

- yieldplotlib: A unified library for exoplanet yield code
- <sub>2</sub> visualizations
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## Summary

NASA's next flagship observatory, as recommended by the Astro2020 decadal survey, is the Habitable World's Observatory (HWO) which has the ambitious goal to "search for biosignatures from a robust number of about ~25 habitable zone planets and be a transformative facility for general astrophysics". In the phrasing of this science goal, the importance of expected exo-Earth yield (the total number of detected habitable zone planets) on the success of the mission is made apparent. As HWO is being developed and trade spaces are explored, yield codes such as the Altruistic Yield Optimization (AYO) and EXOSIMS that can calculate the expected number of detected and characterized planets for a given mission architecture are essential. While these yield codes have the same goal, they can be complex and have major differences in their inputs and outputs that has made comparing results difficult. The need for a unified library for visualizing the inputs and outputs of these yield codes in a complete, descriptive, and accessible way has therefore also become apparent. To this end we have developed yieldplotlib, an open-source Python library to communicate the results of yield codes to the broader community and produce publication-quality plots. Currently, there are modules for analyzing AYO and EXOSIMS, but yieldplotlib is easily extensible and support for other yield codes can be easily added in the future.

# Statement of need

Expected exoplanetary yield is an important metric when evaluating the success of proposed flagship space observatory architectures such as those currently being considered for the Habitable Worlds Observatory (HWO; Feinberg et al. (2024)). As HWO is being developed and trade spaces are explored, yield codes such as the Altruistic Yield Optimizer (AYO; Stark et al. (2014)) and EXOSIMS (Delacroix et al., 2016) that can calculate the expected number of detected and characterized planets for a given mission architecture are essential. While these yield codes have the same goal, they can be complex and have major differences in their inputs and outputs that has made comparing results difficult. The need for a unified library for visualizing these yield codes in a complete, descriptive, and accessible way has therefore also become apparent. This is non-trivial due to the differing syntaxes, structures, and assumptions that each of these codes make.

Despite the challenges, when these values are interrogated directly, new insights are achieved.

Some of these insights are highlighted in detail in Stark et al. (2025) where a comparison of just the internal exposure time calculations of AYO and EXOSIMS revealed sources of previously unknown discrepancy. yieldplotlib is a continuation of that initial work, but aimed instead at the higher level yield products (such as the total number of detected exo-Earths) which are of the most direct interest.

To visualize the inputs and outputs of AYO and EXOSIMS, yieldplotlib uses a custom



- loading and parsing structure that allows for the easy access of equivalent data across each of
- the codes. This allows yieldplotlib to communicate the results of yield codes to the broader
- 44 community and produce publication-quality plots without the need to understand the complex
- 45 underlying yield codes that were used to generate the data. Currently yieldplotlib contains
- modules for analyzing AYO and EXOSIMS, but is easily extensible and support for other yield
- 47 codes can be easily added in the future.

# 48 Methods and Functionality

### 49 Parsing and Getting Values

- yieldplotlib uses a file node and directory structure to parse the yield output packages from
- AYO and EXOSIMS. It then uses a user generated key\_map to link the EXOSIMS and AYO
- keys to a universal key in yieldplotlib. This key\_map is generated from a CSV file in the
- repository that is automatically updated with changes from an active development version
- hosted on Google Sheets for broader collaboration. An example excerpt from the CSV file can
- 55 be found in Figure 1.

### yieldplotlib key\_map.csv sample

yieldplotlib name	description	EXOSIMS name	EXOSIMS file	EXOSIMS Class	AYO name	AYO file	AYO Class
ator diat	Distance to the star	ator diat	radicas atar target and	EXOSIMSCSVFile	diat (na)	torget list sou	AVOCEVEILA
star_dist	(in parsecs).	star_dist	reduce-star-target.csv	EXOSINISCSVFIIE	dist (pc)	target_list.csv	AYOCSVFile
	Yield of Earth-like				exoEarth candidate		
yield_earth	exoplanet candidates	exoE_det_alt_mean	reduce-earth.csv	EXOSIMSCSVFile	yield	observations.csv	AYOCSVFile

**Figure 1:** Example portion of the yieldplotlib key map CSV file containing the mappings between AYO, EXOSIMS, and yieldplotlib parameters.

- 56 Once the yield packages are loaded and parsed, a getter can be called on the directories to
- 57 return the corresponding value from the respective yield code, for example:

```
from yieldplotlib.load.ayo_directory import AYODirectory
from yieldplotlib.load.exosims_directory import EXOSIMSDirectory
```

```
ayo = AYODirectory(Path("path/to/my/ayo_data"))
exosims = EXOSIMSDirectory(Path("path/to/my/exosims_data"))
```

```
ayo.get("yield_earth")
exosims.get("yield_earth")
```

- <sup>58</sup> Yield input packages (YIPs) specifying input coronagraph parameters can also be loaded and
- 59 accessed using the same file node and directory structure. This allows users to access key
- coronagraph performance metrics that serve as critical inputs to these yield codes. In order
- $_{61}$  to process the YIPs, yieldplotlib uses yippy $^{1}$  as a backend, though the user interface is

identical to generating the AYO and EXOSIMS directories, for example: from yieldplotlib.load.yip\_directory import YIPDirectory

```
yip = YIPDirectory(Path("path/to/my/yip_data"))
```

<sup>&</sup>lt;sup>1</sup>github.com/CoreySpohn/yippy



## 63 Plotting

#### 64 Generic and Comparison Plots

yieldplotlib extends the commonly used Python plotting package matplotlib to take advantage of the wide variety of customization options that matplotlib offers, as well as the extensive knowledge base many users of yieldplotlib will have with that package. The yieldplotlib generic plots are used for single yield run visualizations and can make scatter plots, standard plots, and histograms.

