Weak lensing in the UNIONS survey

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Martin Kilbinger, France CEA Paris-Saclay, CosmoStat

martin.kilbinger@cea.fr







- The UNIONS survey
- Weak gravitational lensing analysis
- First results

http://www.skysurvey.cc



UNIONS: Ultra-violet Near-Infrared Optical Northern Survey **CFIS:** Canada-France Imaging Survey

Large imaging survey (4,800 deg²) in the Northern hemisphere with CFTH in optical bands u, r (CFIS), i, z (Pan-STARRS), g, z (HSC). P.I.: Jean-Charles Cuillandre (DAp) & Alain McConnachie (Victoria/Canada)

- Optical bands for Euclid for photometric redshifts
- Weak lensing
- Milky Way dynamics
- Large-scale structure
- Galaxy evolution



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UNIONS footprint & Euclid



CFIS-u area goal : 9,000 deg.²

CFIS-r covered with 3 exposures (full depth) : 7102 deg.
 ⇒ the yellow line indicates the northern Euclid DR1 821 deg.² area with the survey starting from the ecliptic pole (NEP) early 2023.
 ⇒ the South Galactic Cap region is within Euclid DR3.



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UNIONS footprint & Euclid



Sky coverage



u = 80% complete g = 75% complete r = 87% complete i = 100% complete (not full depth) z = 64% complete (Subaru + Pan-STARRS)

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Sky coverage

- u = 80% complete
- g = 75% complete
- r = 87% complete
- i = 100% complete (not full depth)
- z = 64% complete (Subaru + Pan-STARRS)



Pan-STARRS (2018-2025) : i-band (left) + z-band (right)

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Sky coverage

u = 80% complete

g = 75% complete

r = 87% complete

i = 100% complete (not full depth)

z = 64% complete (Subaru + Pan-STARRS)



Subaru : g-band + z-band = WHIGS (2019-2024, left) + WISHES (2020-2024, right)



UNIONS/CFIS vs. SDSS



UNIONS/CFIS

Best wide-field imager on CFHT ever.

Improvements (2011 - 2014)







UNIONS is basically a static LSST in the North. Unique combination of depth, area, and image quality (unmatched before Euclid, Rubin, Roman, CSS-OS, WFST!)

UNIONS depth



Photo-z depth metric proxy (for all): point source in 2 arcseconds diameter aperture, 100

- Euclid (median over the Euclid sky): VIS=25.0, Y=J=H=23.5
- DES in Euclid DR1/2/3: g=24.7, r=24.4, i=23.8, z=23.1
- UNIONS in Euclid DR1: u=23.6, g=24.5, r=24.1, i=23.2, z=23.4
- UNIONS in Euclid DR2: u=23.6, g=24.5, r=24.1, i=23.4, z=23.4
- UNIONS in Euclid DR3: *u*=23.6, *g*=24.5, *r*=24.1, *i*=23.6, *z*=23.4
- Rubin LSST* Y1 in Euclid DR2: *u*=23.7, *g*=24.9, *r*=25.0, *i*=24.3, *z*=23.6
- Rubin LSST* Y1 to Y4 in Euclid DR3: u=24.4, g=25.6, r=25.7, i=25.0, z=24.3

*Rubin-LSST main releases depth with point source PSF performance scaled to the 2" diam. metric

UNIONS ≈ LSST Year 1 depths

UNIONS and other surveys



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Weak gravitational lensing



- Probe of (dark) matter distribution at large scales, and in clusters and galaxies
- Measures density amount and fluctuations amplitude (" σ_8 / S_8 tension")
- Dark-energy dominated epoch

Dvornik, Heymans, Asgari et al. 2022

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- KiDS 2 × 2 pt + SMF

- KiDS + BOSS 3 × 2 pt

---KiDS cosmic shear

- Planck
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- "Weak" = galaxy shape distortions at %-level
 - $\circ \quad \ll$ intrinsic galaxy shapes
 - \circ « atmosphere & telescope distortions
- Need dedicated pipeline to process massive amounts of data for high-precision galaxy shape measurements + calibration

ShapePipe A modular weak-lensing processing and analysis pipeline

https://github.com/cosmostat/shapepipe

Farrens et al., 2022, <u>A&A, 664, 141</u>

ShapePipe

CI passing D pages-build-deployment passing python 3.9 release v1.0.1

ShapePipe is a galaxy shape measurement pipeline developed within the CosmoStat lab at CEA Paris-Saclay. See the documentation for details on how to install and run ShapePipe.



