

Solar System Science from the Dark Energy Camera Deep Drilling Field Survey

Steven Stetzler

with: Mario Juric, Yasin Chowdhury, Aren Heinze, Melissa Graham

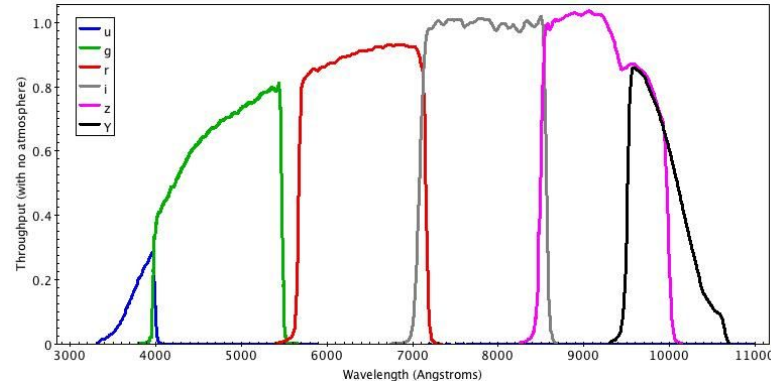
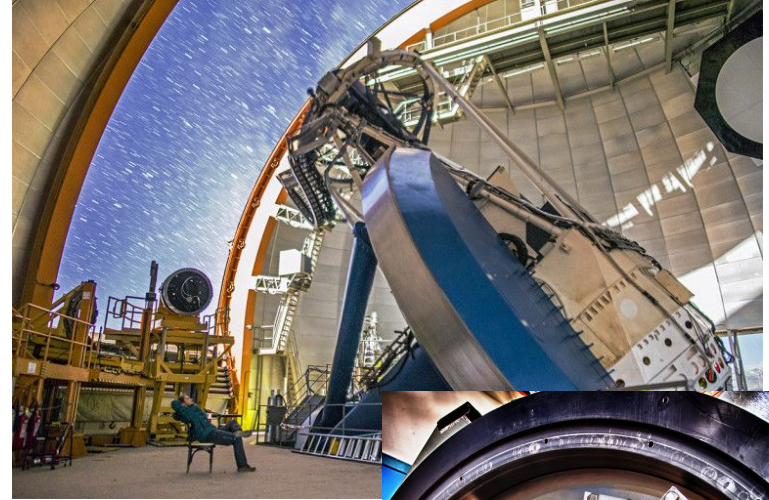


Outline

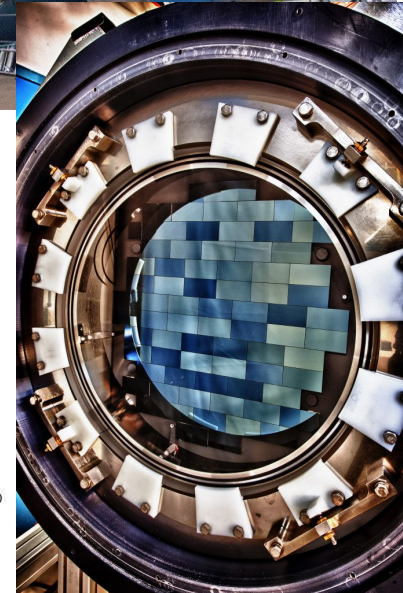
- The Dark Energy Camera (DECam) and the Deep Drilling Field (DDF) Survey
- The upcoming Legacy Survey of Space and Time (LSST)
- Processing image data with the LSST Science Pipelines
- Solar system science: discovery and characterization of main belt asteroids
- Shift-and-stack for faint object detection: towards discovery of Planet IX in the first year of LSST data

Dark Energy Camera (DECam)

- Mounted on the 4m Blanco telescope in Chile
- Camera composed of 62 2K x 4K CCDs
- In front of the camera, one of several “photometric filters” are placed: g, r, i

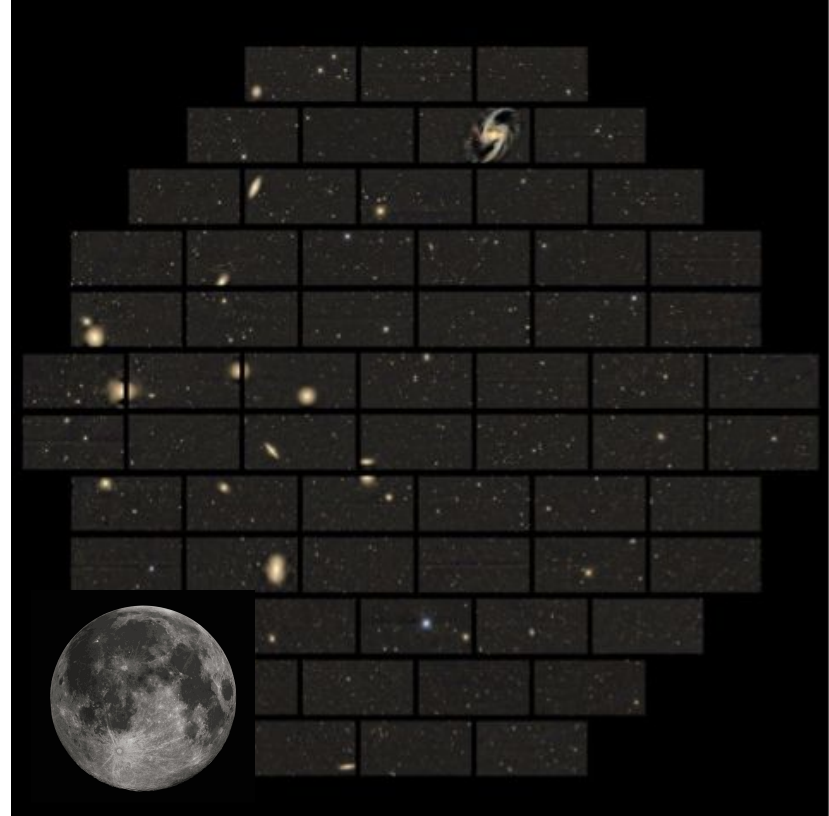


violet green
blue red infrared →



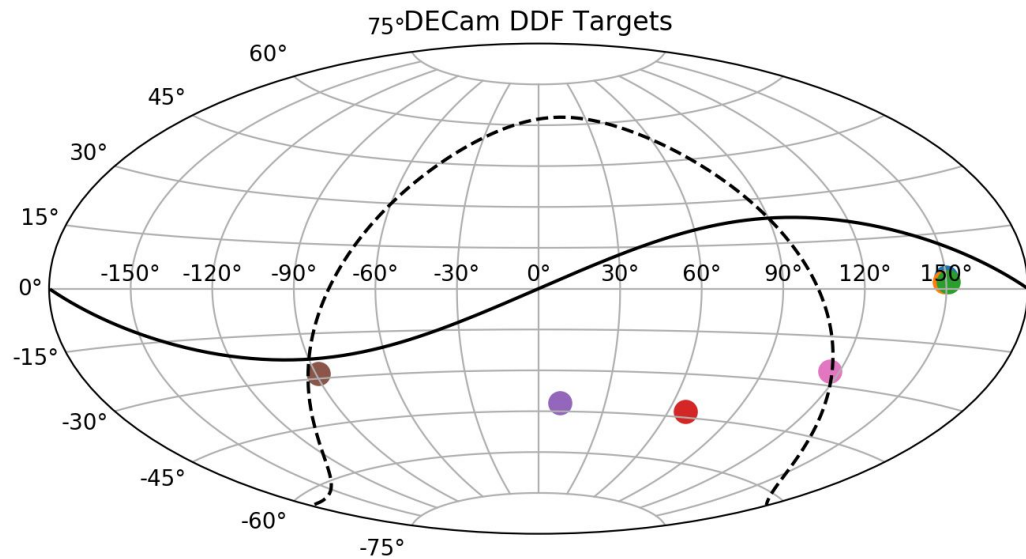
Dark Energy Camera (DECam)

- Mounted on the 4m Blanco telescope in Chile
- Camera composed of 62 2K x 4K CCDs
- In front of the camera, one of several “photometric filters” are placed: g, r, i, z
- A wide field field of view: $\sim 3 \text{ deg}^2$



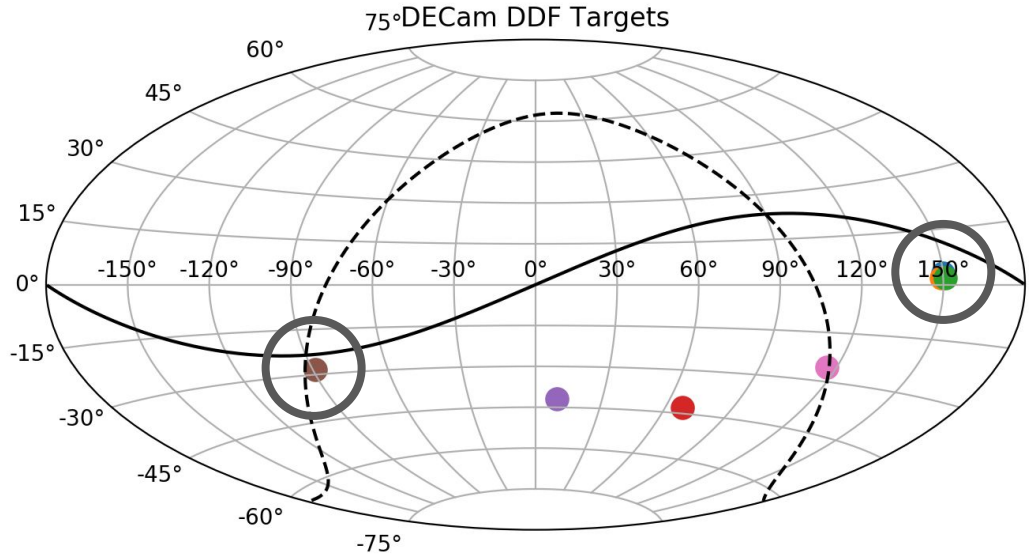
DECam Deep Drilling Field (DDF) Survey

- 7 regions of the sky observed every 3 nights with 5 exposures in gri+z to $r \sim 23.5$ from March-June 2021 and still in-progress



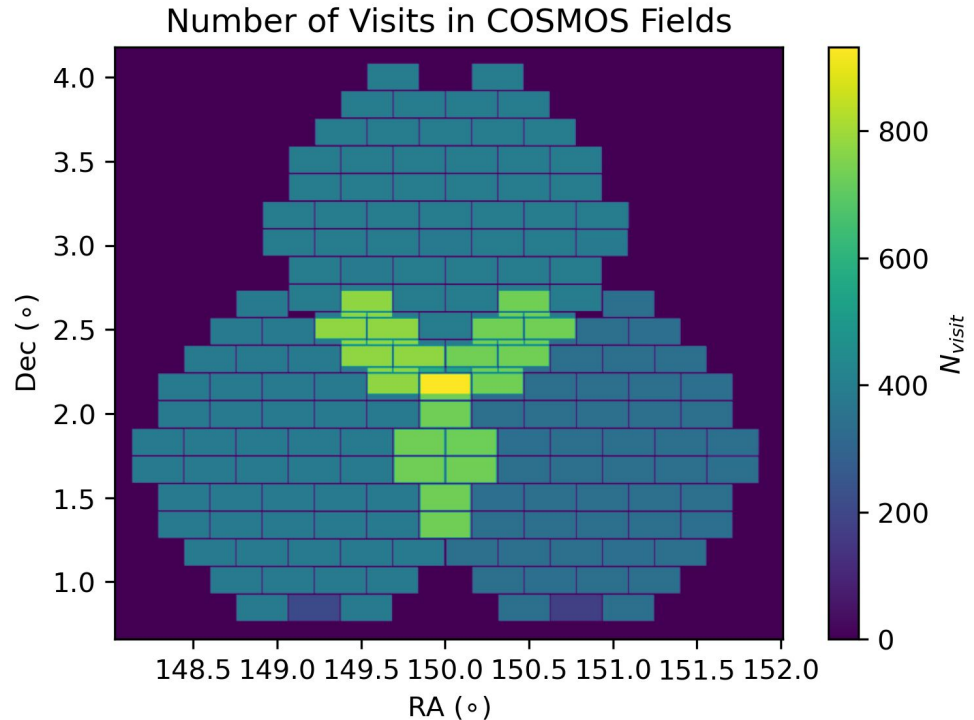
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- 4 pointings on the sky within 10 deg of the ecliptic



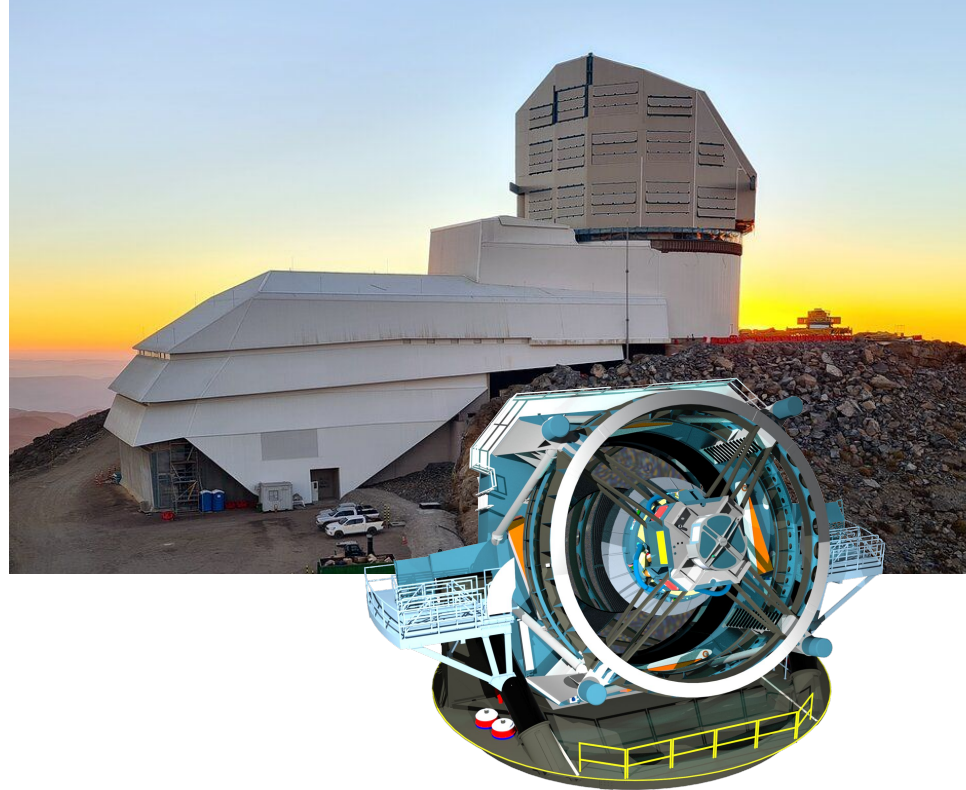
DECam Deep Drilling Field (DDF) Survey

- 7 regions of the sky observed every 3 nights with 5 exposures in gri+z to $r \sim 23.5$ from March-June 2021 and still in-progress
- 4 pointings on the sky within 10 deg of the ecliptic
- The 300-900 multi-filter images provide a rich dataset for studying variable stars, supernovae and solar system objects



