# How to organize a growing set of tests?

UNIT TESTING FOR DATA SCIENCE IN PYTHON



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- row\_to\_list()
- convert\_to\_int()
- get\_data\_as\_numpy\_array()
- split\_into\_training\_and\_testing\_sets()

```
row_to_list()
```

- convert\_to\_int()
- get\_data\_as\_numpy\_array()
- split\_into\_training\_and\_testing\_sets()
- •



```
row_to_list()
```

- convert\_to\_int()
- get\_data\_as\_numpy\_array()
- split\_into\_training\_and\_testing\_sets()
- •



```
row_to_list()
```

- convert\_to\_int()
- get\_data\_as\_numpy\_array()
- split\_into\_training\_and\_testing\_sets()
- . . .



### Need a strategy to organize tests

# Need a strategy to organize tests



src/

# All application code lives here

```
src/  # All application code lives here
|-- data/  # Package for data preprocessing

| |-- __init__.py

| |-- preprocessing_helpers.py  # Contains row_to_list(), convert_to_int()

|-- features/  # Package for feature generation from preprocessed data
|-- __init__.py
```

```
# All application code lives here
src/
                                        # Package for data preprocessing
|-- data/
    |-- __init__.py
    |-- preprocessing_helpers.py
                                        # Contains row_to_list(), convert_to_int()
                                        # Package for feature generation from preprocessed data
|-- features/
    |-- __init__.py
                                        # Contains get_data_as_numpy_array()
    |-- as_numpy.py
|-- models/
                                        # Package for training/testing linear regression model
    |-- __init__.py
    |-- train.py
                                        # Contains split_into_training_and_testing_sets()
```

#### The tests folder

```
src/
                                        # All application code lives here
                                        # Package for data preprocessing
|-- data/
    |-- __init__.py
    |-- preprocessing_helpers.py
                                        # Contains row_to_list(), convert_to_int()
                                        # Package for feature generation from preprocessed data
|-- features/
    |-- __init__.py
                                        # Contains get_data_as_numpy_array()
    |-- as_numpy.py
|-- models/
                                        # Package for training/testing linear regression model
    |-- __init__.py
    |-- train.py
                                        # Contains split_into_training_and_testing_sets()
                                        # Test suite: all tests live here
tests/
```

#### The tests folder mirrors the application folder

```
src/
                                         # All application code lives here
|-- data/
                                         # Package for data preprocessing
    |-- __init__.py
    |-- preprocessing_helpers.py
                                         # Contains row_to_list(), convert_to_int()
                                         # Package for feature generation from preprocessed data
|-- features/
    |-- __init__.py
                                         # Contains get_data_as_numpy_array()
    |-- as_numpy.py
|-- models/
                                         # Package for training/testing linear regression model
    |-- __init__.py
                                         # Contains split_into_training_and_testing_sets()
    |-- train.py
                                         # Test suite: all tests live here
tests/
I-- data/
     -- __init__.py
|-- features/
    |-- __init__.py
|-- models/
    |-- __init__.py
```

## Python module and test module correspondence

```
# All application code lives here
src/
                                        # Package for data preprocessing
|-- data/
    |-- __init__.py
    |-- preprocessing_helpers.py
                                        # Contains row_to_list(), convert_to_int()
|-- features/
                                        # Package for feature generation from preprocessed data
    |-- __init__.py
    |-- as_numpy.py
                                        # Contains get_data_as_numpy_array()
|-- models/
                                        # Package for training/testing linear regression model
    |-- __init__.py
                                        # Contains split_into_training_and_testing_sets()
    |-- train.py
                                        # Test suite: all tests live here
tests/
|-- data/
    |-- __init__.py
    |-- test_preprocessing_helpers.py  # Corresponds to module src/data/preprocessing_helpers.py
|-- features/
    |-- __init__.py
|-- models/
    |-- __init__.py
```

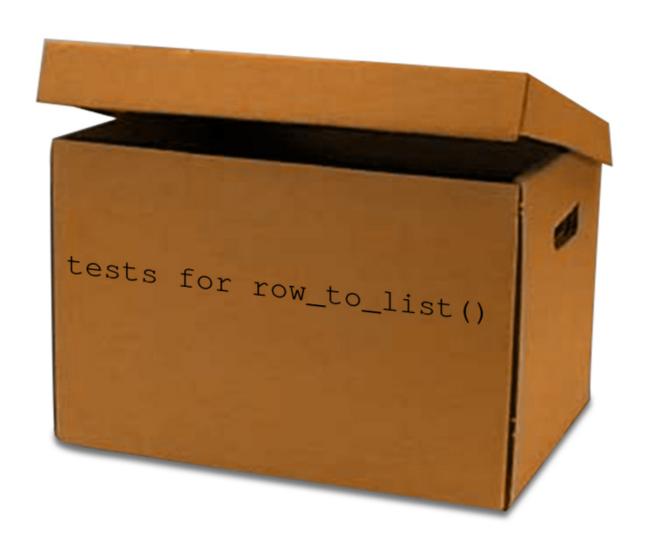
#### Structuring tests inside test modules

```
import pytest
from data.preprocessing_helpers import row_to_list, convert_to_int
def test_on_no_tab_no_missing_value():  # A test for row_to_list()
def test_on_two_tabs_no_missing_value(): # Another test for row_to_list()
def test_with_no_comma():
                                        # A test for convert_to_int()
def test_with_one_comma():
                            # Another test for convert_to_int()
```

#### Test class



#### Test class is a container for a single unit's tests



```
import pytest
from data.preprocessing_helpers import row_to_list, convert_to_int
class
```

```
import pytest
from data.preprocessing_helpers import row_to_list, convert_to_int

class TestRowToList():  # Use CamelCase
```

```
import pytest
from data.preprocessing_helpers import row_to_list, convert_to_int

class TestRowToList(object):  # Always put the argument object
    def test_on_no_tab_no_missing_value():  # A test for row_to_list()
    ...

def test_on_two_tabs_no_missing_value():  # Another test for row_to_list()
    ...
```

```
import pytest
from data.preprocessing_helpers import row_to_list, convert_to_int

class TestRowToList(object):  # Always put the argument object
    def test_on_no_tab_no_missing_value(self):  # Always put the argument self
    ...

def test_on_two_tabs_no_missing_value(self):  # Always put the argument self
    ...
```

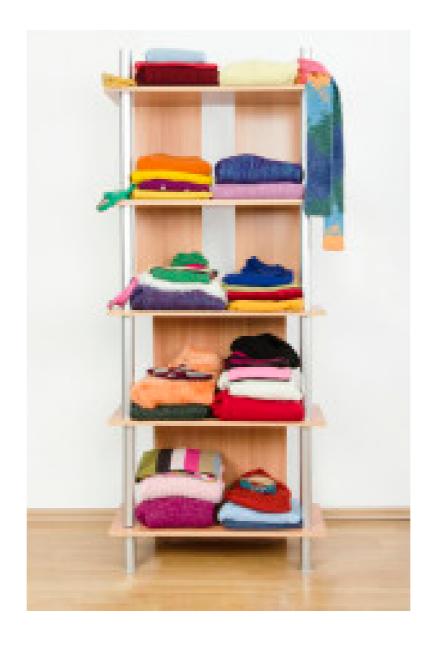
#### **Clean separation**

```
import pytest
from data.preprocessing_helpers import row_to_list, convert_to_int
class TestRowToList(object):
                                    # Always put the argument object
   def test_on_no_tab_no_missing_value(self):
                                             # Always put the argument self
       . . .
   def test_on_two_tabs_no_missing_value(self): # Always put the argument self
       . . .
class TestConvertToInt(object):
                                # Test class for convert_to_int()
   def test_with_no_comma(self):
                                             # A test for convert_to_int()
   def test_with_one_comma(self):
                                   # Another test for convert_to_int()
```

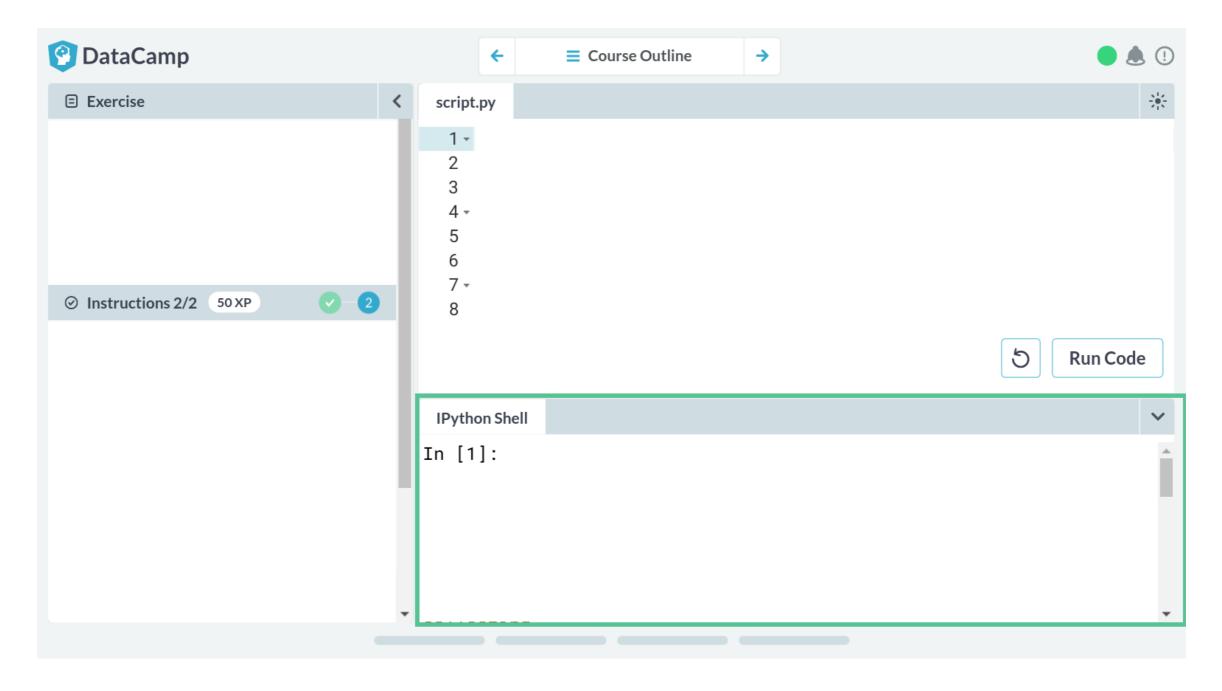
### Final test directory structure

```
src/
                                        # All application code lives here
|-- data/
                                        # Package for data preprocessing
    |-- __init__.py
    |-- preprocessing_helpers.py
                                        # Contains row_to_list(), convert_to_int()
                                        # Package for feature generation from preprocessed data
|-- features/
    |-- __init__.py
                                        # Contains get_data_as_numpy_array()
    |-- as_numpy.py
-- models/
                                        # Package for training/testing linear regression model
    |-- __init__.py
                                        # Contains split_into_training_and_testing_sets()
    |-- train.py
                                        # Test suite: all tests live here
tests/
I-- data/
    |-- __init__.py
    |-- test_preprocessing_helpers.py  # Contains TestRowToList, TestConvertToInt
|-- features/
    |-- __init__.py
    |-- test_as_numpy.py
                                        # Contains TestGetDataAsNumpyArray
|-- models/
    |-- __init__.py
    |-- test_train.py
                                        # Contains TestSplitIntoTrainingAndTestingSets
```

