

Using Simulations To Commission Algorithms And Pipelines

Robert Lupton

12 October 2011

Introduction

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- SDSS
 - Photo
 - Übercal
 - MARVELS
- LSST

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Unacknowledgments: My unthanks to

- Nick Kaiser
- Phil Marshall

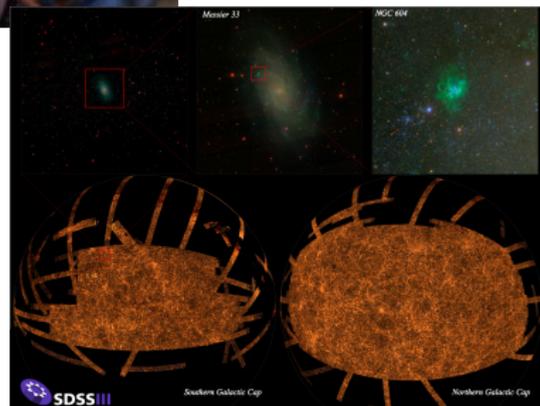
for covering most of the interesting parts of this talk in their discussion sessions.

SDSS



1998

1994



2011

Motivation for simulating

We can use these simulated data to ask fairly detailed questions. If the sky brightness slowly increases over the duration of a photometric scan, does the photometric calibration software correct properly? What is the relative performance of the system at low and high Galactic latitudes? While the test year will no doubt bring some software surprises, the use of simulations has allowed us to have the data system integrated and largely debugged before the telescope itself is fully operational. The ability to use the same underlying data with varying degrees of complication will help isolate problems during debugging. The existence of a catalog with the "right" answers corresponding to a given simulation allows us to do regression testing in a detailed and quantitative way.

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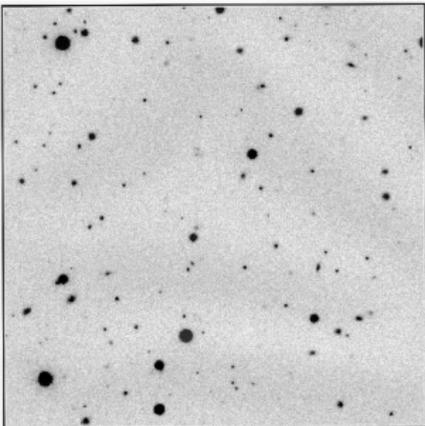
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History of Simulations

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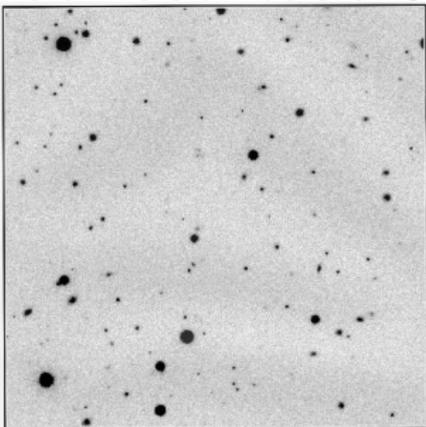
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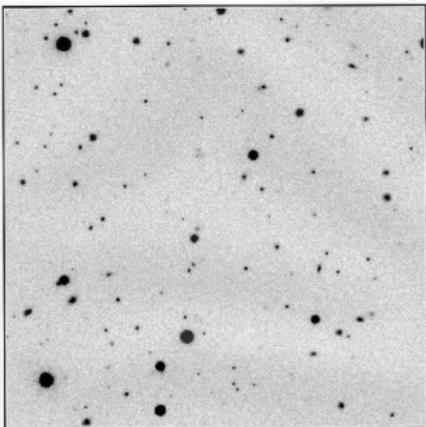
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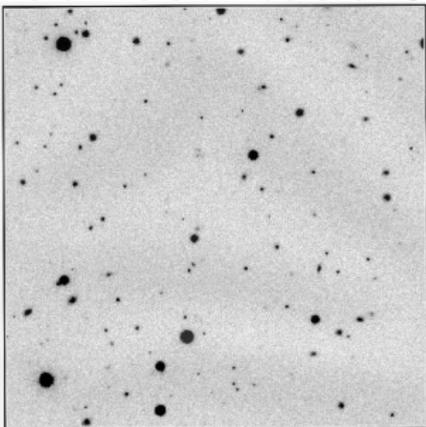
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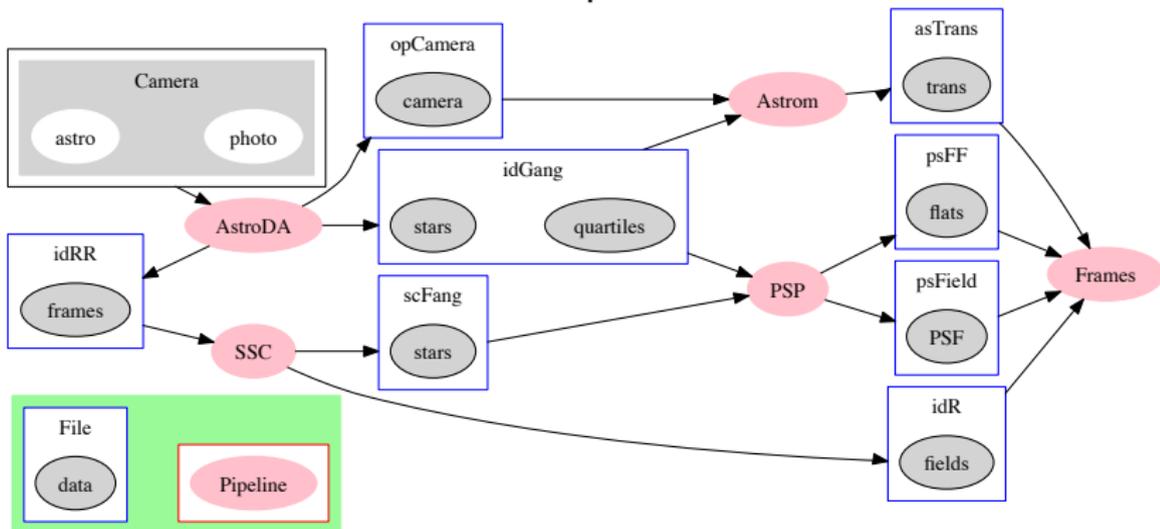
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- First light (full moon, no baffles): 9th May 1998
- First light (dark time, baffles): 29th May 1998
- First QSOs: 14th June 1998