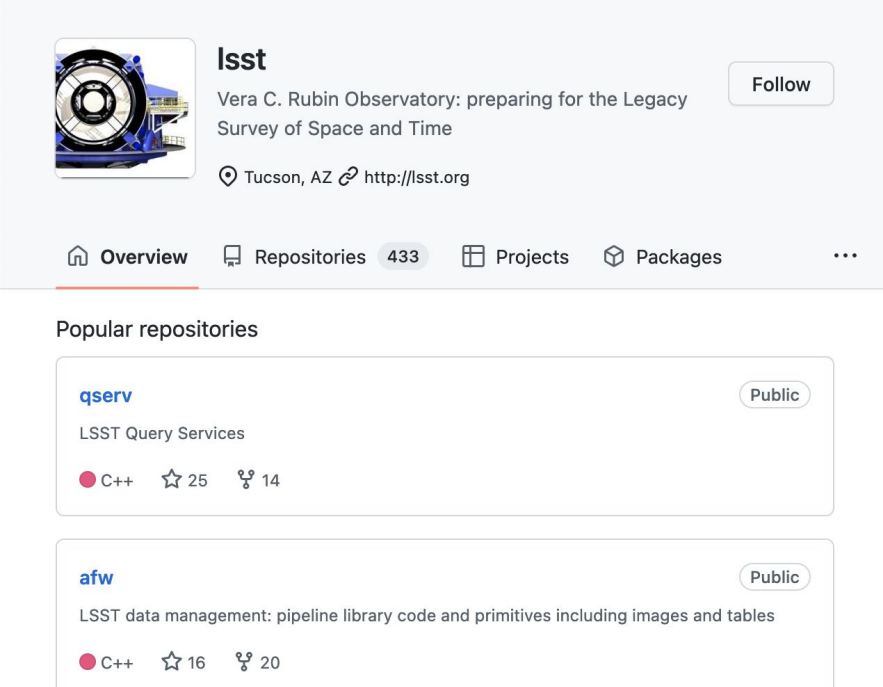
A Precursor to the Legacy Survey of Space and Time

- This survey is a **direct precursor** to the Deep Drilling Fields of the Legacy Survey of Space and Time (LSST), the **next generation survey**. A multi-filter 10-year survey of the entire southern sky
- We are using the DECam DDF dataset to **understand the technical challenges** of processing LSST images and extract **novel solar system science** from them



Data Processing: The LSST Science Pipelines

- Open source image reduction code
- We used the LSST science pipelines to convert ~5TB of raw DECam images to “science ready” images, readying the pipelines for production use on LSST data in ~1-2 years
- Processing scales to 100s of nodes by using distributed computing plugins: HTCondor, Parsl, PanDA



lsst
Vera C. Rubin Observatory: preparing for the Legacy Survey of Space and Time
Tucson, AZ <http://lsst.org>

Overview Repositories 433 Projects Packages

Popular repositories

qserv Public
LSST Query Services
C++ ☆ 25 🍴 14

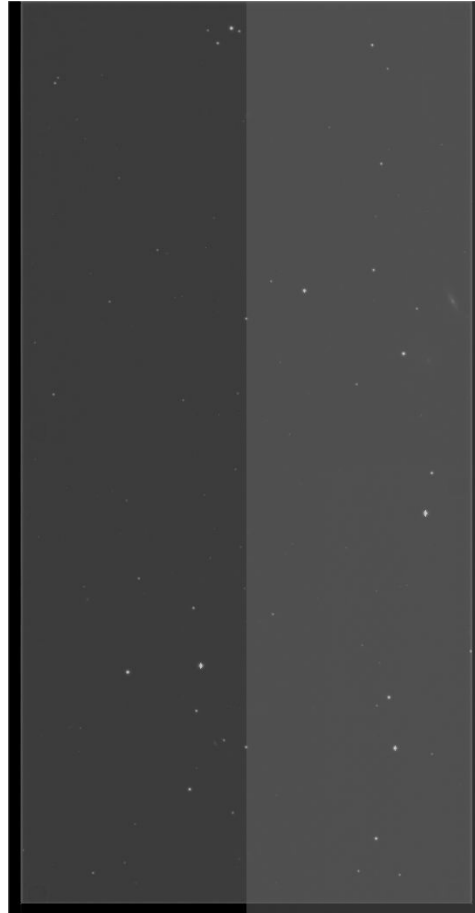
afw Public
LSST data management: pipeline library code and primitives including images and tables
C++ ☆ 16 🍴 20

<https://github.com/lsst>

Data Processing

- Raw images contain signatures of the camera and the observing environment

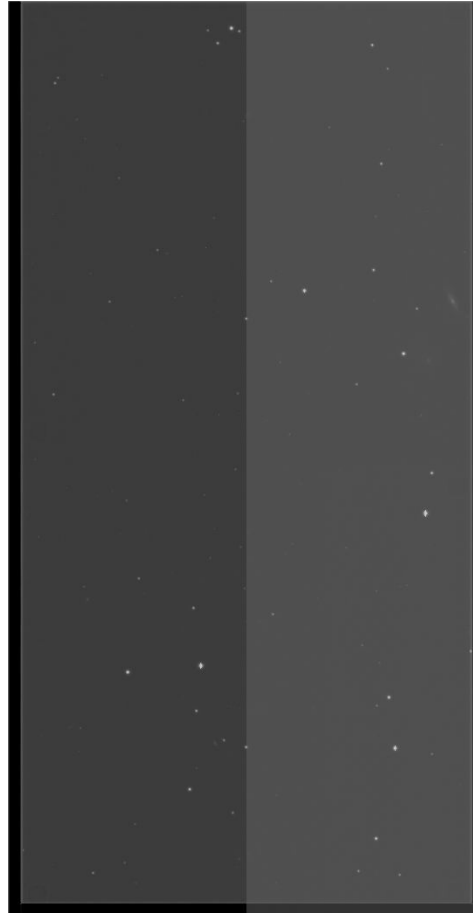
Raw Image



Data Processing

- Raw images contain signatures of the camera and the observing environment
- Calibration makes them science ready

Raw Image



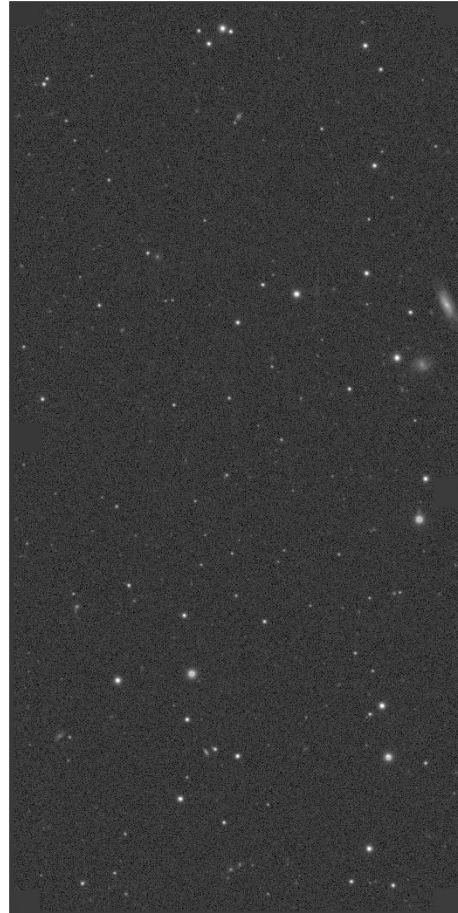
Calibrated Image



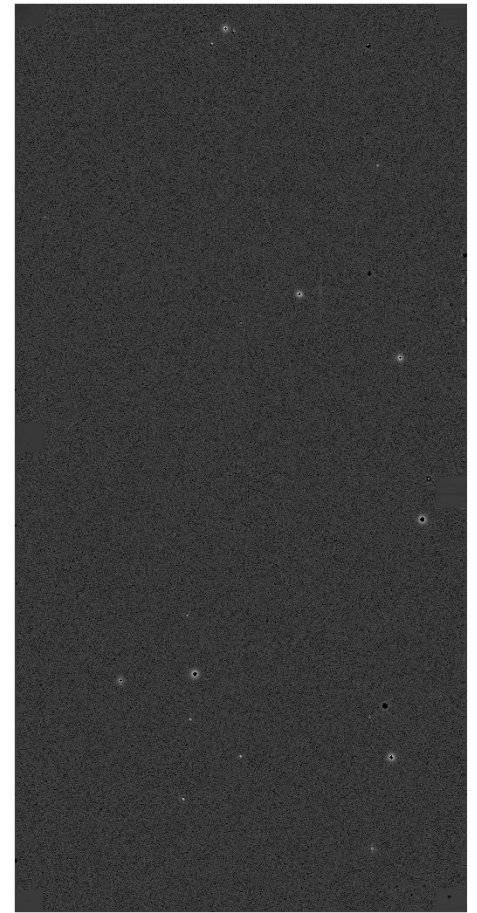
Data Processing

- Raw images contain signatures of the camera and the observing environment
- Calibration makes them science ready
- A model of the sky -- a “template image” -- is subtracted from the calibrated exposure producing a difference image: **variable sources appear in these images**