## Test directory is well organized!



### IPython console's working directory is tests



## IPython console's working directory is tests

```
src/
|-- data/
   |-- __init__.py
    |-- preprocessing_helpers.py
|-- features/
    |-- __init__.py
    |-- as_numpy.py
|-- models/
    |-- __init__.py
   |-- train.py
                                         # This is IPython console's working directory from now on
tests/
I-- data/
    |-- __init__.py
    |-- test_preprocessing_helpers.py
|-- features/
    |-- __init__.py
    |-- test_as_numpy.py
|-- models/
    |-- __init__.py
    |-- test_train.py
```

# Let's practice structuring tests!

UNIT TESTING FOR DATA SCIENCE IN PYTHON



# Mastering test execution

UNIT TESTING FOR DATA SCIENCE IN PYTHON

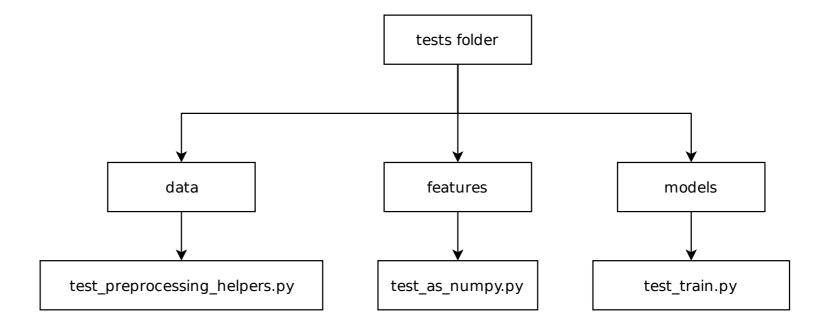


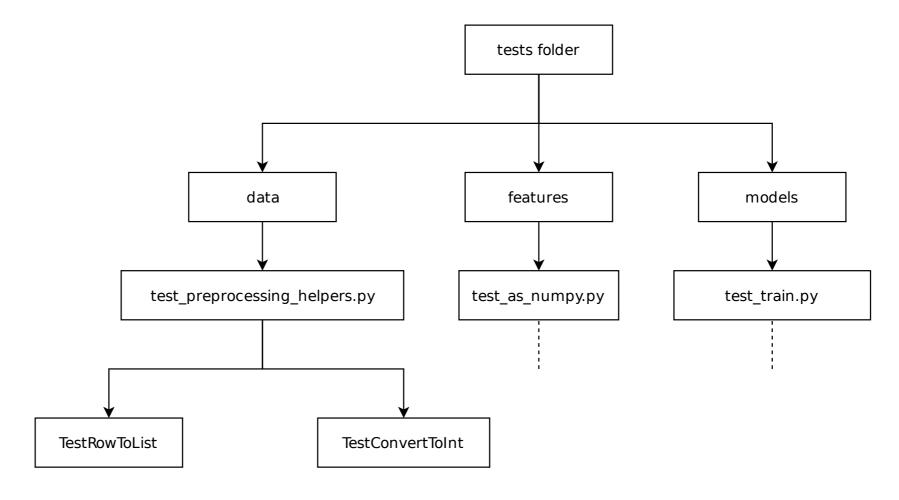
Dibya Chakravorty
Test Automation Engineer

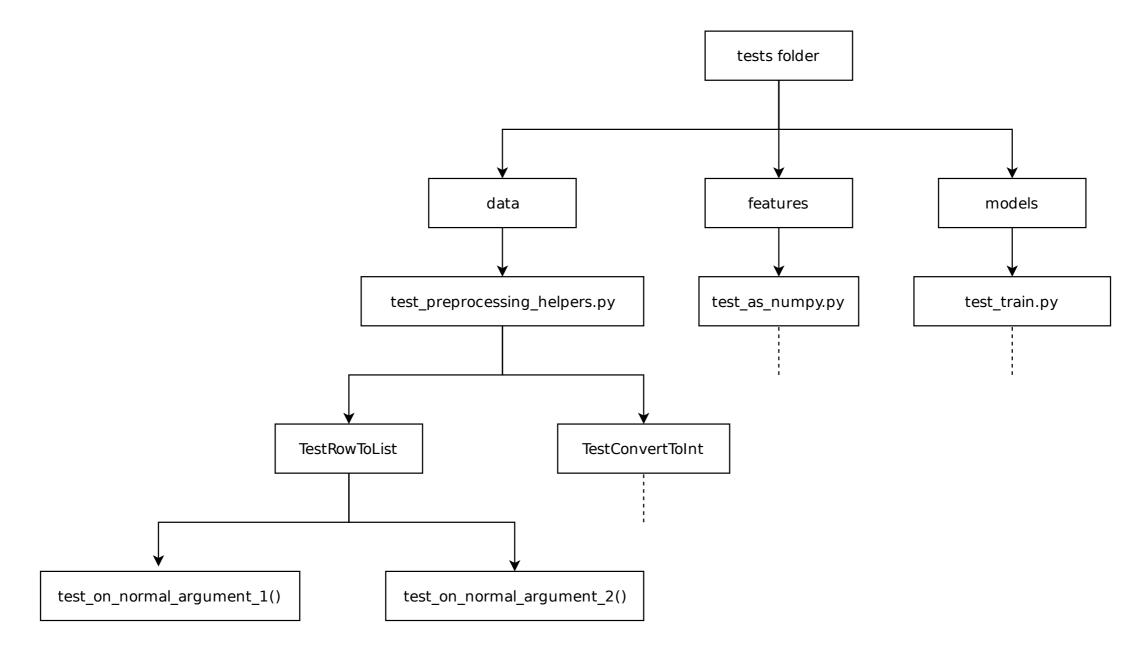


tests folder

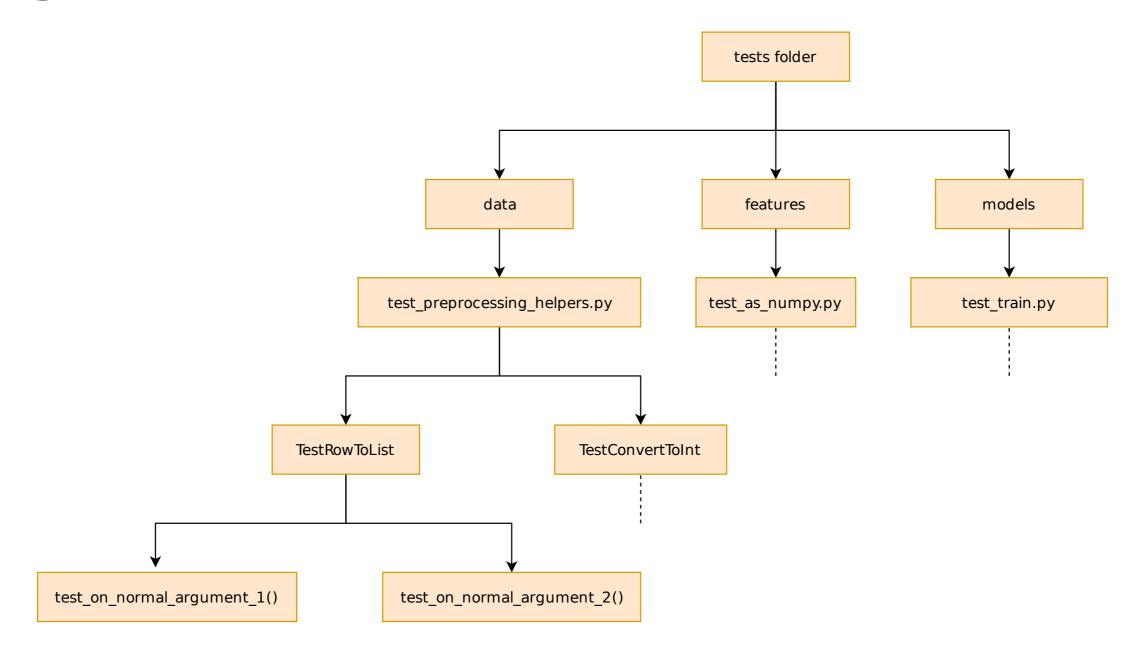








# Running all tests



# Running all tests

```
cd tests
pytest
```

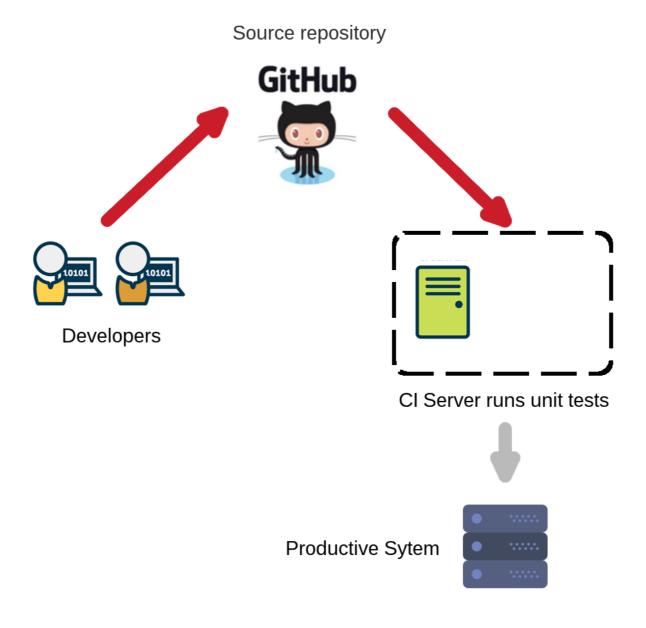
- Recurses into directory subtree of tests/.
  - $\circ$  Filenames starting with test\_  $\rightarrow$  test module.
    - - Function names starting with test\_  $\rightarrow$  unit test.

