Testing







Check out my YouTube

HV Nguyen 2019



Agenda

- Application Testing Contexts: Development vs. Auditing
- Python ecosystem for Application Testing
- Unit Testing, Acceptance Testing and Integration Testing
- Demonstration

"Application" Testing: Two Contexts

Pythonistas

- "Testing your code is very important. People are much more likely to use a project that actually works". "A test is about the most massively useful code a hitchhiker can write." (1)
- "Obey the Testing Goat! Do Nothing Until You Have a Test" (2)

Auditors (Regulators)

- "Application Development Risk" associated with "Manage Change"
- "Control over IT process of Manage changes" ... "requirement for IT to respond to business requirements" ... "alignment with business strategy" ... "reducing solution and service delivery defects and rework" "achieved by: (a) Define and communicate change procedures, (b) Assess, prioritize and authorize changes (c) Track status and report on changes" (3).



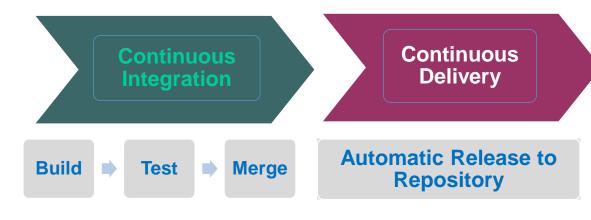
The Testing Goat

⁽¹⁾ Reitz, K. et. al. 2016 "The Hitchhiker's Guide to Python" O'Reilly

⁽²⁾ Percival, H. 2014 "Test-Driven Development with Python", O'Reilly

⁽³⁾ COBIT 5 "Al6 Manage Changes, Process Description", ISACA

"Application" Testing with CI/CD in Data Sciences



- CI/CD Data Sciences
- Audit/
 Compliance
 Concerns

- Repeatable environments
- Repeatable data
- Tested algorithms
- etc. ...
- Authorized Use Case
- "Vetted" source of data
- Tested algorithms
- etc. ...

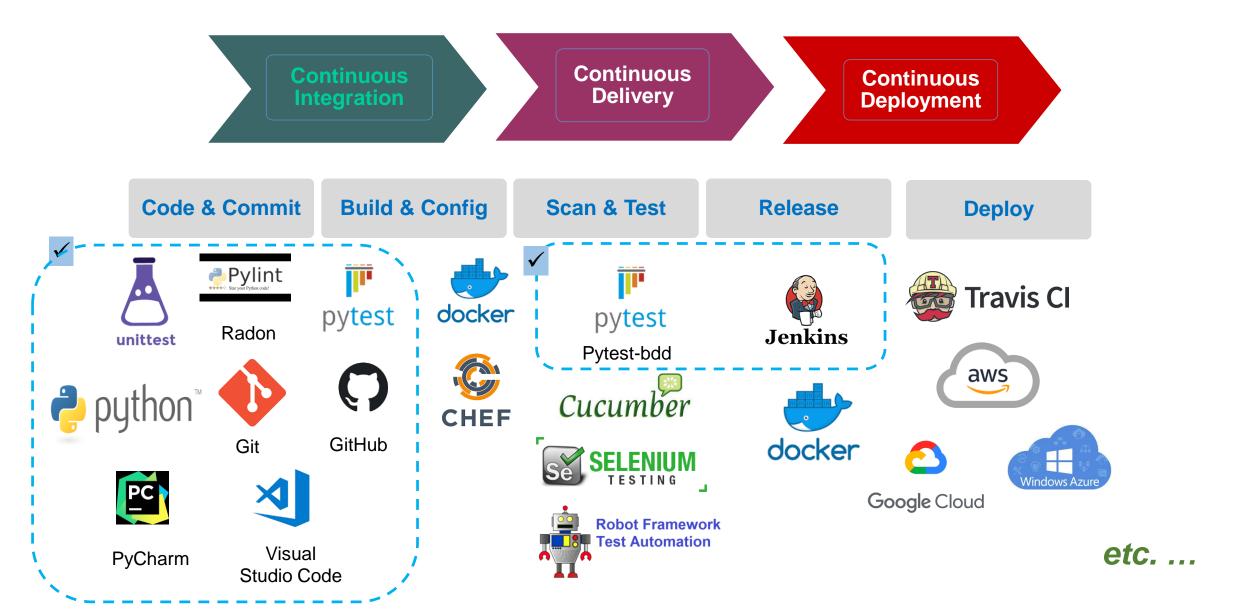
- Actionable insights
- Containerized data
- Catalogued algorithms
- etc. ...
- Secured repository from malicious attack
- etc. ...

