

02476 Machine Learning Operations
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Continuous Integration

Why you should care about today

3 years ago, the day before this lecture, the internet went down for a couple of hours because someone f..ked up their continues integration at [Fastly](#)

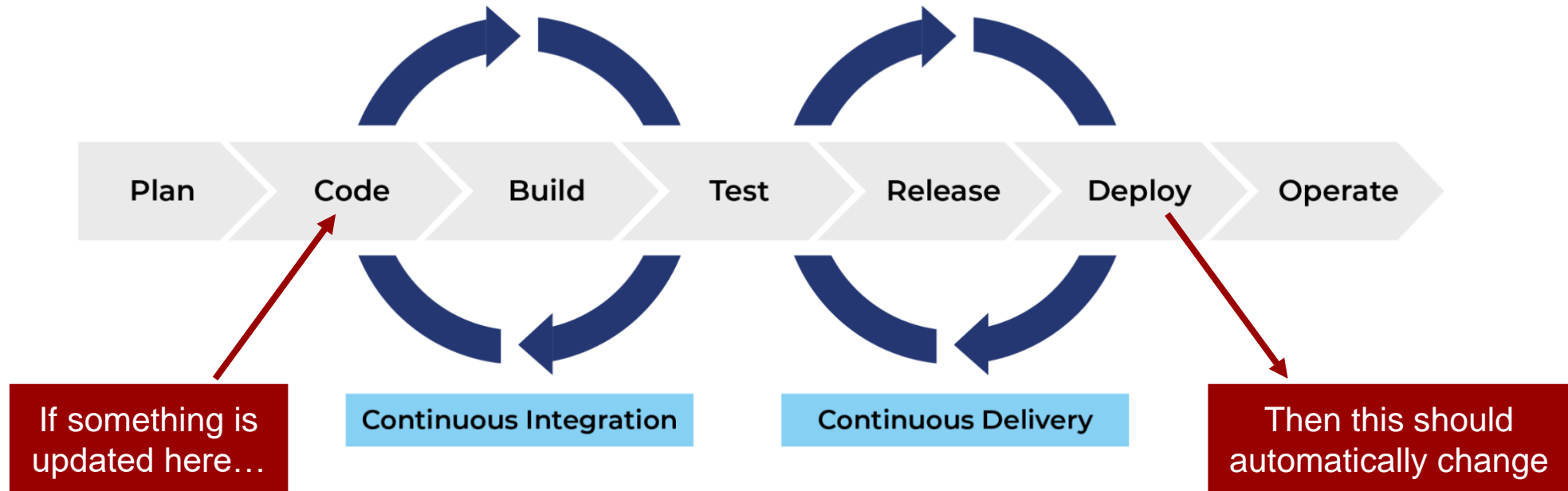
Dev at Fastly : I'll just push this small change to production

Dev at Fastly 2 seconds later:



Continues X

💧 Term refers to a set of software practices for automating tedious tasks and make sure changed in a pipeline are continuously propagated through the pipeline





- ML Model Deployment
- CI/CD Pipelines
- Monitoring & Triggering

CI

Continues Integration

Core tasks:

💡 How to automatically secure that code does not break during development?

💻 App independent concept

CD

Continues Deployment

Core tasks:

💡 How to get your code/application to the user automatically? + monitor life cycle

💻 App dependent concept

CML

Continues Machine Learning

Core tasks:

💡 How to automatically retrain machine learning models when data and code changes?

💻 Specific to ML applications

MLOps levels

The **Maturity model** overall describes the DevOps practices to run a successful MLOps environment.

Intended to identify gaps in an existing organization's attempt to implement such an environment.

💡 Estimate the scope of the work for new engagements.

💡 Establish realistic success criteria.

💡 Identify deliverables you'll hand over at the conclusion of the engagement.

Level	Description	Highlights	Technology	
0	No MLOps	<ul style="list-style-type: none"> Difficult to manage full machine learning model lifecycle The teams are disparate and releases are painful Most systems exist as "black boxes," little feedback during/post deployment 	<ul style="list-style-type: none"> Manual builds and deployments Manual testing of model and application No centralized tracking of model performance Training of model is manual 	CI
1	DevOps but no MLOps	<ul style="list-style-type: none"> Releases are less painful than No MLOps, but rely on Data Team for every new model Still limited feedback on how well a model performs in production Difficult to trace/reproduce results 	<ul style="list-style-type: none"> Automated builds Automated tests for application code 	
2	Automated Training	<ul style="list-style-type: none"> Training environment is fully managed and traceable Easy to reproduce model Releases are manual, but low friction 	<ul style="list-style-type: none"> Automated model training Centralized tracking of model training performance Model management 	CD
3	Automated Model Deployment	<ul style="list-style-type: none"> Releases are low friction and automatic Full traceability from deployment back to original data Entire environment managed: train > test > production 	<ul style="list-style-type: none"> Integrated A/B testing of model performance for deployment Automated tests for all code Centralized tracking of model training performance 	
4	Full MLOps Automated Operations	<ul style="list-style-type: none"> Full system automated and easily monitored Production systems are providing information on how to improve and, in some cases, automatically improve with new models Approaching a zero-downtime system 	<ul style="list-style-type: none"> Automated model training and testing Verbose, centralized metrics from deployed model 	CML

This lecture: continues integration

Core task:

💧 How to automatically secure that code does not break during development? 💧

3 steps to do this:

💡 Use version control

Frequently committing code to a shared repository

💡 Write (unit)test for your code

Should capture unwanted bugs in your code


💡 Automate build + testing

Automatically run test so code cannot be merged without working

A small case study for continuous integration

MANIFEST.in	update CI	6 months ago
Makefile	rename tests/ (#1091)	5 months ago
README.md	Code cleaning after classification refactor 2/n (#1252)	7 days ago
pyproject.toml	CI: re-use checks (#1261)	2 months ago
requirements.txt	Set minimum pytorch version to 1.8 + cleanup (#1263)	2 months ago
setup.cfg	CI: re-use checks (#1261)	2 months ago
setup.py	CI: Enable testing with Python 3.10 (#1132)	5 months ago

☰ README.md ✎



TorchMetrics

Machine learning metrics for distributed, scalable PyTorch applications.


