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# MINI-COURSE ON CODE DEVELOPMENT AND PACKAGING

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# INTRO TO SOME ADVANCED TOPICS

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# GitHub Actions

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# GitHub Actions

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- Last year, GitHub itself released a CI/CD (continuous-integration/continuous-delivery) service that is automatically part of every GitHub repository  
—> `GitHub Actions`
  - Similar to Travis CI, configured with YAML files (`.yaml`), but some big advantages:
    - Easily configure multiple different runs to do (CI tests, building documentation, building a website, responding to issues/pull requests, pushing to AWS S3, ...)
    - Re-use atomic steps defined in other GitHub repositories (e.g., `setup python`, `setup Miniconda`)
    - More free runners available (up to 20)
-

# SETTING UP GITHUB ACTIONS FOR YOUR REPOSITORY

Go to “Actions” tab

<> Code ① Issues 4 🏠 Pull requests 0 **🎯 Actions** 📁 Projects 0 📖 Wiki 🛡 Security 📊 Insights ⚙ Settings

## Get started with GitHub Actions

Skip this: [Set up a workflow yourself](#)

Choose a workflow to build, test, and deploy your code. Make code reviews, branch management, and issue triaging work the way you want.

### Build and test your Python repository

#### Django

Build and Test a Django Project

[Set up this workflow](#)

```
python -m pip install --upgrade pip
pip install -r requirements.txt
python manage.py test
```

actions/starter-workflows Python

#### Python application

Create and test a Python application.

[Set up this workflow](#)

```
python -m pip install --upgrade pip
pip install -r requirements.txt
pip install flake8
```

actions/starter-workflows Python

#### Python package

Create and test a Python package on multiple Python versions.

[Set up this workflow](#)

```
python -m pip install --upgrade pip
pip install -r requirements.txt
pip install flake8
```

actions/starter-workflows Python

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# SETTING UP GITHUB ACTIONS FOR YOUR REPOSITORY

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or just add a `.yaml` file under `.github/workflows`

```
name: Test exampy

on: [push]

jobs:
  build:
    runs-on: ubuntu-latest
    strategy:
      matrix:
        python-version: [3.7, 3.8]
        numpy-version: [1.16,1.17,1.18]
        exclude:
          - python-version: 3.8
            numpy-version: 1.16
          - python-version: 3.8
            numpy-version: 1.17
    steps:
      - uses: actions/checkout@v2
      - name: Set up Python ${ matrix.python-version }
        uses: actions/setup-python@v1
        with:
          python-version: ${ matrix.python-version }
```

```
- name: Install dependencies
run: |
    python -m pip install --upgrade pip
    pip install numpy==${{ matrix.numpy-version }}
- name: Install package
run: |
    pip install -e .
- name: Test with pytest
run: |
    pip install pytest
    pip install pytest-cov
    pip install scipy
    pytest -v tests/ --cov=exampy/
```

```

name: Test exampy

on: [push]

jobs:
  build:
    runs-on: ubuntu-latest
    strategy:
      matrix:
        python-version: [3.7, 3.8]
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        with:
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        run: |
          python -m pip install --upgrade pip
          pip install numpy==${ matrix.numpy-version }
      - name: Install package
        run: |
          pip install -e .
      - name: Test with pytest
        run: |
          pip install pytest
          pip install pytest-cov
          pip install scipy
          pytest -v tests/ --cov=exampy/

```

← Informative name

← When to run the workflow  
(e.g., on: [push,pull request])

← Operating system

(can be ubuntu, mac, windows)

← Define a matrix of different builds,  
similar to Travis CI  
(can't 'include', so exclude)

← Arbitrary sequence of steps:

1) check out the repository

← 2) setup Python

← 3) install dependencies  
with pip

← 4) install package

← 5) install test dependencies  
and run tests





Search or jump to...