Continuous Deployment

Automatic Deployment to Production

- Productionable Insights
- Monetized services
- Insight-based decision-making
- etc. ...
- Insights traceable back to algorithms, learning data, etc.
- Engineering code not maliciously deployed
- Engineering code not deployed by unauthorized personnel
- etc. ...

"Application" Testing with Python Ecosystem



PEP-8 and Code Analysis

PEP-8	 Guidelines for: Code lay-out Whitespace in Expressions and Statements Comments Version Bookkeeping Naming Conventions 	
Developers	Code readability and maintainabilityAccepted Pythonistas Best Practices	PylintRadon
Auditors (Regulators)	 Evidences of following Best Practices (proxy to Development Governance) Bonus: development artifacts from Python development tools 	(See Appendix A01, A02)

Unit Testing

Developers	Code coverageExceptions, errors, 'passed'	pytestpytest-cov
Auditors (Regulators)	 Evidences of unit testing (proxy to Development Governance) Bonus: Code logic + code branches Test logics Test results Testing date Automation Test replication 	(See Appendix A03, A04)

Acceptance Testing

Developers	Focus on 'behavior''Client' perspectives	• pytest-bdd
Auditors (Regulators)	 Evidences of User Acceptance Bonus: Client voice Test results Testing date Automation Test replication 	(See Appendix A05)

Integration Testing

Developers	Repeatable integration steps'Hands-off'Control over deployment	• jenkins
Auditors (Regulators)	 Evidences of Deployment Evidences of Segregation of Duties (developers not tampering with production) Bonus: Deployment logic Deployment results Deployment date Automation Deployment replication 	(See Appendix A06, A07, A08)

What Next?

- Considerations for Machine Learning
 - ML is (especially) hard
 - (Seemingly) random range of "almost"-correct equilibrium (end) states
 - Solutions? Write Tests
 - Subtle, Case-specific Problems? Write (more) Tests
 - Generative Learner? Generative training/test algo/data
 - Discriminative Learner? SGD (gradient step, loss min., etc.)
 - Approaches
 - Model Assertions (running and training time)
 - Runtime monitoring, Corrective action, Active Learning, Weak Supervision
 - Debugging Tasks
 - Classification (training data), Root cause (Pearl's Probability of Sufficiency), etc.

References

- 1. Cadamuro G., et. al. (Preprint) "Debugging Machine Learning Models", University of Washington
- 2. Chakarov A. et.al. 2016 "Debugging Machine Learning Tasks", University of Colorado
- 3. Cohen W. (Presentation) "Debugging Machine Learning Algorithms" CMU (http://www.cs.cmu.edu/~wcohen/10-605/debugging-tips.pdf)
- 4. Kang D. et.al. (Preprint) "Model Assertions for Debugging Machine Learning", Stanford DAWN Project

Question & Answer



I'sstry my best ...

References

Documentation

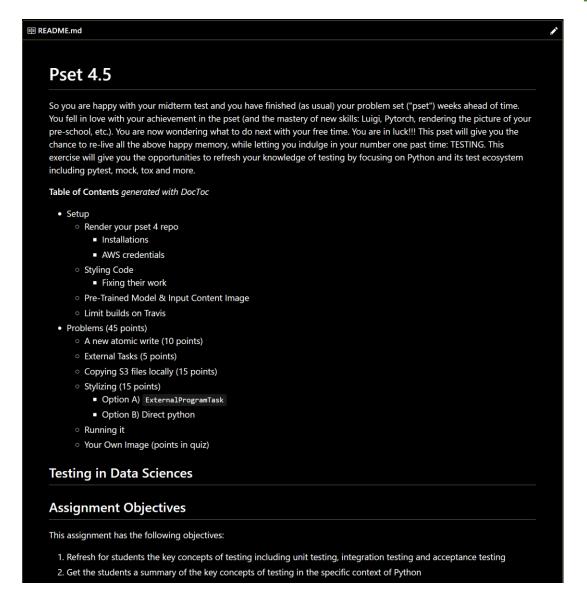
- COBIT 5 "Al6 Manage Changes, Process Description", ISACA
- Jenkins documentation
- <u>luigi test github</u>
- PEP-008 Style Guide for Python Code
- pylint homepage
- pytest documentation
- pytest-bdd documentation
- Radon documentation
- unittest.mock Object Library

