

spike: A Tool to Drizzle *HST*, *JWST*, and Roman PSFs for Improved Analyses

Ava Polzin ¹ ¶

¹ Department of Astronomy and Astrophysics, The University of Chicago, USA ¶ Corresponding author

DOI: [10.21105/joss.08200](https://doi.org/10.21105/joss.08200)

Software

- [Review](#) 
- [Repository](#) 
- [Archive](#) 

Editor: [Ivelina Momcheva](#)  

Reviewers:

- [@EdwardBerman](#)
- [@tobias-liaudat](#)
- [@obi-wan76](#)

Submitted: 03 March 2025

Published: 09 July 2025

License

Authors of papers retain copyright and release the work under a Creative Commons Attribution 4.0 International License ([CC BY 4.0](#)).

Summary

An instrumental point spread function (PSF) describes the distribution of light for a pure point source in an astronomical image due to the optics of the instrument. An accurate PSF is key for deconvolution, point source photometry and source removal. Space-based telescopes can then pose a challenge because their PSFs are influenced by their complex construction, and the myriad of pointings and rotations used to capture deep images. These telescopes also capture the highest resolution images of astronomical sources, resolving stars in even relatively distant galaxies. Proper co-addition of PSFs at a specific source position for space-based imaging is then both critical and challenging. The library described in this work, *spike*, generates model PSFs and runs them through the same processing pipeline used to derive deep, co-added images, providing correctly co-added and resampled PSFs for images from the *Hubble Space Telescope*, the *James Webb Space Telescope*, and the Nancy Grace Roman Space Telescope.

Statement of Need

The PSFs of co-added images are of interest to both ground- and space-based instruments. PSFs can be impacted by different co-addition schemes and may impact the analysis results based on those data ([Mandelbaum et al., 2023](#)). The cumulative effect of the geometric distortions and offsets in angle and pixel location of space-based data are apparent in the effective PSFs of the co-added and resampled (drizzled, [Fruchter & Hook, 2002](#)) images, making the PSFs modeled on uncombined images insufficient for careful photometric analyses. This is a recognized limitation of existing PSF models, and *DrizzlePac* recently added functionality to use drizzled pre-computed model PSFs in their native photometric catalog generator ([Hack et al., 2021](#)). However, this drizzled PSF uses generic *TinyTim* ([Krist et al., 2011](#)) models, which do not account for the positions of sources on the chip and do not allow the user to set model parameters without overwriting the existing grid of model PSFs. Simultaneously, the resultant co-added PSF is not available to users, and there is not an existing, simple way to generate drizzled PSFs for use in other analyses. Alternatively, an empirical PSF may be created from the data (see, e.g., [Liaudat et al., 2023](#) for a brief review) or unsaturated stars near the object of interest may be selected as a proxy for the PSF. For particularly crowded fields, or those where most stars are saturated, these alternatives pose a problem.

For analyses to be consistent, mock PSFs may be used, but the proper treatment of them involves generating model PSFs and then co-adding and processing them in the same way as the parent images are co-added and processed. Workflows have been created for some instruments¹ and surveys (e.g., [Ji et al., 2024](#)), and individual packages have tried to address this in their own data handling, with e.g., *grizli* ([Brammer, 2024](#)) returning drizzled standard empirical PSFs, but, similar to the drizzled PSFs computed by *DrizzlePac*, such solutions

¹https://github.com/spacetelescope/hst_notebooks/tree/main/notebooks/WFC3/point_spread_function;
https://github.com/spacetelescope/wfc3_photometry

leave little room for users to define the method or specifics of model PSF generation. The code presented here, *spike*, streamlines the potentially challenging process of realistic PSF generation, taking images and coordinates and directly outputting correctly co-added model PSFs for the *Hubble Space Telescope* (*HST*), the *James Webb Space Telescope* (*JWST*), and the upcoming Nancy Grace Roman Space Telescope. Model PSFs can be generated using different industry-standard packages, empirical PSFs can be computed from input images, or users can provide PSFs associated with the individual images. *spike* is both easy to use and flexible.