#### Running all tests

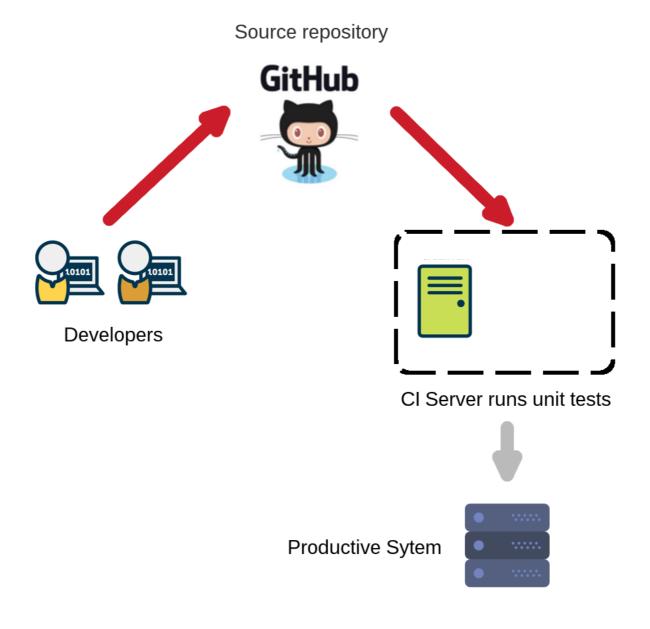
```
data/test_preprocessing_helpers.py ......F....
                                                                            [ 81%]
features/test_as_numpy.py .
                                                                            [ 87%]
                                                                            [100%]
models/test_train.py ...
______ TestRowToList.test_on_one_tab_with_missing_value _______ TestRowToList.test_on_one_tab_with_missing_value
self = <tests.data.test_preprocessing_helpers.TestRowToList object at 0x7f6205475240>
  def test_on_one_tab_with_missing_value(self): # (1, 1) boundary value
    actual = row_to_list("\t4,567\n")
    assert actual is None, "Expected: None, Actual: {0}".format(actual)
    AssertionError: Expected: None, Actual: ['', '4,567']
    assert ['', '4,567'] is None
data/test_preprocessing_helpers.py:55: AssertionError
```



### Typical scenario: CI server



#### Binary question: do all unit tests pass?



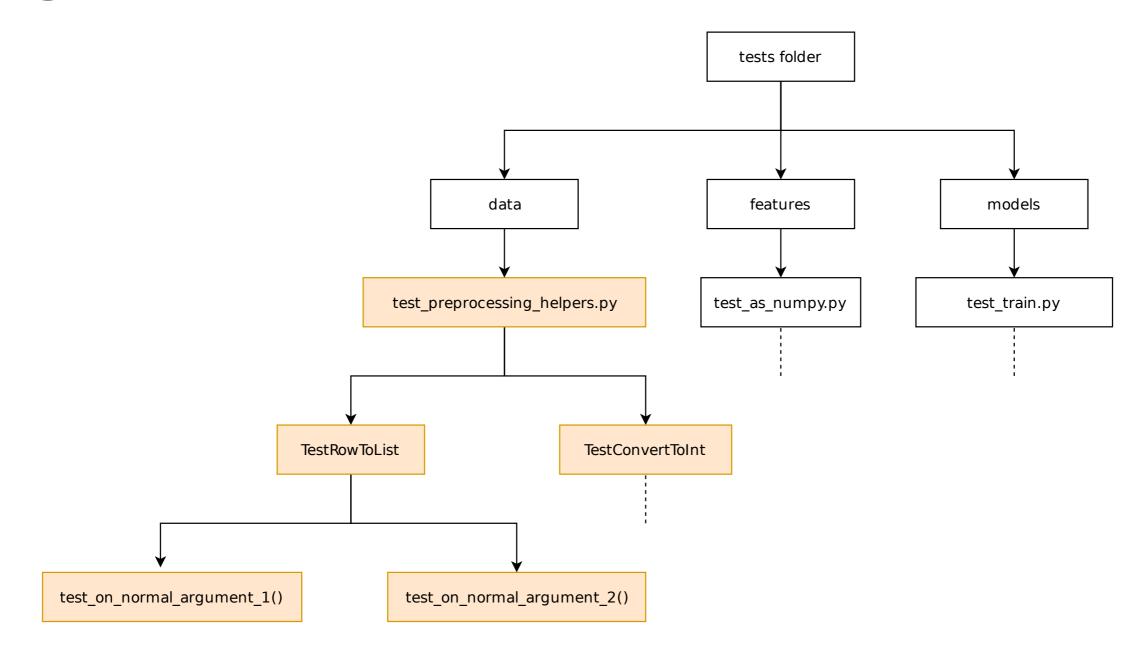
#### The -x flag: stop after first failure

pytest -x

```
data/test_preprocessing_helpers.py ......F
    ______ TestRowToList.test_on_one_tab_with_missing_value _____
self = <tests.data.test_preprocessing_helpers.TestRowToList object at 0x7f6309f17198>
  def test_on_one_tab_with_missing_value(self): # (1, 1) boundary value
    actual = row_to_list("\t4,567\n")
    assert actual is None, "Expected: None, Actual: {0}".format(actual)
    AssertionError: Expected: None, Actual: ['', '4,567']
    assert ['', '4,567'] is None
data/test_preprocessing_helpers.py:55: AssertionError
```



#### Running tests in a test module



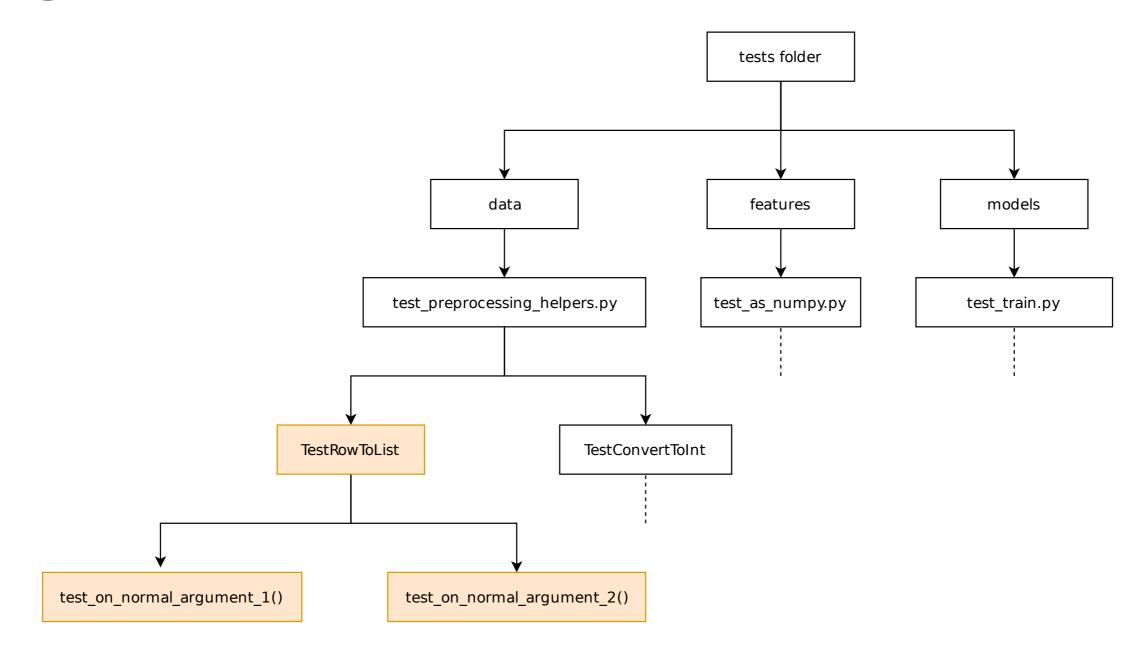
#### Running tests in a test module

pytest data/test\_preprocessing\_helpers.py

```
data/test_preprocessing_helpers.py .......F....
                                                                      [100%]
          _____ TestRowToList.test_on_one_tab_with_missing_value _________________________
self = <tests.data.test_preprocessing_helpers.TestRowToList object at 0x7f435947f198>
  def test_on_one_tab_with_missing_value(self): # (1, 1) boundary value
     actual = row_to_list("\t4,567\n")
     assert actual is None, "Expected: None, Actual: {0}".format(actual)
     AssertionError: Expected: None, Actual: ['', '4,567']
     assert ['', '4,567'] is None
data/test_preprocessing_helpers.py:55: AssertionError
```



# Running only a particular test class



#### Node ID

- Node ID of a test class: <path to test module>::<test class name>
- Node ID of an unit test: <path to test module>::<test class name>::<unit test name>

#### Running tests using node ID

• Run the test class TestRowToList .

```
pytest data/test_preprocessing_helpers.py::TestRowToList
```

```
data/test_preprocessing_helpers.py ..F....
                                                                 [100%]
______ TestRowToList.test_on_one_tab_with_missing_value ______
self = <tests.data.test_preprocessing_helpers.TestRowToList object at 0x7ffb3bac4da0>
  def test_on_one_tab_with_missing_value(self): # (1, 1) boundary value
     actual = row_to_list("\t4,567\n")
     assert actual is None, "Expected: None, Actual: {0}".format(actual)
     AssertionError: Expected: None, Actual: ['', '4,567']
     assert ['', '4,567'] is None
data/test_preprocessing_helpers.py:55: AssertionError
```



#### Running tests using node ID

• Run the unit test test\_on\_one\_tab\_with\_missing\_value() .

```
pytest data/test_preprocessing_helpers.py::TestRowToList::test_on_one_tab_with_missing_value
```

```
data/test_preprocessing_helpers.py F
                                                                      [100%]
      ______ TestRowToList.test_on_one_tab_with_missing_value                       _
self = <tests.data.test_preprocessing_helpers.TestRowToList object at 0x7f4eece33b00>
  def test_on_one_tab_with_missing_value(self): # (1, 1) boundary value
     actual = row_to_list("\t4,567\n")
     assert actual is None, "Expected: None, Actual: {0}".format(actual)
     AssertionError: Expected: None, Actual: ['', '4,567']
     assert ['', '4,567'] is None
data/test_preprocessing_helpers.py:55: AssertionError
```



#### Running tests using keyword expressions



### The -k option

pytest -k "pattern"

• Runs all tests whose node ID matches the pattern.