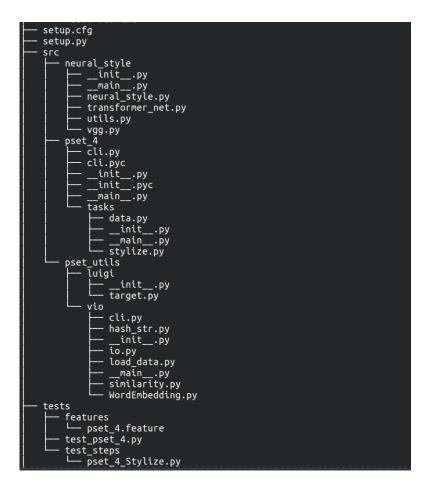
Literature

- Okken, B. 2017 "Python Testing with pytest" The Pragmatic Programmer
- Percival, H. 2014 "Test-Driven Development with Python" O'Reilly
- Reitz, K. et. al. 2016 "The Hitchhiker's Guide to Python" O'Reilly
- Sale, D. 2015 "Testing Python Unit Testing, TDD, BDD" Wiley

Appendices

A00 PSET-4-5 GITHUB Repository

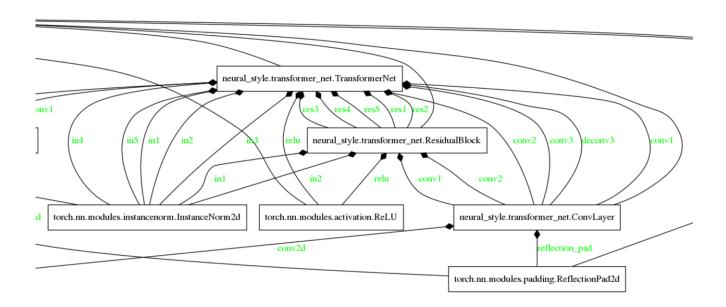




Local repository

A01 Code Analysis Pylint

```
****** Module pset 4
src/pset 4/ init .py:1:0: C0111: Missing module docstring (missing-docstring)
*********** Module pset 4. main
src/pset 4/ main .py:9:0: C0303: Trailing whitespace (trailing-whitespace)
******* Module pset 4.cli
src/pset 4/cli.py:13:0: C0303: Trailing whitespace (trailing-whitespace)
src/pset 4/cli.py:14:0: W0312: Found indentation with tabs instead of spaces (mixed-indentation)
src/pset 4/cli.py:15:0: W0312: Found indentation with tabs instead of spaces (mixed-indentation)
src/pset 4/cli.py:15:67: C0326: No space allowed around keyword argument assignment
       main arg parser.add argument("--content-image", type=str, default = ")
                                                                  ^ (bad-whitespace)
src/pset 4/tasks/stylize.py:21:0: C0111: Missing class docstring (missing-docstring)
src/pset_4/tasks/stylize.py:26:1: W0231: __init__ method from base class 'Task' is not called (si
src/pset 4/tasks/stylize.py:39:33: E0602: Undefined variable 'args' (undefined-variable)
src/pset 4/tasks/stylize.py:40:2: C0103: Variable name "LocalTargetSImg" doesn't conform to snake
src/pset 4/tasks/stylize.py:48:3: E0602: Undefined variable 'args' (undefined-variable)
src/pset 4/tasks/stylize.py:49:3: E0602: Undefined variable 'args' (undefined-variable)
src/pset_4/tasks/stylize.py:50:3: E0602: Undefined variable 'args' (undefined-variable)
src/pset_4/tasks/stylize.py:51:3: E0602: Undefined variable 'args' (undefined-variable)
src/pset_4/tasks/stylize.py:53:11: E0602: Undefined variable 'args' (undefined-variable)
src/pset 4/tasks/stylize.py:11:0: W0611: Unused import argparse (unused-import)
src/pset 4/tasks/stylize.py:14:0: W0611: Unused import luigi (unused-import)
********* Module pset_4.tasks.__main__
src/pset 4/tasks/ main .pv:9:0: C0303: Trailing whitespace (trailing-whitespace)
******* Module pset_4.tasks
src/pset 4/tasks/ init .py:1:0: C0111: Missing module docstring (missing-docstring)
Your code has been rated at -6.05/10 (previous run: -6.05/10, +0.00)
```