Workflow

Given a directory containing reduced and calibrated, but not yet co-added, FITS files from *HST*, *JWST*, or Roman and the coordinates of an object of interest, detector/chip-specific model PSFs are directly “drizzled” by *spike*. A model PSF is generated for each unique input image and coordinate combination. Instrument information, including camera, filter, and, if necessary, chip, is automatically read from the header of each FITS file.

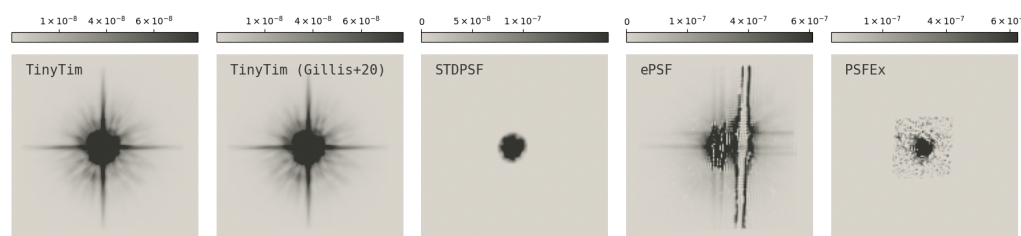


Figure 1: Comparison of drizzled PSFs generated for *HST* images using the default parameters for different methods included in *spike*. All panels use the same ACS/WFC imaging of the COSMOS field in F475W. The stretch of each model’s colormap is chosen based on their individual handling of the background, wings, and faint features of the PSF. Note that the ePSF panel (second from right) shows some artifacts; the robustness of the effective PSF method is heavily dependent on the number of stars in the chosen field and may be changed by altering the star detection threshold.

spike works with both model and empirical PSFs. The built-in PSF generation options are TinyTim (Krist et al., 2011) and the Gillis et al. (2020) modification, STDPsf – formerly WebbPSF (M. Perrin et al., 2024, 2025; M. D. Perrin et al., 2012, 2014), photutils ePSFs (Anderson, 2016; Anderson & King, 2000; Bradley et al., 2024), PSFEx (Bertin, 2011), and Space Telescope Science Institute’s library of empirical STDPSFs² (Anderson, 2016; Libralato et al., 2023, 2024), all of which are included for having the ability to generate a model PSF for an arbitrary detector location. Figure 1 compares output drizzled PSFs from the different methods for *HST* and Figure 2 compares output drizzled PSFs for *JWST*.

²<https://www.stsci.edu/~jayander/HST1PASS/LIB/PSFs/STDPSFs/>; <https://www.stsci.edu/~jayander/JWST1PASS/LIB/PSFs/STDPSFs/>

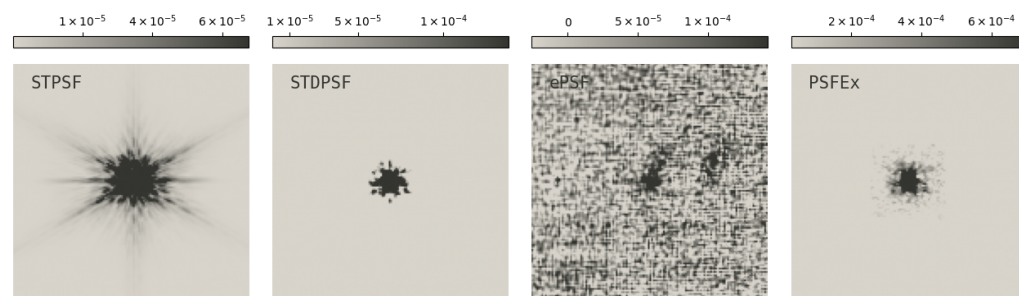


Figure 2: Same as [Figure 1](#) for *JWST*/NIRCam imaging in F115W. Note that the ePSF model shown here was generated using a lower detection threshold and a different star selection algorithm due to a paucity of stars in this field.