[Pull requests](#) [Issues](#) [Marketplace](#) [Explore](#)



[jobovy](#) / [exampy](#)

[Unwatch](#) 1 [Star](#) 1 [Fork](#) 0

[Code](#) [Issues](#) 0 [Pull requests](#) 0 **[Actions](#)** [Projects](#) 0 [Wiki](#) [Security](#) [Insights](#) [Settings](#)

### Workflows

[New workflow](#)

**All workflows**

[Test exampy](#)

### All workflows

Filter workflows

Event ▾ Status ▾ Branch ▾ Actor ▾

**Add GitHub action to test exampy**  
Test exampy #1: Commit f850194 pushed by jobovy

master

21 seconds ago ...  
14s

Fix exclusion syntax  
master 93cf2da

Test exampy  
on: push

Test exampy / build (3.7, 1.16)  
succeeded 24 seconds ago in 21s

Search logs < > ...

- ✓ build (3.7, 1.16)
- ✓ build (3.7, 1.17)
- ✓ build (3.7, 1.18)
- ✓ build (3.8, 1.18)

- ▶ ✓ Set up job 2s
- ▶ ✓ Run actions/checkout@v2 1s
- ▶ ✓ Set up Python 3.7 0s
- ▶ ✓ Install dependencies 8s
- ▶ ✓ Install package 1s
- ▶ ✓ Test with pytest 9s
- ▶ ✓ Post actions/checkout@v2 0s
- ▶ ✓ Complete job 0s

# Easy to use multiple operating systems:

```
name: Test exampy

on: [push]

jobs:
  build:
    runs-on: ${ matrix.os }
    strategy:
      matrix:
        os: [ubuntu-latest, windows-latest, macos-latest]
        python-version: [3.7, 3.8]
        numpy-version: [1.16,1.17,1.18]
        exclude:
          - os: ubuntu-latest
            python-version: 3.8
            numpy-version: 1.16
          - os: ubuntu-latest
            python-version: 3.8
            numpy-version: 1.17
          - os: windows-latest
            python-version: 3.8
            numpy-version: 1.16
          - os: windows-latest
            python-version: 3.8
            numpy-version: 1.17
          - os: macos-latest
            python-version: 3.8
            numpy-version: 1.16
          - os: macos-latest
            python-version: 3.8
            numpy-version: 1.17

    steps:
```

### Run integration tests on all three major OS using Act...

master 6c26f8e

#### Test exampy on: push

- ✓ build (ubuntu-latest, 3.7, ...)
- ✓ build (ubuntu-latest, 3.7, ...)
- ✓ build (ubuntu-latest, 3.7, ...)
- ✓ build (ubuntu-latest, 3.8, ...)
- ✓ build (windows-latest, 3....)
- ✓ build (windows-latest, 3....)
- ✓ build (windows-latest, 3....)
- ✓ build (windows-latest, 3....)
- ✓ build (macos-latest, 3.7, ...)
- ✓ build (macos-latest, 3.7, ...)
- ✓ build (macos-latest, 3.7, ...)
- ✓ build (macos-latest, 3.8, ...)

### Test exampy

This run Workflow file

Create status badge

✓ 12 completed jobs in 1m 34s

#### Artifacts

No artifacts were generated.

#### Annotations

---

# RE-USING OTHER ACTIONS

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- GitHub users can define their own 'actions' that you can re-use in your own workflows: e.g.,
    - - `uses: actions/checkout@v2`
    - - `name: Set up Python ${{ matrix.python-version }}`  
`uses: actions/setup-python@v1`  
`with:`  
`python-version: ${{ matrix.python-version }}`
  - Take arguments in the `with:` section
  - Make sure to a) use a released version (e.g., @v2), b) check that you can trust the action if you give it passwords or other permissions
-