pylint-generated class diagram

pylint report

A02 Code Analysis Radon

```
src/pset_utils/luigi/target.py
   M 56:1 BaseAtomicProviderLocalTarget.open - A (4)
   C 41:0 BaseAtomicProviderLocalTarget - A (3)
   C 16:0 suffix_preserving_atomic_file - A (2)
   M 27:1 suffix_preserving_atomic_file.generate_tmp_path - A (2)
   M 50:1 BaseAtomicProviderLocalTarget.__init__ - A (2)
   M 19:1 suffix_preserving_atomic_file.__init__ - A (1)
   M 22:1 suffix_preserving_atomic_file.__enter__ - A (1)
   M 75:1 BaseAtomicProviderLocalTarget.temporary_path - A (1)
   M 82:1 BaseAtomicProviderLocalTarget.xxtemporary_path - A (1)
   C 89:0 SuffixPreservingLocalTarget - A (1)
```

Radon Cyclomatic Complexity (CC)

CC score	Rank	Risk
1 - 5	Α	low - simple block
6 - 10	В	low - well structured and stable block
11 - 20	С	moderate - slightly complex block
21 - 30	D	more than moderate - more complex block
31 - 40	Е	high - complex block, alarming
41+	F	very high - error-prone, unstable block

Block type	Letter
Function	F
Method	M
Class	С

Radon Raw src/neural_style/transformer net.py LOC: 99 LLOC: 74 SLOC: 72 Comments: 4 • LOC: the total number of lines of code Single comments: 4 Multi: 9 • LLOC: the number of logical lines of code • SLOC: the number of source lines of code - not necessarily corresponding to the LLOC Blank: 14 - Comment Stats • comments: the number of Python comment lines (i.e. only single-line comments #) (C % L): 4% • multi: the number of lines representing multi-line strings (C % S): **6**% • **blank**: the number of blank lines (or whitespace-only ones) (C + M % L): **13**% src/neural style/transformer net.py - A (70.85) Radon src/neural style/utils.py - A (65.61) src/neural style/ main .py - A (81.17) **Maintainability** src/neural style/vgg.py - A (63.27) src/neural style/neural_style.py - A (37.59) Index (MI)

src/neural style/ init .py - A (100.00)

src/pset_utils/vio/load_data.py - A (82.82)
src/pset utils/vio/ init .py - A (100.00)

src/pset_4/__main__.py - A (81.17)
src/pset_4/cli.py - A (94.10)
src/pset_4/__init__.py - A (100.00)
src/pset_4/tasks/data.py - A (74.82)
src/pset_4/tasks/stylize.py - A (86.41)
src/pset_4/tasks/__main__.py - A (81.17)
src/pset_4/tasks/__init__.py - A (100.00)
src/pset_utils/luigi/target.py - A (70.42)
src/pset_utils/luigi/__init__.py - A (100.00)
src/pset_utils/vio/similarity.py - A (91.44)
src/pset_utils/vio/WordEmbedding.py - A (77.96)
src/pset_utils/vio/hash_str.py - A (92.92)
src/pset_utils/vio/cli.py - A (100.00)
src/pset_utils/vio/io.py - A (97.11)

MI score	Rank	Maintainab
100 - 20	Α	Very high
19 - 10	В	Medium
9 - 0	С	Extremely lo