[What is Torchmetrics](#) • [Implementing a metric](#) • [Built-in metrics](#) • [Docs](#) • [Community](#) • [License](#)

python 3.7 | 3.8 | 3.9 | 3.10
pypi package 0.10.3
downloads 28M
conda v0.10.3
downloads 585k
License Apache 2.0

CI testing - complete
Azure Pipelines succeeded
codecov 39%

slack chat
docs passing
DOI 10.5281/zenodo.5844769
JOSS 10.21105/joss.04101
pre-commit.ci passed

Contributors 169



+ 158 contributors

Languages

● Python 99.9% ● Other 0.1%

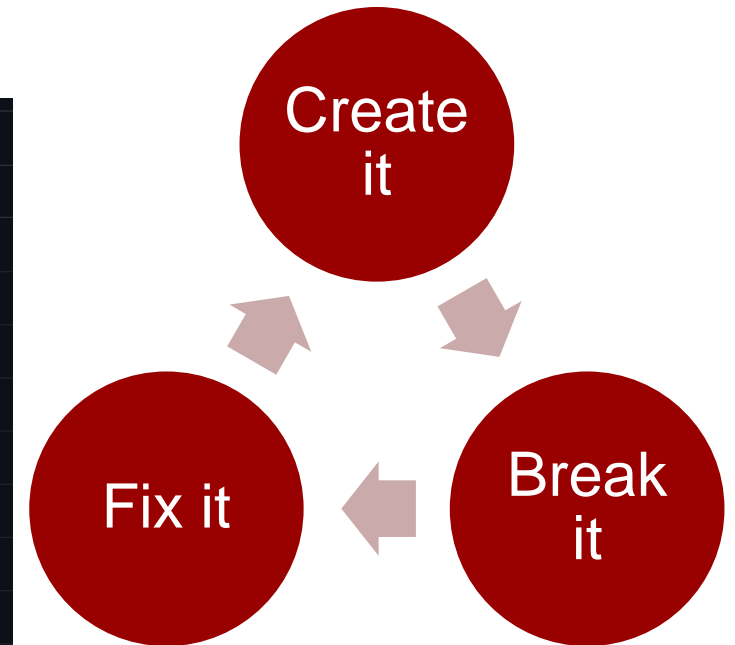
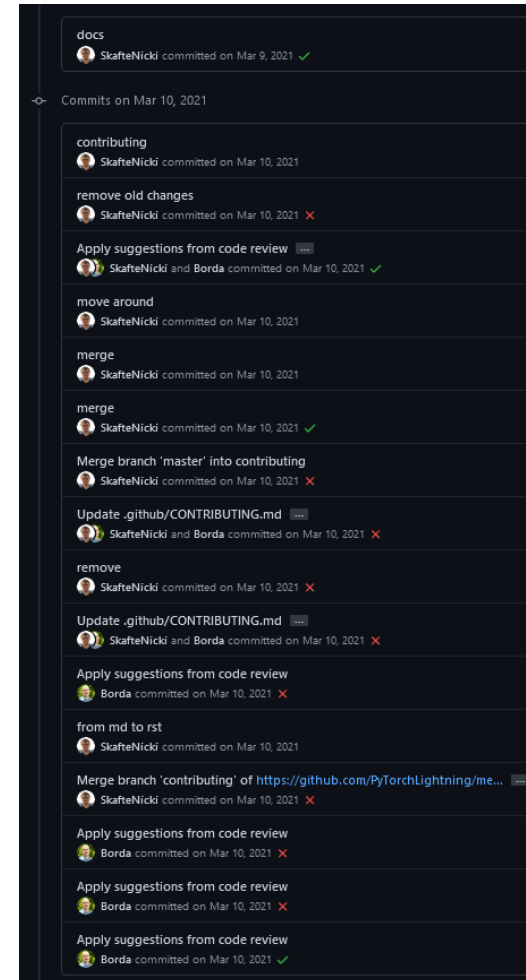
CI step 1: version control

User version control:

- 💡 Code changes are tracked
- 💡 Branches for parallel work

Commit frequently:

- 💡 Catch errors sooner than later
- 💡 Revert back easily to when things were working
- 💡 Merging can be done automatically



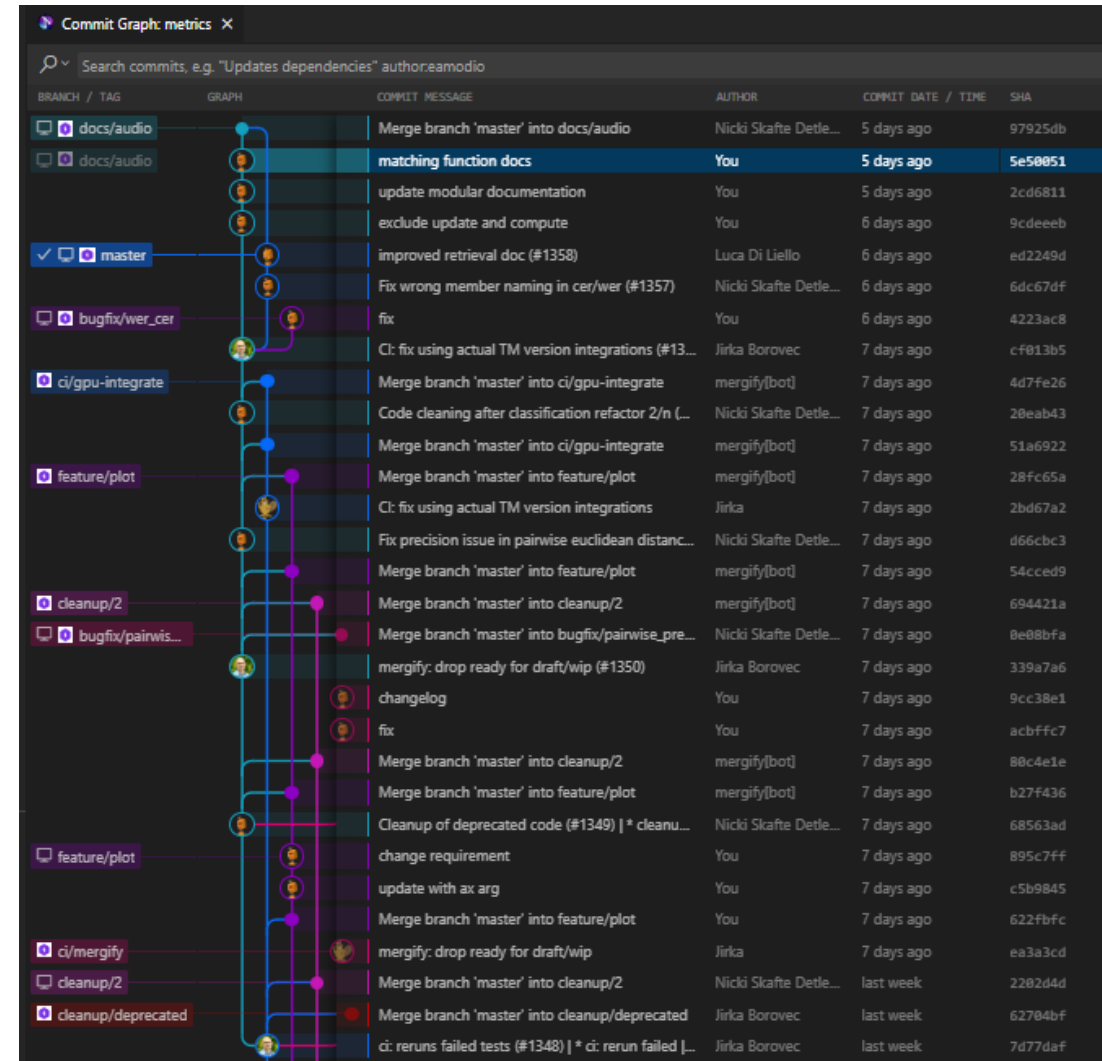
CI step 1: Use branches

Parallel workflow

Experimental features changes are kept away from master/main

Recommend extensions for VS code:

- 💡 [Gitlens](#) or [GitGraph](#)
- 💡 [Github PR and issues](#)



CI step 1: Use pull requests

⚠️ No commit can be pushed to master without being in a pull request

The screenshot shows a GitHub pull request page. The title is "Added MinkowskiDistance support #1362". The pull request is from "clueless-skywatcher" to "Lightning-AI:master". The interface includes navigation tabs for Code, Issues (38), Pull requests (15), Discussions, Actions, Projects (5), Security, Insights, and Settings. The "Pull requests" tab is highlighted with a red box. Below the title, there are tabs for Conversation (15), Commits (6), Checks (43), and Files changed (6). The "Files changed" tab is also highlighted with a red box. The main content area shows a diff view of the file "src/torchmetrics/functional/_init_.py". The diff shows the addition of a new import statement for "minkowski_distance" in line 66. A comment from "SkafteNicki" is visible, asking to add an entry to the "functional/regression/_init_.py" file. The comment is highlighted with a red box. The "Review changes" button is also highlighted with a red box.

1. Find PR

2. Check changes

3. Make one or more comments

4. Send review

CI step 1: pre-commit



- Check that everything is up to standard before commits are created

```
! .pre-commit-config.yaml x
! .pre-commit-config.yaml
1  default_language_version:
2    python: python3
3
4  repos:
5    - repo: https://github.com/pre-commit/pre-commit-hooks
6      rev: v4.4.0
7      hooks:
8        - id: end-of-file-fixer
9        - id: trailing-whitespace
10       # - id: check-json
11       # - id: check-yaml
12       - id: check-toml
13       - id: check-docstring-first
14       - id: check-executables-have-shebangs
15       - id: check-case-conflict
16       - id: detect-private-key
17
18     - repo: https://github.com/astral-sh/ruff-pre-commit
19       rev: v0.1.3
20       hooks:
21         - id: ruff
22         args: [--fix, --exit-non-zero-on-fix]
23
24     - repo: https://github.com/astral-sh/ruff-pre-commit
25       rev: v0.1.3
26       hooks:
27         - id: ruff-format
28
29     - repo: https://github.com/codespell-project/codespell
30       rev: v2.2.5
31       hooks:
32         - id: codespell
33         additional_dependencies: [tomli]
34
```

```
dtu_mlops on main [!?!] via v3.11.5 @mlops
> git commit -m "implementation of client"
fix end of files.....Failed
- hook id: end-of-file-fixer
- exit code: 1
- files were modified by this hook

Fixing s8_monitoring/exercise_files/client.py

trim trailing whitespace.....Passed
check toml.....(no files to check)Skipped
check docstring is first.....Passed
check that executables have shebangs.....Passed
check for case conflicts.....Passed
detect private key.....Passed
ruff.....Failed
- hook id: ruff
- exit code: 1
- files were modified by this hook

s8_monitoring\exercise_files\client.py:17:12: S113 Probable use of requests call without timeout
Found 2 errors (1 fixed, 1 remaining).

ruff-format.....Passed
codespell.....Passed
markdownlint-docker.....(no files to check)Skipped
```

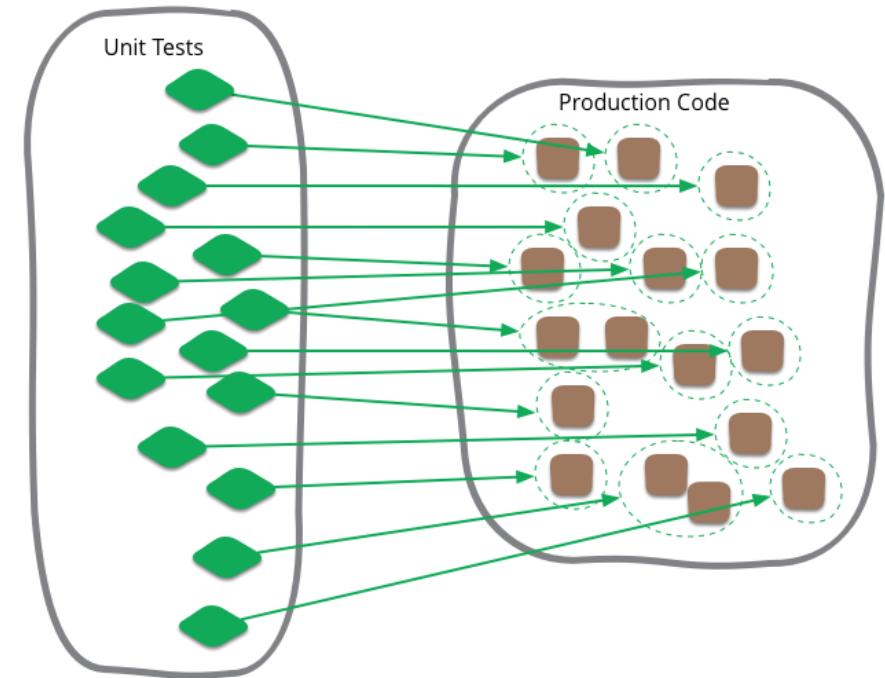
CI step 2: write tests

Tests are the cornerstones of continuous integration

- 💡 *unit tests* are arguable the most important.
- 💡 A single unittest, tests a small part of your code
- 💡 By testing code in small pieces, bugs are easier to find

Other test types worth considering:

- 💧 Integration tests
- 💧 Regression tests
- 💧 Performance tests
- 💧 Security tests



