# Lessons learned from Synpipe tests on HSC SSP data

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## HSC UltraDeep - COSMOS

- Background/ Strategy
- Validation of HSC
- Other Applications
- A Few Thoughts





## Default Catalog of Fake Stars

Based on COSMOS star catalog from Leauthaud et al. 2010; Matched to HSC UltraDeep catalog

Resample large number of fake stars from the GMM model of 5-band photometry



Huang, Leauthaud et al. 2018

## Default Catalog of Fake Galaxies

Also based on Claire Lackner's Sersic models of COSMOS galaxies



Huang, Leauthaud et al. 2018

## Validation of HSC SSP data reduction

### Huang et al. 2018: PDR1 hscPipe v4.0.5 Two tracts: good/bad seeing

PDR2 hscPipe v7.0.1 S20A hscPipe v8.5.0



Publ. Astron. Soc. Japan (2018) 70 (SP1), S6 (1–28) doi: 10.1093/pasj/psx126 Advance Access Publication Date: 2017 December 22



### Characterization and photometric performance of the Hyper Suprime-Cam Software Pipeline

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- Impact from seeing
- Impact from blendedness

## Basic Validation of HSC Photometry of Stars and Galaxies

### S/N difference between 0.5" and 0.7" seeing



## Basic Validation of HSC Photometry of Stars and Galaxies

### CModel color is pretty accurate!



### Recover the color-color distributions of stars and galaxies



### Recover the color-color distributions of stars and galaxies



## Synpipe can reveal interesting insight of photometry



## Synpipe can reveal potential problem of the pipeline e.g. Star-Galaxy separation

### hscPipe used to misclassify lots of faint stars as galaxies



# Synpipe can reveal potential problem of the pipeline

e.g. Galaxy shape/size in CModel

The combination of CModel priors and whether to use per-pixel variance information makes hscPipe think all faint galaxies are small and round



Applications of Synpipe:

Validation of photometry: for HSC or for testing the algorithm Huang et al. 2019; Portillo, Speagle, & Finkbeiner 2019

Impact of blended galaxies on the WL shape catalog Murata et al. in prep.

Detection and completeness of LAE or dropout galaxies Ono et al. 2018, Harikane et al. 2018, Konno et al. 2018, Hayashi et al. 2018 Itoh et al. 2018, Matsuoka et al. 2018

Microlensing events in M31 (single epoch)

Niikura et al. 2019

Impact of blending on photo-z measurements

Under discussion

Photometric Biases in Modern Surveys

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#### ABSTRACT

Most surveys use maximum-likelihood (ML) methods to fit models when extracting photometry from images. We show these ML estimators systematically overestimate the flux as a function of the signal-to-noise ratio (SNR) and the number of model parameters involved in the fit. This bias is substantially worse for galaxies: while a 1% bias is expected for a  $10\sigma$  point source, a  $10\sigma$  galaxy with a simplified Gaussian profile suffers a 2.5% bias. This bias also behaves differently depending how multiple bands are used in the fit: simultaneously fitting all bands leads the flux bias to become roughly evenly distributed between them, while fixing the position in "non-detection" bands (i.e. forced photometry) gives flux estimates in those bands that are biased *low*, compounding a bias in derived colors. We show that these effects are present in idealized simulations, outputs from the HSC fake object pipeline (SynPipe), and observations from SDSS Stripe 82. Prescriptions to correct for these biases are provided along with more detailed results related to biases in ML error estimation.

## PSF Photometry by P.S.F

### https://arxiv.org/abs/1902.02374

### Based on Huang et al. 2018



## Fraction of blended galaxies in the WL shape catalog





### Murata et al. in prep.

Unfortunately the student left the field with the project unfinished...

9 realizations of the same galaxy under similar noise and seeing condition

### Preliminary





Classify into different scenarios: recovered, lost, unrecognized blends

## Constraints of Primordial Black Hole as candidate of DM Using microlensing events in M31

Niikura et al. 2019







## A Few Lessons / Thoughts:

## Mock tests should happen along with the development of the pipeline

• Not after the data reduction. It could help avoid a lot of problems...

Need to advocate more about the importance of mock tests to the community

- The user should know their science always depends on the performance of the data reduction pipeline in some way. We need to make it clear that they can benefit from mock tests.
- We should have done better for HSC...In the HSC DR3 forced photometry catalog, every object has 747 columns....The number will double when independent measurements are included. Should be similar for LSST.
- A lot of information there has never been carefully evaluated ... and there could be problems ...

## A Few Lessons / Thoughts:

## hscPipe/LSST Pipe are not exactly "user friendly" by design

• In my experience, one of the main reasons that people avoid mock tests is they can't run pipeline by themselves

And...no single mock test / mock catalog can satisfy all scientific goals • The pipeline team cannot cover everything. Need to coordinate with

- The pipeline team cannot cover everything. Need to coordinate with the community better.
- What we really need is an interface that allows users to easily run customized mock test on a small/tiny piece of sky, to help them understand the data.

## Realistic galaxy images with "truth label" will be very useful!

- So far, all the mock tests we have done are just "sanity checks". They do not reflect the true complexity of real objects and do not account for all systematics.
- Rendered images from hydro-sims or machine learning can help

e.g., galaxy2galaxy; <u>Lanusse</u> et al. 2020

## Thank You !