In most cases, users will only ever interact with the top-level functions `spike.psf.hst`, `spike.psf.jwst`, and `spike.psf.roman`. However, PSF model creation can be accessed directly via the functions in `spike.psfgen`, and this may be of added value to users on its own, including for use with telescopes/instruments not explicitly mentioned here, as `spike` smoothes over some of the complication of individual tools as an all-in-one means of accessing model PSFs via simple Python functions.

Preparation for Future Observatories

There is a preliminary module included in `spike` for recovering resampled Roman PSFs. `spike.psf.roman` currently takes as input single detector images, which can be used with STPSF models via `spike.psfgen`. Since Roman is not yet collecting data, `spike.psf.roman` is based on the structure of simulated single detector data from e.g., Troxel et al. (2023). When Roman is launched and data become available, `spike` will be updated to reflect the most current version of the reduction pipeline and the detailed considerations of the real data.

Managing Restrictive Dependencies

Since drizzled `spike` PSFs are intended for use with calibrated and resampled data products from the original pipelines, it is imperative that the processing done on the PSFs is the same as the processing of those data products. Both `jwst` (Bushouse et al., 2024) and `roman` (Roman calibration pipeline developers, 2024) are complex packages that house the entire *JWST* and Roman pipelines. As such, they have complicated functionality that relies on modules with more stringent installation requirements. Using `jwst` and `roman` out of the box places strict limitations on the allowed operating systems. To address this, there are stripped down versions of the necessary “tweak” and resample scripts included with `spike` as `spike.jwstcal`, `spike.roman`, `spike.stcal`, and `spike.stpipe`. Each module is only subtly changed from `jwst`, `roman`, and their underlying STCAL (STScI, 2024b) and stpipe (STScI, 2024d) to avoid unnecessary dependencies that restrict installation.

Software and Packages Used

- `asdf` (Graham et al., 2024)
- `astropy` (Astropy Collaboration et al., 2013, 2018, 2022)
- `crds` (STScI CRDS s/w developers, 2024)
- `drizzle` (Simon, Robitaille, Cara, et al., 2024)
- `drizzlepac` (Hoffmann et al., 2021)
- `gwcs` (Dencheva et al., 2024)

- jsonschema (Berman et al., 2024)
- jwst (Bushouse et al., 2024)
- matplotlib (Hunter, 2007)
- numpy (Harris et al., 2020)
- photutils (Bradley et al., 2024)
- PSFEx (Bertin, 2011)
- psutil (Rodola, 2024)
- PyYAML (Simonov, 2024)
- roman_datamodels (STScI, 2024a)
- romancal (Roman calibration pipeline developers, 2024)
- scipy (Virtanen et al., 2020)
- SExtractor (Bertin & Arnouts, 1996)
- spherical_geometry (Simon, Robitaille, Droettboom, et al., 2024)
- STCAL (STScI, 2024b)
- stdatamodels (STScI, 2024c)
- stpipe (STScI, 2024d)
- TinyTim (Krist et al., 2011) – including the option to use the Gillis et al. (2020) parameters
- tweakwcs (Cara et al., 2024)
- STPSF (M. Perrin et al., 2025), formerly WebbPSF (M. Perrin et al., 2024; M. D. Perrin et al., 2012, 2014)

Acknowledgments

AP is supported by the Quad Fellowship administered by IIE and thanks Hsiao-Wen Chen and Juan Guerra for their comments. AP also thanks the reviewers for their suggestions, which improved the manuscript and codebase. This work makes use of observations made with the NASA/ESA Hubble Space Telescope and the NASA/ESA/CSA James Webb Space Telescope obtained from the Mikulski Archive for Space Telescopes at the Space Telescope Science Institute, which is operated by the Association of Universities for Research in Astronomy, Inc., under NASA contracts NAS 5–26555 for HST and NAS 5-03127 for JWST.