I.e. We were able to reduce first light data, and start finding QSOs within a month.

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We probably do need images. Interfaces are more than FITS; e.g. the flatfields (the psFF files) are stored as

```
(unsigned short)((1 << 11)/value + SOFT_BIAS +  
0.5*Random()/RANDOM_MAX);
```

This is a contract between the *PSP* and *Frames* that must be kept.

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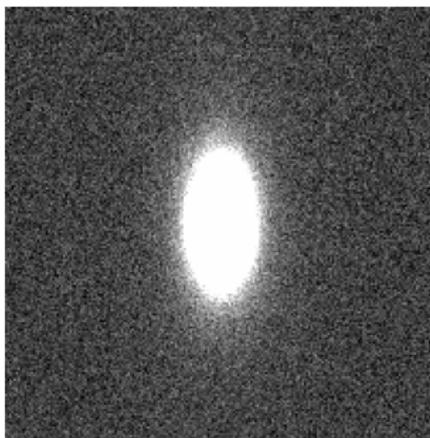
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- Pro: Blind testing
- Con: Hard to keep interfaces in sync
 - e.g. what is the value of `SOFT_BIAS`?

jpgtest Simulations

The Japanese P{romotion,articipation} Group wrote their own simulator to test algorithmic issues.



gal15.fits Exponential disk, $r_e = 8\text{pix}$

Inputs

```
# Data to test profMean
#
sky=100
#
# with noise
#
...
gal15.fits \
    profMean<2>=4185.28 profMean<3>=2701.29 \
    profMean<4>=1387.53 profMean<5>=578.59 \
    profMean<6>=189.35675
...
```

Photometric Algorithms

SDSS measured circular aperture magnitudes, with smallest radius 0.5642 pixels. We did this by assuming a band-limited image, so we can write

$$\begin{aligned}
 \text{flux} &= \int_0^{x^2+y^2 < R^2} D \, dx \, dy \\
 &= \int_0^{x^2+y^2 < R^2} \sum_i D_i \frac{\sin \pi(x - x_i)}{\pi(x - x_i)} \frac{\sin \pi(y - y_i)}{\pi(y - y_i)} \, dx \, dy \\
 &= \sum_i D_i \int_0^{x^2+y^2 < R^2} \frac{\sin \pi(x - x_i)}{\pi(x - x_i)} \frac{\sin \pi(y - y_i)}{\pi(y - y_i)} \, dx \, dy \\
 &= \sum_i D_i c_i
 \end{aligned}$$

N.b. this is exact if the data's truly band limited.

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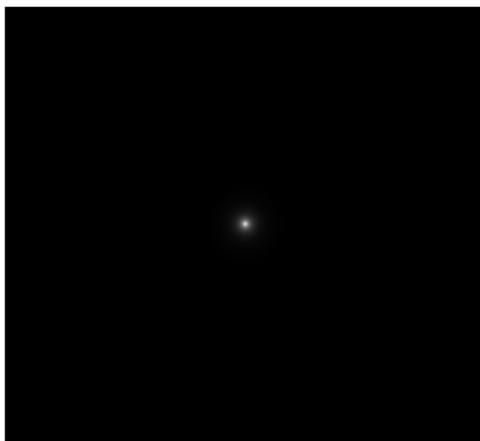
Solution: be more sophisticated (*i.e.* fix the bug).