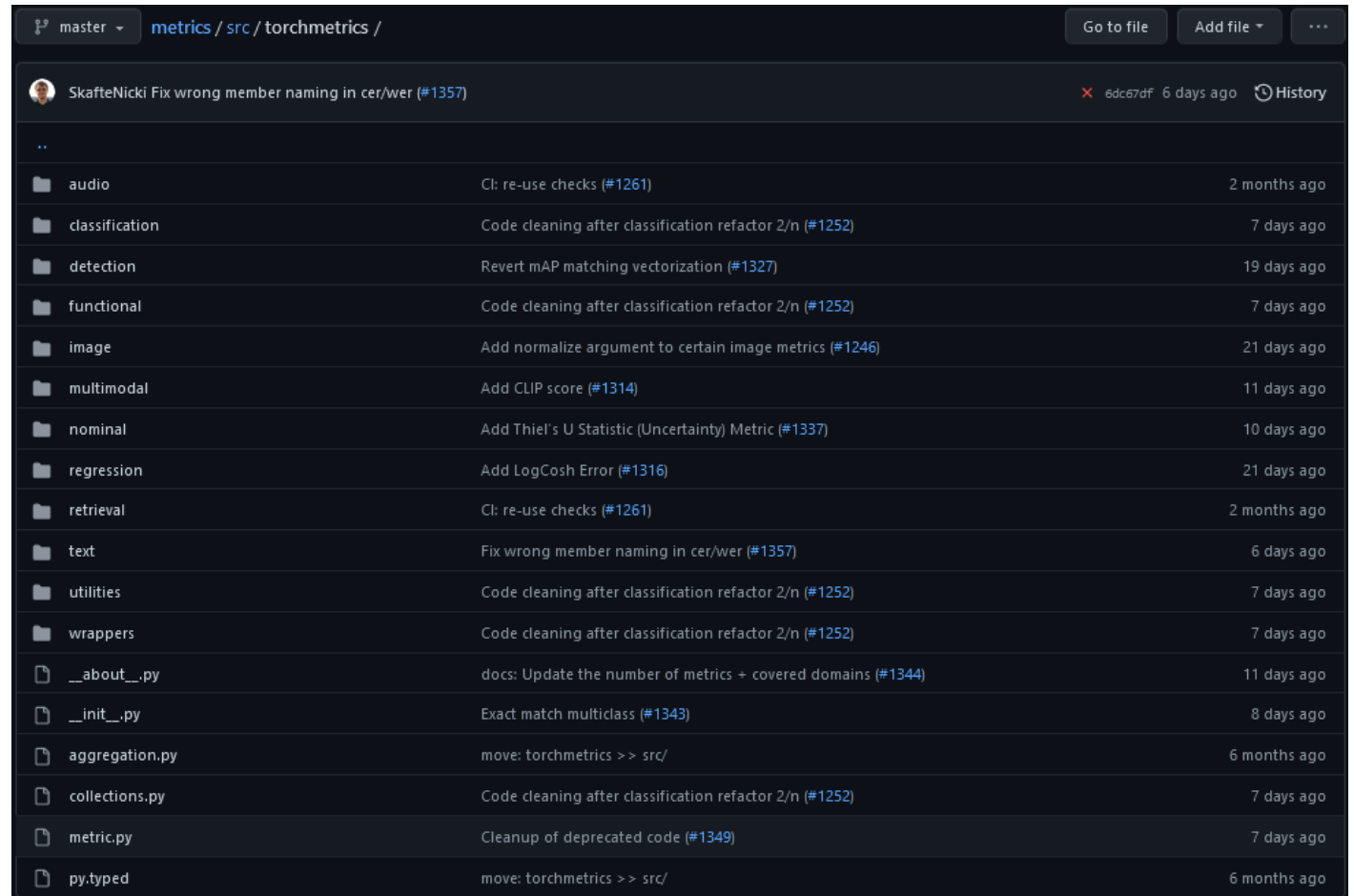
CI step 2: write tests

💡 By Python convention your source code should either be

src/<project_name>
(src-layout)

or

<project_name>
(flat-layout)



The screenshot shows a GitHub repository directory view for the path 'metrics / src / torchmetrics /'. The directory contains several subdirectories and files, each with a commit history link and a timestamp. The subdirectories are: audio, classification, detection, functional, image, multimodal, nominal, regression, retrieval, text, utilities, and wrappers. The files are: __about__.py, __init__.py, aggregation.py, collections.py, metric.py, and py.typed.

Item	Commit History	Timestamp
..		
audio	CI: re-use checks (#1261)	2 months ago
classification	Code cleaning after classification refactor 2/n (#1252)	7 days ago
detection	Revert mAP matching vectorization (#1327)	19 days ago
functional	Code cleaning after classification refactor 2/n (#1252)	7 days ago
image	Add normalize argument to certain image metrics (#1246)	21 days ago
multimodal	Add CLIP score (#1314)	11 days ago
nominal	Add Thiel's U Statistic (Uncertainty) Metric (#1337)	10 days ago
regression	Add LogCosh Error (#1316)	21 days ago
retrieval	CI: re-use checks (#1261)	2 months ago
text	Fix wrong member naming in cer/wer (#1357)	6 days ago
utilities	Code cleaning after classification refactor 2/n (#1252)	7 days ago
wrappers	Code cleaning after classification refactor 2/n (#1252)	7 days ago
__about__.py	docs: Update the number of metrics + covered domains (#1344)	11 days ago
__init__.py	Exact match multiclass (#1343)	8 days ago
aggregation.py	move: torchmetrics >> src/	6 months ago
collections.py	Code cleaning after classification refactor 2/n (#1252)	7 days ago
metric.py	Cleanup of deprecated code (#1349)	7 days ago
py.typed	move: torchmetrics >> src/	6 months ago

CI step 2: write tests

For tests, the convention is to either place the tests in a separate tests folder, or put the tests in the same folder as the function/class/submodule they are testing.

```

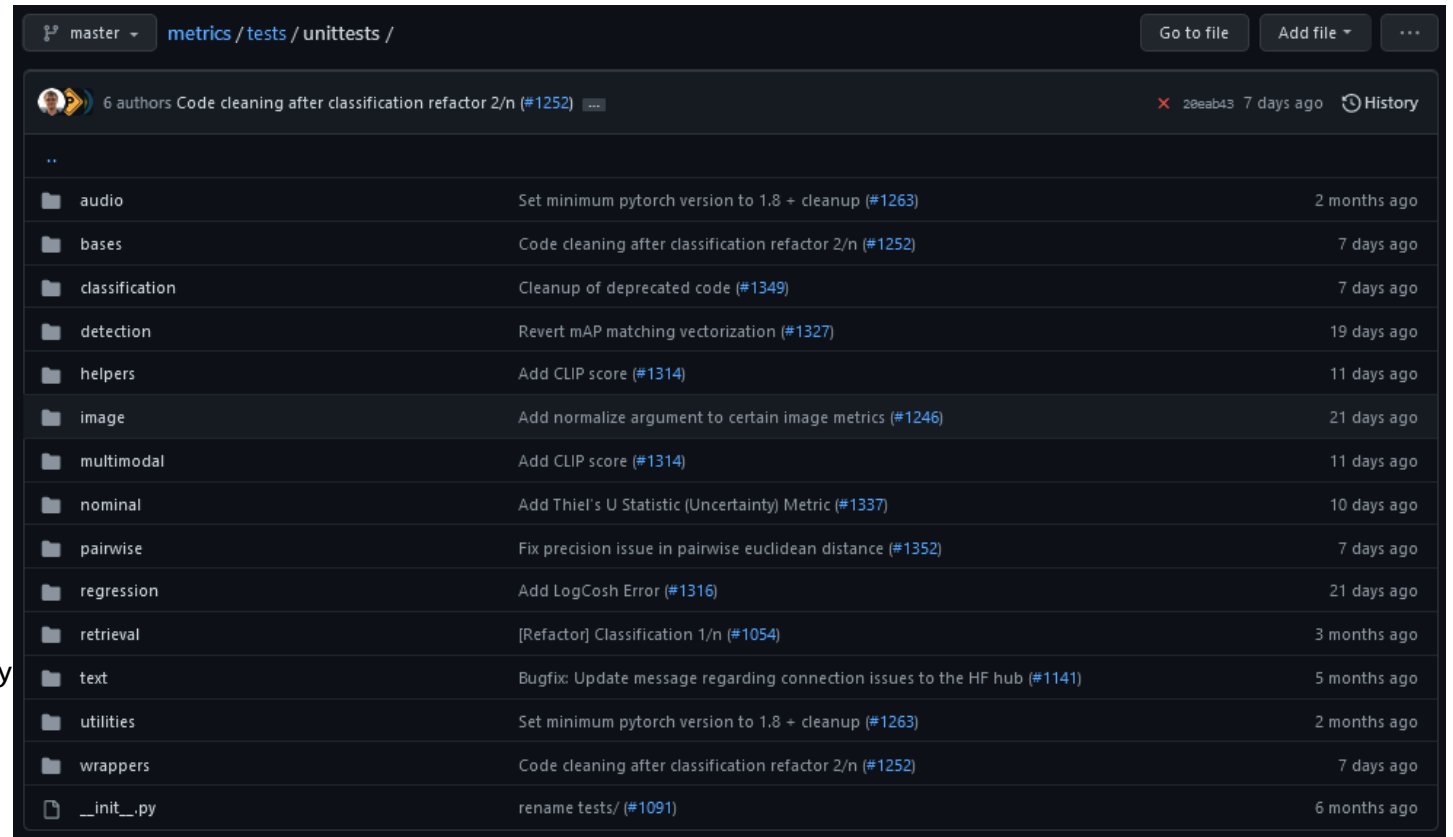
├── README.md
├── src/
│   ├── __init__.py
│   └── important_functions.py
├── tests/
│   ├── __init__.py
│   └── test_important_functions.py