#### The -k option

Run the test class TestSplitIntoTrainingAndTestingSets .

```
pytest -k "TestSplitIntoTrainingAndTestingSets"
models/test_train.py ..
     pytest -k "TestSplit"
models/test_train.py ..
                                                          [100
```



#### Supports Python logical operators

```
pytest -k "TestSplit and not test_on_one_row"
```



#### Let's run some tests!

UNIT TESTING FOR DATA SCIENCE IN PYTHON



# Expected failures and conditional skipping

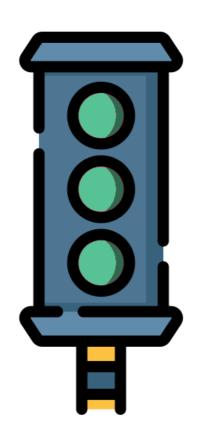
UNIT TESTING FOR DATA SCIENCE IN PYTHON

Dibya Chakravorty
Test Automation Engineer



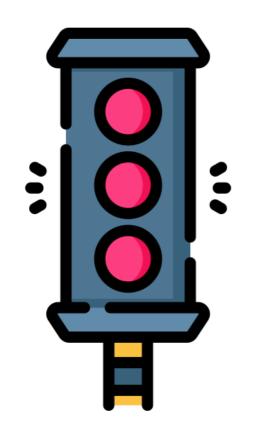


#### Test suite is green when all tests pass





# Test suite is red when any test fails





#### Implementing a function using TDD

• train\_model() : Returns best fit line given training data.

```
import pytest

class TestTrainModel(object):
    def test_on_linear_data(self):
    ...
```

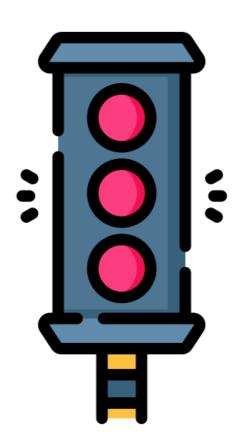
#### The test fails, of course!

pytest

```
data/test_preprocessing_helpers.py ......
                                                       [ 76%]
                                                       [ 82%]
features/test_as_numpy.py .
models/test_train.py ..F
                                                       [100%]
self = <tests.models.test_train.TestTrainModel object at 0x7f5fc0f31978>
  def test_on_linear_data(self):
    test_input = np.array([[1.0, 3.0], [2.0, 5.0], [3.0, 7.0]])
    expected_slope = 2.0
    expected_intercept = 1.0
    actual_slope, actual_intercept = train_model(test_input)
    NameError: name 'train_model' is not defined
models/test_train.py:39: NameError
```



#### False alarm



#### xfail: marking tests as "expected to fail"

```
import pytest

class TestTrainModel(object):
    @
    def test_on_linear_data(self):
    ...
```

#### xfail: marking tests as "expected to fail"

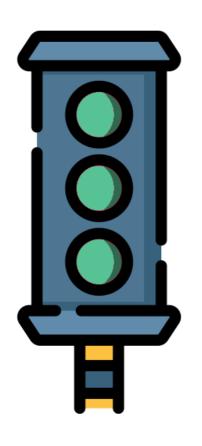
```
import pytest

class TestTrainModel(object):
    @pytest.mark.xfail
    def test_on_linear_data(self):
        ...
```

pytest



### Test suite stays green





#### Expected failures, but conditionally

Tests that are expected to fail

- on certain Python versions.
- on certain platforms like Windows.

```
class TestConvertToInt(object):
    def test_with_no_comma(self):
        """Only runs on Python 2.7 or lower"""
        test_argument = "756"
        expected = 756
        actual = convert_to_int(test_argument)
        message = unicode("Expected: 2081, Actual: {0}".format(actual)) # Requires Python 2.7 or lowersert actual == expected, message
```

#### Test suite goes red on Python 3

pytest

```
platform linux -- Python 3.6.8, pytest-4.3.1, py-1.8.0, pluggy-0.9.0
self = <tests.data.test_preprocessing_helpers.TestConvertToInt object at 0x7f2c479a76a0>
  def test_with_no_comma(self):
    test_argument = "756"
    expected = 756
    actual = convert_to_int(test_argument)
    message = unicode("Expected: 2081, Actual: {0}".format(actual))
    NameError: name 'unicode' is not defined
data/test_preprocessing_helpers.py:12: NameError
```



#### skipif: skip tests conditionally

```
class TestConvertToInt(object):
    @pytest.mark.skipif
    def test_with_no_comma(self):
        """Only runs on Python 2.7 or lower"""
        test_argument = "756"
        expected = 756
        actual = convert_to_int(test_argument)
        message = unicode("Expected: 2081, Actual: {0}".format(actual))
        assert actual == expected, message
```

#### skipif: skip tests conditionally

```
class TestConvertToInt(object):
    @pytest.mark.skipif(boolean_expression)
    def test_with_no_comma(self):
        """Only runs on Python 2.7 or lower"""
        test_argument = "756"
        expected = 756
        actual = convert_to_int(test_argument)
        message = unicode("Expected: 2081, Actual: {0}".format(actual))
        assert actual == expected, message
```

• If boolean\_expression is True, then test is skipped.

#### skipif when Python version is higher than 2.7

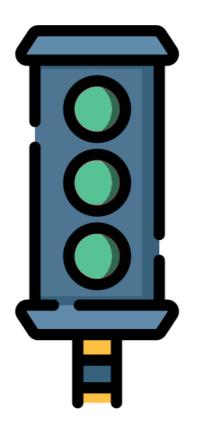
```
import sys
class TestConvertToInt(object):
   @pytest.mark.skipif(sys.version_info > (2, 7))
    def test_with_no_comma(self):
        """Only runs on Python 2.7 or lower"""
        test_argument = "756"
        expected = 756
        actual = convert_to_int(test_argument)
        message = unicode("Expected: 2081, Actual: {0}".format(actual))
        assert actual == expected, message
```

#### The reason argument

```
import sys
class TestConvertToInt(object):
   @pytest.mark.skipif(sys.version_info > (2, 7), reason="requires Python 2.7")
    def test_with_no_comma(self):
        """Only runs on Python 2.7 or lower"""
        test_argument = "756"
        expected = 756
        actual = convert_to_int(test_argument)
        message = unicode("Expected: 2081, Actual: {0}".format(actual))
        assert actual == expected, message
```

#### 1 skipped, 1 xfailed

pytest





# Showing reason in the test result report

pytest -r

# The -r option

pytest -r[set\_of\_characters]



#### Showing reason for skipping

pytest -rs

```
platform linux -- Python 3.6.8, pytest-4.3.1, py-1.8.0, pluggy-0.9.0
collected 17 items
data/test_preprocessing_helpers.py s......
                                             [ 76%]
                                             [ 82%]
features/test_as_numpy.py .
models/test_train.py ..x
                                             [100%]
SKIPPED [1] tests/data/test_preprocessing_helpers.py:8: Requires Python 2.7 or lower
```



## Optional reason argument to xfail

```
import pytest

class TestTrainModel(object):
    @pytest.mark.xfail
    def test_on_linear_data(self):
    ...
```

## Optional reason argument to xfail

```
import pytest

class TestTrainModel(object):
    @pytest.mark.xfail(reason=""Using TDD, train_model() is not implemented")
    def test_on_linear_data(self):
    ...
```

## Showing reason for xfail

pytest -rx

```
platform linux -- Python 3.6.8, pytest-4.3.1, py-1.8.0, pluggy-0.9.0
collected 17 items
data/test_preprocessing_helpers.py s......
                                              [ 76%]
features/test_as_numpy.py .
                                              [ 82%]
models/test_train.py ..x
                                              [100%]
XFAIL models/test_train.py::TestTrainModel::test_on_linear_data
 Using TDD, train_model() is not implemented
```



## Showing reason for both skipped and xfail

pytest -rsx

```
platform linux -- Python 3.6.8, pytest-4.3.1, py-1.8.0, pluggy-0.9.0
rootdir: /home/dibya/startup-code/datacamp/univariate_linear_regression, inifile:
collected 17 items
data/test_preprocessing_helpers.py s.......
                                                       [ 76%]
features/test_as_numpy.py .
                                                       [ 82%]
models/test_train.py ..x
                                                       [100%]
SKIPPED [1] tests/data/test_preprocessing_helpers.py:8: Requires Python 2.7 or lower
XFAIL models/test_train.py::TestTrainModel::test_on_linear_data
 Using TDD, train_model() is not implemented
```



## Skipping/xfailing entire test classes

# Let's practice xfailing and skipping!

UNIT TESTING FOR DATA SCIENCE IN PYTHON



# Continuous integration and code coverage

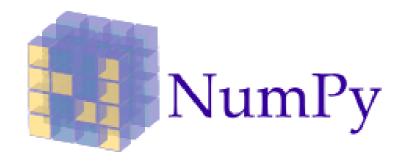
UNIT TESTING FOR DATA SCIENCE IN PYTHON

Dibya Chakravorty
Test Automation Engineer





## Code coverage and build status badges



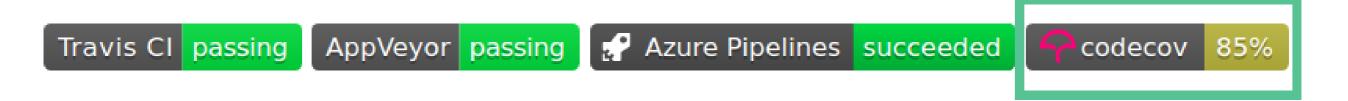


NumPy is the fundamental package needed for scientific computing with Python.