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ShapePipe

A modular weak-lensing processing and analysis pipeline

Software paper

Farrens et al., 2022, <u>A&A, 664, 141</u>

ShapePipe: A modular weak-lensing processing and analysis pipeline

S. Farrens¹ *, A. Guinot², M. Kilbinger¹, T. Liaudat¹, L. Baumont¹, X. Jimenez³, A. Peel⁴, A. Pujol¹, M. Schmitz⁵, J.-L. Starck¹, and A. Z. Vitorelli¹

¹ AIM, CEA, CNRS, Université Paris-Saclay, Université Paris Diderot, Sorbonne Paris Cité, F-91191 Gif-sur-Yvette, France

² Université de Paris, CNRS, Astroparticule et Cosmologie, F-75013 Paris, France

³ Université Paris-Saclay, CNRS, ENS Paris-Saclay, Centre Borelli, 91190, Gif-sur-Yvette, France

⁴ Institute of Physics, Laboratory of Astrophysics, Ecole Polytechnique Fédérale de Lausanne (EPFL), Observatoire de Sauverny, 1290 Versoix, Switzerland

⁵ Université Côte d'Azur, Observatoire de la Côte d'Azur, CNRS, Laboratoire Lagrange, Bd de l'Observatoire, CS 34229, 06304 Nice Cedex 4, France

ABSTRACT

We present the first public release of SHAPEPTPE, an open-source and modular weak-lensing measurement, analysis, and validation pipeline written in Python. We describe the design of the software and justify the choices made. We provide a brief description of all the modules currently available and summarise how the pipeline has been applied to real Ultraviolet Near-Infrared Optical Northern Survey data. Finally, we mention plans for future applications and development. The code and accompanying documentation are publicly available on GitHub.

Key words. Gravitational lensing: weak - Methods: data analysis

ShapePipe



- Modular
- Easy
- Fast (enough)
- Robust



- Conda
- Docker (in prep)
- CD/Cl

Three components

Pipeline

- Arguments & config
- I/O
- Job handling (MPI, SMP)
- Errors & logging

Modules

- WL data processing
- Book-keeping



- Scripts
- Tools
- Survey-specific content

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Image processing with ShapePipe

Input images are pre-processed (calibrated for astrometry and photometry)

Main processing

- Mask
- Detect objects
 - Star candidates on single exposures
 - Galaxy candidates and stacks
- Select stars
- Create PSF model
- Interpol PSF model to galaxy positions
- Validate PSF model
- Measure galaxy shapes including calibration information

Post-processing

- Galaxy selection
- Apply calibration
- Systematic checks (e.g null tests)

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Masking

Image artefacts: spurious detections as galaxies, contaminations to weak-lensing shear (correlations).

We mask:

- Halos and diffraction spikes of bright halos (from Guide Star Catalogue GSC II)
- Messier & NGC objects
- CCD borders

Already masked in pre-processing:

- cosmic rays (somewhat)
- bad columns









Knots in nearby galaxies create spurious detections as WL galaxies, need to be removed from analysis.

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Star selection

Use stars to create PSF model.