```

```

├── README.md
├── src/
│   ├── __init__.py
│   └── submodule/
│       ├── __init__.py
│       ├── important_functions.py
│       └── test_important_functions.py

```



CI step 2: write tests

- 💡 In python, we recommend using the **pytest** framework.
- 💡 Test are simple functions that start with *test_* and uses *assert*

```
import torch
from torch.nn.functional import mse_loss

def test_mse_loss_zeros():
    # (0 - 0)**2 = 0
    assert mse_loss(torch.zeros(1,), torch.zeros(1,)) == 0

def test_mse_loss_ones():
    # (1 - 0)**2 = 1
    assert mse_loss(torch.ones(1,), torch.zeros(1,)) == 0
```

CI step 2: write tests

Test can be simple...

```
def test_warning_on_nan(tmpdir):  
    preds = torch.randint(3, size=(20, ))  
    target = torch.randint(3, size=(20, ))  
  
    with pytest.warns(  
        UserWarning,  
        match='.* nan values found in confusion matrix have been replaced with zeros.',  
    ):  
        confusion_matrix(preds, target, num_classes=5, normalize='true')
```


CI step 2: write tests

Test can be simple...

```
def test_warning_on_nan(tmpdir):
    preds = torch.randint(3, size=(20, ))
    target = torch.randint(3, size=(20, ))

    with pytest.warns(
        UserWarning,
        match='.* nan values found in confusion matrix have been replaced with zeros.',
    ):
        confusion_matrix(preds, target, num_classes=5, normalize='true')
```

Or complicated

```
@pytest.mark.parametrize("normalize", ['true', 'pred', 'all', None])
@pytest.mark.parametrize(
    "preds, target, sk_metric, num_classes, multilabel",
    [
        (_input_binary_prob.preds, _input_binary_prob.target, _sk_cm_binary_prob, 2, False),
        (_input_binary_logits.preds, _input_binary_logits.target, _sk_cm_binary_prob, 2, False),
        (_input_binary.preds, _input_binary.target, _sk_cm_binary, 2, False),
        (_input_mlb_prob.preds, _input_mlb_prob.target, _sk_cm_multilabel_prob, NUM_CLASSES, True),
        (_input_mlb_logits.preds, _input_mlb_logits.target, _sk_cm_multilabel_prob, NUM_CLASSES, True),
        (_input_mlb.preds, _input_mlb.target, _sk_cm_multilabel, NUM_CLASSES, True),
        (_input_mcls_prob.preds, _input_mcls_prob.target, _sk_cm_multiclass_prob, NUM_CLASSES, False),
        (_input_mcls_logits.preds, _input_mcls_logits.target, _sk_cm_multiclass_prob, NUM_CLASSES, False),
        (_input_mcls.preds, _input_mcls.target, _sk_cm_multiclass, NUM_CLASSES, False),
        (_input_mdmc_prob.preds, _input_mdmc_prob.target, _sk_cm_multidim_multiclass_prob, NUM_CLASSES, False),
        (_input_mdmc.preds, _input_mdmc.target, _sk_cm_multidim_multiclass, NUM_CLASSES, False)]
)

class TestConfusionMatrix(MetricTester):

    @pytest.mark.parametrize("ddp", [True, False])
    @pytest.mark.parametrize("dist_sync_on_step", [True, False])
    def test_confusion_matrix(
        self, normalize, preds, target, sk_metric, num_classes, multilabel, ddp, dist_sync_on_step
    ):
        self.run_class_metric_test(
            ddp=ddp,
            preds=preds,
            target=target,
            metric_class=ConfusionMatrix,
            sk_metric=partial(sk_metric, normalize=normalize),
            dist_sync_on_step=dist_sync_on_step,
            metric_args={
                "num_classes": num_classes,
                "threshold": THRESHOLD,
                "normalize": normalize,
                "multilabel": multilabel
            }
        )
```

CI step 2: execute locally

```
(lightning) C:\Users\nsde\Documents\metrics>pytest tests\unittests\regression\test_mean_error.py
===== test session starts =====
platform win32 -- Python 3.8.13, pytest-6.2.5, py-1.11.0, pluggy-1.0.0
rootdir: C:\Users\nsde\Documents\metrics, configfile: setup.cfg
plugins: cov-4.0.0, doctestplus-0.12.1, timeout-2.1.0
collected 116 items

tests\unittests\regression\test_mean_error.py sssssssssssss.....SSSSSSSSSSSSSS.....XXXXXXXX.....

===== warnings summary =====
..\..\Anaconda3\envs\lightning\lib\site-packages\_pytest\config\_init__.py:1183
C:\Users\nsde\Anaconda3\envs\lightning\lib\site-packages\_pytest\config\_init__.py:1183: PytestDeprecationWarning: The --strict option is deprecated, use --strict-markers instead.
  self.issue_config_time_warning(
-- Docs: https://docs.pytest.org/en/stable/warnings.html
===== 80 passed, 28 skipped, 8 xfailed, 1 warning in 16.44s =====
```

- Test passed
- F** Test failed
- S** Test skipped (`pytest.skipif`, `pytest.skip`)
- X** Test was expected to fail (`pytest.xfail`)

Do you remember to do this before each commit?