References

- Anderson, J. (2016). *Empirical Models for the WFC3/IR PSF* (p. 12). Instrument Science Report WFC3 2016-12, 42 pages.
- Anderson, J., & King, I. R. (2000). Toward High-Precision Astrometry with WFPC2. I. Deriving an Accurate Point-Spread Function. *Publications of the Astronomical Society of the Pacific*, 112(776), 1360–1382. <https://doi.org/10.1086/316632>
- Astropy Collaboration, Price-Whelan, A. M., Lim, P. L., Earl, N., Starkman, N., Bradley, L., Shupe, D. L., Patil, A. A., Corrales, L., Brasseur, C. E., Nöthe, M., Donath, A., Tollerud, E., Morris, B. M., Ginsburg, A., Vaher, E., Weaver, B. A., Tocknell, J., Jamieson, W., ... Astropy Project Contributors. (2022). The Astropy Project: Sustaining and Growing a Community-oriented Open-source Project and the Latest Major Release (v5.0) of the Core Package. *The Astrophysical Journal*, 935(2), 167. <https://doi.org/10.3847/1538-4357/ac7c74>
- Astropy Collaboration, Price-Whelan, A. M., Sipőcz, B. M., Günther, H. M., Lim, P. L., Crawford, S. M., Conseil, S., Shupe, D. L., Craig, M. W., Dencheva, N., Ginsburg, A., VanderPlas, J. T., Bradley, L. D., Pérez-Suárez, D., de Val-Borro, M., Aldcroft, T. L., Cruz, K. L., Robitaille, T. P., Tollerud, E. J., ... Astropy Contributors. (2018). The Astropy Project: Building an Open-science Project and Status of the v2.0 Core Package. *The Astronomical Journal*, 156(3), 123. <https://doi.org/10.3847/1538-3881/aabc4f>

