



# Using Coadds for Photometry and Shear

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# Outline

- ▶ Introduction to coadds: pros and cons
- ▶ Mitigating issues with coadds
  - ▶ Kaiser coadds
  - ▶ Coadd the PSF
  - ▶ Single-object coadds to deal with additional PSF issues
  - ▶ Dealing with correlated noise
- ▶ Simulation tests
  - ▶ Noise tests
  - ▶ Shear bias tests
- ▶ Future Work

## Coadds: pros

- ▶ Large data compression: factor of about 100 for LSST
- ▶ Corresponding speed up for analysis
- ▶ Simplifies analysis, don't need to do multi-epoch fitting
  - ▶ But do still want simultaneous multi-band fitting. In DES we found this improves S/N significantly

## Coadds: cons

- ▶ The variance of quantities derived from standard coadds is generally higher than those calculated using a multi-epoch fitting approach
- ▶ The PSF, noise, etc. discontinuous in the coadd at the location of edges in original images
- ▶ The noise is correlated in standard coadds due to interpolation

# Example of Increased Variance

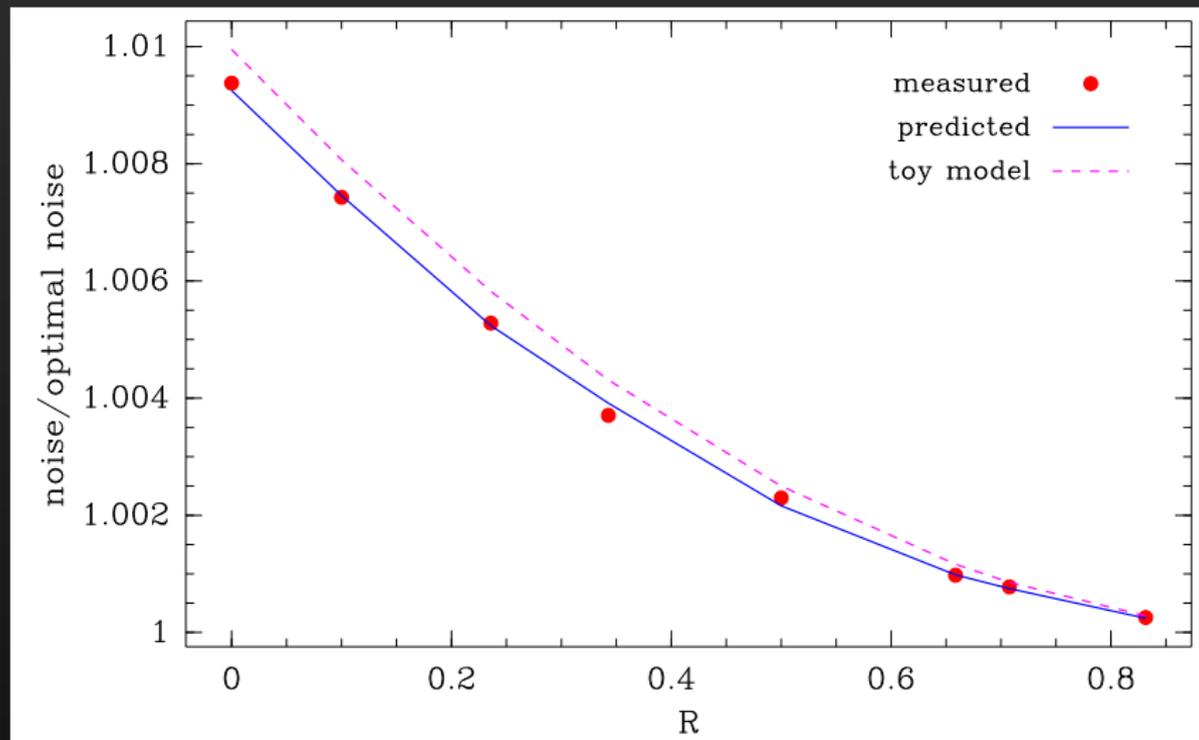
- ▶ Template flux, just fitting for an amplitude  $A$
- ▶ We can calculate directly the increased variance
- ▶ Can also calculate a toy model with Gaussian PSF and object, assume Gaussian final image (Sheldon, Armstrong, Huff, et al. in prep)

$$\text{var}\hat{A}_{\text{coadd}} = \text{var}\hat{A}_{\text{me}} \left[ 1 + 2(1 - R)^2 \left( \frac{\Delta\sigma_p}{\sigma_p} \right)^2 \right] \quad (1)$$

