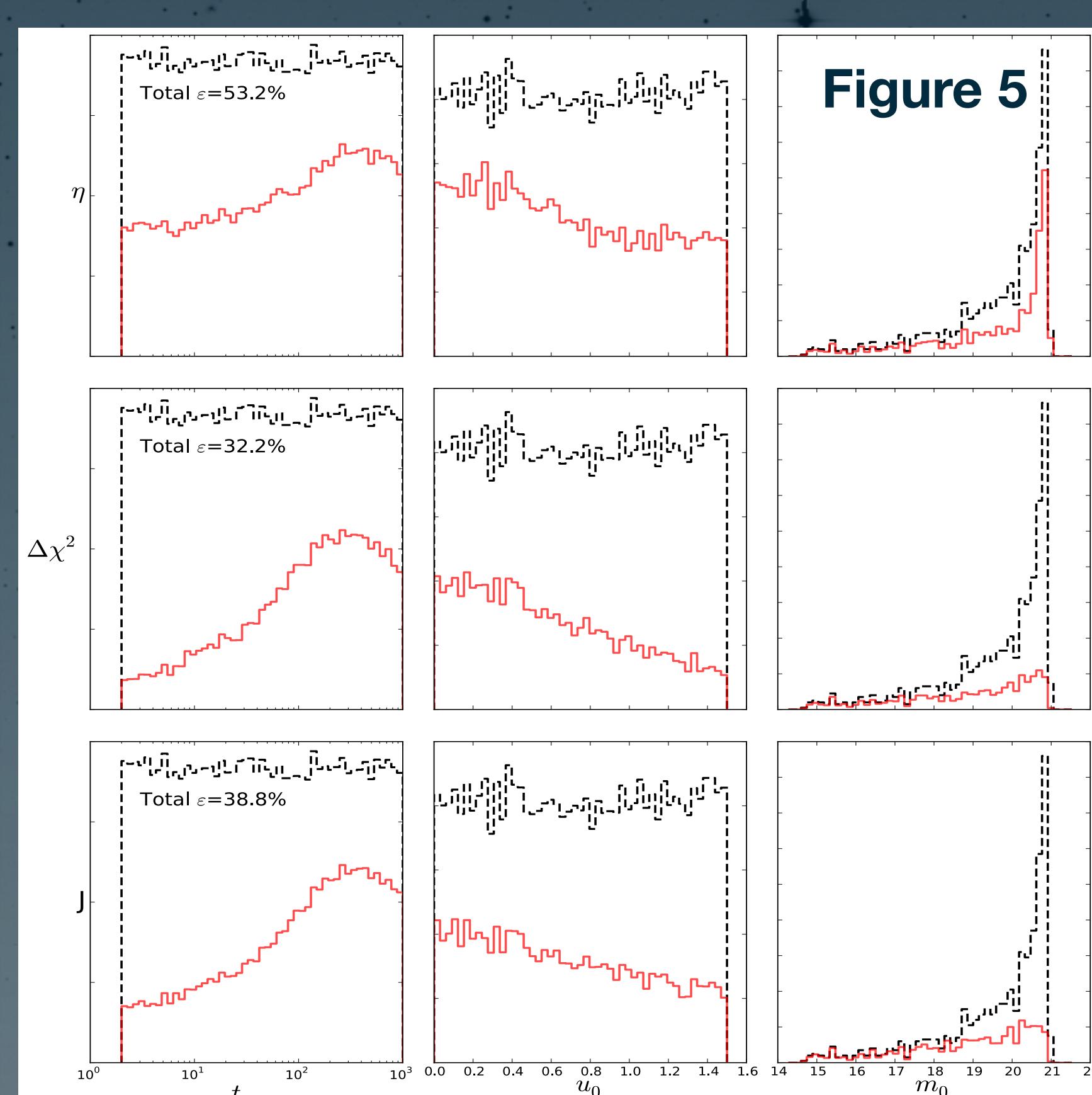


Figure 5

## 4

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