A03 Unit Test Code

```
# -*- coding: utf-8 -*-
 """ Module to illustrate the unit testing of luigi tasks
     Source: <a href="https://github.com/spotify/luigi/tree/master/test">https://github.com/spotify/luigi/tree/master/test</a>
 import os
 import tempfile
                                                              unittest
 import unittest
 import functools
 import itertools
 import boto3
 from boto.s3 import key
                                                           AWS boto.
 from mock import patch
                                                                                                     Luigi
                                                               boto3
 from moto import mock s3, mock sts
                                                                                                     DAG
 from luigi.mock import MockTarget
from luigi.contrib.s3 import (DeprecatedBotoClientException, FileNotFoundException,
 from luigi import six
 from pset 4.tasks.data import ContentImage, SavedModel, CopyS3ImageLocally, CopyS3ModelLocally
 from pset 4.tasks.stylize import Stylize
 from pset 4.cli import main as climain
from pset_utils.luigi.target import suffix_preserving_atomic_file, \

    def create bucket():

⊞class with config(object):

⊞class ContentImageTest (unittest.TestCase, ContentImage):
⊞class SavedModelTest (unittest.TestCase, SavedModel):
deligion : Text CopyS3ImageLocallyTest (unittest.TestCase, CopyS3ImageLocally):
         # self.assertTrue(s3 client.exists('s3://psetbucket/tempfile'))
         # self.assertFalse(s3 client.exists('s3://psetbucket/temp'))
         # s3_client.put(self.tempFilePath, 's3://psetbucket/tempdir0_$folder$')
         # self.assertTrue(s3 client.exists('s3://psetbucket/tempdir0'))
         # s3 client.put(self.tempFilePath, 's3://psetbucket/tempdir1/')
         # self.assertTrue(s3 client.exists('s3://psetbucket/tempdir1'))
         # s3 client.put(self.tempFilePath, 's3://psetbucket/tempdir2/subdir')
         # self.assertTrue(s3 client.exists('s3://psetbucket/tempdir2'))
         # self.assertFalse(s3 client.exists('s3://psetbucket/tempdir'))
⊞class CopyS3ModelLocallyTest (unittest.TestCase, CopyS3ModelLocally):
⊞class StylizeTest (unittest.TestCase, Stylize):
Hclass SuffixPreservingTest(unittest.TestCase, suffix preserving atomic file):
⊞class BaseAtomicTest(unittest.TestCase, BaseAtomicProviderLocalTarget):
Eclass SuffixPreserveTest(unittest.TestCase, SuffixPreservingLocalTarget):
Hif __name__ == '__main__':
```

Function coverage

```
test_pset4.py
```

```
class ContentImageTest (unittest.TestCase, ContentImage):
    """ Test class ContentImage """
    def setUp(self):
        f = tempfile.NamedTemporaryFile(mode='wb', delete=False)
        self.tempFileContents = (
                                                                                    TmpFile
        self.tempFilePath = f.name
        f.write(self.tempFileContents)
                                                                                     setup
        f.close()
        self.addCleanup(os.remove, self.tempFilePath)
        self.mock s3 = mock s3()
                                                                                     Mock
        self.mock s3.start()
        self.addCleanup(self.mock s3.stop)
                                                                                       S3
    def tearDown(self):
        pass
    def Output(self):
                                                                                      Mock
        return MockTarget("output Image")
                                                                                     Target
    def create target(self, format=None, **kwargs):
        client = S3Client(AWS ACCESS KEY, AWS SECRET KEY)
        return S3Target('s3://psetbucket/luigi.jpg', client=client, format=format, **kwargs)
    def test read(self):
        # Test read file when file exists
                                                                                      Test
        client = S3Client(AWS ACCESS KEY, AWS SECRET KEY)
                                                                                    S3Client
        client.put(self.tempFilePath, 's3://psetbucket/tempfile')
        t = S3Target('s3://psetbucket/tempfile', client=client)
        read file = t.open()
        file str = read file.read()
        self.assertEqual(self.tempFileContents, file str.encode('utf-8'))
                                                                                      Test
                                                                                   S3Target
    def test read no file (self):
        # Test read file when file does not exist
        t = self.create target()
        self.assertRaises(FileNotFoundException, t.open)
    def test read iterator long(self):
        # Test iteration - write a file that is 5X the boto buffersize
        old buffer = key.Key.BufferSize
        key.Key.BufferSize = 2
        try:
        finally:
        self.assertEqual(3, len(lines))
        self.assertEqual(firstline, lines[0])
        self.assertEqual(secondline, lines[1])
        self.assertEqual(thirdline, lines[2])
    def test get path(self):
        # Test get path
        t = self.create target()
        path = t.path
        self.assertEqual('s3://psetbucket/luigi.jpg', path)
```