Calibrated Image



Difference Image



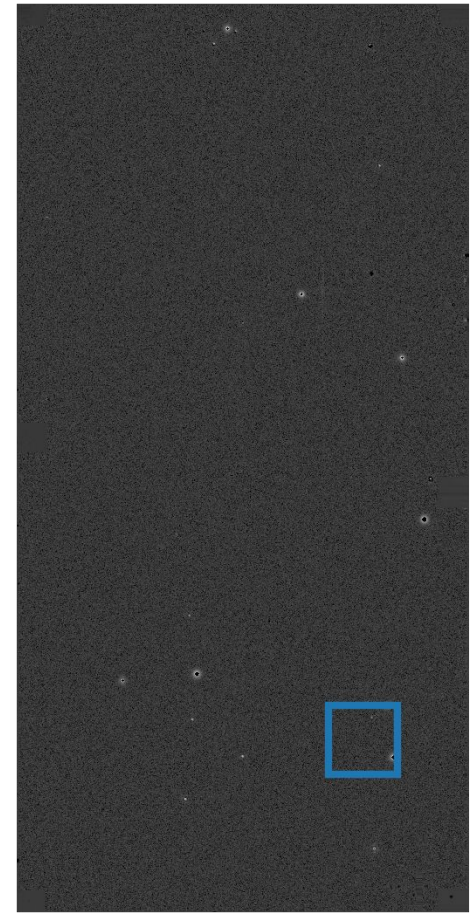
Data Processing

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Calibrated Image



Difference Image

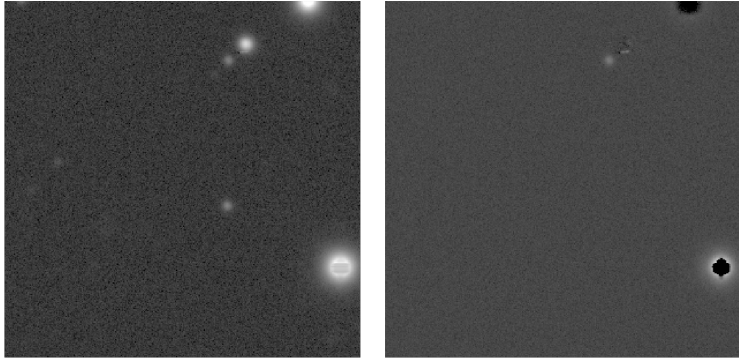


Data Processing

Exposure 1 Band r

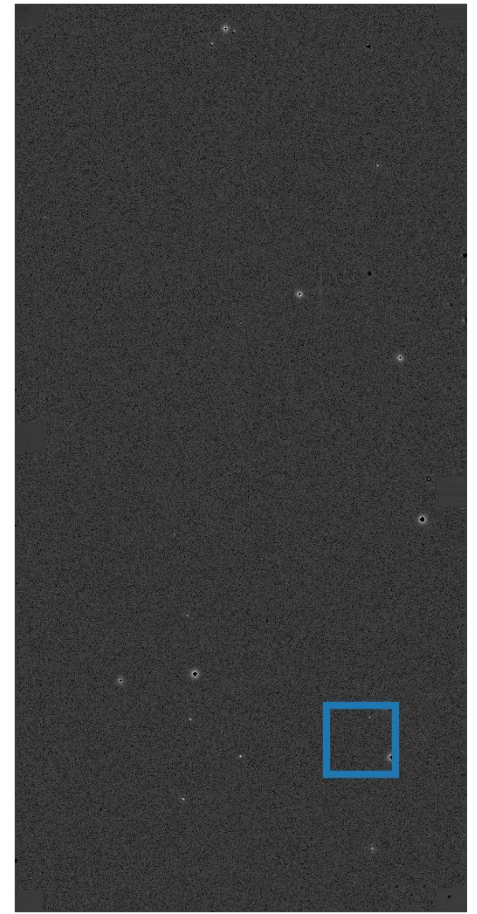
Calibrated Image

Difference Image



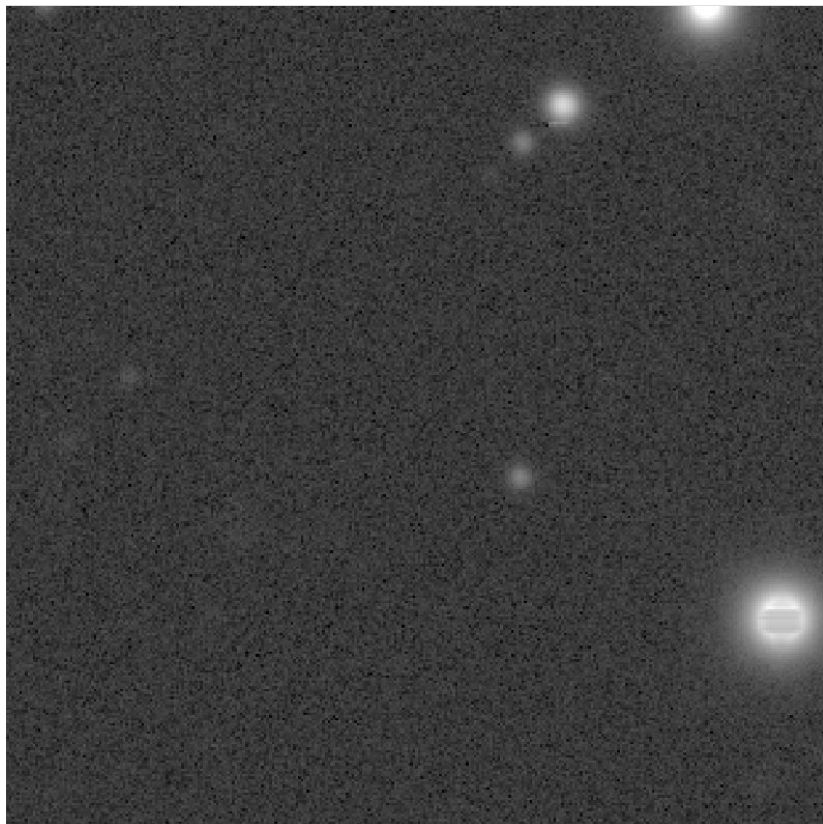
Calibrated Image

Difference Image

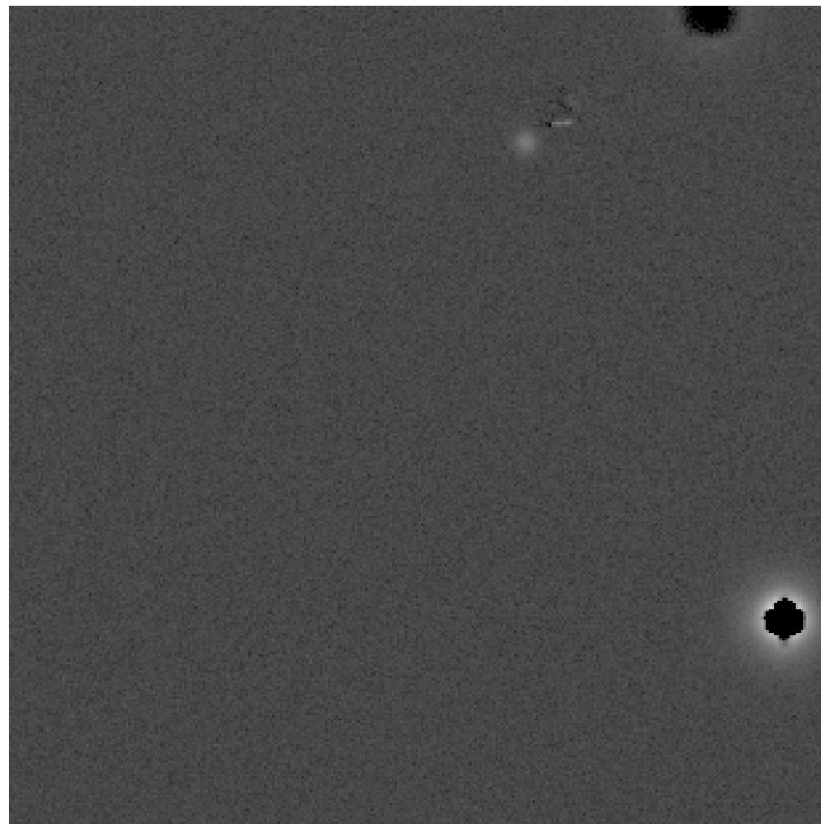


Exposure 1 Band r

Calibrated Image

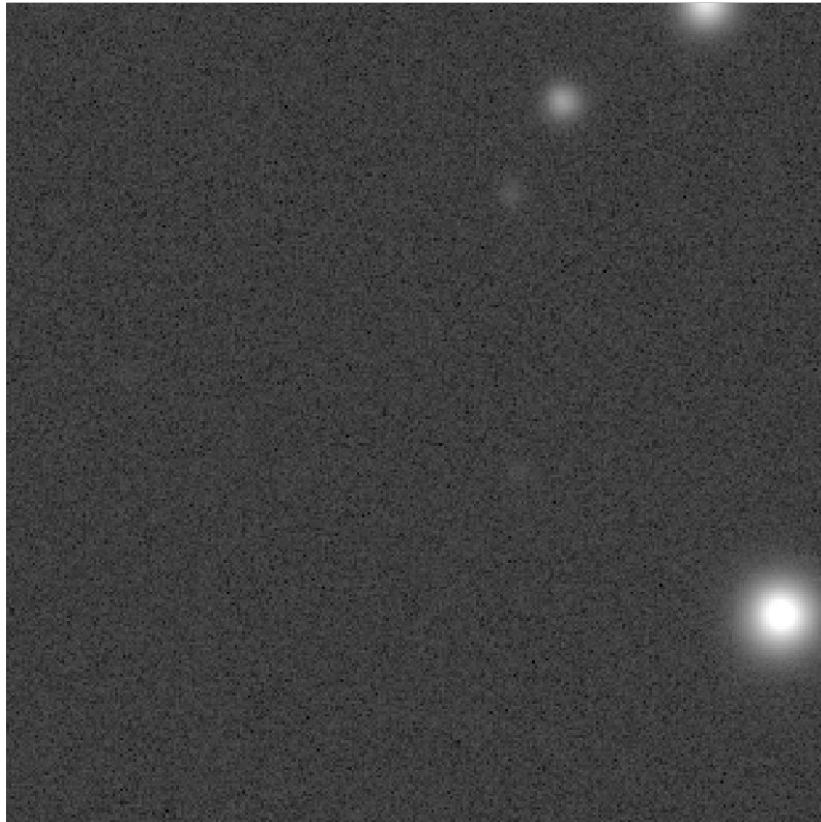


Difference Image

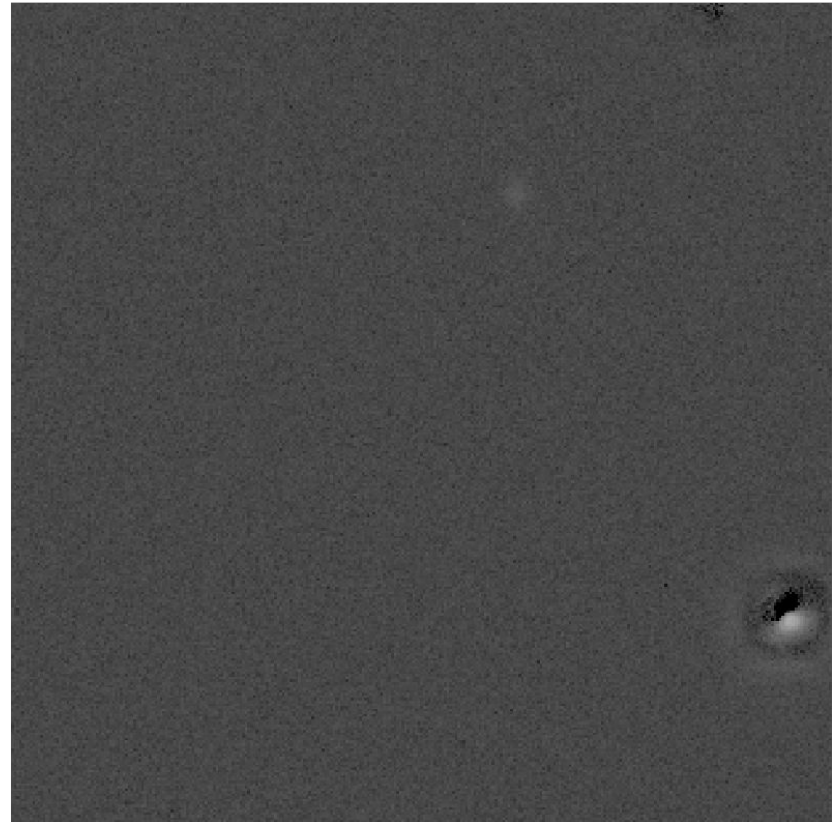


Exposure 2 Band g

Calibrated Image

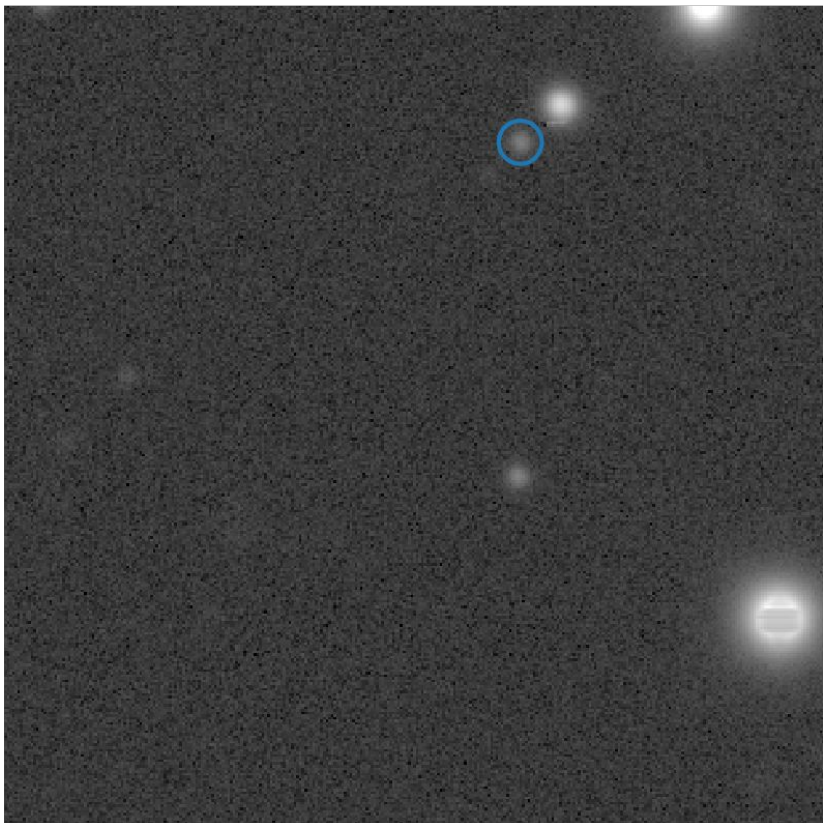


Difference Image

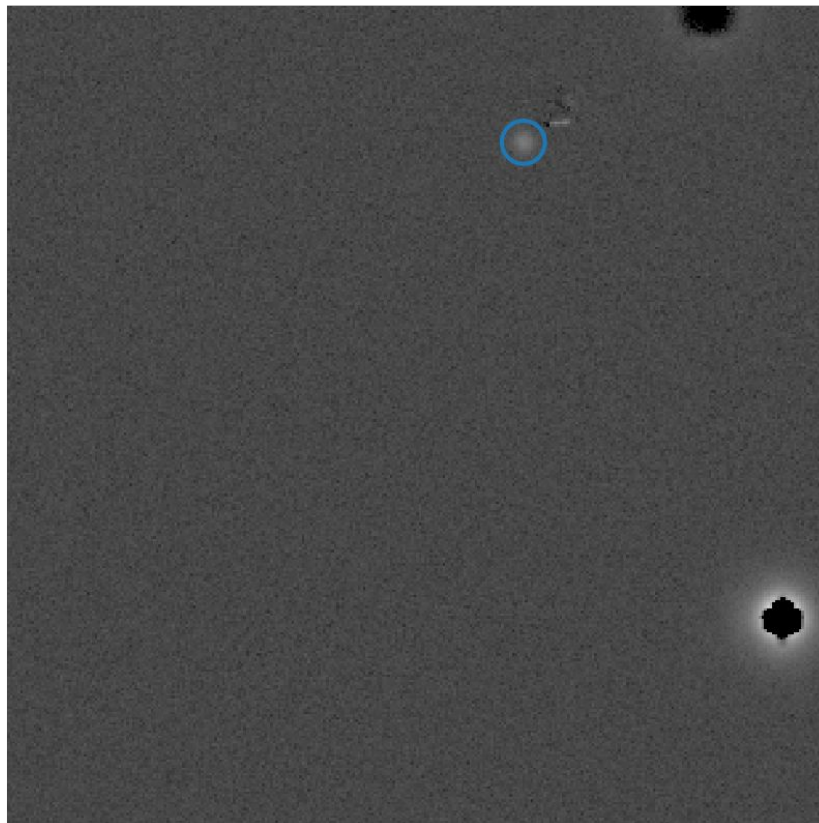