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# USING SECRETS

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- If as part of a workflow, you need to authenticate, you can add ‘secrets’ to your GitHub repository that can be used by actions (usernames, passwords, SSH keys, etc.)
  - Use as `${{ secrets.SECRET_NAME }}`
  - Not shared with forks, quite secure
  - But always try to make secrets specific to GitHub, so can be easily revoked (e.g., set up special SSH key for GitHub use rather than using your normal one)
  - SSH keys: set up special GitHub private key with *no passphrase*
-

Options

Manage access

Branches

Webhooks

Notifications

Integrations & services

Deploy keys

Autolink references

Secrets

Moderation

Interaction limits

# Settings

## Repository name

exampy Rename

**Template repository**

Template repositories let users generate new repositories with the same directory structure and files. Indicate if **jobovy/exampy** can be used as a template for creating other repositories.

## Social preview

Upload an image to customize your repository's social media preview.

Images should be at least 640x320px (1280x640px for best display).

[Download template](#)

Options

Manage access

Branches

Webhooks

Notifications

Integrations & services

Deploy keys

Autolink references

**Secrets**

Actions

Moderation

Interaction limits

## Secrets

Secrets are environment variables that are **encrypted** and only exposed to selected actions. Anyone with **collaborator** access to this repository can use these secrets in a workflow.

Secrets are not passed to workflows that are triggered by a pull request from a fork. [Learn more.](#)

[Add a new secret](#)



[Options](#)[Manage access](#)[Branches](#)[Webhooks](#)[Notifications](#)[Integrations & services](#)[Deploy keys](#)[Autolink references](#)[Secrets](#)[Actions](#)[Moderation](#)[Interaction limits](#)

## Secrets

Secrets are environment variables that are **encrypted** and only exposed to selected actions. Anyone with **collaborator** access to this repository can use these secrets in a workflow.

Secrets are not passed to workflows that are triggered by a pull request from a fork. [Learn more](#).

[Add a new secret](#)

**Name**

**Value**

[Add secret](#)

Once you hit 'Add secret',  
you can never see the value again

# PRACTICAL EXAMPLE: UPDATE YOUR WEBSITE ON LEPUS

```
1  name: Update website
2
3  on: [push]
4
5  jobs:
6    build_website:
7      name: Build main website
8      runs-on: ubuntu-latest
9      if: "!contains(github.event.head_commit.message, 'ci skip')"
10     steps:
11       # check-out this repository
12       - uses: actions/checkout@v2
13       # Build main website
14       - name: Build website
15         shell: bash -l {0}
16         run: |
17           mkdir build
18           make web ONLINEPATH=build
19       # Setup SSH agent
20       - uses: webfactory/ssh-agent@v0.2.0
21         with:
22           ssh-private-key: ${ secrets.SSH_PRIVATE_KEY }
23       # Upload to lepus, to quickly upload new website
24       - name: Upload
25         shell: bash -l {0}
26         working-directory: build
27         run: rsync -e"ssh -o StrictHostKeyChecking=no -o UserKnownHostsFile=/dev/null" -azv ./ bovy@lepus.astro.utoronto.ca:/home/bovy/web/
```

```
28 build_cv:
29   name: Build CV
30   runs-on: ubuntu-latest
31   if: "!contains(github.event.head_commit.message, 'ci skip')"
32   steps:
33     # check-out this repository
34     - uses: actions/checkout@v2
35     # Setup SSH agent
36     - uses: webfactory/ssh-agent@v0.2.0
37       with:
38         ssh-private-key: ${ secrets.SSH_PRIVATE_KEY }
39     # Install LaTeX for CV building
40     - name: Install LaTeX
41       shell: bash -l {0}
42       run: |
43         sudo paperconfig -p letter
44         sudo apt-get install -qq --no-install-recommends dvipng texlive-latex-base texlive-latex-extra texlive-fonts-recommended graphviz
45     # Build CV
46     - name: Build CV
47       shell: bash -l {0}
48       working-directory: CV
49       run: |
50         mkdir ../build
51         make web ONLINEPATH=../build
52     # Upload to lepus, including CV now
53     - name: Upload
54       shell: bash -l {0}
55       working-directory: build
56       run: rsync -e"ssh -o StrictHostKeyChecking=no -o UserKnownHostsFile=/dev/null" -azv ./ bovy@lepus.astro.utoronto.ca:/home/bovy/web/
```