Let's automate doing it instead

CI step 3: Automating stuff

What can be automated: EVERYTHING 🤖

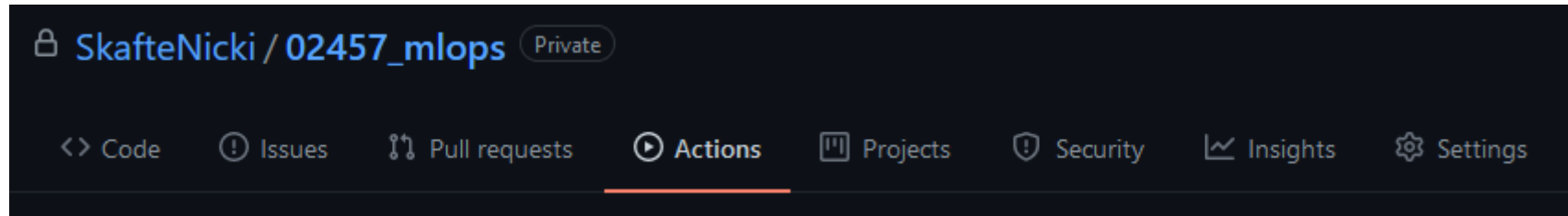
- 💡 Unit testing
- 💡 Integration testing
- 💡 Documentation creation
- 💡 Linters (style formatting)
- 💡 Security checks
- 💡 Code coverage
- 💡 Custom checks...

Only your imagination is the limit...

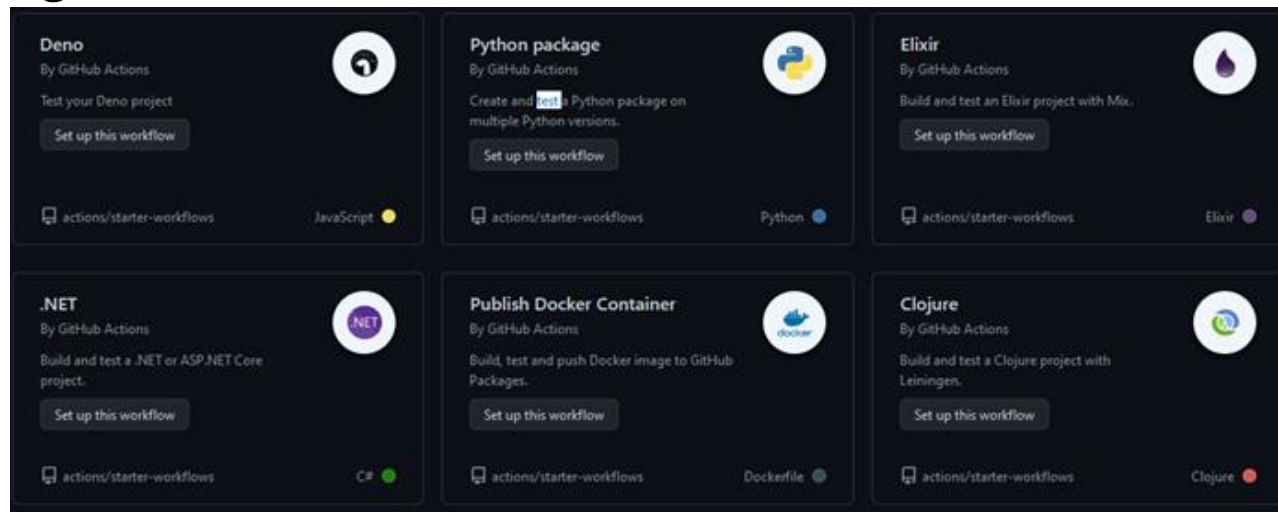
CI step 3: Github actions

Build-in continuous integration in Github.

Free 2000 automation minutes/month (public repository)



Many ready to go workflows



CI step 3: workflow files

Workflow files are a set of instructions that should be executed on a virtual machine hosted by Github

You can have one or many workflow files (runs in parallel)

When should workflow be triggered

Define OS + python

Clones code

Setup Python

Install dependencies

Check formatting

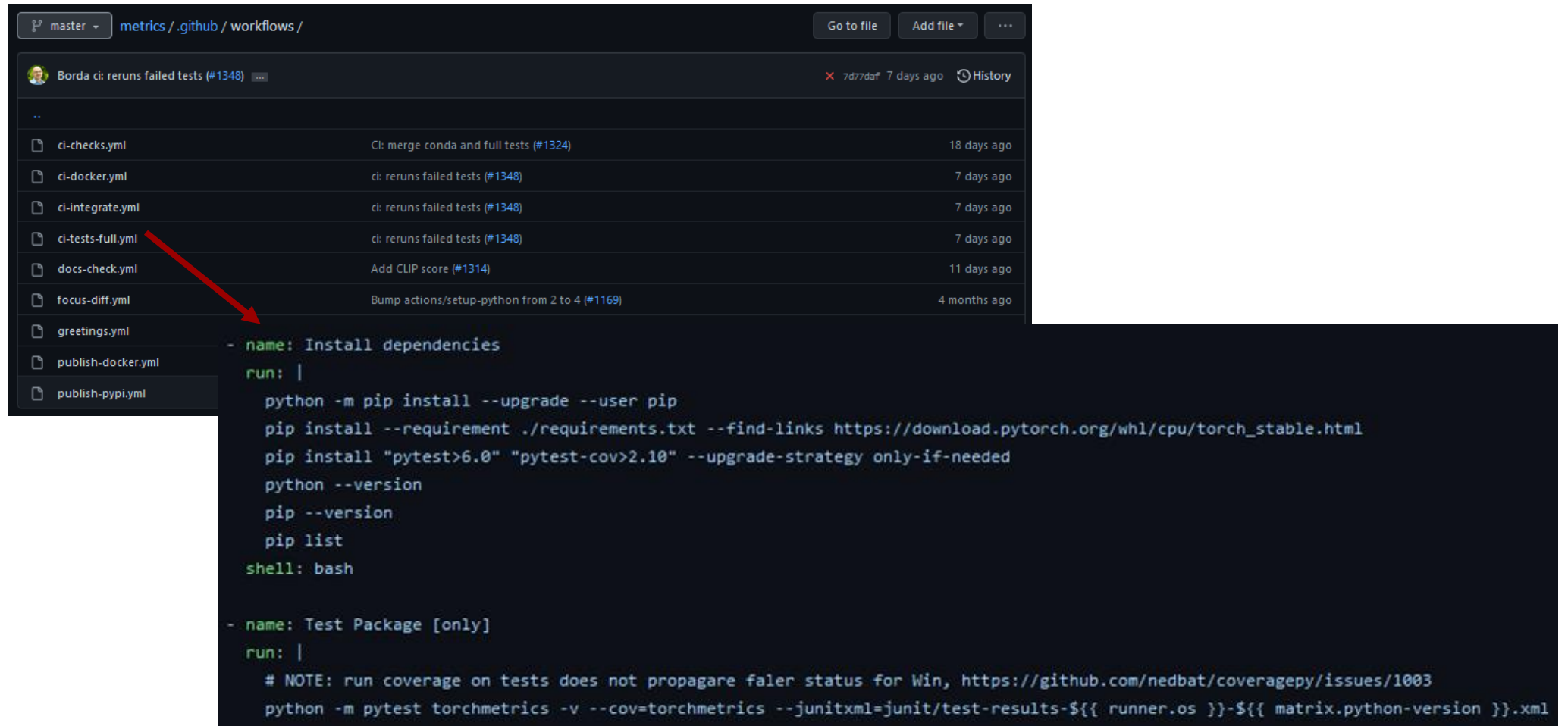
Run tests

```

1  name: Python package
2
3  on:
4  push:
5    branches: [ main ]
6  pull_request:
7    branches: [ main ]
8
9  jobs:
10 build:
11
12   runs-on: ubuntu-latest
13   strategy:
14     matrix:
15       python-version: ["3.7", "3.8", "3.9", "3.10"]
16
17   steps:
18     - uses: actions/checkout@v3
19     - name: Set up Python ${ matrix.python-version }
20       uses: actions/setup-python@v4
21       with:
22         python-version: ${ matrix.python-version }
23     - name: Install dependencies
24       run: |
25         python -m pip install --upgrade pip
26         pip install flake8 pytest
27         pip install -r requirements.txt
28         python setup.py install
29     - name: Lint with flake8
30       run: |
31         flake8 src/
32     - name: Test with pytest
33       run: |
34         pytest tests/
35