- Website (including documentation): https://www.numpy.org
- Mailing list: https://mail.python.org/mailman/listinfo/numpy-discussion

## Code coverage and build status badges

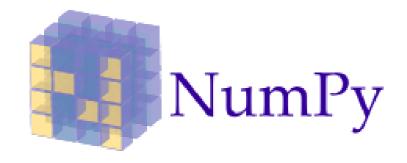




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## Code coverage and build status badges





NumPy is the fundamental package needed for scientific computing with Python.

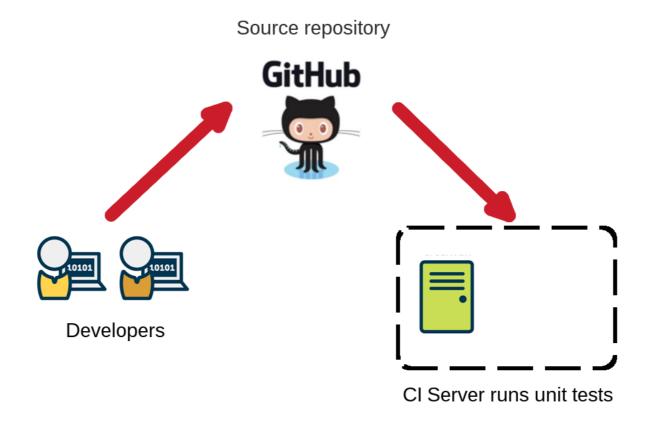
- Website (including documentation): https://www.numpy.org
- Mailing list: https://mail.python.org/mailman/listinfo/numpy-discussion

## The build status badge

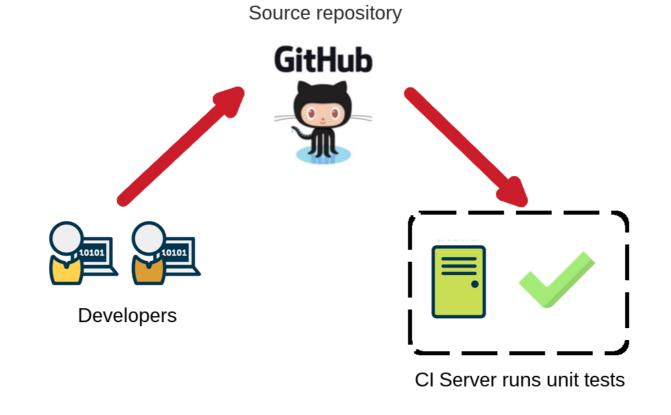
build passing



## The build status badge

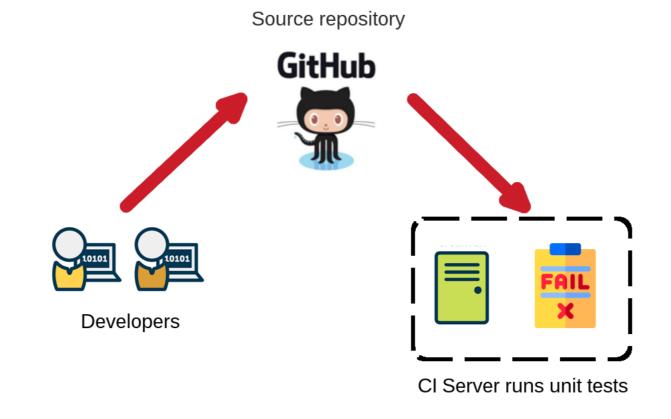


## **Build passing = Stable project**





## **Build failing = Unstable project**





#### **CI** server



## Step 1: Create a configuration file

```
repository root
|-- src
|-- tests
|--.travis.yml
```

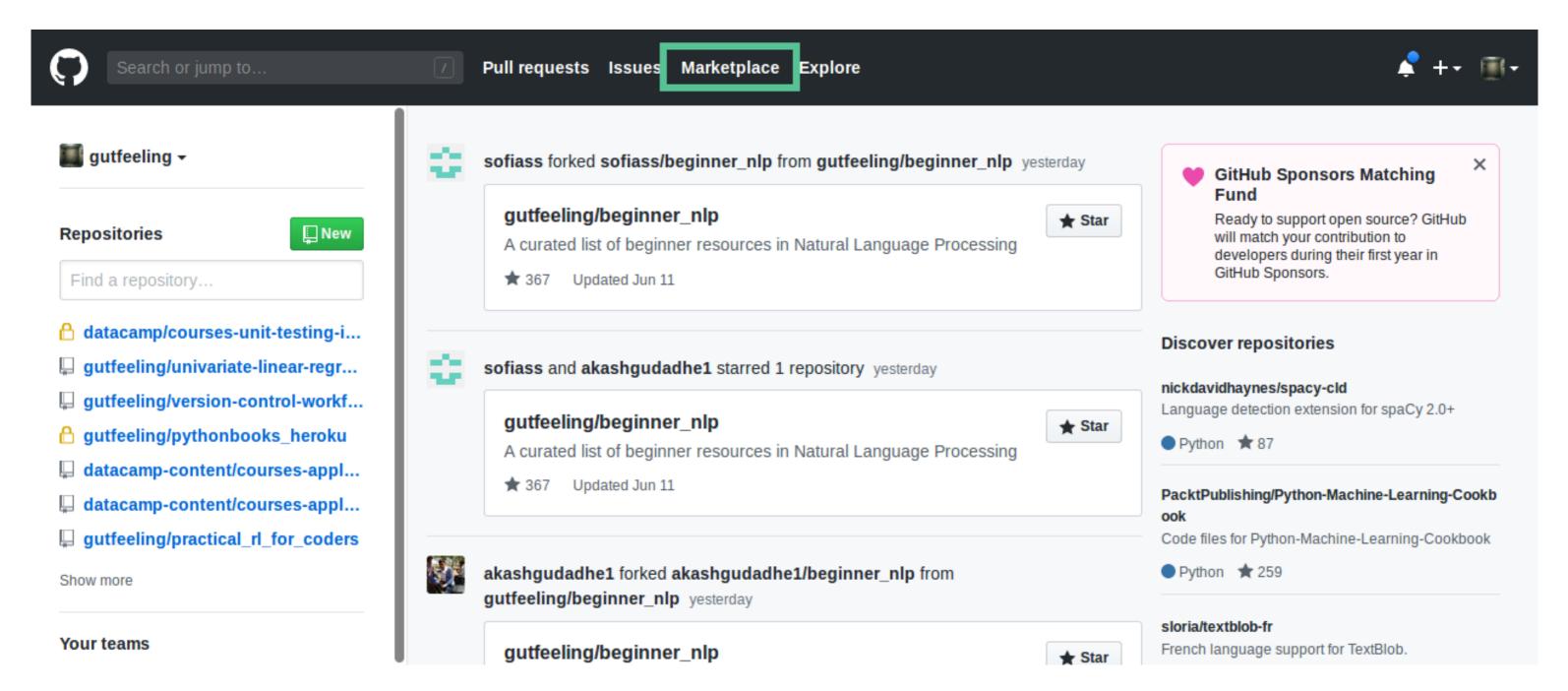
## Step 1: Create a configuration file

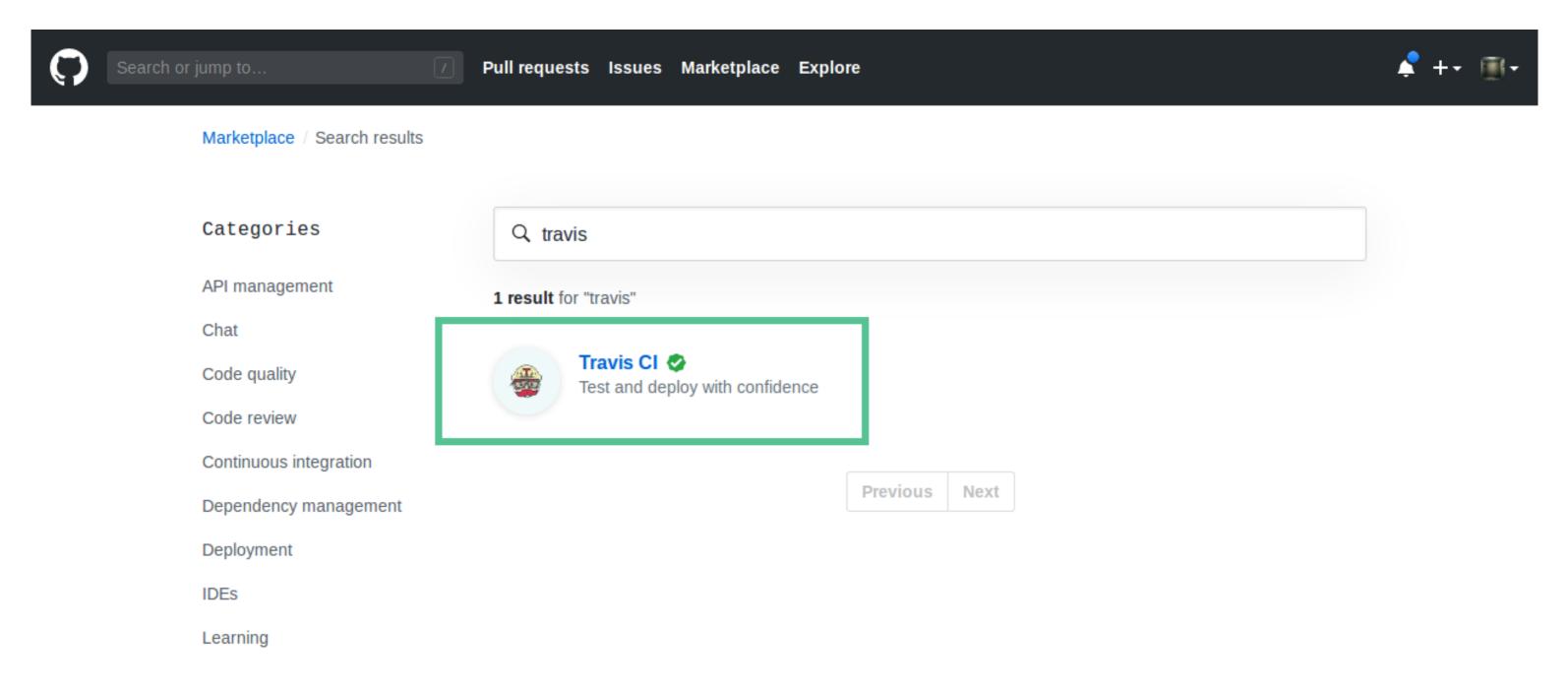
Contents of .travis.yml .

```
language: python
python:
    - "3.6"
install:
    - pip install -e .
script:
    - pytest tests
```