Sky Subtraction

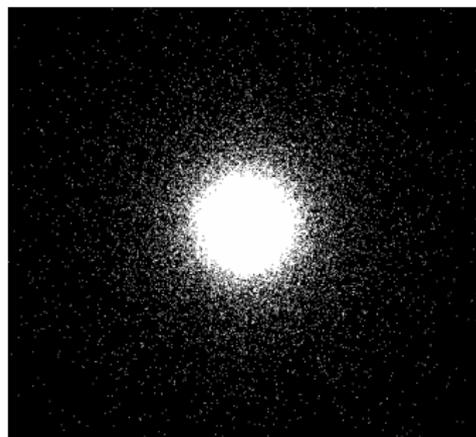
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$r_e = 5\text{pixel log}$



$r_e = 5\text{pixel linear}$

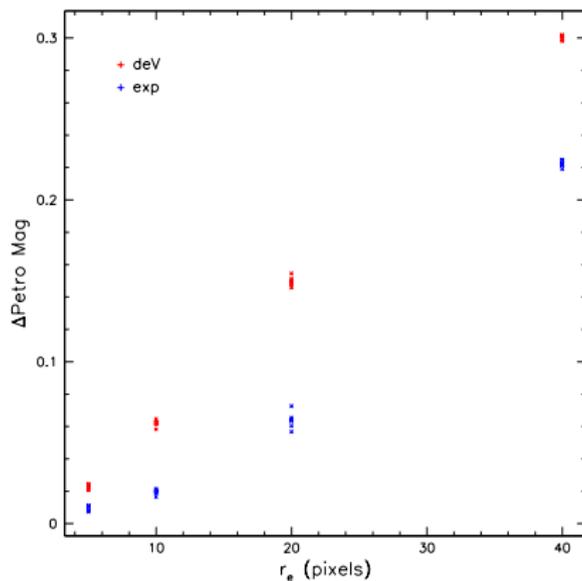
1000 × 1000 Test images for sky subtraction

Sky Subtraction

What happens when we run that through *photo*?

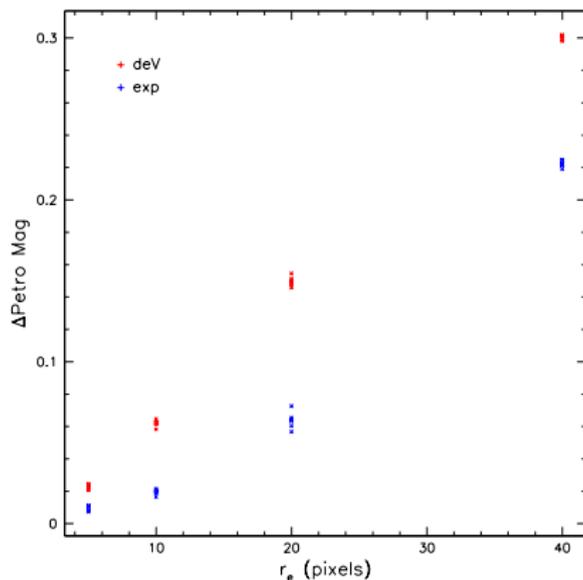
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There's a clear signal of problems; what went wrong?

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- We didn't think about the impact on faint sources near the bright ones (*cf.* Mandelbaum *et al.*)

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I'm describing ancient history, so we didn't use `jUnit`, `unittest`, `boost::test`, ...; we wrote our own framework in TCL using these `jpgtest` simulations. Unfortunately, the more extensive examination of pipeline outputs was originally done by hand, and could not be captured and automated.

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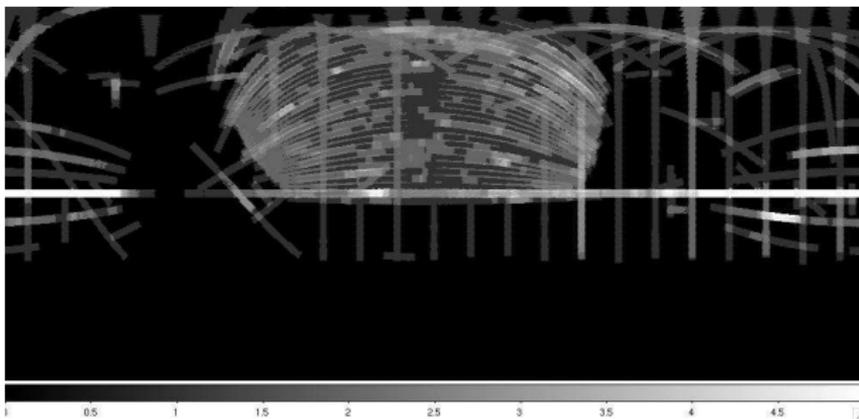
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As first light was just around the corner, we (*i.e.* I) ignored the last generation of simulations, and waited patiently for reality.