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# PRACTICAL EXAMPLE: UPDATE WEBSITE ON AWS S3

---

```
1 name: Update website
2
3 # Update on every push
4 on: [push]
5
6 jobs:
7   build:
8     name: Update website
9     runs-on: ubuntu-latest
10    if: "!contains(github.event.head_commit.message, 'ci skip')"
11    steps:
12      # check-out this repository
13      - uses: actions/checkout@v2
14      # Specify Python version as >=3
15      - uses: actions/setup-python@v1
16        with:
17          python-version: '>3.6'
18          architecture: 'x64'
19      # Verify the JSON file
20      - name: verify papers JSON
21        working-directory: py
22        shell: bash -l {0}
23        run: python verify_papers_json.py
24      # Push to Amazon S3
25      - name: Upload website
26        uses: jakejarvis/s3-sync-action@v0.5.1
27        with:
28          args: --acl public-read --follow-symlinks --delete
29        env:
30          AWS_S3_BUCKET: ${ secrets.AWS_S3_BUCKET }
31          AWS_ACCESS_KEY_ID: ${ secrets.AWS_ACCESS_KEY_ID }
32          AWS_SECRET_ACCESS_KEY: ${ secrets.AWS_SECRET_ACCESS_KEY }
33          AWS_REGION: 'us-east-2'
34          SOURCE_DIR: 'src'          # optional: defaults to entire repository
```

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# ADDING BADGES TO YOUR README

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# WHY BADGES?

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- What are status badges? Images like 
  - Helpful way to get an overview of your package's status on the various services that you are using:
    - Continuous-integration services like `Travis CI`, `AppVeyor`, `GitHub Actions`
    - Test coverage statistics from `Codecov`
    - Documentation's status from `readthedocs.io`
    - Package version on `PyPI`
    - ...
-

 [README.md](#)

Add various badges to README

now

 [setup.py](#)

Add long\_description

5 days ago

 [README.md](#)

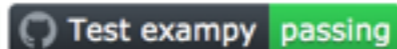


# exampy

This is an example Python package to illustrate a set of notes on code development and packaging.

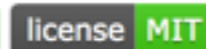
 build passing

 build passing

 Test exampy passing

 codecov 89%

 docs passing

 license MIT



```
1 # exampy
2
3 This is an example Python package to illustrate a set of notes on code
4 development and packaging.
5
6 \[!Build Status\]\(https://travis-ci.com/jobovy/exampy.svg?branch=master\) (https://travis-ci.com/jobovy/exampy)
7 \[!Build status\]\(https://ci.appveyor.com/api/projects/status/7hybo3b6t0rrxnio?svg=true\) (https://ci.appveyor.com/project/jobovy/exampy)
8 \[!Test exampy\]\(https://github.com/jobovy/exampy/workflows/Test%20exampy/badge.svg\)
9 \[!codecov\]\(https://codecov.io/gh/jobovy/exampy/branch/master/graph/badge.svg\) (https://codecov.io/gh/jobovy/exampy)
10 \[!Documentation Status\]\(https://readthedocs.org/projects/exampy/badge/?version=latest\) (https://exampy.readthedocs.io/en/latest/?badge=latest)
11 \[!image\]\(http://img.shields.io/badge/license-MIT-brightgreen.svg\) (https://github.com/jobovy/exampy/blob/master/LICENSE)
12
```

# Travis CI

build passing

Click on the badge!