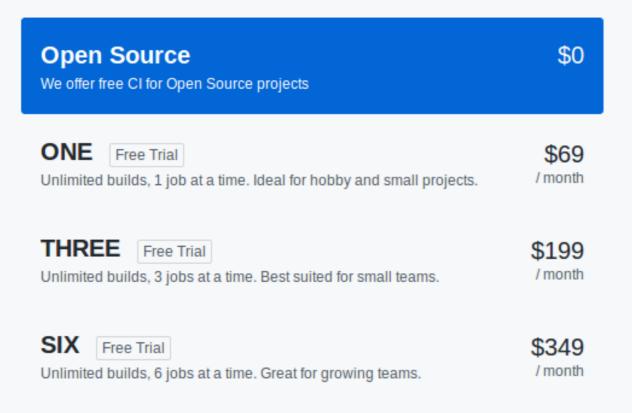
## Step 2: Push the file to GitHub

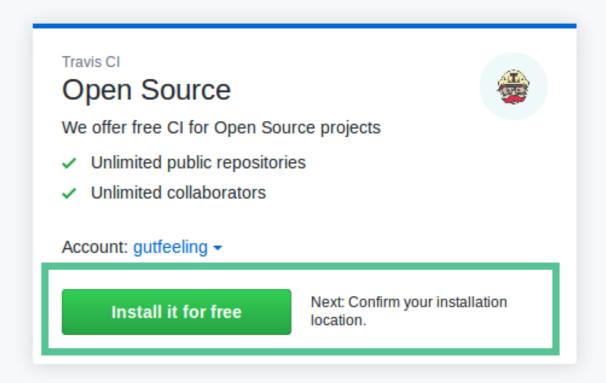
```
git add .travis.yml
git push origin master
```



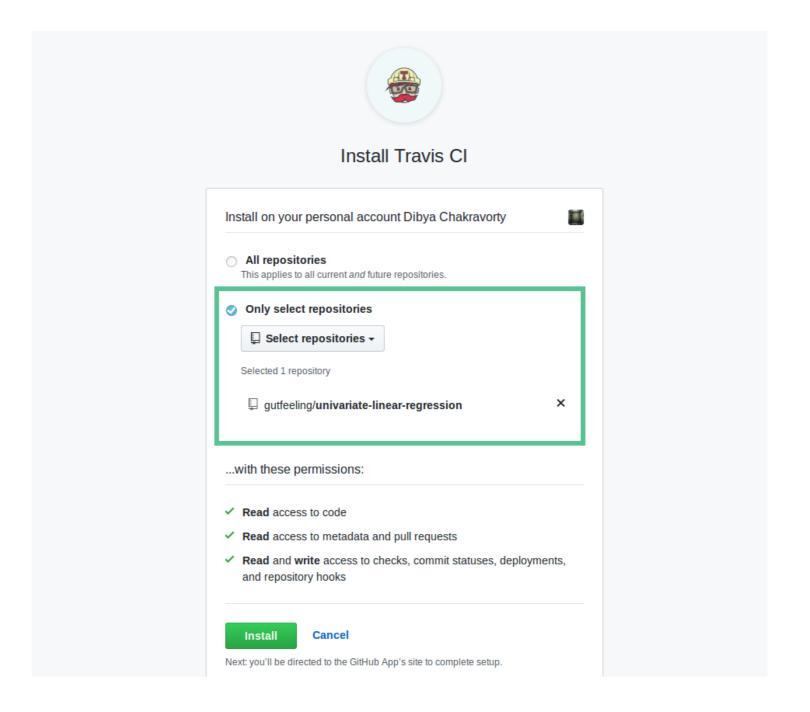


#### **Pricing and setup**

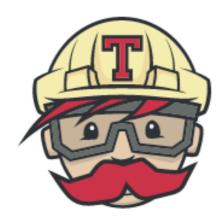




Travis CI is provided by a third-party and is governed by separate terms of service, privacy policy, and support contact.