The comparison plots are for more complex comparisons by plotting multiple yield runs in either the same multi-panel figure, or on the same set of axes.

#### 72 Plotting Scripts

yieldplotlib contains scripts for generating common plots used in yield code visualizations to provide instant usability for comparing AYO and EXOSIMS as motivated by the rapid pace of the ongoing architecture trade studies for HWO. This also serves to provide examples on how the package can be used for those who want to adapt the generic yieldplotlib parsing structure and plotting methods to generate their own bespoke visualizations.

Figure 2 and Figure 3 show two different examples of these types of yield outputs. Figure 2 shows the fraction of a star's habitable zone that cen be sampled by during the lifetime of a mission known as the "habitable zone completeness" with the two yield codes in side by side axes and using the same color bar for ease of comparison. Figure 3 shows histograms of the total number of detected planets found as a function of planet type in this case just using EXOSIMS.

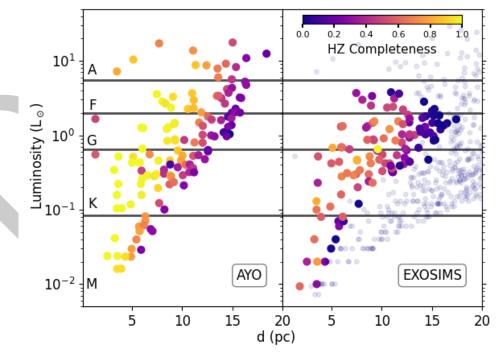


Figure 2: Plot of the Habitable Zone (HZ) completeness as a function of host star luminosity (in units of Solar luminosity) and distance (in parsecs). Here the AYO results are on the left and the EXOSIMS results are on the right.



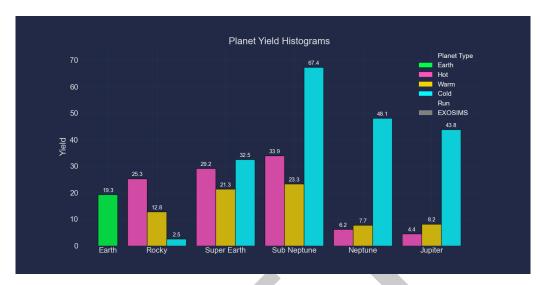


Figure 3: Bar chart showing expected EXOSIMS planet yields for hot (pink), warm (yellow), and cold (blue) Rocky planets, Super Earths, Sub-Neptunes, Neptunes and Jupiters. Earth-like planets which are of the most interest for HWO are shown in green. This plot uses the "cyberpunk" theme from matplotlib which is supported as a keyword argument to yieldplotlib as a dark mode alternative to the standard plotting color schemes.

- Yield code inputs can also have a profound impact on their results and so plotting these values
- 85 is important to ensure consistency. Figure 4 shows the throughput for a key series of starlight
- supprrssion optics in the observatory known collectively as a coronagraph. Smaller throughputs
- result in less planet light on the detector which can have a profound impact on final yields.



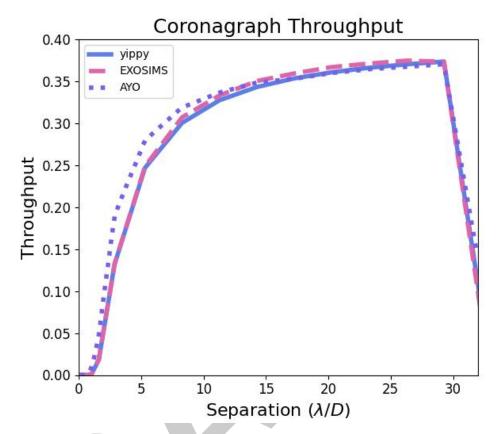


Figure 4: Core throughput vs. separation (in lambda/D) for the coronagraph assumed by AYO (dotted purple), EXOSIMS (dashed pink) and pulled directly from the yield input package using yippy (solid blue). Slight differences between the codes can be attributed to how the "core" is defined. EXOSIMS and yippy adopt a fixed radius circular aperture whereas AYO defines an aperture based on pixels having more than 30% of the peak flux. Additional sources of difference can also lie in the interpolation methods used by all of the codes. This highlights the types of insights that tools like yieldplotlib can help to uncover.

### **88** Pipeline and Command Line Interface

- 99 In order to generate summary plots quickly, yieldplotlib comes packaged with a command
- 90 line interface and plotting pipeline to create a suite of commonly used yield plots. This is
- 91 accessed through the terminal by:

run\_ypl path/to/yield/runs

- where the specified path is either to a single folder containing the outputs for a single AYO or
- 93 EXOSIMS run, or to a directory containing subdirectories of many AYO and EXOSIMS runs.

### 4 Future Work

- <sub>95</sub> Following up on the ETC cross-calibration work in Stark et al. (2025), a new cross-calibration
- study of high-level yield products is planned which will utilize yieldplotlib. This work will
- 97 be vital to the ongoing HWO architecture trade studies by ensuring more reliable and robust
- 98 yield estimates, improving current yield codes, and providing a standard on which to calibrate
- 99 new yield codes in the future.



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