Star selection

Stars FWHM in field

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Weak-lensing in the UNIONS survey

0.79

0.78

0.77

0.76

0.75

0.74

0.73

PSF model

Two models can be used:

- PSFEx, Bertin et al. 2011
- MCCD, Liaudat et al. 2021, <u>A&A, 646, A27</u> •

Stacked MegaCAM focal plane



-0.050

PSF ellipticity component 1





PSF ellipticity residual component 1

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PSF diagnostics

The standard equation for PSF leakage for a galaxy is



From this we derive the rho statistics as additive terms to the shear two-point correlation function. Their contribution propagates to cosmological parameters.

$$\rho_1(\theta) = \langle \delta e^*_{\rm PSF}(\theta') \delta e_{\rm PSF}(\theta' + \theta) \rangle;$$

$$\rho_2(\theta) = \langle e_{\rm PSF}^*(\theta') \delta e_{\rm PSF}(\theta' + \theta) \rangle;$$

$$\rho_{3}(\theta) = \left\langle \left(e_{\text{PSF}}^{*} \frac{\delta T_{\text{PSF}}}{T_{\text{PSF}}} \right) (\theta') \left(e_{\text{PSF}} \frac{\delta T_{\text{PSF}}}{T_{\text{PSF}}} \right) (\theta' + \theta) \right\rangle;$$

$$\rho_4(\theta) = \left\langle \delta e^*_{\rm PSF}(\theta') \left(e_{\rm PSF} \frac{\delta T_{\rm PSF}}{T_{\rm PSF}} \right) (\theta' + \theta) \right\rangle;$$

$$\rho_{5}(\theta) = \left\langle e_{\rm PSF}^{*}(\theta') \left(e_{\rm PSF} \frac{\delta T_{\rm PSF}}{T_{\rm PSF}} \right) (\theta' + \theta) \right\rangle$$

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PSF leakage

The standard equation for PSF leakage for a galaxy is

$$e_i^{\text{obs}} = (1+m)\gamma_i + c_i + \alpha e_i^{\text{psf}}.$$
(1)

(2)

Neglecting the shear (which is fine since later we will look at large samples), so far we have written the PSF leakage part as a matrix equation,

$$e_i^{\mathrm{obs}} = \sum_j lpha_{ij} e_j^{\mathrm{psf}} + c_i \quad \mathrm{or} \quad e^{\mathrm{obs}} = lpha e^{\mathrm{psf}} + c,$$

and fitted the four components of α independently.

PSF leakage into galaxy ellipticity



(see also Zhang et al. (2022), HSC-Y3 papers (2023)

PSF leakage

<u>Kitching & Deshpande (2022)</u>, consistent relations between spin-2 quantities. To second order:

$$e_{1}^{\text{obs}} = q_{111} \left[e_{1}^{\text{psf}} \right]^{2} + q_{122} \left[e_{2}^{\text{psf}} \right]^{2} + q_{112} e_{1}^{\text{psf}} e_{2}^{\text{psf}} + m_{11} e_{1}^{\text{psf}} + m_{12} e_{2}^{\text{psf}} + c_{1};$$

$$e_{2}^{\text{obs}} = q_{222} \left[e_{2}^{\text{psf}} \right]^{2} + q_{211} \left[e_{1}^{\text{psf}} \right]^{2} + q_{212} e_{1}^{\text{psf}} e_{2}^{\text{psf}} + m_{22} e_{2}^{\text{psf}} + m_{12} e_{1}^{\text{psf}} + c_{2}.$$
 (3)

- Coupled equations, need to do joint fits as function of both PSF ellipticity components
- Six quadratic terms
- One mixed linear term $m_{12} = m_{21}$



PSF leakage

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PSF diagnostics



Observed ellipticity

 $e_i^{\rm obs} = (1+m)\gamma_i + c_i + \alpha e_i^{\rm psf}.$

Leakage function

$$\alpha(\theta) = \frac{\xi_{+}^{gp}(\theta) - \langle e_{gd} \rangle^{*} \langle e_{PSF} \rangle}{\xi_{+}^{pp}(\theta) - |\langle e_{PSF} \rangle|^{2}}.$$

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Galaxy shape measurement



PSF

- Simple model for galaxy light profile (Gaussian)
- Convolve model with PSF
- Fit to observed galaxy, minimise to measure shape parameters
- <u>ngmix</u> (DES; E. Sheldon et al.), weighted moments



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(Meta-)Calibration

- Weak-lensing shapes are biased (noise, wrong model or PSF, blended galaxies.
- Multiplicative bias **R** most important:

 $\boldsymbol{\gamma}^{\text{obs}} = \mathbf{R} \, \boldsymbol{\gamma}^{\text{true}} + \mathbf{c}$