- ▶  $g$  marks the object and  $p$  the PSF
- ▶  $R = \sigma_g^2 / (\sigma_p^2 + \sigma_g^2)$  is 0 for stars, 1 for huge galaxies

# Fluxes: comparison of formula with simulation

$$\Delta\sigma_p/\sigma_p = 0.10$$



(Sheldon, Armstrong, Huff, et al. in prep)

## Mitigating increased variance: Kaiser Coadds

- ▶ For LSST, we expect a very minor increase in variance ( $< 1\%$ ).
- ▶ For surveys with large seeing variation, we might care more.
- ▶ Kaiser derived a more optimal coadd for which there should be no increase in variance
- ▶ However in DES and LSST we currently use standard coadds
- ▶ From here on all the tests I show will be for standard coadds

## Mitigating PSF issues: single-object coadds

- ▶ Overcome some discontinuities by coadding the PSF reconstructions also (e.g. SDSS coadd, Annis et al. 2011)
- ▶ However if an object straddles an image boundary in one of the epochs, the PSF will still not be correct
- ▶ Solution is single-object coadds: make a coadd for each object separately, only including epochs where the object does not straddle an edge (I heard the idea first from Jim Bosch)

# Mitigating correlated noise issues

- ▶ Not a big problem for fluxes, but causes a bias for shear measurement
- ▶ One can whiten the noise, but in my experience it results in a significant increase in noise
- ▶ (Kaiser claims no loss of information if done correctly, but I don't understand this yet)
- ▶ Alternatively: determine the covariance and use it in analyses
  - ▶ Run noise images through the coadd process also
  - ▶ Feed this noise image into METACALIBRATION
  - ▶ For BFD, measure a covariance matrix and use it when calculating moments. Moments only taken once in BFD, so this is feasible.

# Simulation Tests

- ▶ Tested realistic galaxy size and flux distribution, as well as fixed size and flux (to isolate any increase in noise).
- ▶ DES-like seeing distribution.
- ▶ Used typical DES WCS variations, including translations.
- ▶ Also ran tests with random rotations like in LSST.
- ▶ Ran in full multi-epoch mode and coadd mode.
- ▶ Blame: Coadd code by Armstrong & Sheldon.  
Simulation and METACALIBRATION code Sheldon.  
BFD code Bob Armstrong.

## Increased shear variance

- ▶ Fixed galaxy size and flux to isolate variation in noise.
  - ▶ Want to avoid selections needed for realistic distributions: With correlated noise, quantities used for selection, such as S/N, are different
- ▶ DES-like seeing and PSF ellipticity distribution.
- ▶ METACALIBRATION for the smallest galaxies we would use ( $T/T_{\text{PSF}} = 0.5$ ) and typical  $S/N = 15$  the noise in the recovered shear increases by

$$(0.65 \pm 0.02)\% \quad (2)$$

- ▶ BFD (B. Armstrong) Not sure exactly what size/flux distribution was used. Reported noise of 0.0007 for both (need an error bar)

# Increased shear bias

- ▶ Realistic size and galaxy flux distribution. DES-like seeing and PSF ellipticity distribution.
- ▶ METACALIBRATION

$$m = (0.56 \pm 0.36) \times 10^{-3} \quad (3)$$

(expect  $\sim 0.25 \times 10^{-3}$  due to breakdown of weak shear approximation)

- ▶ BFD (B. Armstrong)

$$m = (1.2 \pm 0.7) \times 10^{-3} \quad (4)$$

## Future Work

- ▶ In DES edges are important due to the low number of epochs ( $\sim 10$ ).
- ▶ We need to create a code for the single-object coadds and corresponding PSF coaddition. May be able to work this into the MEDS maker. Need to run noise images through as well for correlated noise.
- ▶ For LSST exposures will be rotated randomly: coadds need to be done on the full images, or very large initial postage stamps, to avoid artifacts in the “corners”.
- ▶ However, for LSST edges are less of a problem due to the large number of epochs ( $\sim 100$ ). It would be good to test in simulations if we need the single-object coadds at all.