Photometry: *Übercalibration*



SDSS-I imaging coverage (white: ≥ 5 visits)

The Problem

Given a set of SDSS 'runs', α , nights, β , the true and measured (at airmass z and time t) magnitude of a star is given by

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It's pretty straightforward to write down the Normal equations, involving very large but very sparse matrices, and easy enough to solve them iteratively.

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While all of the foregoing is quite simple, we (*i.e.* primarily Nikhil Padmanabhan, David Schlegel, and Doug Finkbeiner) nevertheless decided that a survey simulator was a wise investment of time.

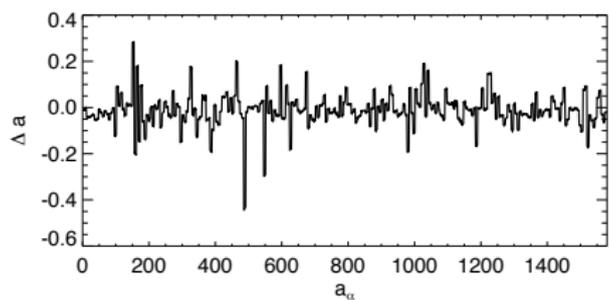
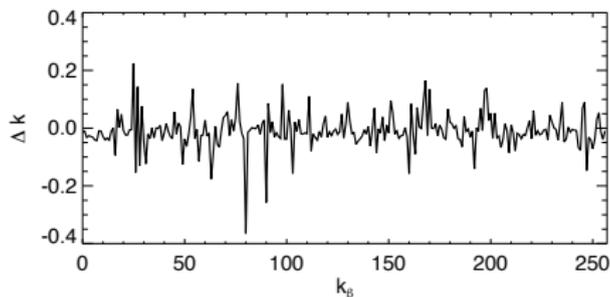
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- Start with the actual catalogue of SDSS stars.
- Simulate “true” magnitudes for each of the stars.
- Given an observation of the star, calculate the observed magnitude, assuming values for a and k .
- Simulate k 's time variation using a Gaussian random walk.
- Add photon noise to the instrumental magnitudes.

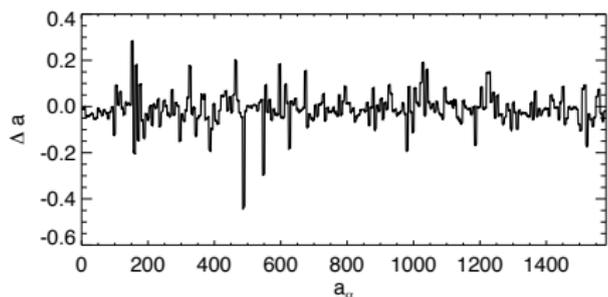
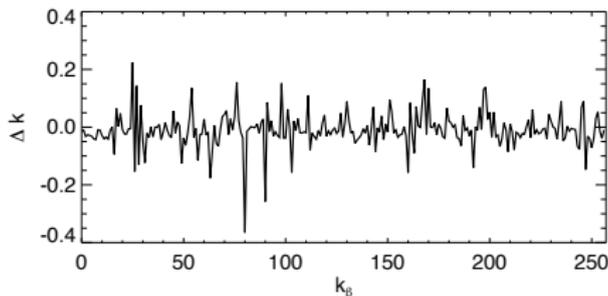
Results: zeropoints and extinction

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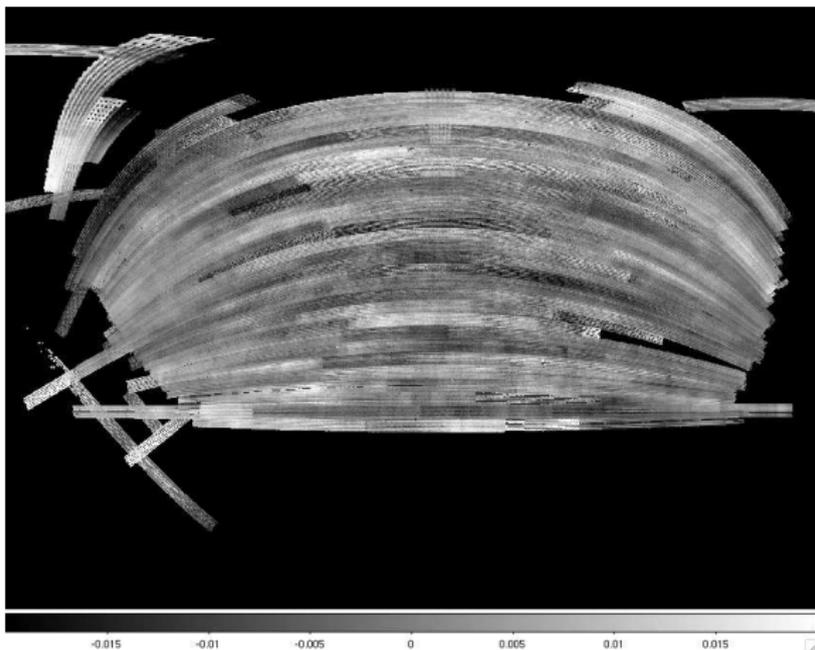
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This isn't surprising; we usually scanned at nearly constant z