Travis Cl About Us Plans & Pricing Enterprise Help

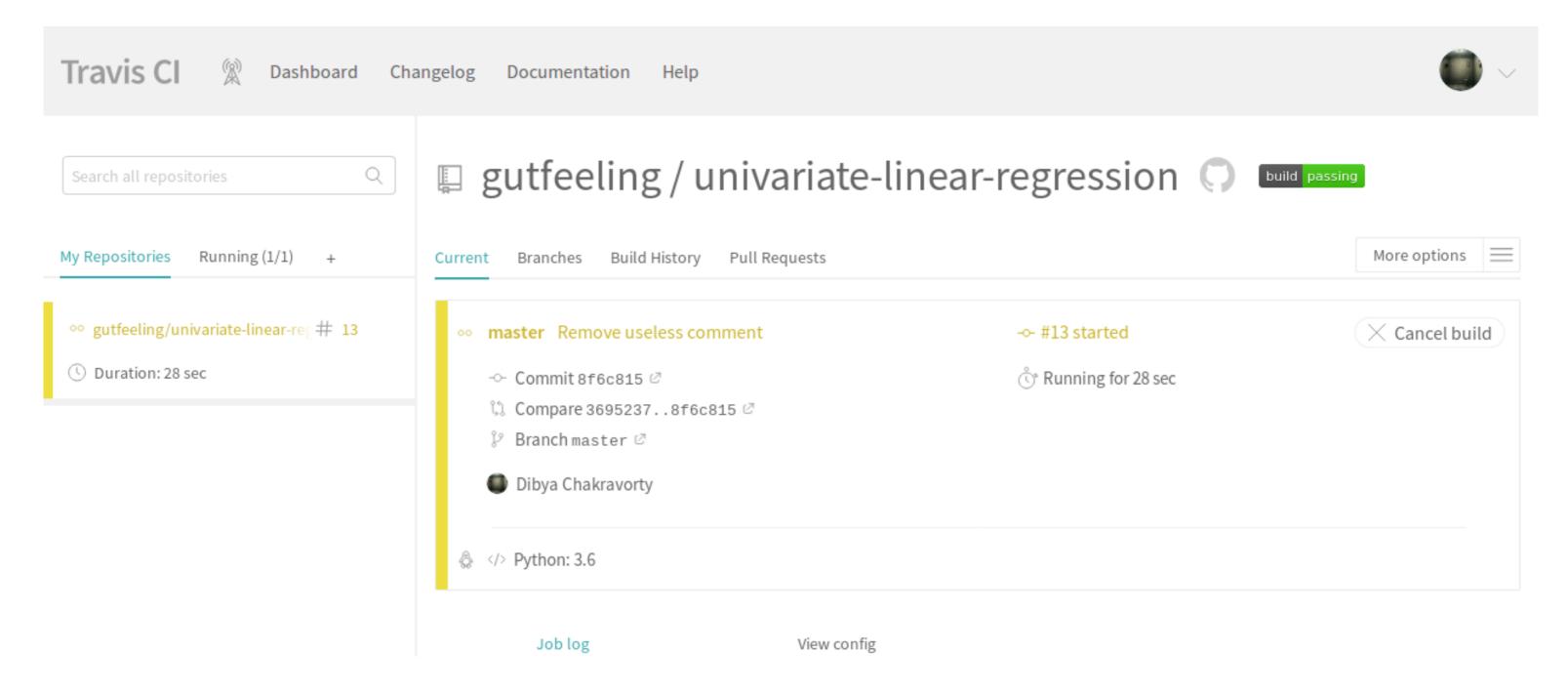


#### We're so glad you're here!

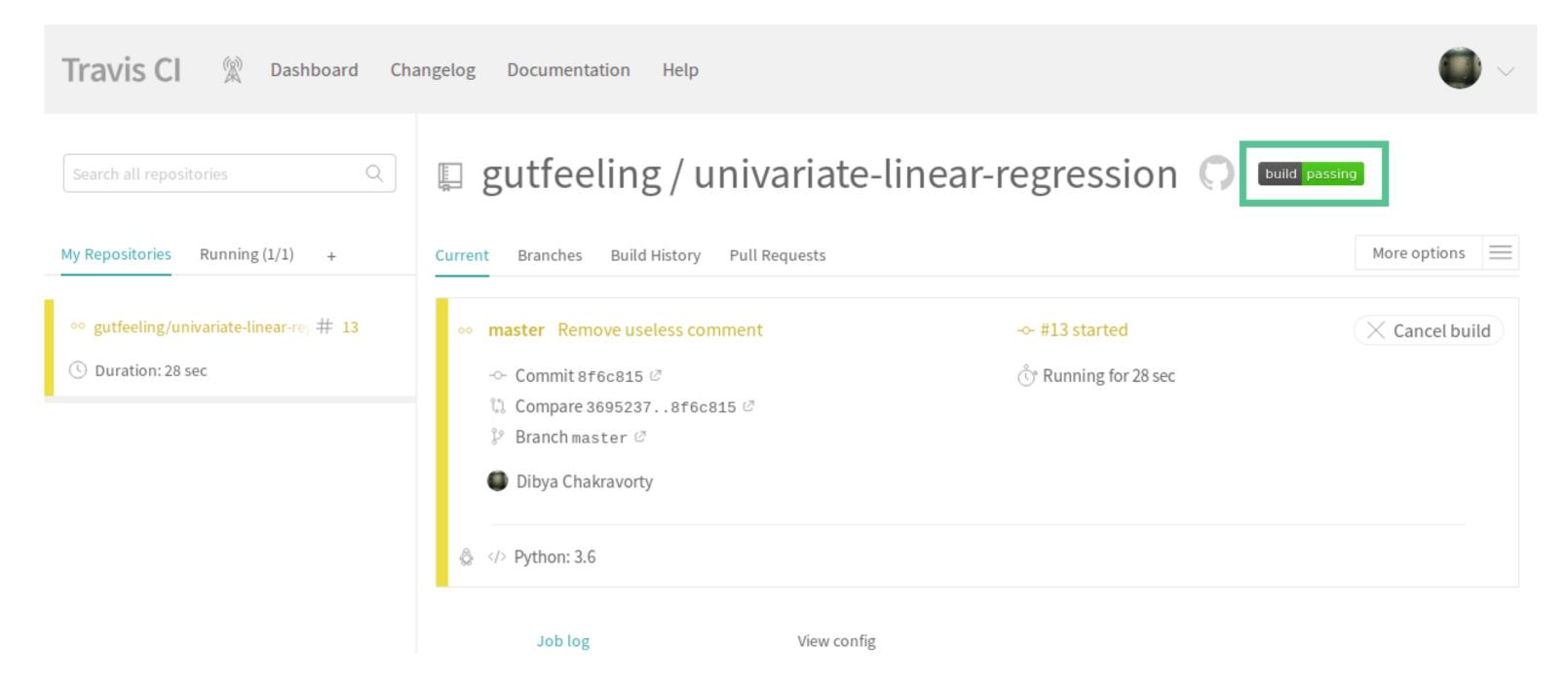
Please sign in to view your repositories.

Sign in with GitHub

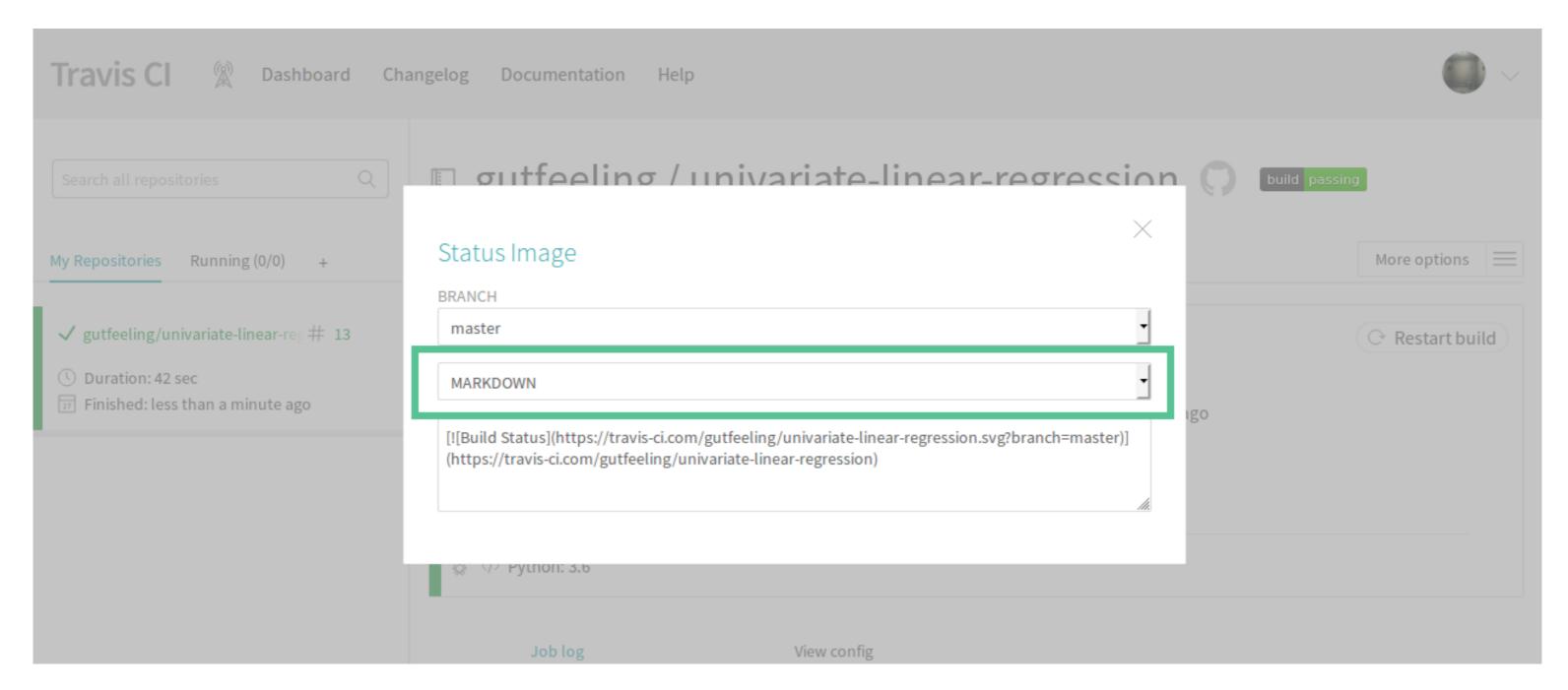
## Every commit leads to a build



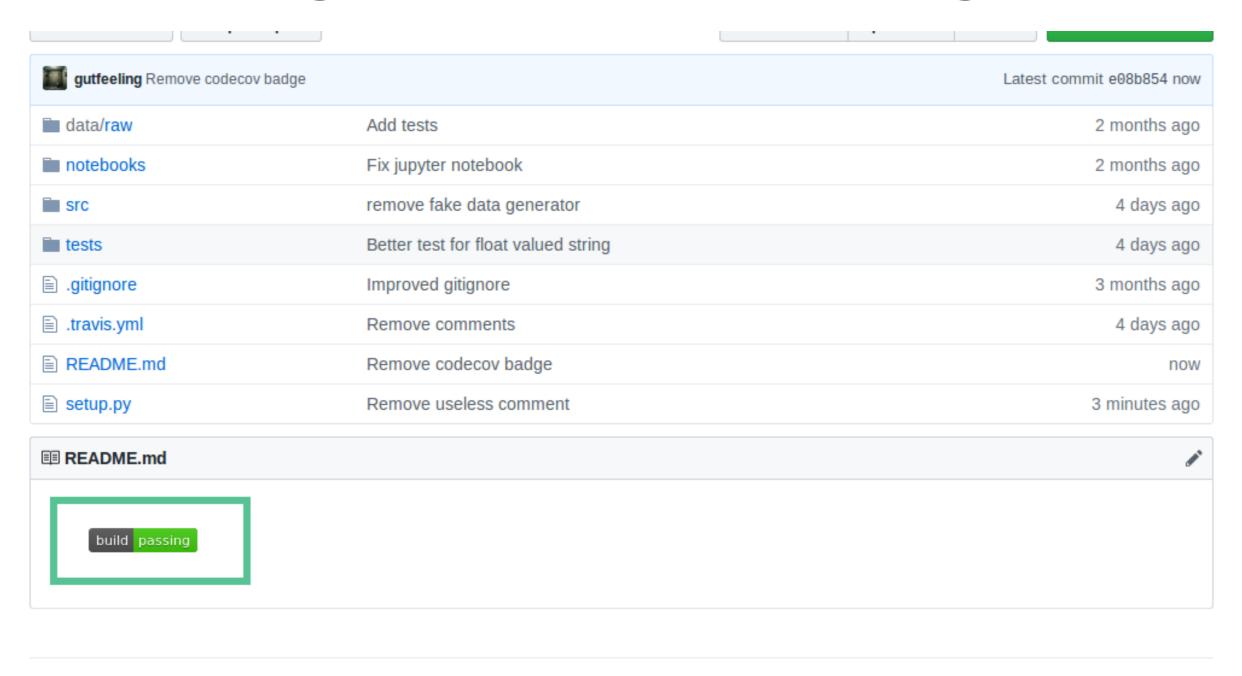
## Step 4: Showing the build status badge



## Step 4: Showing the build status badge



## Step 4: Showing the build status badge



## Code coverage



- $code\ coverage = rac{num\ lines\ of\ application\ code\ that\ ran\ during\ testing}{total\ num\ lines\ of\ application\ code} imes 100$
- Higher percentages (75% and above) indicate well tested code.