• Interpret **R** as response of the observed shape to a (small) shear:

$$\mathbf{R} = d\boldsymbol{\gamma}^{\rm obs} / d\boldsymbol{\gamma}^{\rm true} \approx \left[\boldsymbol{\gamma}^{\rm obs} (\boldsymbol{\gamma}^{\rm true} + \boldsymbol{\delta} \boldsymbol{\gamma}) - \boldsymbol{\gamma}^{\rm obs} (\boldsymbol{\gamma}^{\rm true} - \boldsymbol{\delta} \boldsymbol{\gamma}) \right] / \left[2 \, \boldsymbol{\delta} \boldsymbol{\gamma} \right]$$

• **R** can be measured by applying small artificial shear $\delta \gamma$ to each observed galaxy.



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Metacalibration response matrix



Galaxies: <R>~0.7, 30% bias. Stars: <R>~0-0.2, stars are point sources, no/small response to shear.

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Some first results

- Mass maps, cluster convergence & masses
- Peak counts
- Intrinsic galaxy alignment
- Dark matter halo shapes

Future publications

- Blinded (redshift distribution)
- Two pipelines (ShapePipe and *lensfit*)







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Peak counts

Number of peaks in WL overdensity (/ noise) map depends on cosmological parameters.



- Local shear calibration
- Baryonic effects
- Intrinsic alignments
- Redshift uncertainty



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Ayçoberry et al, 2023

100 200 300

400

SNR map

0

100

200

300

400

500

Peak counts & local calibration







М

UNIONS & SDSS overlap

Combining spectroscopic and imaging information



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Intrinsic alignment



Source: Joachimi 2016, Galaxy alignments: An overview

Intrinsic galaxy alignment

shape sample=201 639

CMASS

 $\langle z \rangle = 0.55$

 $\langle e \rangle = 0.216$

 $A_1 = 4.86 \pm 0.51$



 $\langle z \rangle$ =0.74 # shape sample=78 134 $\langle e \rangle$ =0.265 $A_1 = 3.6 \pm 1.0$



UNIONS galaxies matched to SDSS galaxy pairs at same *z*.

Hervas Peters, MK et al. (in prep)

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Intrinsic alignment

Quasi-Stellar Objects (QSO)







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Intrinsic alignment



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- Two AGN samples:
 - Liu et al (2019), SDSS DR7, 48,000 objects, 10,000 in UNIONS footprint.
 - Shen et al. (2011) and <u>Wu & Shen (2022)</u>, SDSS DR16, includes DR7 catalogue, 206,000 objects, 55,000 in UNIONS footprint.
 - BH masses from broad-line regions.



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M - σ relation: linking black-hole mass to stellar velocity dispersion (proxy for halo mass).

Connection between black-hole growth and galaxy evolution.

Can we measure halo mass of black holes (AGNs) with weak-lensing?

Work with Li Qinxun, Luo Wentao, Zhang Ziwen, Fabian Hervas Peters, Elisa Russier and others.



Fitting AGN halos with HOD (Halo Occupation Distribution) model.

Pyccl implementation:

 $\langle n_g(r)|M,a
angle = ar{N}_c(M,a)\left[f_c(a) + ar{N}_s(M,a)u_{
m sat}(r|M,a)
ight]$

$$ar{N_c}(M,a) = rac{1}{2} igg[1 + ext{erf}\left(rac{\log(M/M_{ ext{min}})}{\sigma_{ ext{ln}M}}
ight) igg] \ ar{N_s}(M,a) = \Theta(M-M_0) igg(rac{M-M_0}{M_1}igg)^lpha \ u_s(r|M,a) \propto rac{\Theta(r_{ ext{max}}-r)}{(r/r_g)(1+r/r_g)^2}$$

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UNIONS weak-lensing results (with ShapePipe) A modular weak-lensing processing and analysis pipeline

Software paper Code & documentations

UNIONS first weak-lensing analysis Peak counts Group & cluster masses Dark-matter halo shapes Multi-CCD PSF model Farrens et al., 2022, <u>A&A, 664, 141</u> <u>https://github.com/cosmostat/shapepipe</u>