```

CI step 3: workflow files



The screenshot shows a GitHub Actions workflow file viewer for the repository 'metrics/.github/workflows/'. The selected workflow file is 'ci-tests-full.yml', which is highlighted with a red arrow. The content of the file is displayed in a dark-themed code editor.

```
..
ci-checks.yml      CI: merge conda and full tests (#1324)      18 days ago
ci-docker.yml      ci: reruns failed tests (#1348)             7 days ago
ci-integrate.yml   ci: reruns failed tests (#1348)             7 days ago
ci-tests-full.yml  ci: reruns failed tests (#1348)             7 days ago
docs-check.yml     Add CLIP score (#1314)                     11 days ago
focus-diff.yml    Bump actions/setup-python from 2 to 4 (#1169) 4 months ago
greetings.yml
publish-docker.yml
publish-pypi.yml

- name: Install dependencies
  run: |
    python -m pip install --upgrade --user pip
    pip install --requirement ./requirements.txt --find-links https://download.pytorch.org/whl/cpu/torch_stable.html
    pip install "pytest>6.0" "pytest-cov>2.10" --upgrade-strategy only-if-needed
    python --version
    pip --version
    pip list
  shell: bash

- name: Test Package [only]
  run: |
    # NOTE: run coverage on tests does not propagare faler status for Win, https://github.com/nedbat/coveragepy/issues/1003
    python -m pytest torchmetrics -v --cov=torchmetrics --junitxml=junit/test-results-{{ runner.os }}-{{ matrix.python-version }}.xml
```

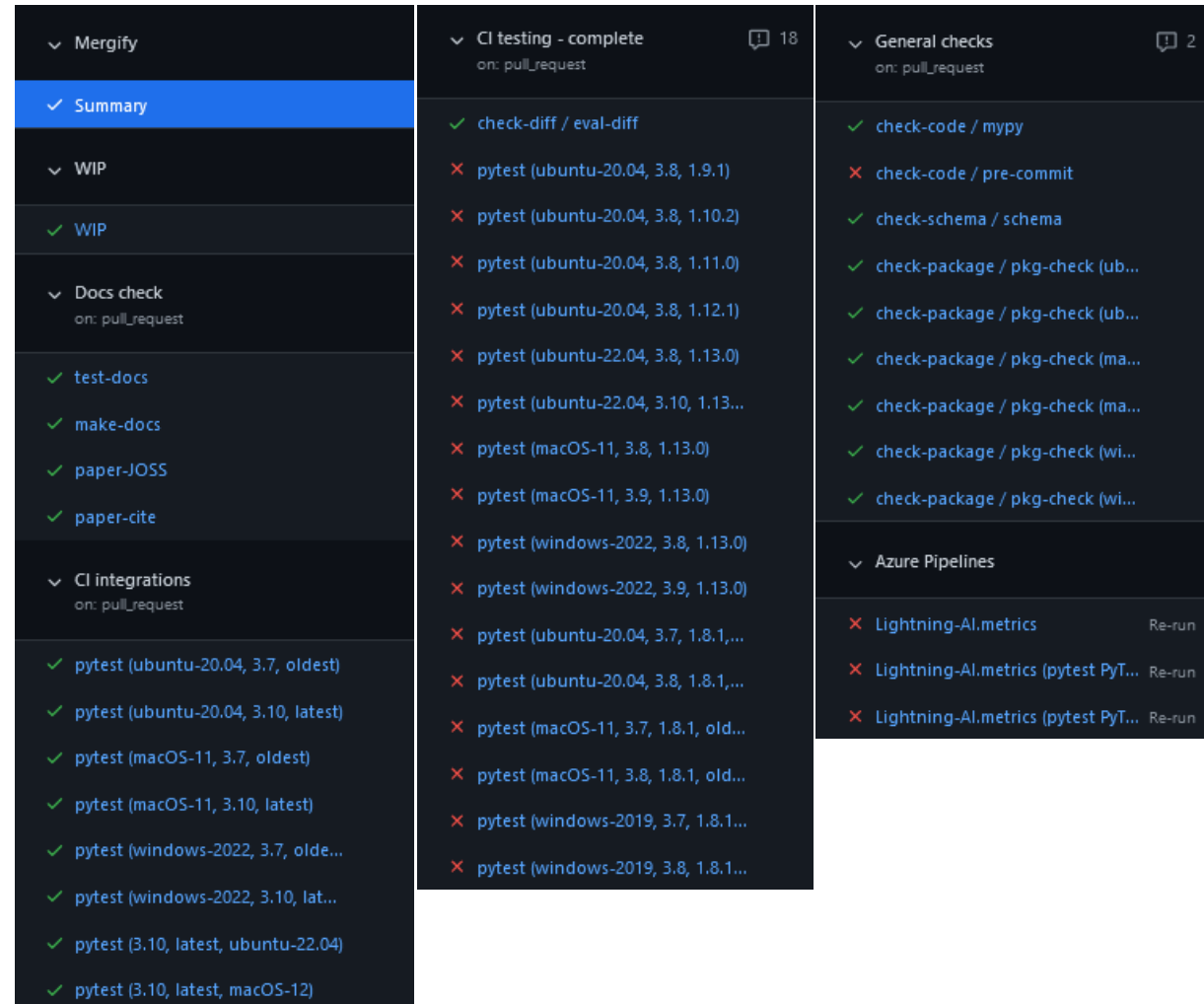
CI step 3: Workflow files

☑️ 43 checks in total

Test a combination of

- 💡 Hardware setup
- 💡 Operating system
- 💡 Python version
- 💡 Core dependencies

Runs unit tests, build documentation, test coverage, linting of code, package installer etc.