Results: zeropoints



The zeropoints are good to c. 10mmag, with no visible large-scale power

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More quantitatively,

Filter	$\langle \Delta m \rangle$	σ	σ_3	$\%(3\sigma)$	σ_0
u	-1.67	13.38	12.53	0.85	7.27
g	0.82	7.79	7.31	0.72	1.77
r	0.93	7.81	7.26	0.81	1.69
i	0.92	6.84	6.38	0.75	1.32
z	0.97	8.06	7.61	0.68	2.70

where all values are in mmag.

Results: dk/dt



The result of setting $dk/dt = 0$ is a slope of c. 10 mmag

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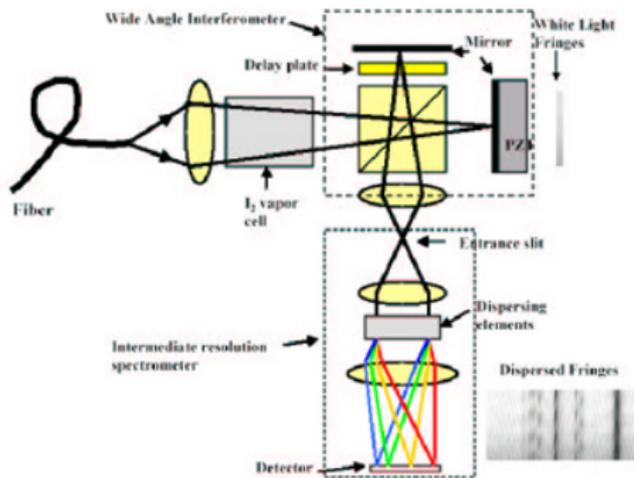
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- The dk/dt slope is our worst systematic. We could have taken data to avoid it — backwards non-constant-airmass scans?

Spectroscopy: *MARVELS*

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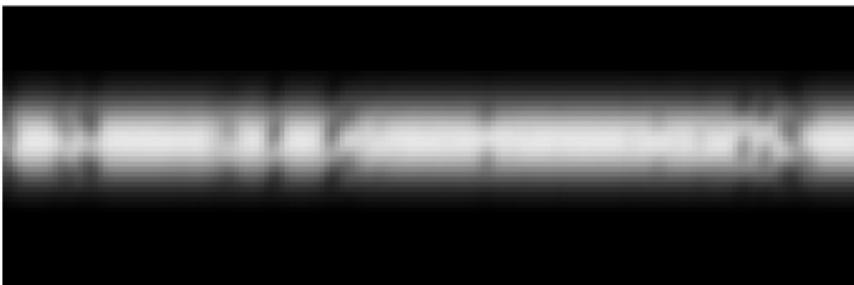
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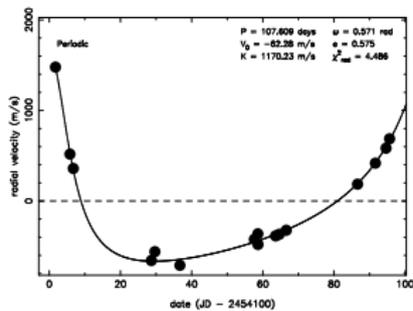
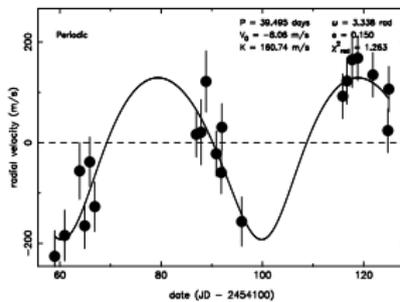
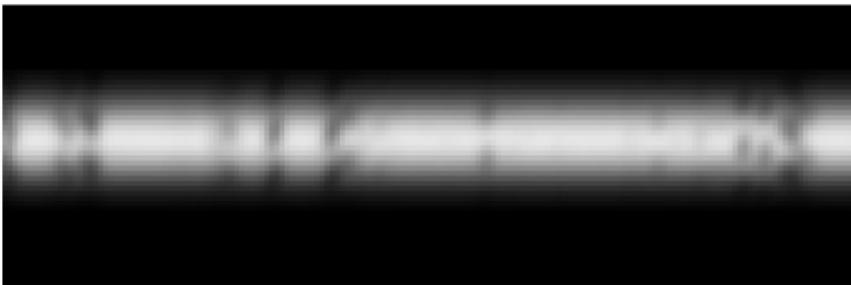
Ge *et al.*, 2002, PASP

A combination of a medium ($R \sim 10000$) spectrograph and a Michelson interferometer.

Data



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Brian Lee, Duy Cuong Nguyen, and Nathan De Lee spent 9 months writing a nice simulator.