Guinot et al., 2022, <u>A&A, 666, A162</u> Ayçoberry et al., 2023, <u>A&A, 671, A17</u> Spitzer et al., 2022, submitted to MNRAS Robison et al., 2022, <u>arXiv:2209.09088</u> Liaudat et al., 2021, <u>A&A, 646, A27</u>

In progress Intrinsic galaxy alignment Void lensing Cosmic shear, constraints on Ω_m , σ_8 , DE Peak counts II Lensing by AGNs, $M_{\rm BH}$ - $M_{\rm halo}$ relation Analysis of CFHT P.I. data (rotating galaxy cluster, FRB field)

UNIONS weak-lensing: conclusions

https://unions.skysurvey.cc

- UNIONS: unique dataset for weak gravitational lensing:
 - Excellent image quality (median seeing < 0.7")
 - Homogeneous survey depth thanks to adaptive observing strategy
 - Wide (4,800 deg²), and deep (~ 10 galaxies arcmin⁻²)
 - Large overlap with deep spectroscopic surveys (SDSS, eBOSS, DESI)
- Require dedicated image processing pipeline including calibration, systematic testing: ShapePipe; open source, tutorials, contribution & collaboration welcome
- Help understand relation between dark and luminous matter: group scaling relations, halo shapes, intrinsic alignments



Backup slides

Cosmological constraints

PSF systematics

- <= 10% of xi+, < statistical errors
- impact on cosmology TBC but probably small



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Cosmological const

C03 (purple): NL halofit C04 (green): NL hmcode2020_feedback C05 (blue): C04+ IA C06 (pink): C05+delta_nz shifts

with Goh, Hervas Peters, Guerrini, Baumont



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Void lensing

$$\frac{\rho_V(r)}{\overline{\rho}} - 1 = \delta_c \frac{1 - (r/r_s)^{\alpha}}{1 + (r/r_V)^{\beta}}$$

2 free parameters: δ_{c} and $\Sigma_{H}(y) = 2 \int_{y}^{\infty} \frac{(\rho_{V}(r) - \overline{\rho})r}{\sqrt{r^{2} - y^{2}}} dr$ $\Delta \Sigma = \overline{\Sigma(< r)} - \Sigma(r)$

Citation: Hamaus N., Sutter P. M., Wandlet B. D., 2014, Phys. Rev. Lett., 112, 251302





Fits of overdensity profiles of stacked simulated voids at redshift of 0. Source: (Hamaus et al. 2014)



From Hunter Martin, Mike Hudson

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Group and cluster masses

Overdensity around SDSS redMaPPer groups.



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Dark-matter halo shapes

WL halo profile of 146,000 SDSS DR7 Luminous Red Galaxies (LRGs).

Monopole.



Can we measure the **quadrupole?** →halo shape Stack LRGs along galaxy orientation

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Robison et al, 2022

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Time allocation

UNIONS = CFHT (u,r) + Pan-STARRS (i,z) + Subaru (g,z)



CFHT: 3 Large Programs (473 nights, 2015-2024)

- u : DEC>+0 on the SGC*, and DEC>+18 on the NGC*
- r:DEC>+30

*SGC = South Galactic Cap, NGC = North Galactic Cap

Subaru: Waterloo-Hawaii-IfA G-band Survey

o g: DEC>+30 (20 nights, 2019-2024)

Pan-STARRS: (40% of PS1+PS2 since 2017)

- i : DEC>+30 (integration from NEOs search)
- o z:+30<DEC<+42

Subaru: Wide Imaging with Subaru HSC of the Euclid Sky

z: DEC>+42 (40 nights, 2020-2024)

UNIONS extension plan



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UNIONS publications

27 accepted peer reviewed publications so far:

Resolved Stellar Populations Galaxy evolution Weak lensing

27. Robison, B., et al., 2023, in press, "The shape of dark matter haloes: results from weak lensing in the Ultraviolet-Near Infrared Optical Northern Survey (UNIONS)" 26. Lim, S., et al., 2023, MNRAS, in press, "Constraints on galaxy formation from the cosmic-infrared-background / optical-imaging cross-correlation using Herschel and UNIONS' 25. Smith, S., et al., 2023, ApJ, in press, "Discovery of a new Local Group galaxy candidate in UNIONS: Bo'otes V" 24. Chu, A., et al., 2023, A&A, in press, A UNIONS view of the brightest central galaxies of candidate fossil groups 23. Bickley, R., et al., 2023, MNRAS, 519, 6149, "AGN in post mergers from the Ultraviolet Near Infrared Optical Northern Survey" 22. Ayc,coberry, E., et al., 2023, A&A, 671, 17, "UNIONS : impact of systematic errors on weak-lensing peak counts" 21. Savary, E., et al. 2022, A&A, 666, 1 "A search for galaxy-scale strong gravitational lenses in UNIONS" 20. Chan, J. H. H., et al. 2022, A&A, 659, 140 "Discovery of Strongly Lensed Quasars in UNIONS" 19. Wilkinson, S., et al., 2022, MNRAS, 516, 4354, "The merger fraction of post-starburst galaxies in UNIONS" 18. Ellison, S., et al., MNRAS, 517, L92, "Galaxy mergers can rapidly shut down star formation" 17. Bickley, R., et al., 2022, MNRAS, 514, 3294, "Star formation characteristics of CNN-identified post-mergers in the Ultraviolet Near Infrared Optical Northern Survey (UNIONS) Farrens, S., et al., 2022, A&A, 664, A141, "A modular weak lensing processing and analysis pipeline". Guinot, A., et al., 2022, A&A, 666, 162, "ShapePipe: a new shape measurement pipeline and weak-lensing application to UNIONS/CFIS data" 14. Sola, E., et al., 2022, A&A, 662, 124, "Characterization of LSB structures in annotated deep images" 13. Roberts, I., et al., 2022, MNRAS, 509, 1342, "Ram Pressure Candidates in UNIONS" 12. Jensen, J., et al., 2021, MNRAS, 507, 1923, "Uncovering fossils of the distant Galaxy with UNIONS: NGC 5466 and its stellar stream" 11. Bickley, R., et al., 2021, MNRAS, 504, 372, "Convolutional neural network identification of galaxy post-mergers in UNIONS using IllustrisTNG" 10. Fantin, N., et al., 2021, ApJ, 913, 30, "The Mass and Age Distribution of Halo White Dwarf Candidates in the Canada-France Imaging Survey" 9. Liaudat, T., et al., 2021, A&A, A27, "Multi-CCD modelling of the point spread function" 8. Thomas, G., et al., 2020, ApJ, 902, 89, "The Hidden Past of M92: Detection and Characterization of a Newly Formed 17o Long Stellar Stream Using the Canada-France Imaging Survey " 7. Fantin N., et al., 2019, ApJ, 877, 148, "The Canada France Imaging Survey: Reconstructing the Milky Way from its white dwarf population" Thomas, G., et al., 2019, ApJ, 866, 10, "Dwarfs or giants? Stellar metallicities and distances from ugrizG multi-band photometry" 5. Ellison, S., et al., 2019, MNRAS, 487, 2491, "A definitive merger-AGN connection at z=0 with CFIS: mergers have an excess of AGN and AGN hosts are more frequently disturbed" Thomas, G., et al. 2019, MNRAS, 483, 3, "A-type stars in the Canada-France Imaging Survey - II. Tracing the height of the disc at large distances." with Blue Stragglers" 3. Thomas, G., et al., 2018, MNRAS, 481, 4, "A-type stars in the Canada-France Imaging Survey I. The stellar halo of the Milky Way traced to large radius by blue horizontal branch stars' 2. Ibata, R., et al., 2017, ApJ, 848, 2, 129, "Chemical Mapping of the Milky Way with The Canada-France Imaging Survey: A Non-parametric Metallicity-Distance Decomposition of the Galaxy" 1. Ibata, R., et al., 2017, ApJ, 848, 2, 128, "The Canada-France Imaging Survey: First Results from the u-Band Component"