A04 Unit Test pytest report

pytest_pset45.html

Report generated on 04-May-2019 at 13:03:47 by pytest-html v1.20.0

Environment

Packages	{'pytest': '4.4.1', 'py': '1.8.0', 'pluggy': '0.9.0'}
Platform	Linux-4.15.0-48-generic-x86_64-with-debian-buster-sid
Plugins	{'metadata': '1.8.0', 'html': '1.20.0', 'cov': '2.7.1'}
Python	3.7.2

Date report generated

Environment

Summary

6 tests ran in 2.29 seconds.

(Un)check the boxes to filter the results.

☑ 5 passed, ☑ 0 skipped, ☑ 1 failed, ☑ 4 errors, ☑ 0 expected failures, ☑ 0 unexpected passes

Summary

Error'

section

Results

Show all details / Hide all details

Result	▼ Test
Error (show details)	tests/test_pset_4.py::CopyS3ImageLocallyTest::test_exists::setup
Error (show details)	tests/test_pset_4.py::CopyS3ImageLocallyTest::test_get_key::setup
Error (show details)	tests/test_pset_4.py::CopyS3ImageLocallyTest::test_init_with_config::setup
Error (show details)	tests/test_pset_4.py::CopyS3ImageLocallyTest::test_init_without_init_or_config::setup
Failed (hide details)	tests/test_pset_4.py::test_climain

'Failed' section

 Passed (show details)
 tests/test_pset_4.py::test_pset_4.with_config

 Passed (show details)
 tests/test_pset_4.py::ContentImageTest::test_get_path

 Passed (show details)
 tests/test_pset_4.py::ContentImageTest::test_read

 Passed (show details)
 tests/test_pset_4.py::ContentImageTest::test_read_iterator_long

 Passed (show details)
 tests/test_pset_4.py::ContentImageTest::test_read_no_file

'Passed' section

pytest_pset45.html

Report generated on 04-May-2019 at 13:03:47 by pytest-html v1.20.0

Environment

Packages	{'pytest': '4.4.1', 'py': '1.8.0', 'pluggy': '0.9.0'}
Platform	Linux-4.15.0-48-generic-x86_64-with-debian-buster-sid
Plugins	{'metadata': '1.8.0', 'html': '1.20.0', 'cov': '2.7.1'}
Python	3.7.2

☑ 5 passed. ☑ 0 skipped. ☑ 1 failed. ☑ 4 errors. ☑ 0 expected failures. ☑ 0 unexpected passes

Summary

6 tests ran in 2.29 seconds.

Frror (show details)

Error (show details)

(Un)check the boxes to filter the results.

Results 'Error' Show all details / Hide all details details Result - Test Error (hide details) tests/test_pset_4.py::CopyS3ImageLocallyTest::test_exists::setup ../../.local/share/virtualenvs/pset-4-5-7H9seXuk/lib/python3.7/site-packages/luigi/task register.py:88: in call param values = cls.get param values(params, args, kwargs) ../../.local/share/virtualenvs/pset-4-5-7H9seXuk/lib/python3.7/site-packages/luigi/task.py:405: in get param values raise parameter. UnknownParameterException ('%s: takes at most %d parameters (%d given)' % (exc desc, len (positional params), len (args) E luigi.parameter.UnknownParameterException: CopyS3ImageLocallyTest[args=('test_exists',), kwargs={}]: takes at most 0 parameters (1 gi Error (hide details) tests/test_pset_4.py::CopyS3ImageLocallyTest::test_get_key::setup ../../.local/share/virtualenvs/pset-4-5-7H9seXuk/lib/python3.7/site-packages/luigi/task register.py:88: in call param values = cls.get param values(params, args, kwargs) ../../.local/share/virtualenvs/pset-4-5-7H9seXuk/lib/python3.7/site-packages/luigi/task.py:405: in get_param_values raise parameter.UnknownParameterException('%s: takes at most %d parameters (%d given)' % (exc desc, len(positional params), len(args)

