## Creating Dcr-Matched Templates For Image Differencing

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Large Synoptic Survey Telescope



## Overview



DCR overview

Iterative forward modeling

Improved image differencing

Single-filter color estimates

# **DCR Overview**

Refraction deflects the apparent position of sources towards zenith.

The amplitude of refraction depends on environmental factors and the wavelength of incident light.



Differential Chromatic Refraction (DCR) occurs when the index of refraction of the atmosphere changes significantly across the bandwidth of a filter

# **DCR Overview**

#### When do we care about DCR?

Worst case DCR estimate: Take the relative deflection between two parallel beams of monochromatic light at the red and blue edges of a filter bandpass

The diamonds mark the angles where the maximum DCR equals one LSST pixel in each filter



#### **DCR Overview Uncorrected DCR leads to dipoles in difference imaging**



Simulated airmass 1.3 observation - zenith template in g-band, with no astrometric calibration.

Calibration and PSF-matching may fix many dipoles, but will make some worse

Zenith

#### **DCR Overview Uncorrected DCR leads to dipoles in difference imaging**



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# **Forward Modeling**





Each pixel in an image contains flux smeared out along the zenith direction

A small sub-band of the full filter bandwidth has negligible DCR

The sub-band model is shifted towards zenith relative to the center of the band

The original image can be reproduced by shifting and stacking models from all of the sub-bands.

## **Forward Modeling**





Repeated observations of the same field see the flux smeared in different directions

Only the direction and magnitude of the shift of the sub-band models depends on the observing conditions.

The pixel values of the models do not change

# **Iterative Forward Modeling**



Each image is the sum of a series of convolutions with the sub-band models:



# **Iterative Forward Modeling**



Each image is the sum of a series of convolutions with the sub-band models:

$$\sum_{\alpha} B_{i\alpha} \overrightarrow{y_{\alpha}} = \overrightarrow{s_i}$$

If the convolution kernel **B** is a shift, then  $B^{\star}_{\alpha i}B_{i\alpha} = 1$ 

And we can re-write the above equation to solve for a single sub-band model

$$\overrightarrow{y_{\gamma}} = B_{\gamma i}^{\star} \overrightarrow{s_i} - B_{\gamma i}^{\star} \sum_{\alpha \neq \gamma} B_{i\alpha} \overrightarrow{y_{\alpha}}$$

=> To solve for  $\overrightarrow{y_{\gamma}}$ , use an iterative solution and plug in the results from the previous iteration for  $\overrightarrow{y_{\alpha}}$ 

Note: to prevent oscillating solutions, after each iteration use the average of the new and old solutions for the next iteration

# **Iterative Forward Modeling**



#### **Extension to variable PSFs**

A work in progress!

$$\sum_{\alpha} B_{i\alpha} Q^{(i)} \overrightarrow{y_{\alpha}} = P \overrightarrow{s_i}$$

**P**: PSF of the sub-band models **Q**<sub>i</sub>: Measured PSF of each image i

which gives an iterative solution of

$$Q^{(i)}\overrightarrow{y_{\gamma}} = B^{\star}_{\gamma i}P\overrightarrow{s_{i}} - B^{\star}_{\gamma i}\sum_{\alpha\neq\gamma}B_{i\alpha}Q^{(i)}\overrightarrow{y_{\alpha}}$$

Then, after each iteration we need to solve for  $\overrightarrow{y_{\alpha}}$  given solutions of  $Q^{(i)}\overrightarrow{y_{\alpha}}$  for each image *i* 





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A simulated g-band airmass 1.3 image.

Stars simulated using Kurucz SEDs and Kolmogorov PSFs

No galaxies, transients, or variable sources





#### Simulated observations

DCR-matched templates subtract well far from zenith

Fewer 5- $\sigma$  detections in the difference image than simply using a nearby observation as the template



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The DCR sub-band model is built from 8 simulated observations between airmass 2.0 and 1.0

After detecting sources, forced photometry was run on each of three subbands.

The footprint of every detected source is filled with the measured fluxes from the sub-bands, converted to RGB





The simulated airmass 1.3 image minus an airmass 1.22 simulated image (5 degrees closer to zenith)

The DCR-derived colors can help classify image subtraction errors





0.8 We know the true spectrum of each 0.6 source within g-band Measured g(b)-g(r) color 0.4 So we can compare the measured color 0.2 between sub-bands to the true color 0.0 -0.2 -0.4

1.0

-0.4

-0.2

0.0

0.2

True g(b)-g(r) color

0.4

0.6

0.8

1.0



0.8 We know the true spectrum of each 0.6 source within g-band Measured g(b)-g(r) color 0.4 So we can compare the measured color 0.2 between sub-bands to the true color 40 └ 420 0.0 7500 L\_\_\_\_ 420 \_\_--0.4 40000 L\_\_\_\_ 420 0.2 -0.20.0 0.4 0.6 0.8 1.0 True g(b)-g(r) color

1.0

# Summary

#### **DCR-matched templates show promise**

- By forward-modeling DCR we can use all observations to build our template, regardless of airmass or parallactic angle
  - Can include more effects in the model if known, such as different detector responses
- DCR-matched templates perform well in image differencing
  - We can still use our favorite image differencing algorithm
- We can extract color information from observations taken with a single filter
- Code is in development, but available:
   <u>https://github.com/lsst-dm/experimental\_DCR</u>







Sub-band models

The sub-band models pick up real frequency structure ... but also some artifacts







#### DCR - matched template

The difference images below use different template images to subtract from the science image at right



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Airmass

PΑ



A simulated airmass 1.3 image minus it's DCR-matched template



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Differential Chromatic Refraction (DCR) <sup>1</sup>-occurs when the index of refraction of the atmosphere changes significantly across the bandwidth of a filter



$$n_{0}(\lambda) = 1 + \left( \left[ 2371.34 + \frac{683939.7}{130 - \sigma(\lambda)} + \frac{4547.3}{38.9 - \sigma(\lambda)^{2}} \right] D_{s} + \left( 6487.31 + 58.058\sigma(\lambda)^{2} - 0.71150\sigma(\lambda)^{4} + 0.08851\sigma(\lambda)^{6} \right) D_{w} \right) \times 10^{-8}$$
Environmental factors
$$\begin{cases} \sigma(\lambda) = 10^{4}/\lambda \quad (\mu m^{-1}) \\ D_{s} = \left[ 1 + (P_{s} - P_{w}) \left( 57.90 \times 10^{-8} - \frac{9.3250 \times 10^{-4}}{T} + \frac{0.25844}{T^{2}} \right) \right] \frac{(P_{s} - P_{w})}{T} \\ D_{w} = \left[ 1 + P_{w} \left( 1 + 3.7 \times 10^{-4}P_{w} \right) \left( -2.37321 \times 10^{-3} + \frac{2.23366}{T} - \frac{710.792}{T^{2}} + \frac{7.75141 \times 10^{4}}{T^{3}} \right) \right] \frac{P_{w}}{T} \\ P_{w} = RH \times 10^{-4} \times e^{(77.3450 + 0.0057T - 7235.0/T)} / T^{8.2} \end{cases}$$