- Astropy Collaboration, Robitaille, T. P., Tollerud, E. J., Greenfield, P., Droettboom, M., Bray, E., Aldcroft, T., Davis, M., Ginsburg, A., Price-Whelan, A. M., Kerzendorf, W. E., Conley, A., Crighton, N., Barbary, K., Muna, D., Ferguson, H., Grollier, F., Parikh, M. M., Nair, P. H., ... Streicher, O. (2013). Astropy: A community Python package for astronomy. *Astronomy and Astrophysics*, 558, A33. <https://doi.org/10.1051/0004-6361/201322068>
- Berman, J., Sterling, C., Taprest, R., Nezbeda, H., chen, wilson, Rosen, S., DavidKorczynski, Opemipo, Maynard, G., Smithers, B., Zugnoni, M., Dunklau, C., Arnold, H., Nephin, D., Noord, D. van, Dygalo, D., ApamNapat, Lennart, Anderson, J., ... Moorman, J. D. (2024). *Python-jsonschema/jsonschema: v4.23.0* (Version v4.23.0). Zenodo. <https://doi.org/10.5281/zenodo.5539941>
- Bertin, E. (2011). Automated Morphometry with SExtractor and PSFEx. In I. N. Evans, A. Accomazzi, D. J. Mink, & A. H. Rots (Eds.), *Astronomical data analysis software and systems XX* (Vol. 442, p. 435).
- Bertin, E., & Arnouts, S. (1996). SExtractor: Software for source extraction. *Astronomy and Astrophysics, Supplement*, 117, 393–404. <https://doi.org/10.1051/aas:1996164>
- Bradley, L., Sipőcz, B., Robitaille, T., Tollerud, E., Vinícius, Z., Deil, C., Barbary, K., Wilson, T. J., Busko, I., Donath, A., Günther, H. M., Cara, M., Lim, P. L., Meßlinger, S., Conseil, S., Burnett, Z., Bostroem, A., Droettboom, M., Bray, E. M., ... Georgiev, I. Y. (2024). *Astropy/photutils*. Zenodo. <https://doi.org/10.5281/zenodo.596036>
- Brammer, G. (2024). *grizli*. <https://doi.org/10.5281/zenodo.1146904>
- Bushouse, H., Eisenhamer, J., Dencheva, N., Davies, J., Greenfield, P., Morrison, J., Hodge, P., Simon, B., Grumm, D., Droettboom, M., Slavich, E., Sosey, M., Pauly, T., Miller, T., Jedrzejewski, R., Hack, W., Davis, D., Crawford, S., Law, D., ... Clarke, M. (2024). *JWST Calibration Pipeline* (Version 1.16.0). <https://doi.org/10.5281/zenodo.7038885>
- Cara, M., Hunkeler, J., Burnett, Z., Bradley, L., Graham, B., Lim, P. L., Dencheva, N., Schlafly, E., Rendina, M., Jamieson, W., & Geiger, Z. (2024). *spacetelescope/tweakwcs: A maintenance release* (Version 0.8.9). Zenodo. <https://doi.org/10.5281/zenodo.4018234>
- Dencheva, N., Mumford, S., Cara, M., perrygreenfield, Bradley, L., Graham, B., Burnett, Z., D'Avella, D., Sipőcz, B., Lim, P. L., Jamieson, W., Shanahan, C., Davies, J., Earl, N., Simon, B., Tollerud, E., Slavich, E., Simpson, C., Deil, C., ... Geiger, Z. (2024). *Spacetelescope/gwcs: GWCS v 0.21.0* (Version 0.21.0). Zenodo. <https://doi.org/10.5281/zenodo.1041789>
- Fruchter, A. S., & Hook, R. N. (2002). Drizzle: A Method for the Linear Reconstruction of Undersampled Images. *Publications of the Astronomical Society of the Pacific*, 114(792), 144–152. <https://doi.org/10.1086/338393>
- Gillis, B. R., Schrabback, T., Marggraf, O., Mandelbaum, R., Massey, R., Rhodes, J., & Taylor, A. (2020). Validation of PSF models for HST and other space-based observations. *Monthly Notices of the Royal Astronomical Society*, 496(4), 5017–5038. <https://doi.org/10.1093/mnras/staa1818>
- Graham, B., D'Avella, D., Jamieson, W., Droettboom, M., Slavich, E., Robitaille, T., Dencheva, N., Burnett, Z., perrygreenfield, Simon, B., MacDonald, K., Bray, E. M., Davies, J., Mumford, S., Markovtsev, V., Tollerud, E., Sipőcz, B., Bradley, L., Fabry, Ç., ... Kerzendorf, W. (2024). *asdf-format/asdf: 4.0.0* (Version 4.0.0). Zenodo. <https://doi.org/10.5281/zenodo.6617556>
- Hack, W. J., Cara, M., Sosey, M., mdlpstsci, Dulude, M., Chris, Hunkeler, J., Dencheva, N., astropy-buildbot, kevinlindsay, Sienkiewicz, M., Bray, E. M., Simon, B., Lim, P. L., Rendina, M., Hanley, C., Bradley, L., D'Avella, D., Neuheisel, J., ... system, S. S. C. I. (2021). *Spacetelescope/drizzlepac: Drizzlepac v3.3.0* (Version 3.3.0). Zenodo. <https://doi.org/10.5281/zenodo.5426649>