Exposure 1 Band r

Calibrated Image

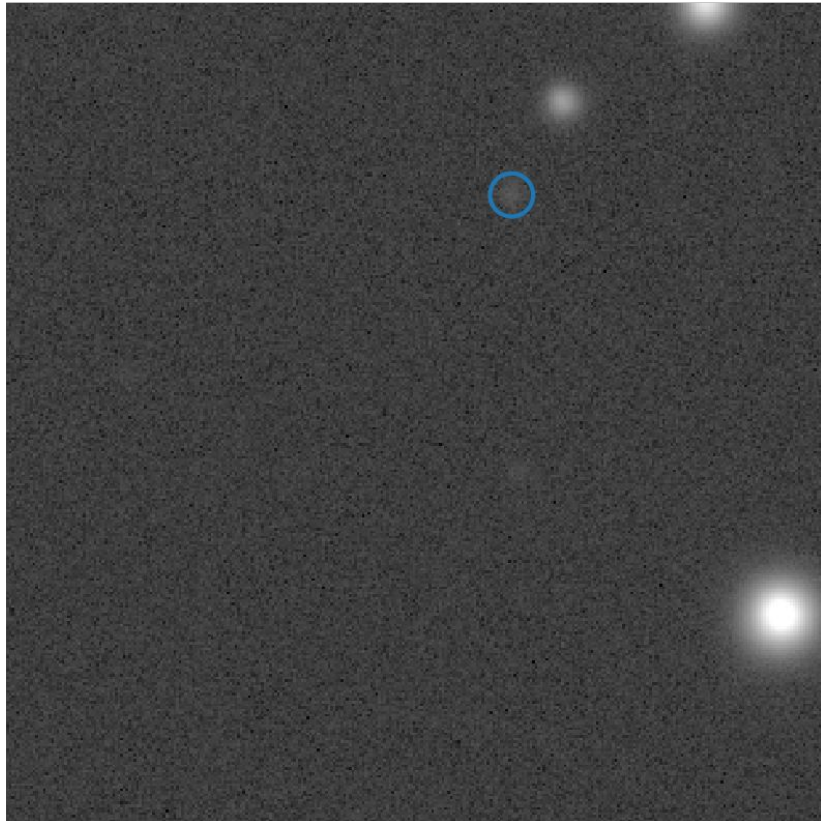


Difference Image

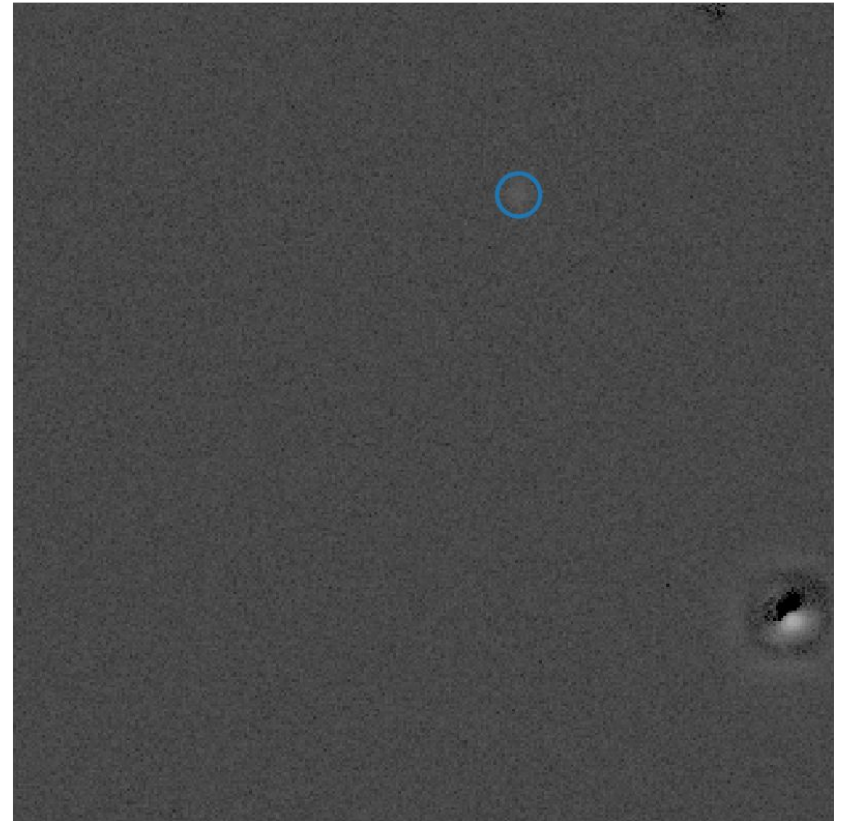


Exposure 2 Band g

Calibrated Image

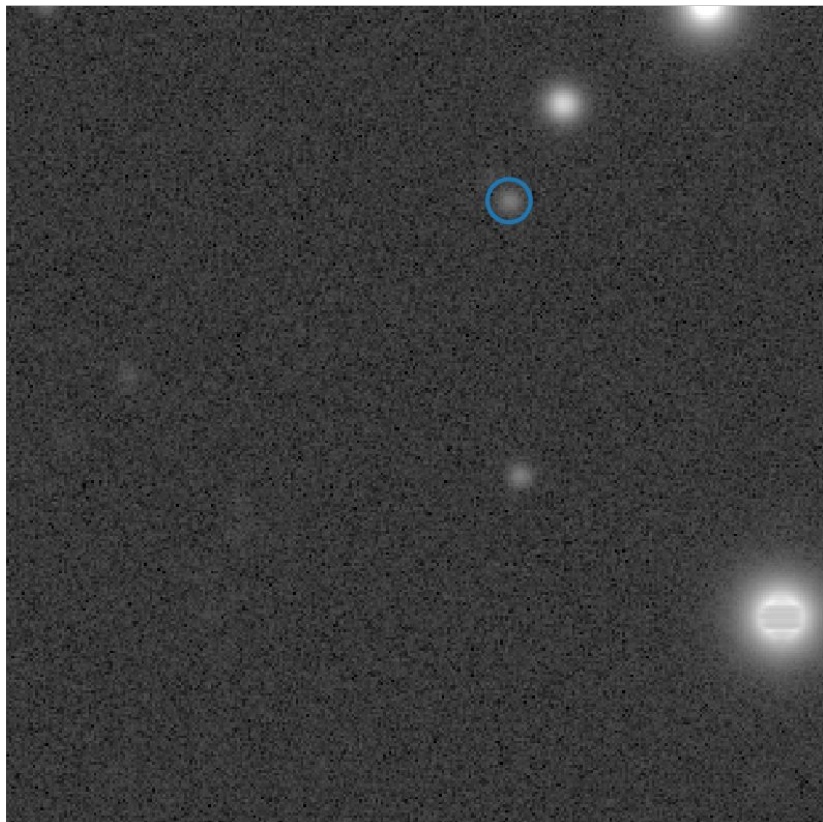


Difference Image

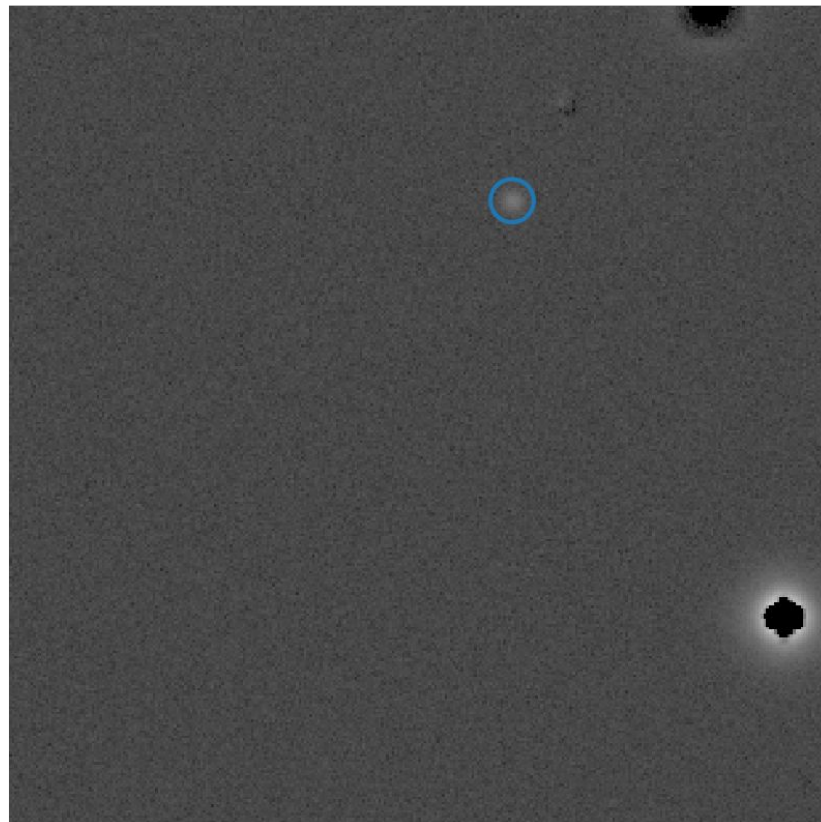


Exposure 3 Band r

Calibrated Image



Difference Image

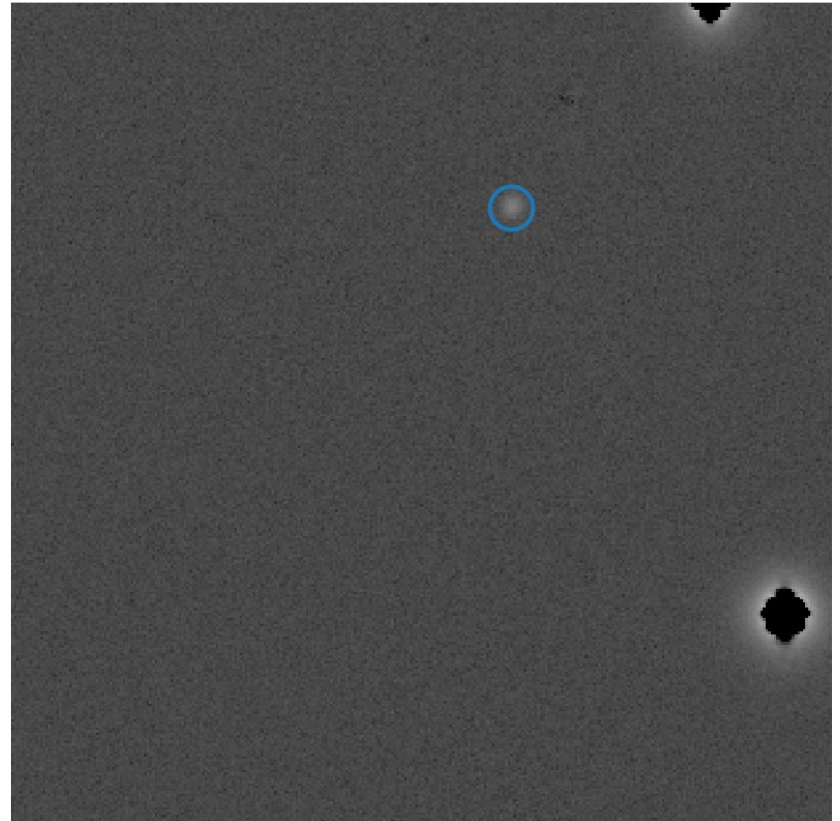


Exposure 4 Band i

Calibrated Image

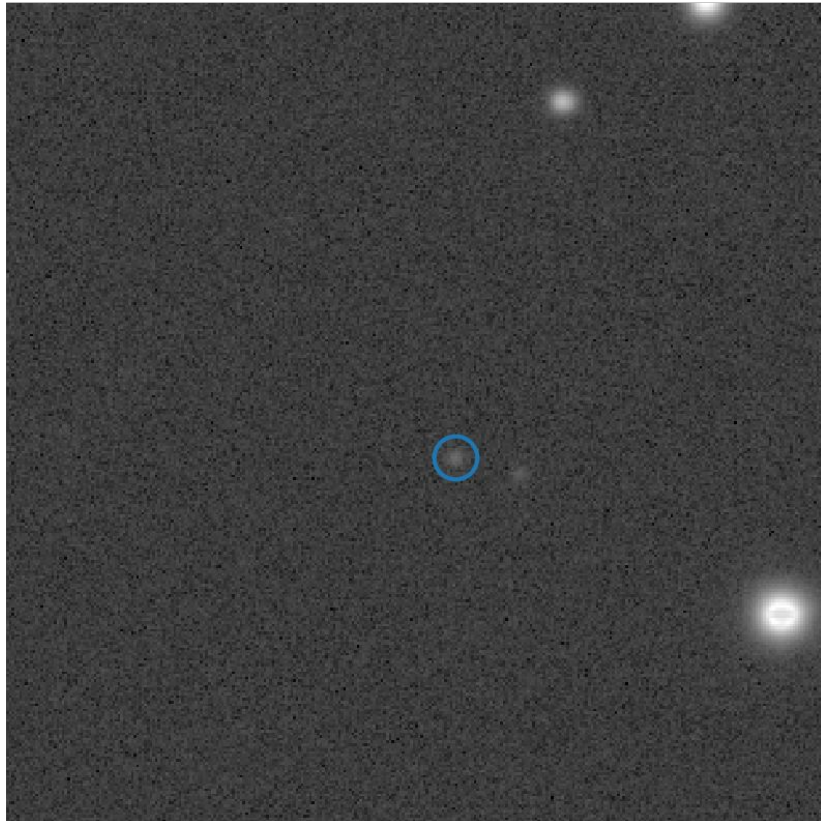


Difference Image

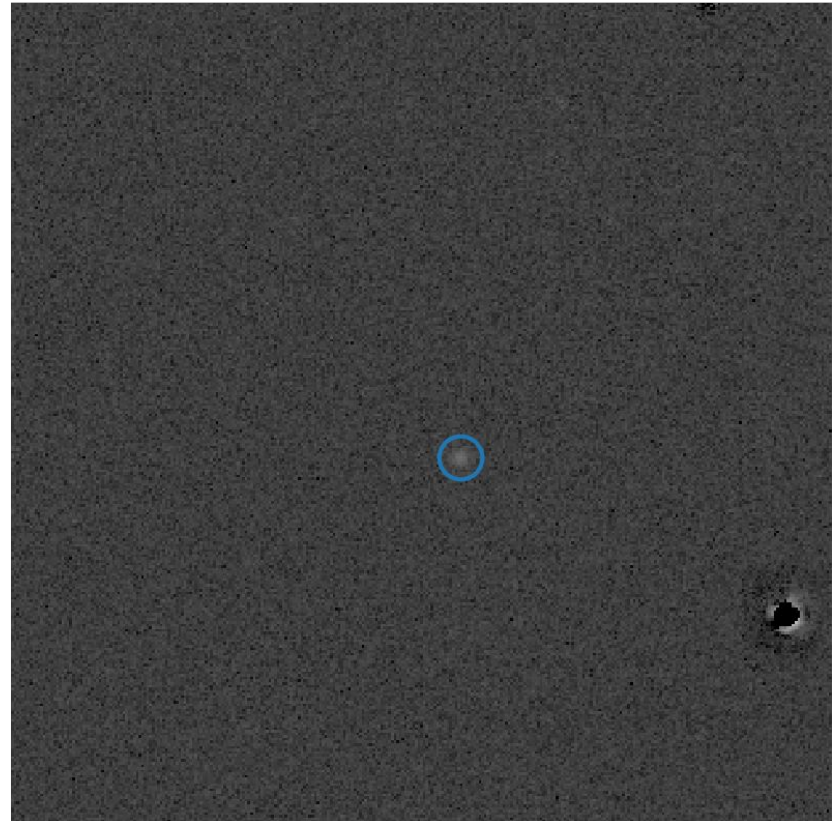


Exposure 5 Band g

Calibrated Image

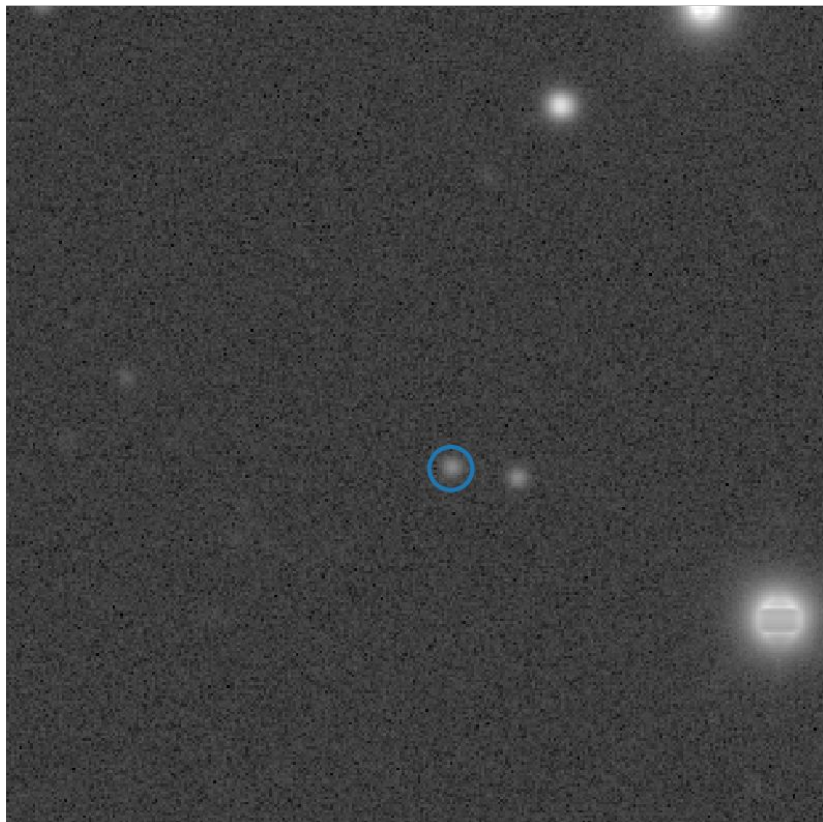


Difference Image

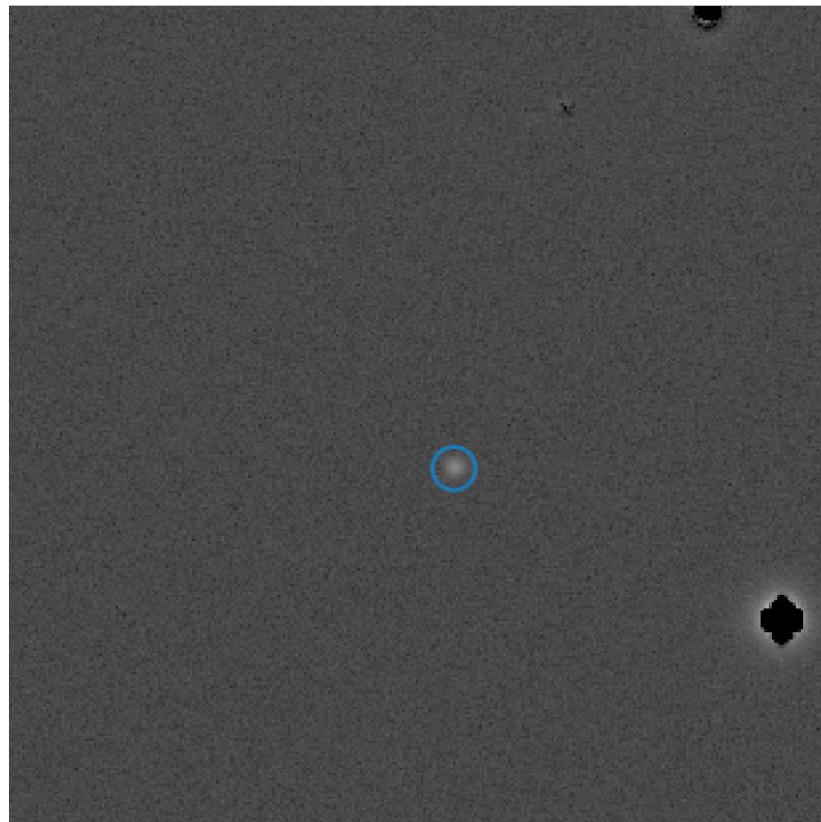


Exposure 6 Band r

Calibrated Image

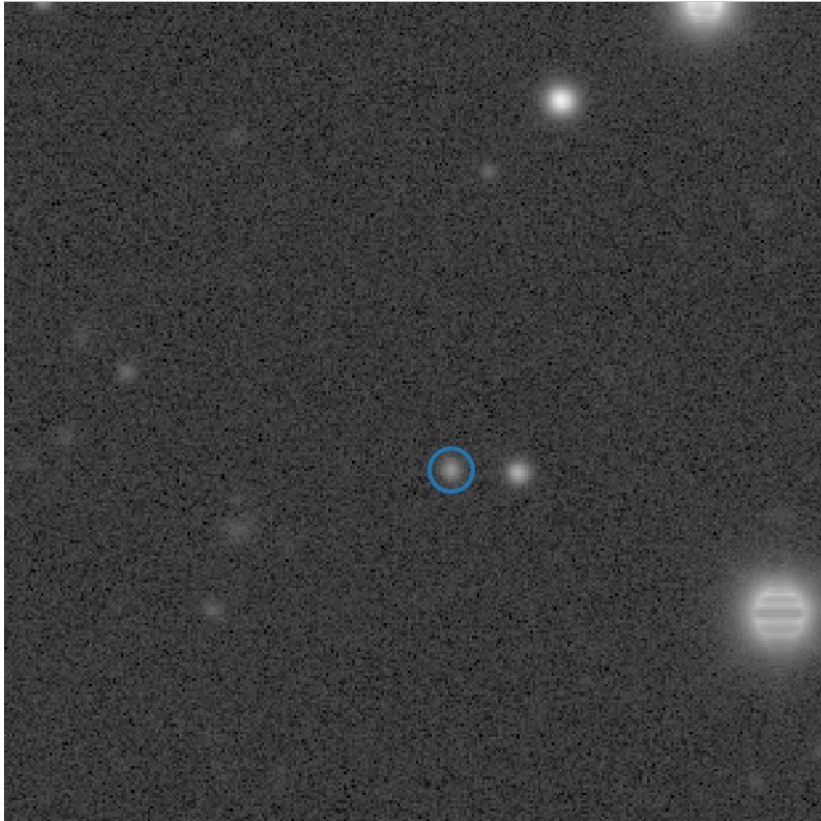