The MARVELS simulator

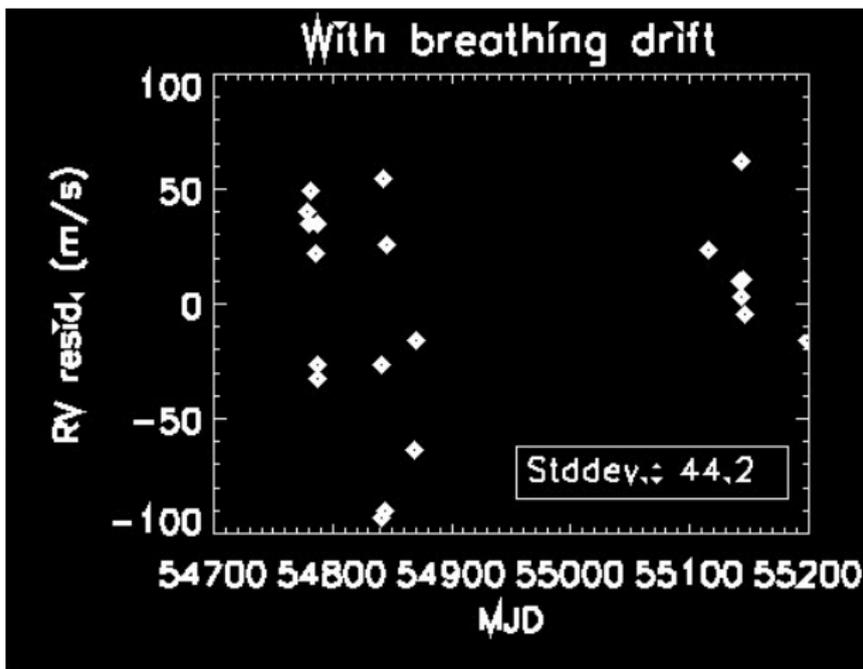
Lots of things included:

- Velocity shift
- Rotational broadening
- Interferometer Comb
- Phase Distortion
- Point Spread Function
- Illumination Profile
- Slant Transform
- Line Spread Function
- Instrument Drift
- Photon Noise
- Readout Noise
- Ghost Contamination

Lessons Learned I: Bugs

- Sign flip in the fine-scale RV extractor
- Phase-to-velocity conversion approximation improved
- Final Julian Dates were exposure starts instead of flux-centred Julian Dates from header

Lessons Learned III: Problems



44 m/s is a lot...

Meta-Lessons Learned

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Moral: A simulator, and associated reduction pipeline, delivered at the same time as the instrument could have saved the project.

LSST



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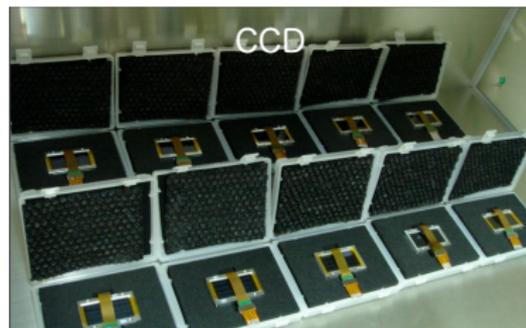
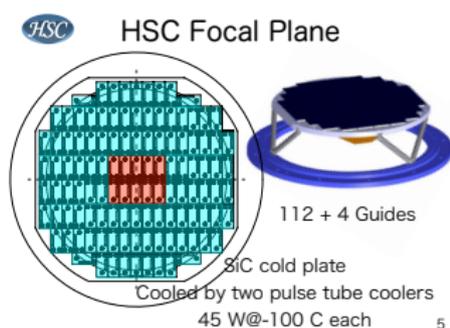
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HSC on Subaru (1.8deg^2)

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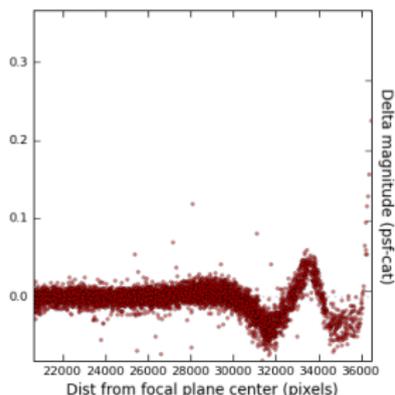
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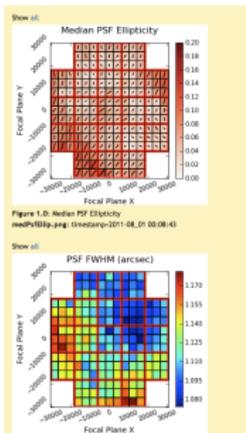
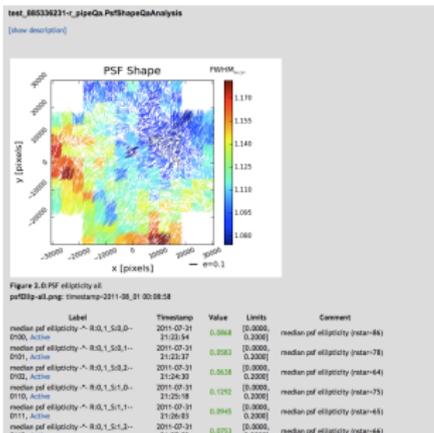
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Problems in techniques for simulating objects and background:



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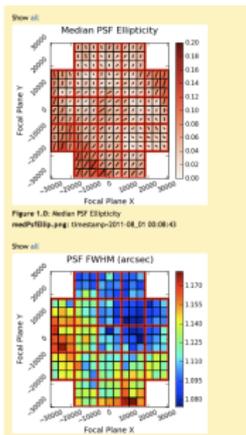
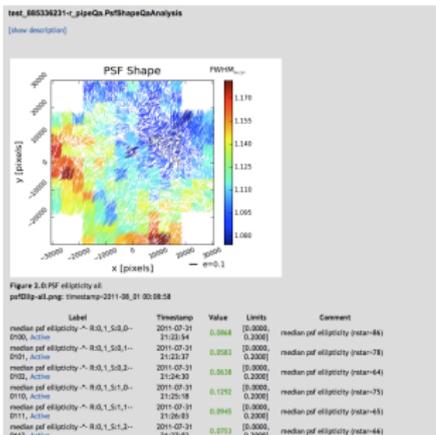
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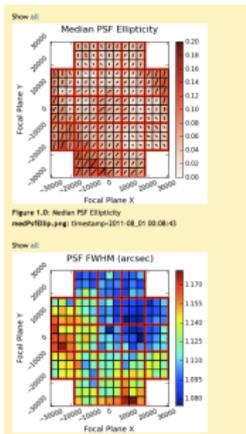
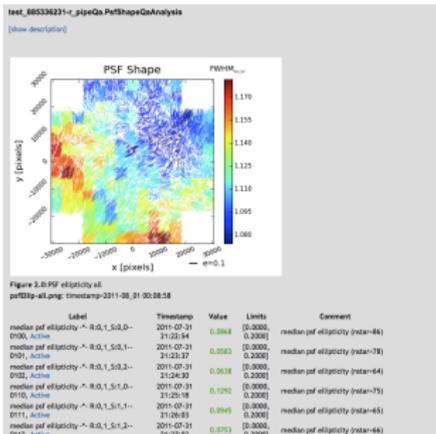
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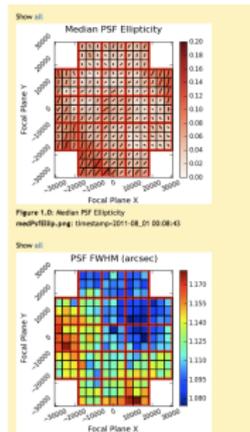
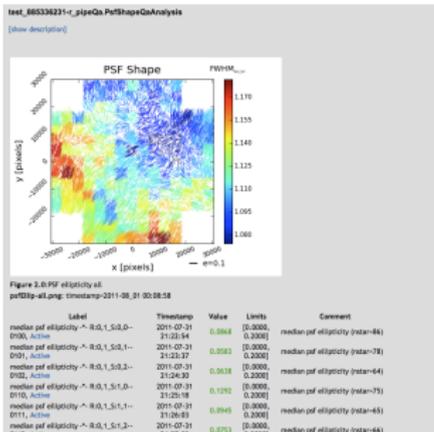
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Is this correct? Does it matter? It depends. For predicting weak lensing, Yes. For developing codes, probably No.