- Harris, C. R., Millman, K. J., Walt, S. J. van der, Gommers, R., Virtanen, P., Cournapeau, D., Wieser, E., Taylor, J., Berg, S., Smith, N. J., Kern, R., Picus, M., Hoyer, S., Kerkwijk, M. H. van, Brett, M., Haldane, A., Río, J. F. del, Wiebe, M., Peterson, P., ... Oliphant, T. E. (2020). Array programming with NumPy. *Nature*, 585(7825), 357–362. <https://doi.org/10.1038/s41586-020-2649-2>
- Hoffmann, S. L., Mack, J., Avila, R., Martlin, C., Cohen, Y., & Bajaj, V. (2021). New Drizzlepac Handbook Version 2.0 Released In Hdox: Updated Documentation For HST Image Analysis. *American Astronomical Society Meeting Abstracts*, 53, 216.02.
- Hunter, J. D. (2007). Matplotlib: A 2D graphics environment. *Computing in Science & Engineering*, 9(3), 90–95. <https://doi.org/10.1109/MCSE.2007.55>
- Ji, Z., Williams, C. C., Tacchella, S., Suess, K. A., Baker, W. M., Alberts, S., Bunker, A. J., Johnson, B. D., Robertson, B., Sun, F., Eisenstein, D. J., Rieke, M., Maseda, M. V., Hainline, K., Hausen, R., Rieke, G., Willmer, C. N. A., Egami, E., Shivaee, I., ... Sandles, L. (2024). JADES + JEMS: A Detailed Look at the Buildup of Central Stellar Cores and Suppression of Star Formation in Galaxies at Redshifts $3 < z < 4.5$. *The Astrophysical Journal*, 974(1), 135. <https://doi.org/10.3847/1538-4357/ad6e7f>
- Krist, J. E., Hook, R. N., & Stoehr, F. (2011). 20 years of Hubble Space Telescope optical modeling using Tiny Tim. In M. A. Kahan (Ed.), *Optical modeling and performance predictions v* (Vol. 8127, p. 81270J). <https://doi.org/10.1117/12.892762>
- Liaudat, T. I., Starck, J.-L., & Kilbinger, M. (2023). Point spread function modelling for astronomical telescopes: A review focused on weak gravitational lensing studies. *Frontiers in Astronomy and Space Sciences*, Volume 10 - 2023. <https://doi.org/10.3389/fspas.2023.1158213>
- Libralato, M., Argyriou, I., Dicken, D., García Marín, M., Guillard, P., Hines, D. C., Kavanagh, P. J., Kendrew, S., Law, D. R., Noriega-Crespo, A., & Álvarez-Márquez, J. (2024). High-precision Astrometry and Photometry with the JWST/MIRI Imager. *Publications of the Astronomical Society of the Pacific*, 136(3), 034502. <https://doi.org/10.1088/1538-3873/ad2551>
- Libralato, M., Bellini, A., van der Marel, R. P., Anderson, J., Sohn, S. T., Watkins, L. L., Alderson, L., Allen, N., Clampin, M., Glidden, A., Goyal, J., Hoch, K., Huang, J., Kammerer, J., Lewis, N. K., Lin, Z., Long, D., Louie, D., MacDonald, R. J., ... Wakeford, H. R. (2023). JWST-TST Proper Motions. I. High-precision NIRISS Calibration and Large Magellanic Cloud Kinematics. *The Astrophysical Journal*, 950(2), 101. <https://doi.org/10.3847/1538-4357/acd04f>
- Mandelbaum, R., Jarvis, M., Lupton, R. H., Bosch, J., Kannawadi, A., Murphy, M. D., Zhang, T., & the LSST Dark Energy Science Collaboration. (2023). PSFs of coadded images. *Open Journal of Astrophysics*, 6, arXiv:2209.09253. <https://doi.org/10.21105/astro.2209.09253>
- Perrin, M. D., Sivaramakrishnan, A., Lajoie, C.-P., Elliott, E., Pueyo, L., Ravindranath, S., & Albert, Loïc. (2014). Updated point spread function simulations for JWST with WebbPSF. In Jr. Oschmann Jacobus M., M. Clampin, G. G. Fazio, & H. A. MacEwen (Eds.), *Space telescopes and instrumentation 2014: Optical, infrared, and millimeter wave* (Vol. 9143, p. 91433X). <https://doi.org/10.1117/12.2056689>
- Perrin, M. D., Soummer, R., Elliott, E. M., Lallo, M. D., & Sivaramakrishnan, A. (2012). Simulating point spread functions for the James Webb Space Telescope with WebbPSF. In M. C. Clampin, G. G. Fazio, H. A. MacEwen, & Jr. Oschmann Jacobus M. (Eds.), *Space telescopes and instrumentation 2012: Optical, infrared, and millimeter wave* (Vol. 8442, p. 84423D). <https://doi.org/10.1117/12.925230>
- Perrin, M., Melendez, M., Osborne, S., Geda, R., Sappington, B., Lajoie, C.-P., Long, J., & Otor, O. J. (2024). WebbPSF (Version 1.4.0). <https://github.com/spacetelescope/webbpsf>