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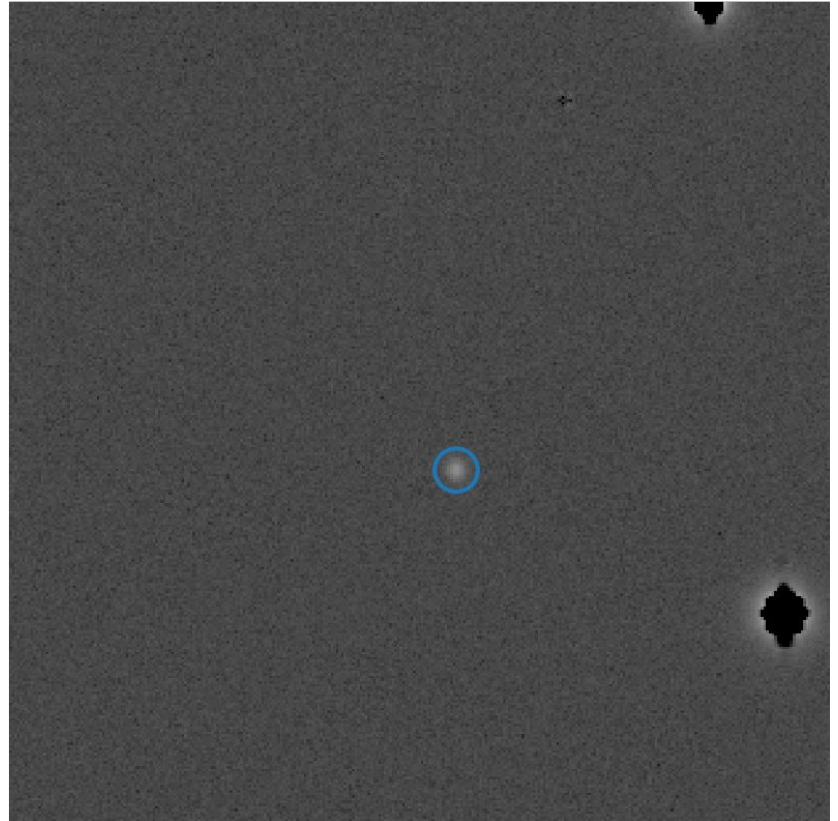


Exposure 7 Band i

Calibrated Image

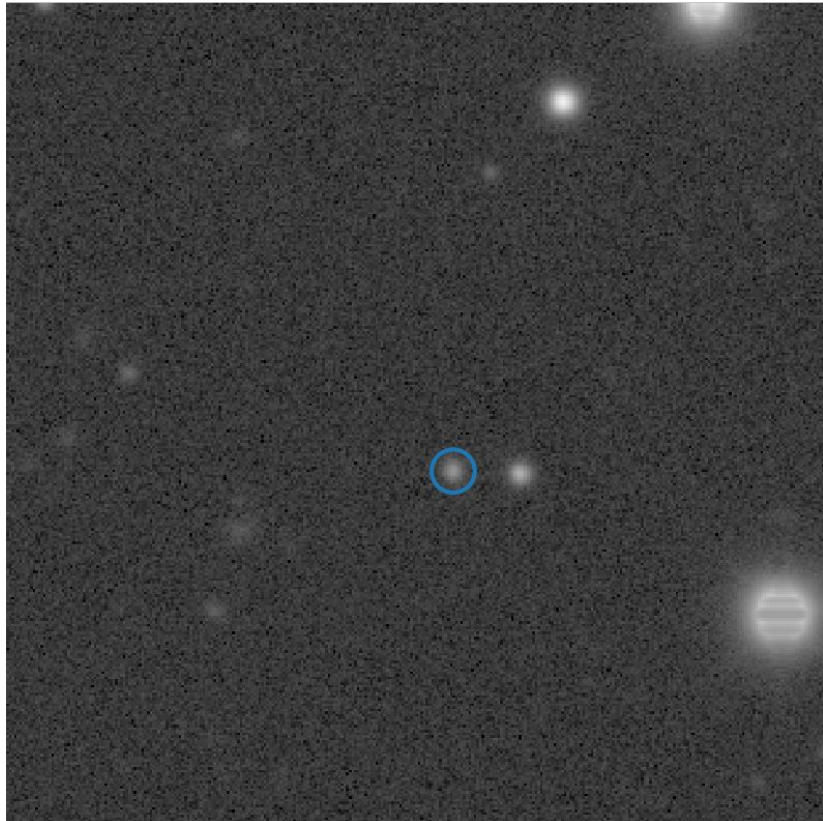


Difference Image

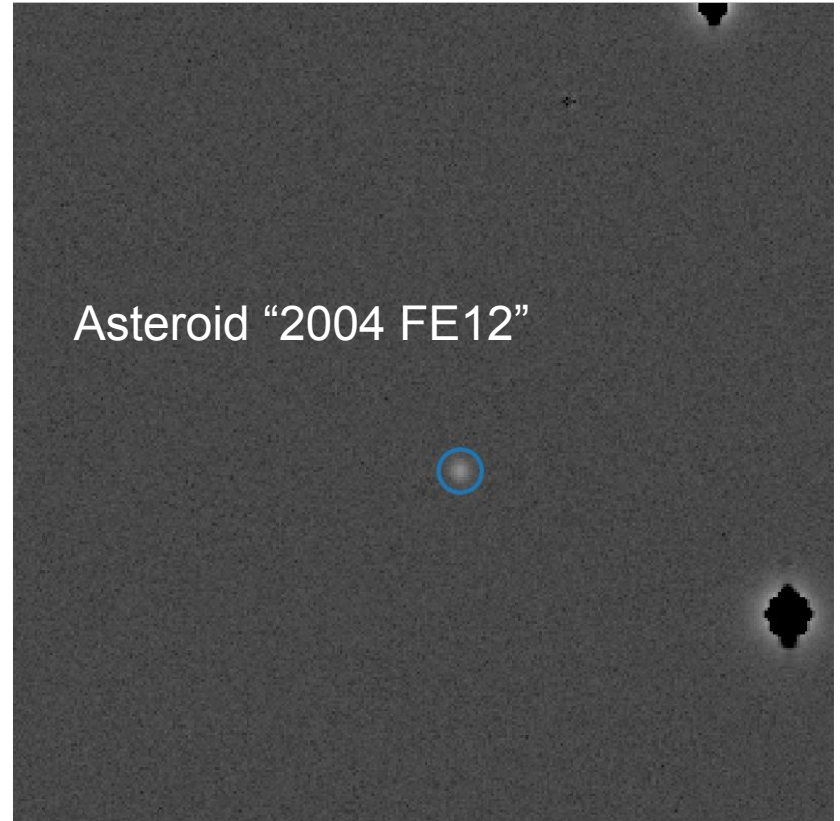


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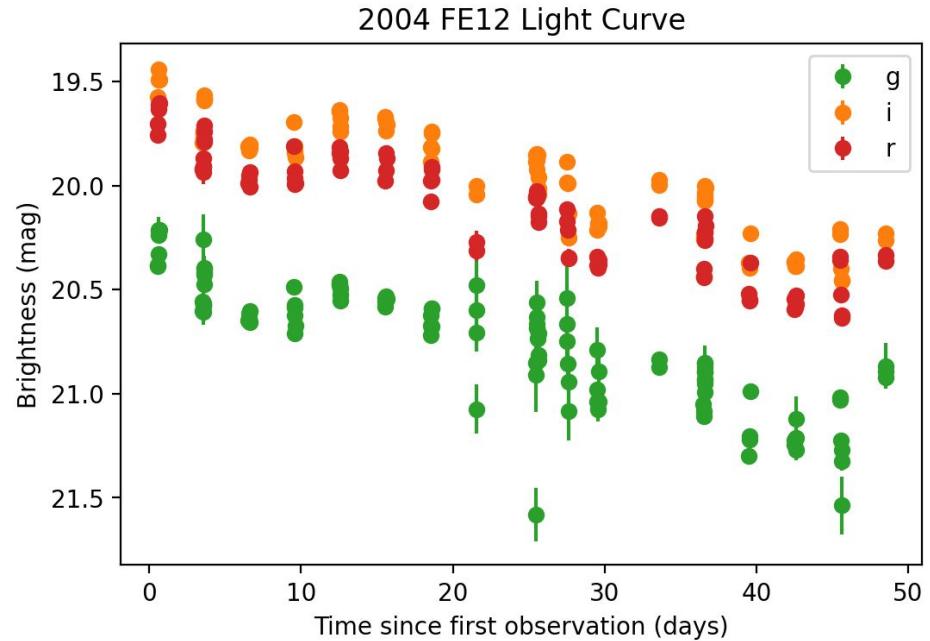


Asteroid Discovery and Characterization

- In this survey, we have observed
~8,000 known asteroids like
2004 FE12
- What can we do with these
observations?

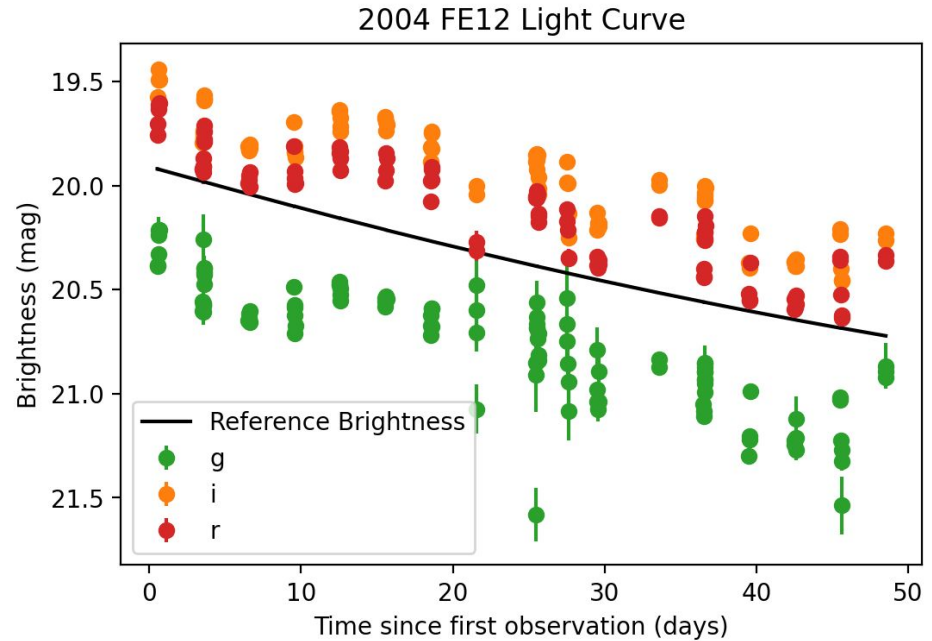
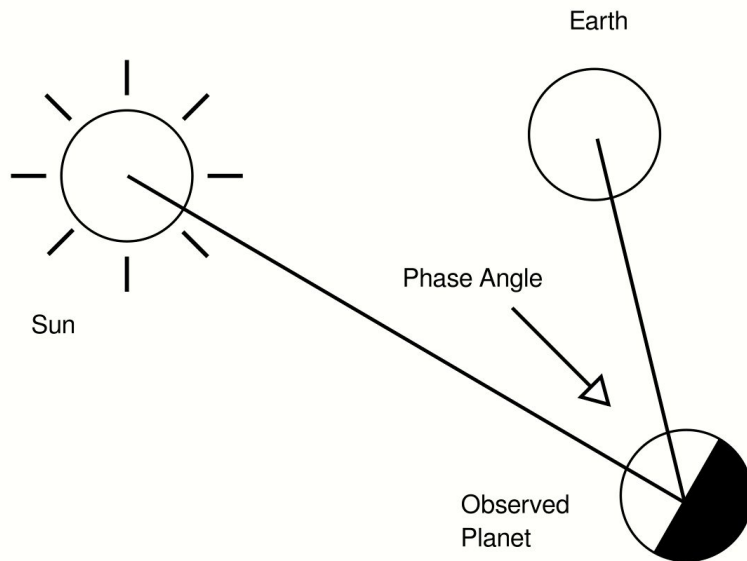
Asteroid Discovery and Characterization

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- We can characterize them through their light curves: how their brightness changes over time



