



UNIVERSITY OF OXFORD



Jason J. Watson SGSO Simulation Workshop March 4, 2019 What is ctapipe?

Python as a Pipeline Framework

Github Workflow

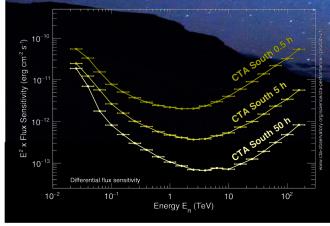
# What is cta**pipe**?

- Intention:
  - A pipeline for the offline low-level processing of CTA Cherenkov Shower data from cameras and Monte Carlo simulations
- Currently:
  - Alpha development stage (v0.6.2)
  - No full, single pipeline implemented yet
  - A library of methods useful for IACT data processing
  - Can read data from cameras and sim\_telarray
- Python
- Open source: <u>https://github.com/cta-observatory/ctapipe</u>
- Utilises packages maintained by the large Python data science and astronomy community

# What is the scope of ctapipe?

3. Reconstruct properties of Cherenkov shower progenitor

4. Provide event lists to the science tools (e.g. ctools, gammapy)
From simulations: Produce sensitivity
& Instrument Response Functions



2. Parameterise image of Cherenkov shower

> 1. Extract charge from each pixel's waveform stored on disk

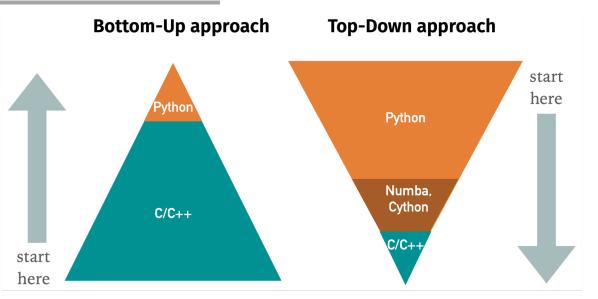
#### Original Illustration Credit: Richard White

J. J. Watson



3

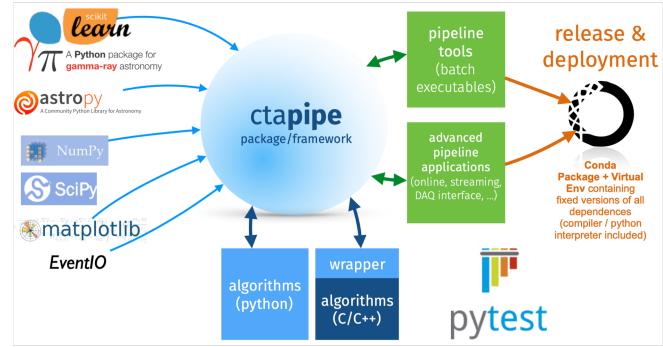
## Python as a Pipeline Framework



- Pipeline frameworks often adopt a "Bottom-Up" approach, with the aim of creating statically-compiled optimised code from the start, which may be wrapped with a higher-level Python interface
- Due to its dynamically typed nature, Python is often considered slow. It is therefore unusual to use Python as the core language for a pipeline framework
- However, Python is easy to learn, easy to contribute to, and has intuitive syntax
- Python can also be extended with static compiled languages (such as C, C++ or Fortran)
- There is an extensive amount of scientific computing resources available in Python, utilising optimised low-level C and Fortran operations
- ctapipe has therefore adopted the "Top-Down" approach, writing Python code which utilises these extensive resources to achieve processing speeds matching (and often surpassing) hand-written static code.
- Areas requiring further optimisation are identified via profiling, and static code is written to remove bottleneck
  - "premature optimization is the root of all evil"

### Python Scientific Resources

- NumPy: the fundamental package for scientific processing in Python, providing a contiguous, n-dimensional array object, used to pass data between statically-typed extensions.
- SciPy: expands on the operations one can perform with the NumPy array, providing extensive functionality useful for scientific computing, including statistical operations, interpolation, and signal processing.
- Astropy: developed by the astronomy community to consolidate various common astronomy procedures into a single package.
- Matplotlib: supplies extensive 2D plotting capabilities for Python, similar to those found in MATLAB, and is compatible with NumPy arrays.



# Extending Python with C

- Many options!
- https://intermediate-and-advanced-software-carpentry.readthedocs.io/en/latest/c++-wrapping.html
- Numba & Cython
  - Python or "Python-like" code which is compiled into C code, allowing for an improvement in speed
  - https://jakevdp.github.io/blog/2012/08/24/numba-vs-cython/
- By hand
  - Python is itself written in C (CPython)
  - <u>https://docs.python.org/3/extending/extending.html</u>
- SWIG (Simplified Wrapper and Interface Generator)
  - Wraps low-level code such that methods can be called from high-level code
  - Entire libraries can easily be wrapped
- ctypes
  - Easy interface to C-written methods
  - https://pgi-jcns.fz-juelich.de/portal/pages/using-c-from-python.html