The screenshot displays the Travis CI web interface for a repository named 'jobovy / exampy'. The interface includes a navigation bar with 'Travis CI', 'Dashboard', 'Changelog', 'Documentation', and 'Help'. A search bar is present for repositories. The main content area shows the repository name and a 'build passing' badge. Below this, there are tabs for 'Current', 'Branches', 'Build History', and 'Pull Requests'. A 'Status Image' dialog box is open, showing the following configuration:

- BRANCH: master
- FORMAT: Markdown
- RESULT: `[[Build Status]](https://travis-ci.com/jobovy/exampy.svg?branch=master))`

The background shows a list of build jobs with their status (all passing), build numbers (43.1-43.4), and durations (1 min 32 sec, 26 sec, 27 sec, 27 sec). The environment variables 'AMD64', 'Python: 3.7', and 'NUMPY\_VERSION=1.16' are also visible.

# AppVeyor



jobovy ▾ Projects Environments BYOC Account Support ▾ Jo Bovy ▾

exampy

Current build History Deployments Events Settings

General

Environment

Build

Tests

Artifacts

Deployment

NuGet

Notifications

Permissions


**Badges**

Export YAML

Delete project

### Project status badge

Current status



SVG image URL

```
https://ci.appveyor.com/api/projects/status/7hybo3b6t0rrxnio?svg=true
```

Raster image URL

```
https://ci.appveyor.com/api/projects/status/7hybo3b6t0rrxnio
```

Sample markdown code

```
[![Build status](https://ci.appveyor.com/api/projects/status/7hybo3b6t0rrxnio?)
```

### master branch status badge

SVG branch image URL

```
https://ci.appveyor.com/api/projects/status/7hybo3b6t0rrxnio/branch/master?svg=true
```

Raster branch image URL

```
https://ci.appveyor.com/api/projects/status/7hybo3b6t0rrxnio/branch/master
```

# GitHub Actions

A screenshot of the GitHub Actions interface for the repository 'jobovy/exampy'. The top navigation bar includes 'Pull requests', 'Issues', 'Marketplace', and 'Explore'. The repository name 'jobovy/exampy' is shown with 'Unwatch', 'Star', and 'Fork' buttons. The 'Actions' tab is selected, showing a list of workflows. The 'Test exampy' workflow is highlighted. A search bar contains 'workflow:Test exampy'. A table lists workflow runs with columns for Event, Status, Branch, and Actor. A modal window is open, showing a 'Test exampy passing' badge and its Markdown code: `[[Test exampy]] (https://github.com/jobovy/exampy/workflows/Test%20exampy/badge.svg)`. The modal also includes a 'Copy status badge Markdown' button and a '3m 7s' duration indicator.

# Codecov



gh jobovy exampy Docs Support

Overview Commits Branches Pulls Compare Settings

General  
Yaml  
Badge

**Markdown** Copy

```
[![codecov](https://codecov.io/gh/jobovy/exampy/branch/master/graph/badge.svg)](https://codecov.
```

**HTML** Copy


```
<a href="https://codecov.io/gh/jobovy/exampy">  
    
</a>
```

**RST** Copy

```
.. image:: https://codecov.io/gh/jobovy/exampy/branch/master/graph/badge.svg  
   :target: https://codecov.io/gh/jobovy/exampy
```

# readthedocs.io

docs passing

 Read the Docs bovy

Projects > **exampy** [View Docs](#)

[Overview](#) [Downloads](#) [Search](#) [Builds](#) [Versions](#) [Admin](#)

**reStructuredText**

```
.. image:: https://readthedocs.org/projects/exampy/badge/?version=1
:target: https://exampy.readthedocs.io/en/latest/?badge=latest
:alt: Documentation Status
```

**Markdown**

```
[![Documentation Status](https://readthedocs.org/projects/exampy/b
```


**HTML**


```
<a href='https://exampy.readthedocs.io/en/latest/?badge=latest'>
  <img src='https://readthedocs.org/projects/exampy/badge/?versio
</a>
```

**Repository**  
<https://github.com/jobovy/exampy.git>

**Project Slug**  
exampy

**Last Built**  
1 hour, 37 minutes ago passed

**Maintainers**  


**Badge**  
docs passing 

**Tags**  
Project has no tags. Add some in your [project settings](#).

**Project Privacy Level**  
Public

---

# PyPI

A badge with a dark grey background on the left containing the text 'pypi' and an orange background on the right containing the text 'v0.2'.

```
[![image](http://img.shields.io/pypi/v/exampy.svg)](https://pypi.python.org/pypi/exampy/)
```

which gives .