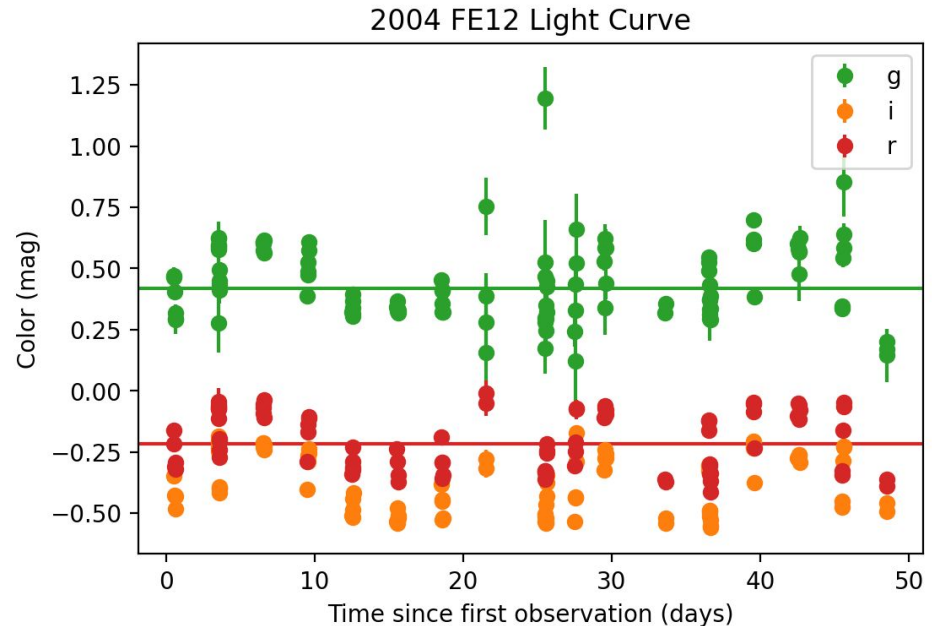
Asteroid Discovery and Characterization

- We can measure the **brightness** of 2004 FE12 over time in **different filters**



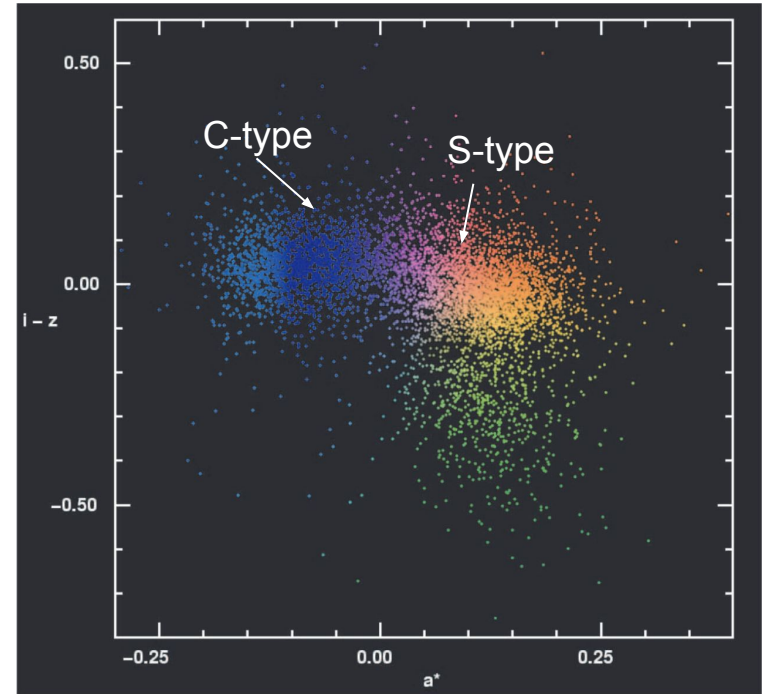
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- The “**color**” of the asteroid can be measured



Asteroid Discovery and Characterization

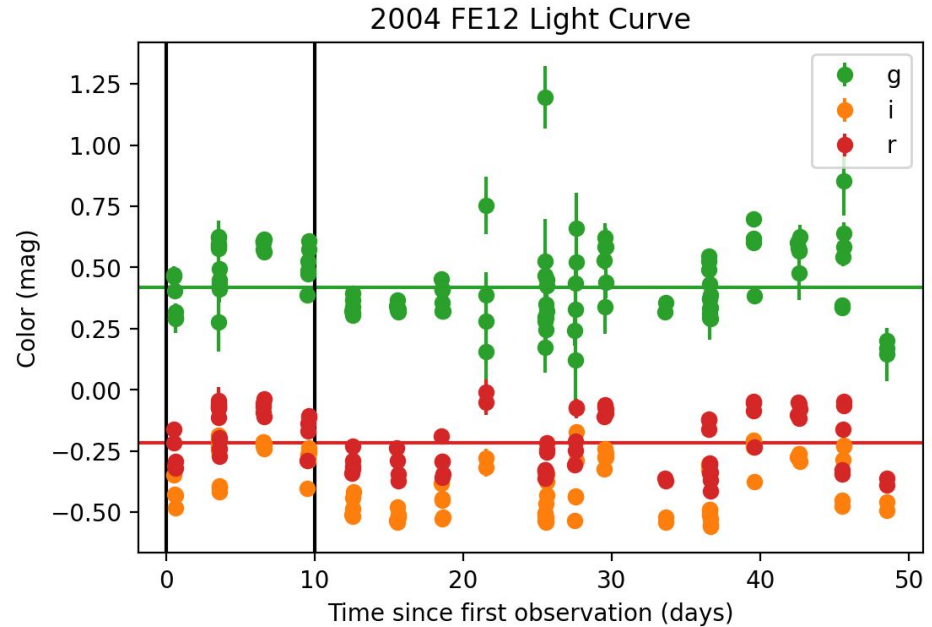
- We can measure the brightness of 2004 FE12 over time in different filters
- The “color” of the asteroid can be measured → proxy for **surface composition**



Credits: Ivezić et al. 2002

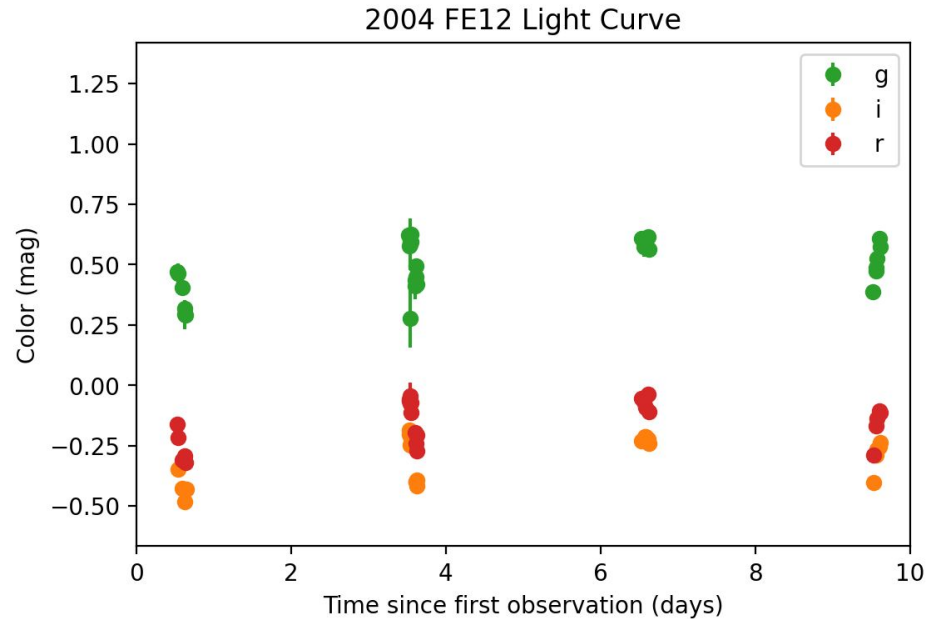
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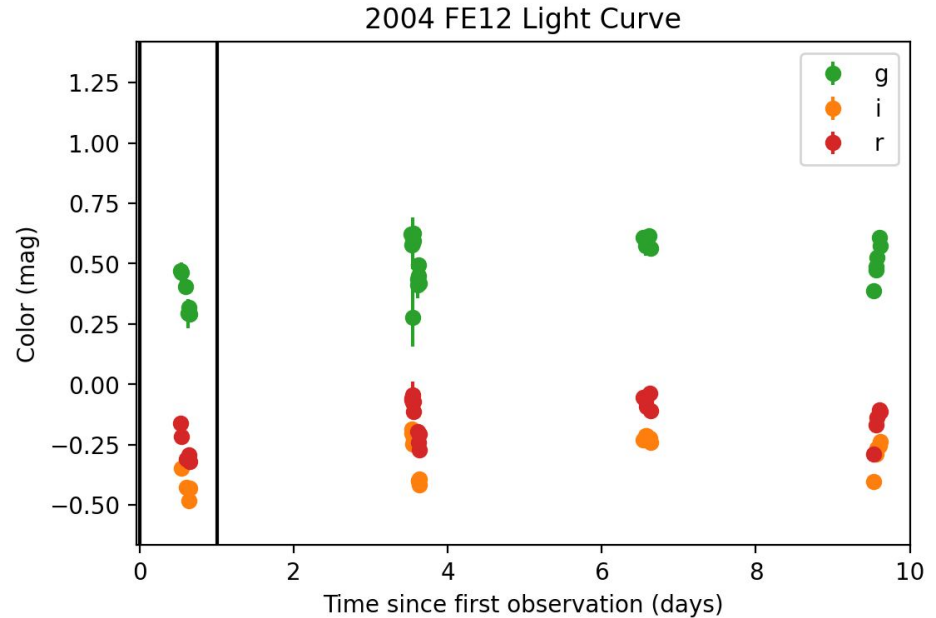
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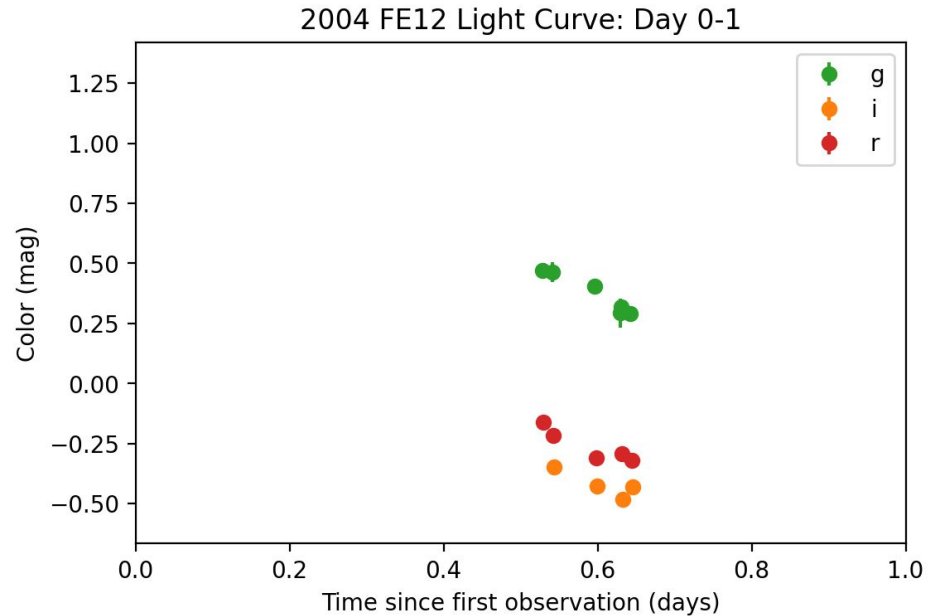
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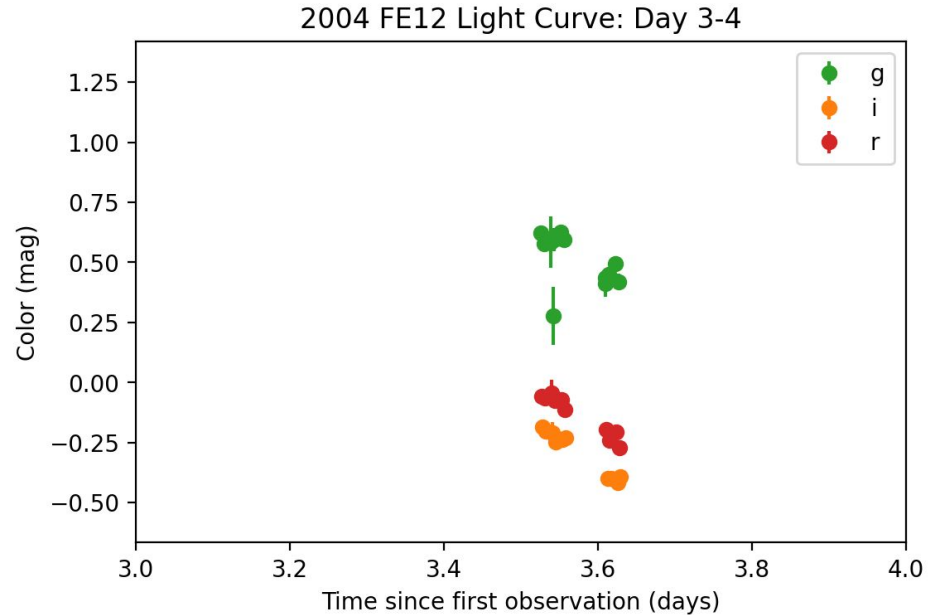
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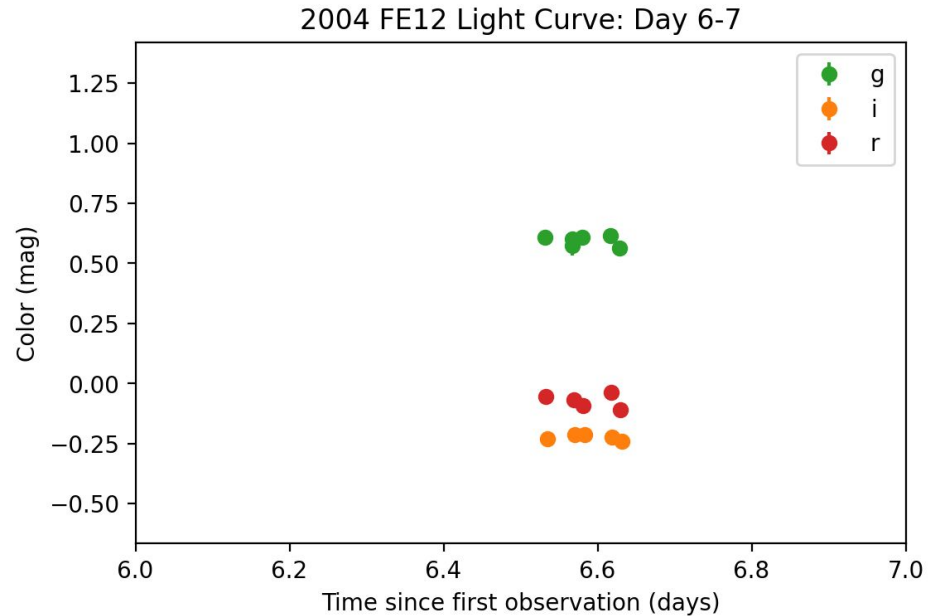
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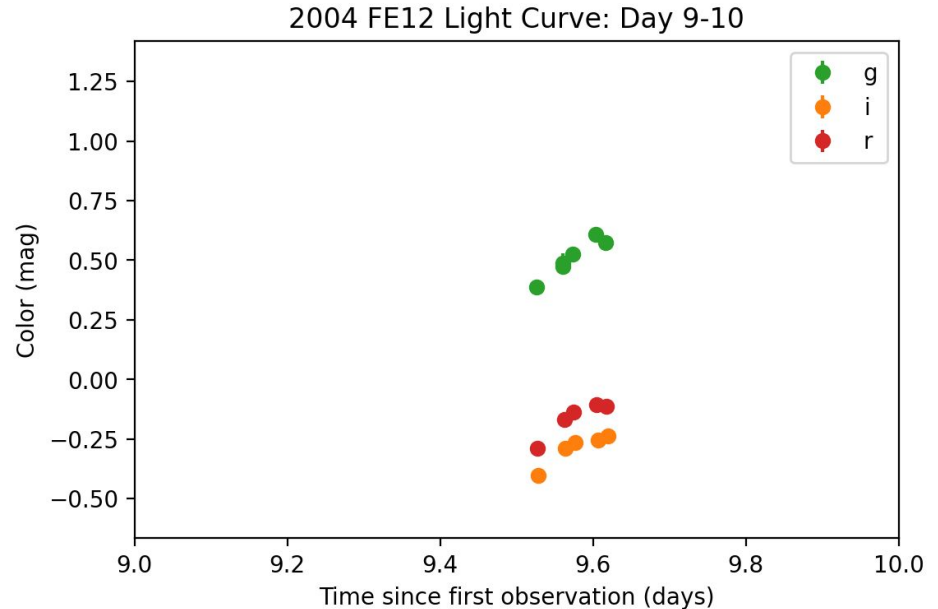
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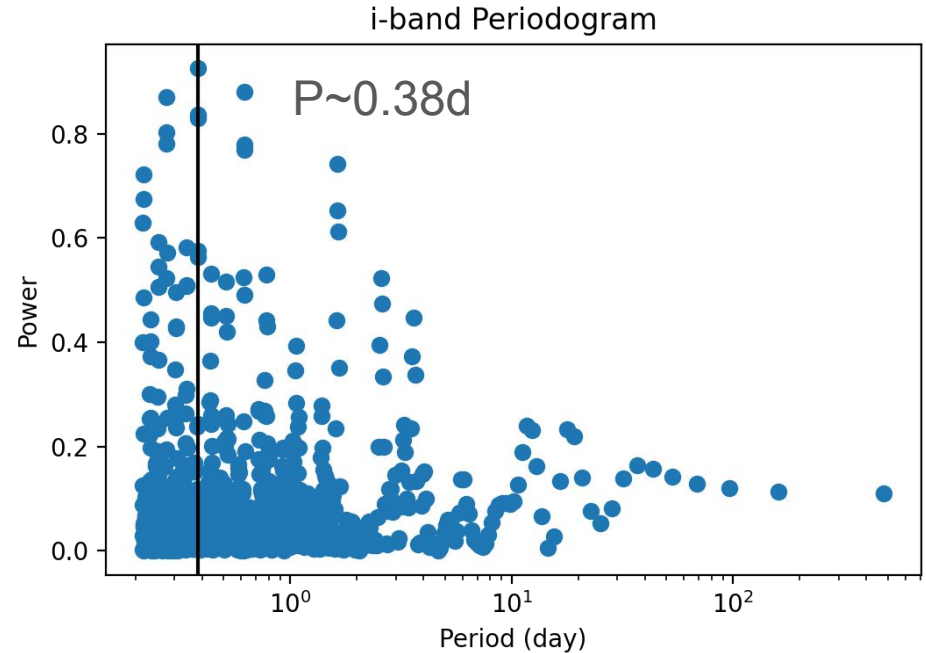
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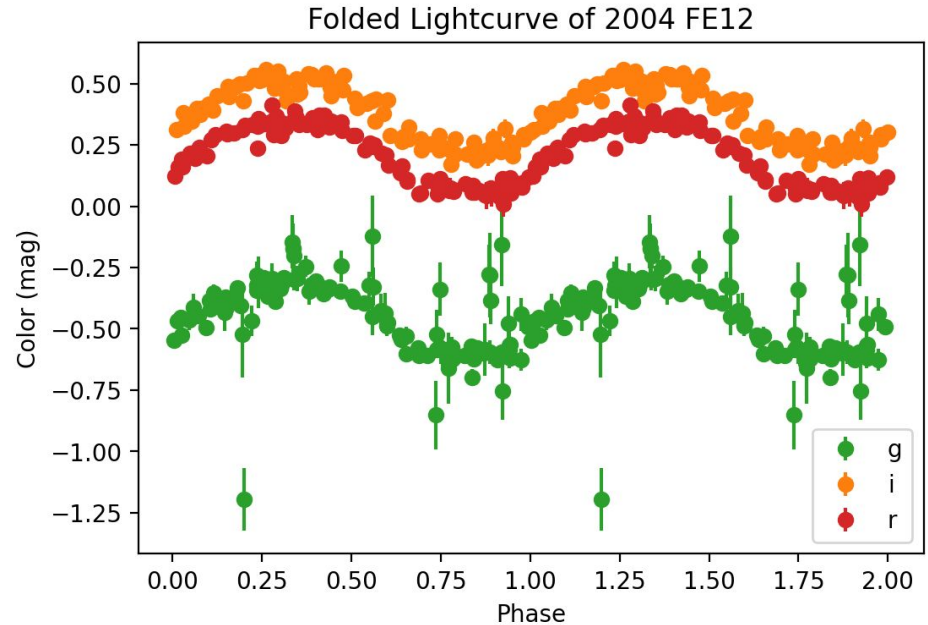
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- A periodogram or fourier transform reveals **periodicity**