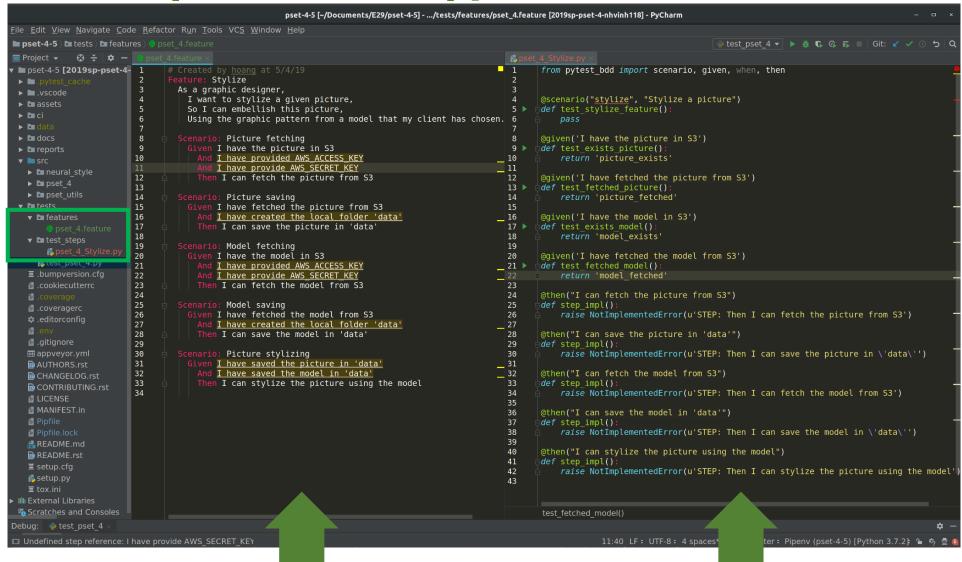
E luigi.parameter.UnknownParameterException: CopyS3ImageLocallyTest[args=('test_get_key',), kwargs={}]: takes at most 0 parameters (1 c

tests/test_pset_4.py::CopyS3ImageLocallyTest::test_init_with_config::setup

tests/test_pset_4.py::CopvS3ImageLocallyTest::test_init_without_init_or_config::setup

pytest report (html)