## **Github Version Control**

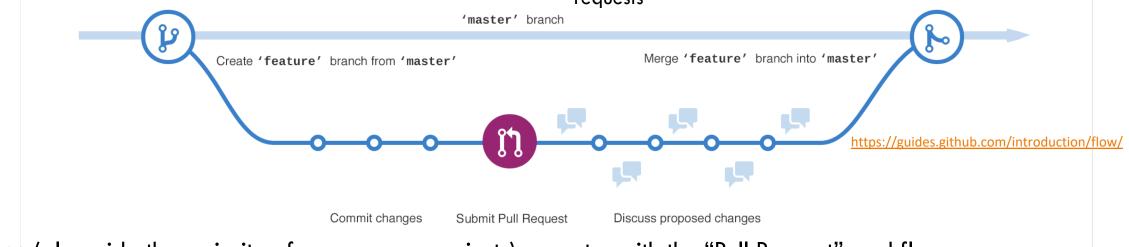
- ctapipe is open source, and is on Github: <u>https://github.com/cta-observatory/ctapipe</u>
- There are two typical Github workflows (that I am aware of):

#### <u>Push/Pull</u>

- Fast integration of new code
- No/limited review procedure
  - No dedicated place for discussion of contribution
  - No enforcement of coding standards
  - No ensuring of working code

#### Pull Request

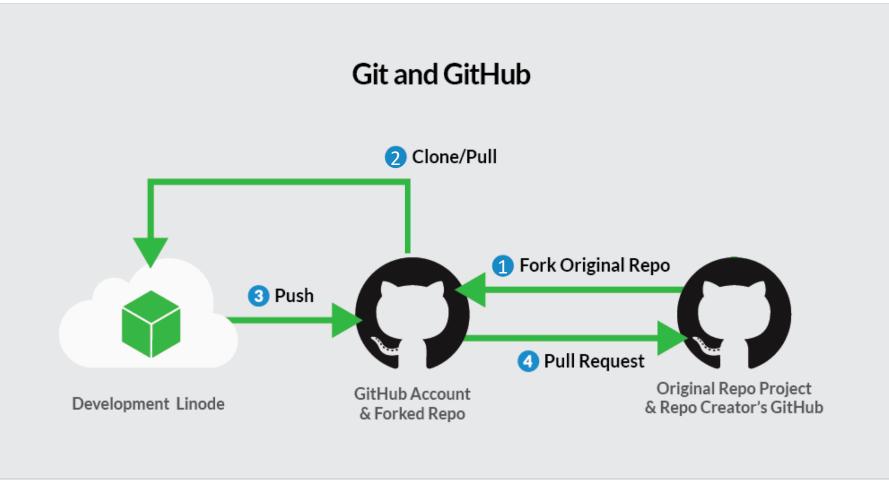
- New code is reviewed before acceptance into main repository
- Contributions can be discussed
- Coding standards can be enforced
- Possibility for automated unit tests to ensure new code works, and does not break existing code
- However, can be slow. Requires manpower to review new pull requests



ctapipe (alongside the majority of open-source projects) operates with the "Pull Request" workflow

cta**pipe** 

#### Github Workflow (Fork & Pull Request)



Modified from: https://www.linode.com/docs/development/version-control/how-to-install-git-and-clone-a-github-repository/

cta**pipe** 

# Using the Github Workflow in cta**pipe**

- The automated unit tests (TravisCI) and Pull request discussion have been paramount in a cohesive development
- Integration of new code was very slow to begin with Only one person had permissions to accept Pull Requests
- We now (recently in the last few months) have a core-developer team (~5 people) who can review Pull Requests
- Pull requests are checked for unit tests (TravisCI), coverage (codecov), and coding standards (Codacy)
- Each Pull Request requires 2 reviews before merge

Key to a smooth development: Lots of reviewers!

<b>~</b>	Changes approved 2 approving reviews by reviewers with write access. Learn more.			Hide all reviewers
~	😥 watsonjj approved these changes	See review	Dismiss review	Re-request review
~	MaxNoe approved these changes	See review	Dismiss review	Re-request review
<b>~</b>	All checks have passed 4 successful checks			Hide all checks
~	Codacy/PR Quality Review — Up to standards. A positive pull request.			Details
~	<b>codecov/patch</b> — 100% of diff hit (target 78.93%)			Details
~	<b>? codecov/project</b> — 78.95% (+0.02%) compared to 7a40dba			Details
~	location and the second			Required Details
This branch has no conflicts with the base branch Merging can be performed automatically.				
Merge pull request  You can also open this in GitHub Desktop or view command line instructions.				

cta**pipe** 

## Summary

- Utilising Python for a pipeline framework in a "Top-Down" design is proving to be successful for ctapipe
  - The scientific resources available in Python are extensive, impressive, and easy to use
- The "Pull-Request" Github workflow is extremely reliable for collaborative development
  - Ensuring high quality and working code
- It is important to have multiple trusted reviewers of code
  - Ensuring speedy acceptance of contributions