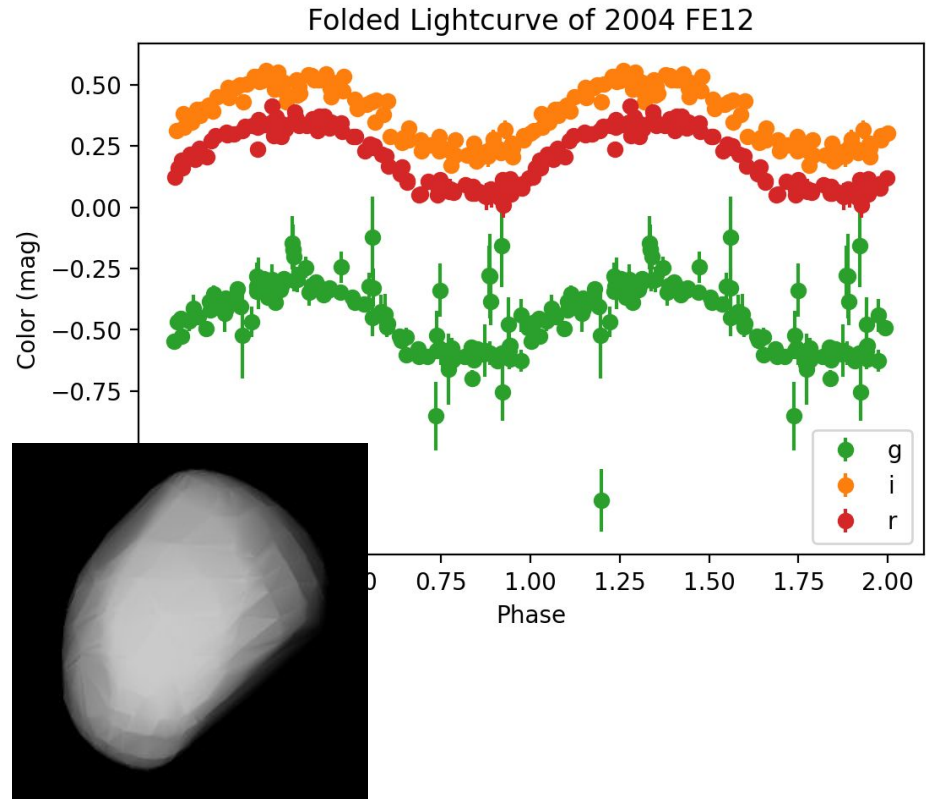
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- 2004 FE12 is **rotating** at $P \sim 0.38d$



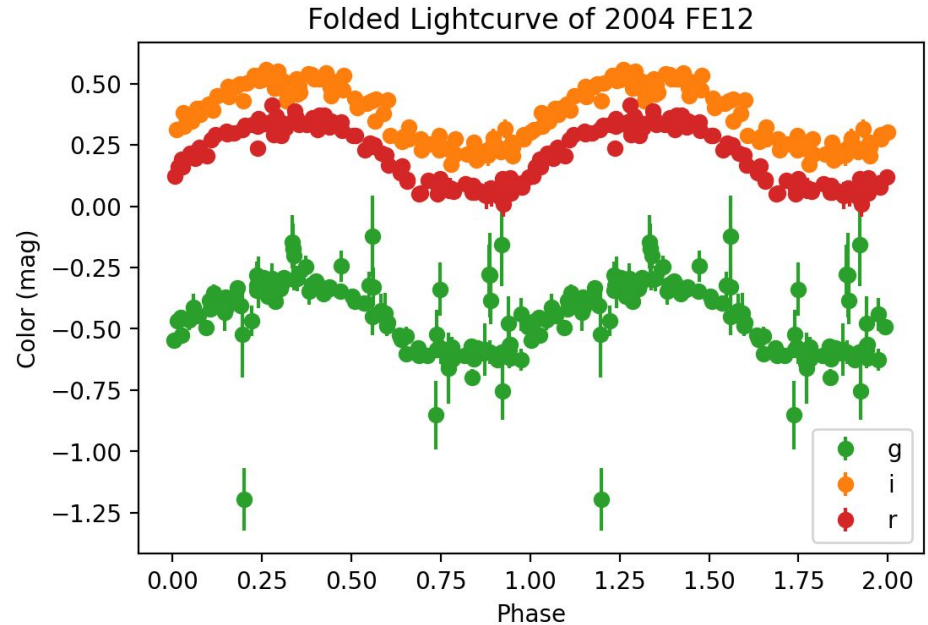
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- 2004 FE12 is rotating at $P \sim 0.38\text{d}$
- Light curves → **shape models**



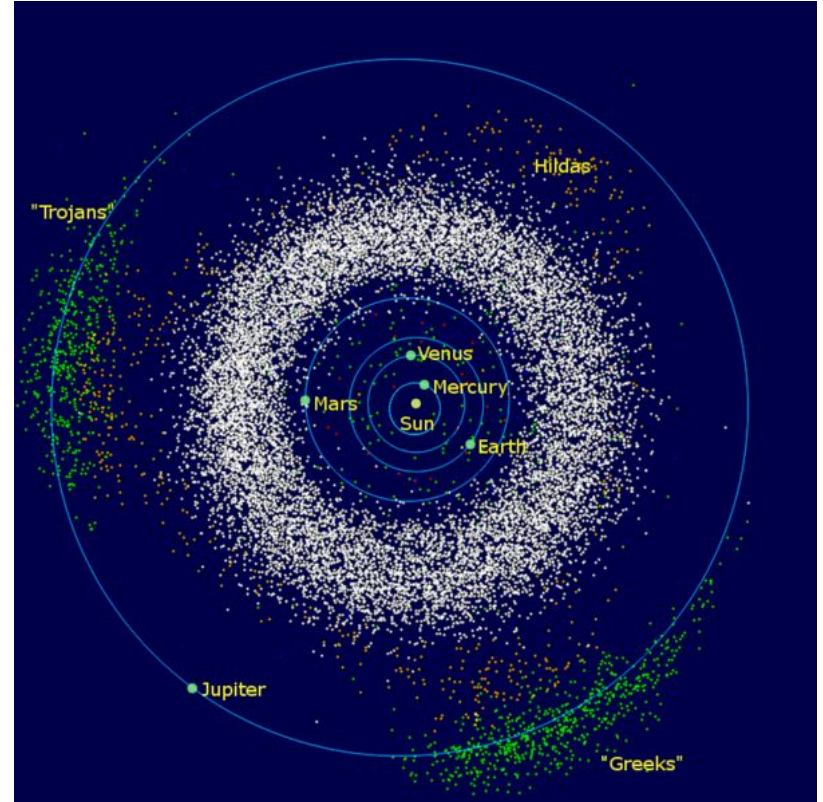
Asteroid Discovery and Characterization

- In this survey, we have observed **~8,000 known asteroids**
- For all: colors surface properties
- For well measured: rotation periods and shape models.
- We have used a portion of this dataset to discover 10s of new asteroids with an undergrad at UW, with the potential to discover many more



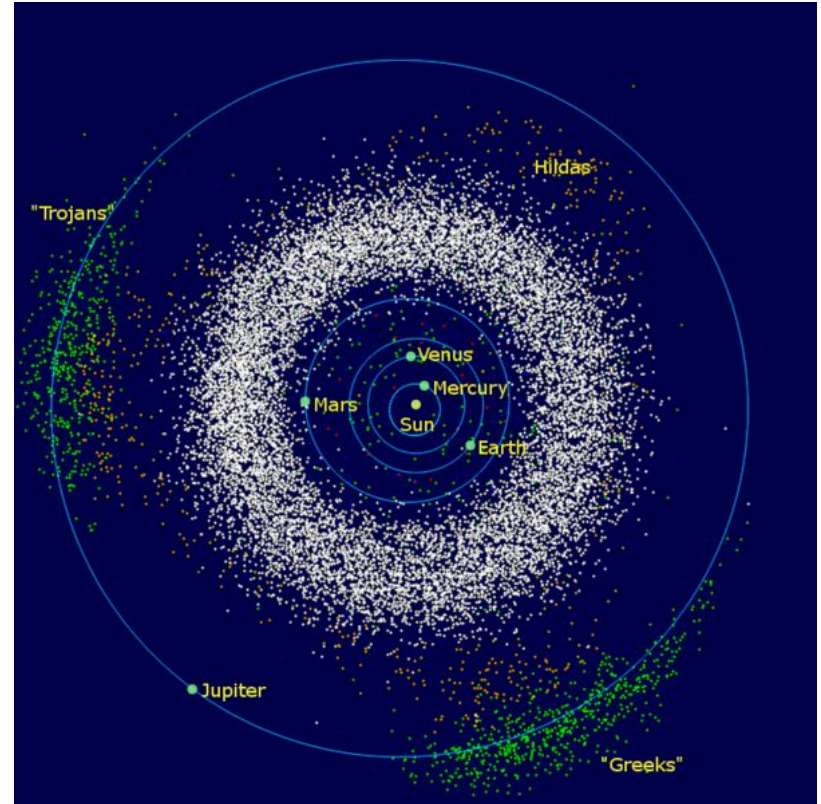
Asteroid Discovery and Characterization

- These kinds of analyses let us characterize “Main Belt” asteroids, the small bodies in the inner solar system



Asteroid Discovery and Characterization

- These kinds of analyses let us characterize “Main Belt” asteroids, the small bodies in the inner solar system
- But we can use different detection techniques to discovery **Trans Neptunian Objects** (TNOs), very **faint objects** at the outer reaches of the solar system