The screenshot shows a GitHub Actions CI workflow status page with three main sections:

- Mergify:** Summary (checked), WIP (checked), Docs check (checked, on: pull_request)
 - test-docs (checked)
 - make-docs (checked)
 - paper-JOSS (checked)
 - paper-cite (checked)
- CI testing - complete (on: pull_request):** 18 checks
 - check-diff / eval-diff (checked)
 - pytest (ubuntu-20.04, 3.8, 1.9.1) (failed)
 - pytest (ubuntu-20.04, 3.8, 1.10.2) (failed)
 - pytest (ubuntu-20.04, 3.8, 1.11.0) (failed)
 - pytest (ubuntu-20.04, 3.8, 1.12.1) (failed)
 - pytest (ubuntu-22.04, 3.8, 1.13.0) (failed)
 - pytest (ubuntu-22.04, 3.10, 1.13.0) (failed)
 - pytest (macOS-11, 3.8, 1.13.0) (failed)
 - pytest (macOS-11, 3.9, 1.13.0) (failed)
 - pytest (windows-2022, 3.8, 1.13.0) (failed)
 - pytest (windows-2022, 3.9, 1.13.0) (failed)
 - pytest (ubuntu-20.04, 3.7, 1.8.1, ...) (failed)
 - pytest (ubuntu-20.04, 3.8, 1.8.1, ...) (failed)
 - pytest (macOS-11, 3.7, 1.8.1, old...) (failed)
 - pytest (macOS-11, 3.8, 1.8.1, old...) (failed)
 - pytest (windows-2019, 3.7, 1.8.1...) (failed)
 - pytest (windows-2019, 3.8, 1.8.1...) (failed)
- General checks (on: pull_request):** 2 checks
 - check-code / mypy (checked)
 - check-code / pre-commit (failed)
 - check-schema / schema (checked)
 - check-package / pkg-check (ub...) (checked)
 - check-package / pkg-check (ub...) (checked)
 - check-package / pkg-check (ma...) (checked)
 - check-package / pkg-check (ma...) (checked)
 - check-package / pkg-check (wi...) (checked)
 - check-package / pkg-check (wi...) (checked)

At the bottom, there is a section for **Azure Pipelines** with three failed checks:

- Lightning-AI.metrics (Re-run)
- Lightning-AI.metrics (pytest PyT... (Re-run)
- Lightning-AI.metrics (pytest PyT... (Re-run)

CI step 3: Code is checked before merging

Branch protection rules:

- ⚠️ All/some tests should pass
- ⚠️ At least x core members need to approve
- ⚠️ Comments should be taken care of

View more [here](#)

The screenshot displays a GitHub pull request interface with the following elements:

- Review required:** A red 'x' icon and text indicating that at least 2 approving reviews are required by reviewers with write access. A link to "Learn more" is provided.
- 1 approval:** A green checkmark icon and text indicating that one approval has been received.
- 4 pending reviewers:** A person icon and text indicating that four reviewers are pending.
- No unresolved conversations:** A green checkmark icon and text indicating that there are no unresolved conversations on this pull request.
- Some checks were not successful:** A green circle with a red border icon and text indicating that four checks are failing and 43 are successful. A link to "Hide all checks" is provided.
- Docs check / test-docs (pull_request):** A red 'x' icon and text indicating that the check is failing after 1 minute. A "Required" badge and a "Details" link are present.
- CI integrations / pytest (ubuntu-20.04, 3.7, oldest) (pull_request):** A green checkmark icon and text indicating that the check is successful in 1 minute. A "Required" badge and a "Details" link are present.
- CI integrations / pytest (ubuntu-20.04, 3.10, latest) (pull_request):** A green checkmark icon and text indicating that the check is successful in 1 minute. A "Details" link is present.
- CI integrations / pytest (macOS-11, 3.7, oldest) (pull_request):** A green checkmark icon and text indicating that the check is successful in 4 minutes. A "Details" link is present.
- CI integrations / pytest (macOS-11, 3.10, latest) (pull_request):** A green checkmark icon and text indicating that the check is successful in 2 minutes. A "Details" link is present.
- CI integrations / pytest (windows-2022, 3.7, oldest) (pull_request):** A green checkmark icon and text indicating that the check is successful in 7 minutes. A "Details" link is present.
- Merging is blocked:** A red 'x' icon and text indicating that merging can be performed automatically with 2 approving reviews.
- Enable auto-merge (squash):** A dropdown menu with a "v" icon and text indicating that auto-merge is disabled. A link to "Learn more" is provided.

CI step 3: Automate tedious tasks with bots

```

justusschock and others added 5 commits 7 days ago
├── Update test_auc.py [Verified] 674e7ea
├── [pre-commit.ci] auto fixes from pre-commit.com hooks [P] 07a4b85
├── Update test_auc.py [Verified] 85e4458
├── [pre-commit.ci] auto fixes from pre-commit.com hooks [P] 0a94ba5
└── Update test_auc.py [Verified] 0527efd
  
```

```

tests/classification/test_auc.py
@@ -93,9 +93,9 @@ def test_auc_differentiability(self, x, y, reorder):
93 def test_auc(x, y, expected, unsqueeze_x, unsqueeze_y):
94     if unsqueeze_x:
95         x = x.unsqueeze(-1)
96 -
97     if unsqueeze_y:
98         y = y.unsqueeze(-1)
99 -
100     # Test Area Under Curve (AUC) computation
101     assert auc(tensor(x), tensor(y), reorder=True) == expected
  
```

CI step 3: Automate tedious tasks with bots

Dependabot can help auto checking new releases of dependencies in your project

The image shows a GitHub pull request interface on the left and a diff view on the right. The pull request is titled "build(deps): update kornia requirement from <0.7.1,>=0.6.7 to >=0.6.7, <0.7.2 in /requirements #2293". The diff view shows the change in the file "requirements/image_test.txt":

```

@@ -2,7 +2,7 @@
 2 # in case you want to preserve/enforce restrictions on the latest
 3   compatible version, add "strict" as an in-line comment
 4   scikit-image >=0.19.0, <=0.21.0
 5 - kornia >=0.6.7, <0.7.1
 6 + kornia >=0.6.7, <0.7.2
 7   pytorch-msssim ==1.0.0
 8   sewar >=0.4.4, <=0.4.6
 9   numpy <1.25.0
  
```

Below the diff view, a snippet of the ".github/dependabot.yml" file is shown:

```

1 # Basic dependabot.yml file with
2 # minimum configuration for two package managers
3
4 version: 2
5 updates:
6   # Enable version updates for python
7   - package-ecosystem: "pip"
8     # Look for a `requirements` in the `root` directory
9     directory: "/requirements"
10    # Check for updates once a week
11    schedule:
12      interval: "weekly"
  
```

Summary of continues integration

1. Use version control



2. Write (unit-)test for your code



3. Automate build + test



Meme of the day



Gabriele Petronella
@gabro27

So this just happened:

- a bot found a vulnerability in a dependency
- a bot sent a PR to fix it
- the CI verified the PR
- a bot merged it
- a bot celebrated the merge with a GIF