LSSTDC3bPT1.2

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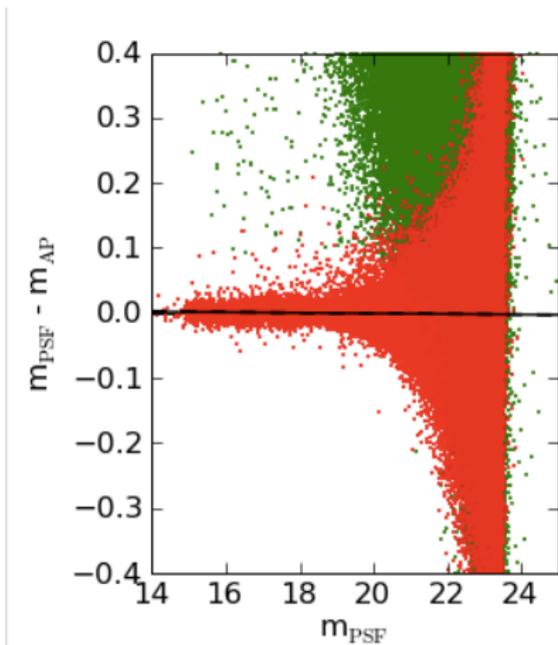
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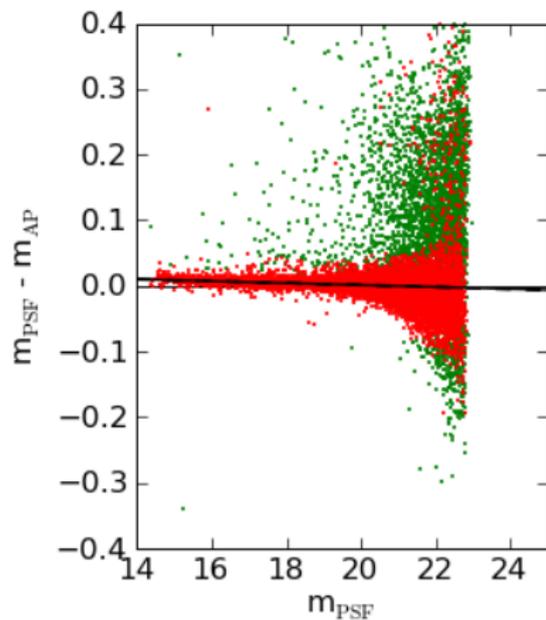
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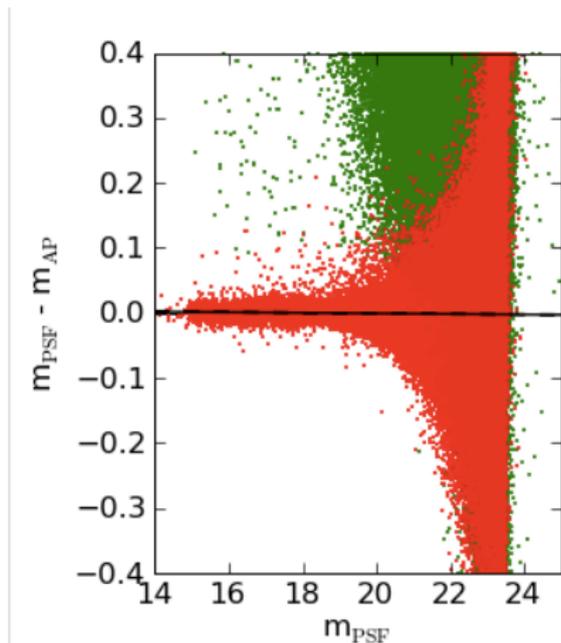


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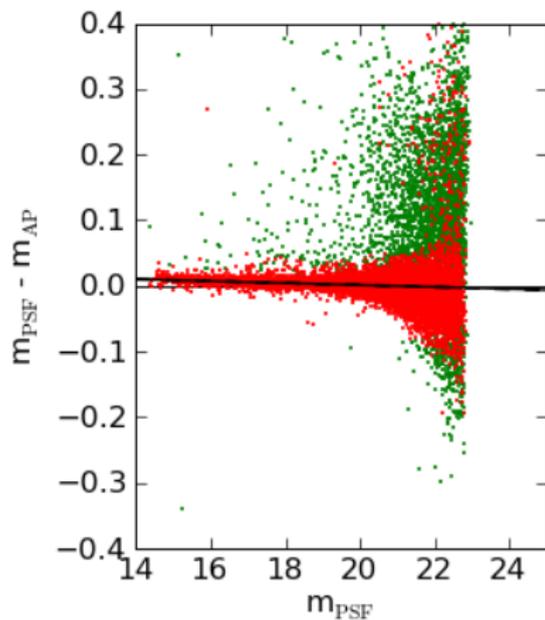


SuprimeCam

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LSST ImSim



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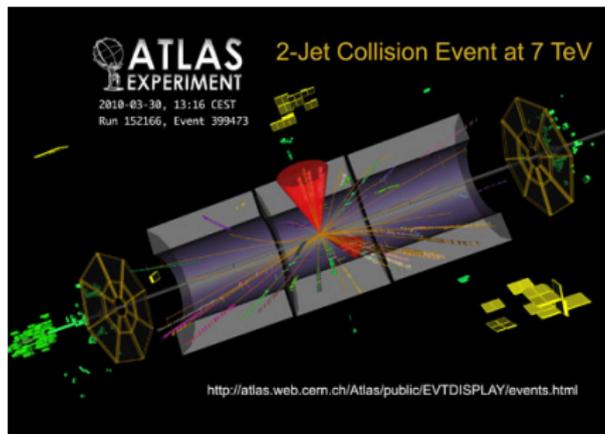
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i.e. it's an arms race; the sims must keep a step ahead of the pipelines.

When Should we Stop Simulating?



It's important that we're convinced our Monte Carlo simulation and our data match, because we're deriving our calibrations from the Monte Carlo," explains Kerstin Perez. [Monte Carlo allows us to understand] how jets shower and progress through the detector – "an incredibly complicated process that no-one can really describe fully"