---

---

# MAKE YOUR OWN WITH `shields.io`

---

```
[![image](http://img.shields.io/badge/license-MIT-brightgreen.svg)](https://github.com/jobovy/exampy/blob/master/LICENSE)
```

A badge with a dark gray background and a bright green section on the right. The word "license" is written in white on the gray part, and "MIT" is written in white on the green part.

license MIT

---



 [README.md](#)

Add various badges to README

now

 [setup.py](#)

Add long\_description

5 days ago

 [README.md](#)

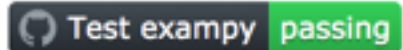


# exampy


This is an example Python package to illustrate a set of notes on code development and packaging.

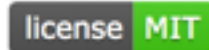
 build passing

 build passing

 Test exampy passing

 codecov 89%

 docs passing

 license MIT

---

# ADDING A C EXTENSION TO YOUR PACKAGE

---

---

# WHY YOU MIGHT WANT TO ADD A C EXTENSION

---

- Python is very convenient to code in, but can be slow for computationally-expensive applications
  - *Olden times*: write entire application in C or Fortran to get speed (e.g., Gadget, MESA)
  - Now: provide interaction API in Python for easy code interaction, results analysis, plotting; write slow parts in compiled language
  - Could use other compiled languages, but Python is itself written in C (CPython), so C is the easiest option
-

---

# OPTIONS FOR C EXTENSION

---

- Write an entire module in C (e.g., some parts of the standard library):
    - Cumbersome, difficult, and not very portable
  - Wrap existing C library/code in Python with no changes to C code:
    - Advantage is that you can wrap existing code or allow C code to interact with other languages (e.g., wrap same C library in multiple languages)
    - `ctypes`, or wrapper generators like SWIG (SWIG not recommended)
  - Write C code specific to Python application, but use C only to speed up computationally-expensive parts of the code:
    - Convenient, good option for speeding-up highly package-specific code
    - `cython`
  - Don't write any C code! Just use an automatic Python → C/machine-code compiler: works well for simple functions
-

---

# ctypes

---

- My own preferred method, part of standard library
  - Sequence:
    - Compile C module into *shared library* or *DLL* (can be done automatically in `setup.py`)
    - Load shared library in Python code, declare function signature
    - Call functions in the shared library directly from Python
-

# c types: example

```
// C extension for exampy
#include <_math.h>
double square(double x){
    return x*x;
}
```

```
-uuu:**-F1  _math.c      Top L1      (C/l Abbrev)-----
```

```
#ifndef __EXAMPY_MATH_H__
#define __EXAMPY_MATH_H__
double square(double);
#endif /* _math.h */
```

```
-uuu:---F1  _math.h      All L5      (C/l Flymake:! Abbrev)-----
```

---

# ctypes: example

---

```
import setuptools

with open("README.md", "r") as fh:
    long_description = fh.read()

setuptools.setup(
    name="exampy_c",
    version="0.2",
    author="Jo Bovy",
    author_email="bovy@astro.utoronto.ca",
    description="A small example Python package",
    long_description=long_description,
    long_description_content_type="text/markdown",
    packages=["exampy_c", "exampy_c/integrate"],
    install_requires=["numpy"],
    ext_modules=[setuptools.Extension('libexampy', sources=['exampy_c/_math.c'],
                                     include_dirs=['exampy_c'])]
)
```

```
-uu-:---F1  setup.py      All L12      (Python Flymake Pyflakes)-----
```