A05 "Acceptance" Test pytest-bdd

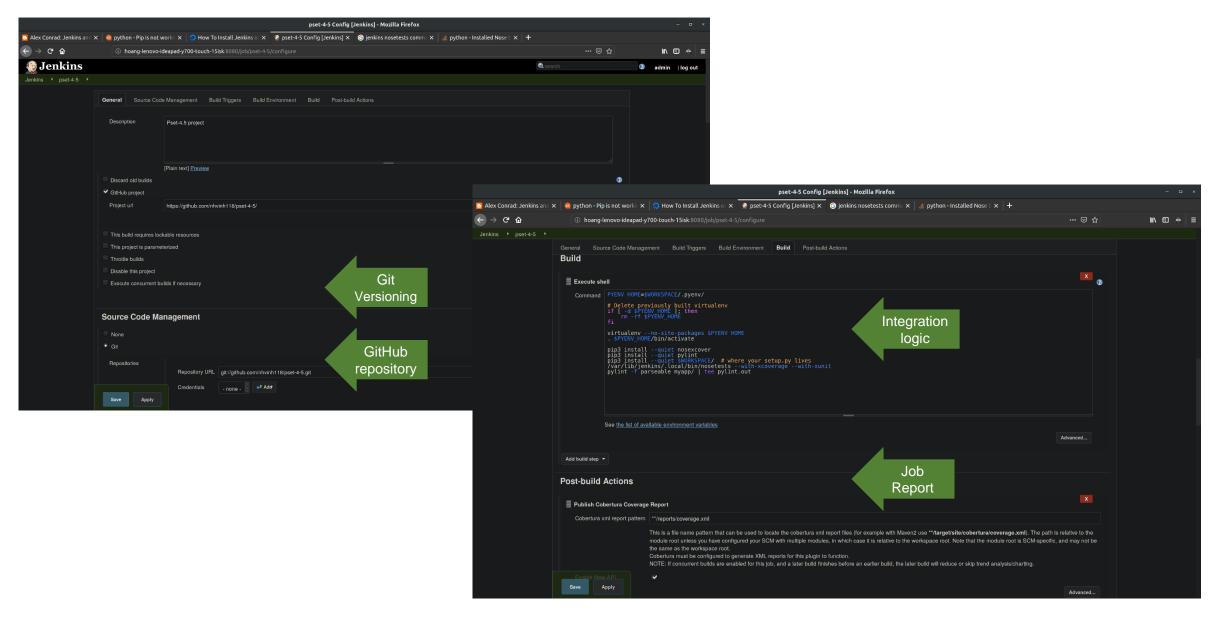


Folders containing pytest-bdd codes

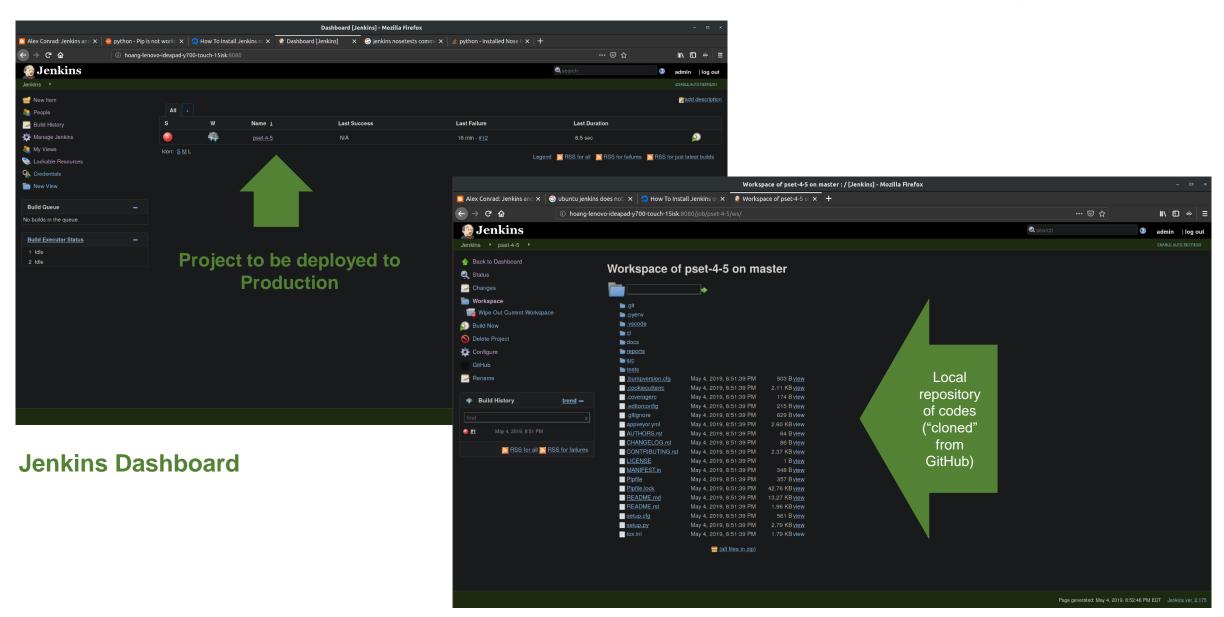
"Features": English like description of the functionality

"Test Steps": Translation of features into testable code

A06 "Integration" Jenkins Configuration



A07 "Integration" Jenkins Dashboard & Workspace



A07 "Integration" Jenkins Dashboard & Workspace