- Perrin, M., Melendez, M., Osborne, S., Geda, R., Sappington, B., Lajoie, C.-P., Long, J., & Otor, O. J. (2025). *STPSF* (Version 2.0.0). <https://github.com/spacetelescope/stpsf>
- Rodola, G. (2024). Psutil: Cross-platform lib for process and system monitoring in python. In *GitHub repository*. GitHub. <https://github.com/giampaolo/psutil>
- Roman calibration pipeline developers. (2024). Romancal: Python library to process science observations from the nancy grace roman space telescope. In *GitHub repository*. GitHub. <https://github.com/spacetelescope/romancal>
- Simon, B., Robitaille, T., Cara, M., Burnett, Z., Lim, P. L., Davies, J., Droettboom, M., Tollerud, E., Bray, E. M., Bradley, L., Craig, M., Deil, C., Hunkeler, J., Ginsburg, A., Streicher, O., Barbary, K., Sipőcz, B., Graham, B., MacDonald, K., ... Günther, H. M. (2024). *spacetelescope/drizzle: API redesign to make code I/O agnostic. Bug fixes* (Version 2.0.0). Zenodo. <https://doi.org/10.5281/zenodo.10672889>
- Simon, B., Robitaille, T., Droettboom, M., Lim, P. L., Cara, M., Hunkeler, J., Tollerud, E., MacDonald, K., Bray, E. M., Bradley, L., Rendina, M., Jamieson, W., Craig, M., Deil, C., perrygreenfield, Sipőcz, B., Barbary, K., Dencheva, N., Ginsburg, A., ... wohenbushuang. (2024). *spacetelescope/spherical_geometry: Bug fixes: inner1d, degree arg removed. Build with numpy 2.0* (Version 1.3.2). Zenodo. <https://doi.org/10.5281/zenodo.11636209>
- Simonov, K. (2024). PyYAML: YAML parser and emitter for python. In *GitHub repository*. GitHub. <https://github.com/yaml/pyyaml>
- STScI. (2024a). Roman_datamodels: Data models supporting calibration of the nancy grace roman space telescope. In *GitHub repository*. GitHub. https://github.com/spacetelescope/roman_datamodels
- STScI. (2024b). STCAL: STScI calibration algorithms and tools. In *GitHub repository*. GitHub. <https://github.com/spacetelescope/stcal>
- STScI. (2024c). Stdamodels: Core support for DataModel classes used in calibration pipelines. In *GitHub repository*. GitHub. <https://github.com/spacetelescope/stdamodels>
- STScI. (2024d). Stpipe: Framework for calibration pipeline software. In *GitHub repository*. GitHub. <https://github.com/spacetelescope/stpipe>
- STScI CRDS s/w developers. (2024). Crds: Calibration reference data system, HST/JWST/roman reference file management. In *GitHub repository*. GitHub. <https://github.com/spacetelescope/crds>
- Troxel, M. A., Lin, C., Park, A., Hirata, C., Mandelbaum, R., Jarvis, M., Choi, A., Givans, J., Higgins, M., Sanchez, B., Yamamoto, M., Awan, H., Chiang, J., Doré, O., Walter, C. W., Zhang, T., Cohen-Tanugi, J., Gawiser, E., Hearin, A., ... LSST Dark Energy Science Collaboration. (2023). A joint Roman Space Telescope and Rubin Observatory synthetic wide-field imaging survey. *Monthly Notices of the Royal Astronomical Society*, 522(2), 2801–2820. <https://doi.org/10.1093/mnras/stad664>
- Virtanen, P., Gommers, R., Oliphant, T. E., Haberland, M., Reddy, T., Cournapeau, D., Burovski, E., Peterson, P., Weckesser, W., Bright, J., van der Walt, S. J., Brett, M., Wilson, J., Millman, K. J., Mayorov, N., Nelson, A. R. J., Jones, E., Kern, R., Larson, E., ... SciPy 1.0 Contributors. (2020). SciPy 1.0: Fundamental Algorithms for Scientific Computing in Python. *Nature Methods*, 17, 261–272. <https://doi.org/10.1038/s41592-019-0686-2>