---

---

# ctypes: example

---

```
import os
import ctypes
import numpy.ctypeslib as ctl
import sysconfig
math_lib= ctl.load_library('libexampy'+sysconfig.get_config_var('EXT_SUFFIX'),
                           os.path.abspath(\
                               os.path.join(os.path.dirname(__file__), '..')))
square_c= math_lib.square
square_c.argtypes= [ctypes.c_double]
square_c.restype= ctypes.c_double
```

```
def square(x):
    """The square of a number
```

```
-uu-:---F1  _math.py      Top L14      (Python Flymake Pyflakes)-----
```

---



---

# ctypes

---

- Annoying:
    - Can be confusing to find the library (built for system libraries)
    - You have to declare all functions and their parameters and return types
    - Complicated to pass objects, need to define them as `structs` in C
  - Good!
    - Can easily pass arrays as pointers, other pointers (but make sure arrays are `C_CONTIGUOUS`)
    - Very fast
-

---

# ctypes on Windows

---

- Things are a bit more complicated on Windows: You need to explicitly export the C functions you want to expose, leads to code such as

- ```
#ifdef _WIN32
#include <Python.h>
#define EXPORT __declspec(dllexport)
#if PY_MAJOR_VERSION >= 3
PyMODINIT_FUNC PyInit_libexampy(void) { // Python 3
    return NULL;
}
#else
PyMODINIT_FUNC initlexampy(void) {} // Python 2
#endif
#endif
#else
#if defined(__GNUC__)
#define EXPORT __attribute__((visibility("default")))
#else
#define EXPORT
#endif
```

- Then put EXPORT in front of functions you want to expose
  - Since Python 3.8, you need to specify `winmode=0x008` in the CDLL call
-

---

# cython

---

- Essentially, a way to write Python-style code that allows fast compiled C code to be generated
  - So keep many of the advantages of coding in Python, combined with speed of C
  - Install with `pip install cython`
-

---

# cython: example

---

```
from libc.math cimport pow

def square(double x):
    """The square of a number

    Parameters
    -----
    x: float
        Number to square

    Returns
    -----
    float
        Square of x
    """
    return pow(x,2.0)
```

```
-uu-:---F1  _math.pyx      All L17      (Fundamental)-----
```

Note the docstring!

---

---

# cython: example

---

```
import setuptools
from Cython.Build import cythonize

with open("README.md", "r") as fh:
    long_description = fh.read()

setuptools.setup(
    name="exampy_c",
    version="0.2",
    author="Jo Bovy",
    author_email="bovy@astro.utoronto.ca",
    description="A small example Python package",
    long_description=long_description,
    long_description_content_type="text/markdown",
    packages=["exampy_c", "exampy_c/integrate"],
    install_requires=["numpy"],
    ext_modules=cythonize(setuptools.Extension("exampy_c.math_cython",
  sources=['exampy_c/_math.pyx']))
)
```

```
-uu-:---F1  setup.py      Top L21  (Python Flymake Pyflakes)-----
```

Can now import `exampy_c.math_cython` and use functions

---

---

# cython

---

- Typical workflow:
    - Figure out which parts of your code are slow
    - Move them to a .pyx file, add static types (double, etc.)
    - use `def` for functions available in Python, `cdef` for functions only available in C, `cpdef` for functions available in both
  - Quite complicated in the end, because need to almost learn another language and create non-portable code
-

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# ALSO CHECK OUT

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- `numba`: Just-In-Time (JIT) compilation of functions that use `numpy` into fast machine code
- `cupy`: run `numpy` code on a GPU with minimal changes

```
from numba import jit
import random

@jit(nopython=True)
def monte_carlo_pi(nsamples):
    acc = 0
    for i in range(nsamples):
        x = random.random()
        y = random.random()
        if (x ** 2 + y ** 2) < 1.0:
            acc += 1
    return 4.0 * acc / nsamples
```

---

# PRESENTATIONS

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