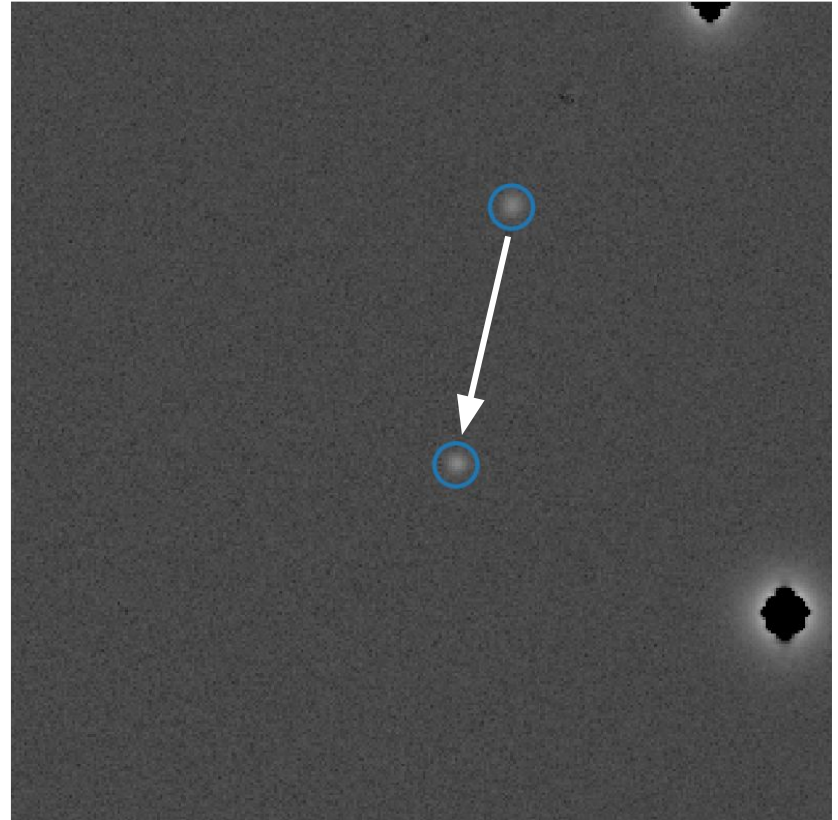
Detecting Faint Objects

- By **shifting and stacking** images we can **detect objects at or below the noise threshold**

Detecting Faint Objects

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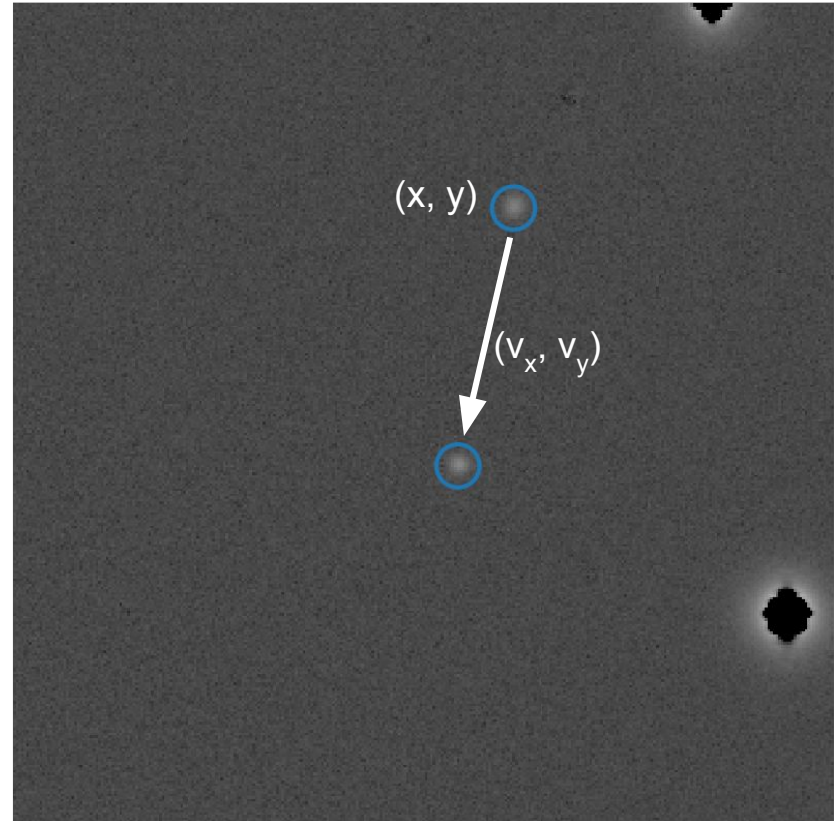
Difference Image



Detecting Faint Objects

- By shifting and stacking images we can detect objects at or below the noise threshold
- Sum pixels along linear trajectories
- Guess a starting pixel (x, y) and a velocity (v_x, v_y)
- A **4-dimensional search problem** that scales $\sim O(N*n*v*t^2)$

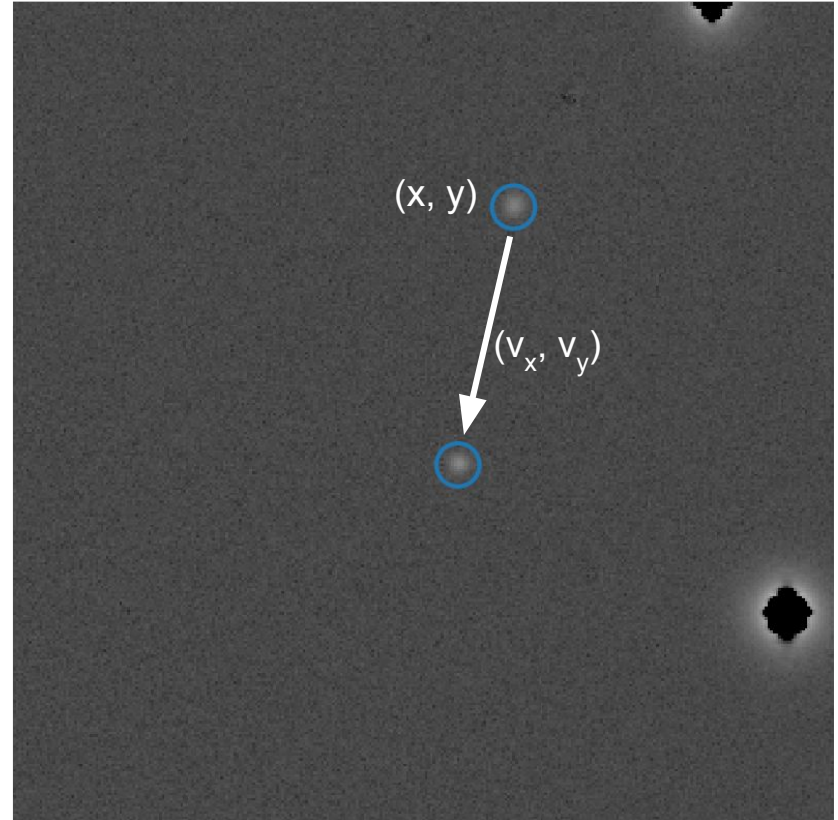
Difference Image



Detecting Faint Objects

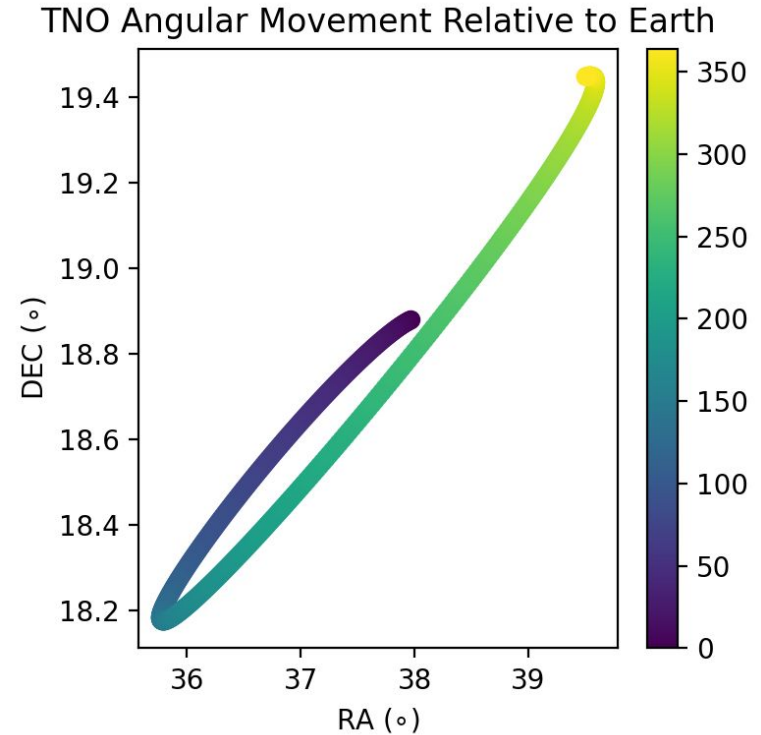
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- KBMOD: **Accelerate this using GPUs**: 10^{10} trajectories through 10 images in 1 minute

Difference Image



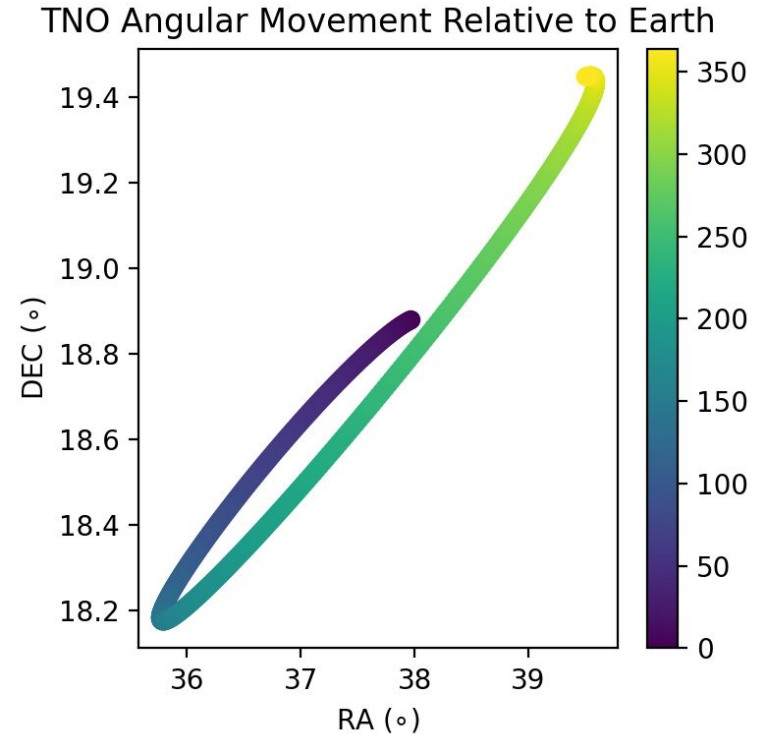
Shift-and-Stack over Long Time Baselines

- **Issue:** on-sky trajectories of solar system objects are non-linear over week-month long time baselines



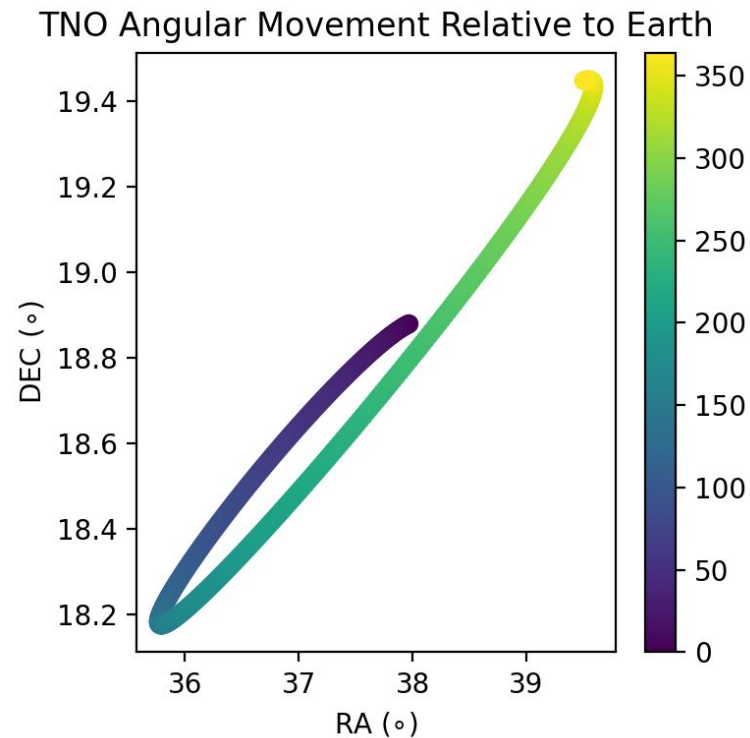
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- Adds an **extra dimension** to the problem



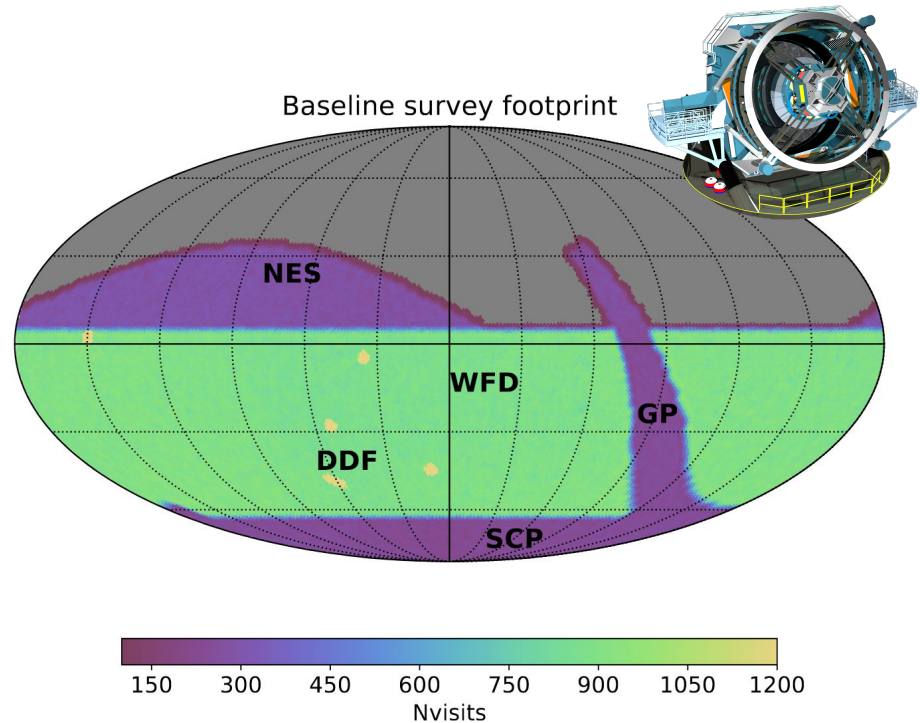
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- Adds an extra dimension to the problem
- Applying shift-and-stack to this dataset will be a **first application** of these extended searches using KBMOD



Towards LSST: Shift-and-stack for Faint Object Detection

- ~80 images over ~3 months across the entire ecliptic in the first year
- Shift-and-stack will require ~3.5M GPU-hours (~5000 GPU-months)
- The payoff is large: ~10x more TNOs discovered and potentially the putative Planet IX
- Applying shift-and-stack to the DECam DDF data is the first step towards this ambitious goal



Thanks

Thanks to:

- My advisor: Mario Juric
- My practicum advisor: Michael Grosskopf
- CSGF: Lindsey, Michelle, Kris, the steering committee, fellows, and alumni