### Codecov



```
language: python
python:
    - "3.6"
install:
    - pip install -e .

script:
    - pytest tests
```

```
language: python
python:
    - "3.6"
install:
    - pip install -e .
    - pip install pytest-cov codecov  # Install packages for code coverage report
script:
    - pytest tests
```

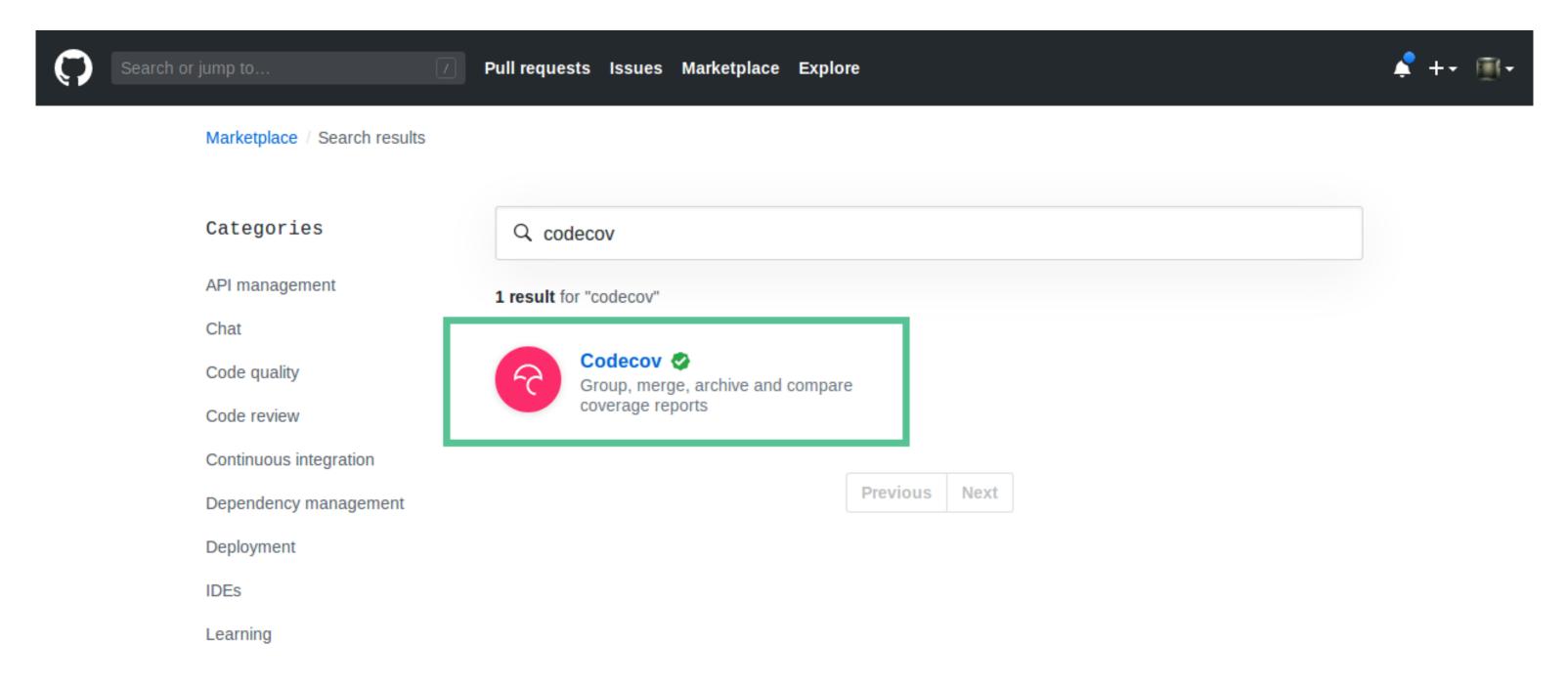
```
language: python
python:
    - "3.6"
install:
    - pip install -e .
    - pip install pytest-cov codecov  # Install packages for code coverage report
script:
    - pytest --cov=src tests  # Point to the source directory
```

```
language: python
python:
  - "3.6"
install:
  - pip install -e .

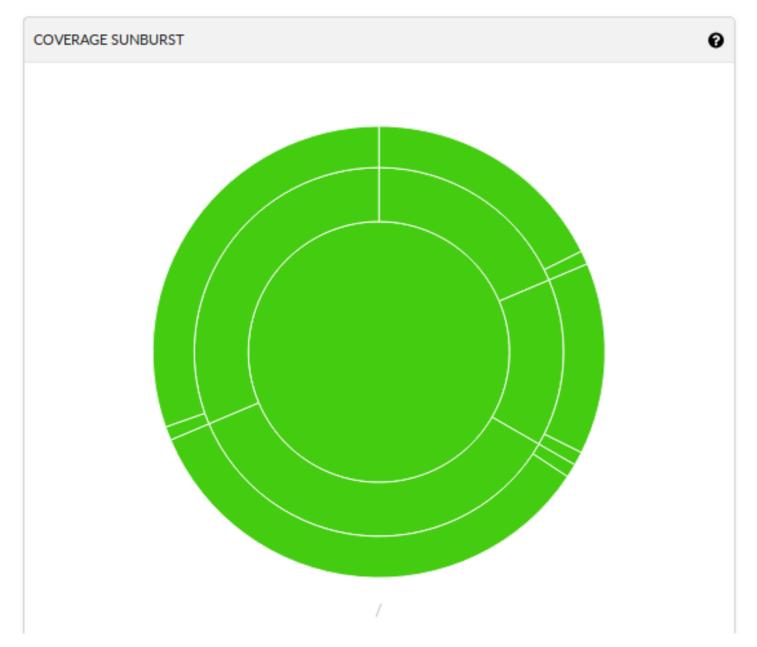
    pip install pytest-cov codecov # Install packages for code coverage report

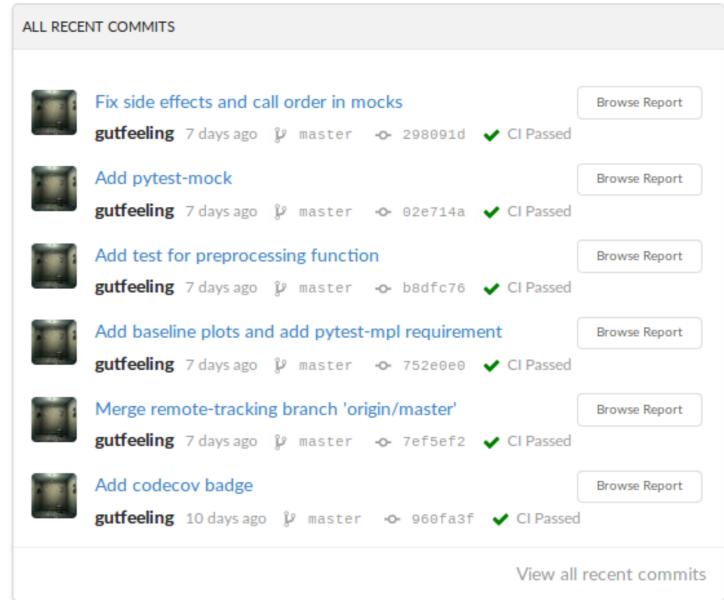
script:
                                       # Point to the source directory
  - pytest --cov=src tests
after_success:
                                       # uploads report to codecov.io
  - codecov
```

## Step 2: Install Codecov

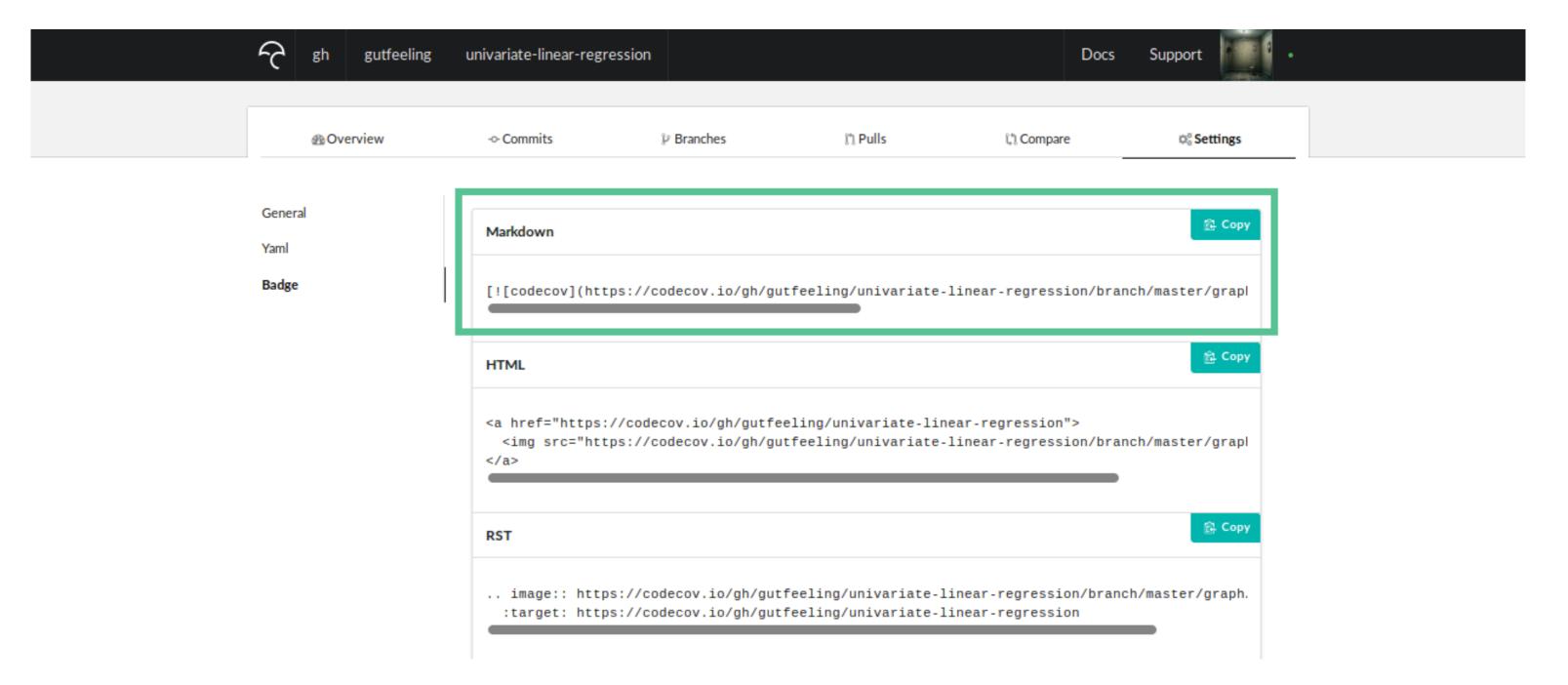


## Commits lead to coverage report at codecov.io

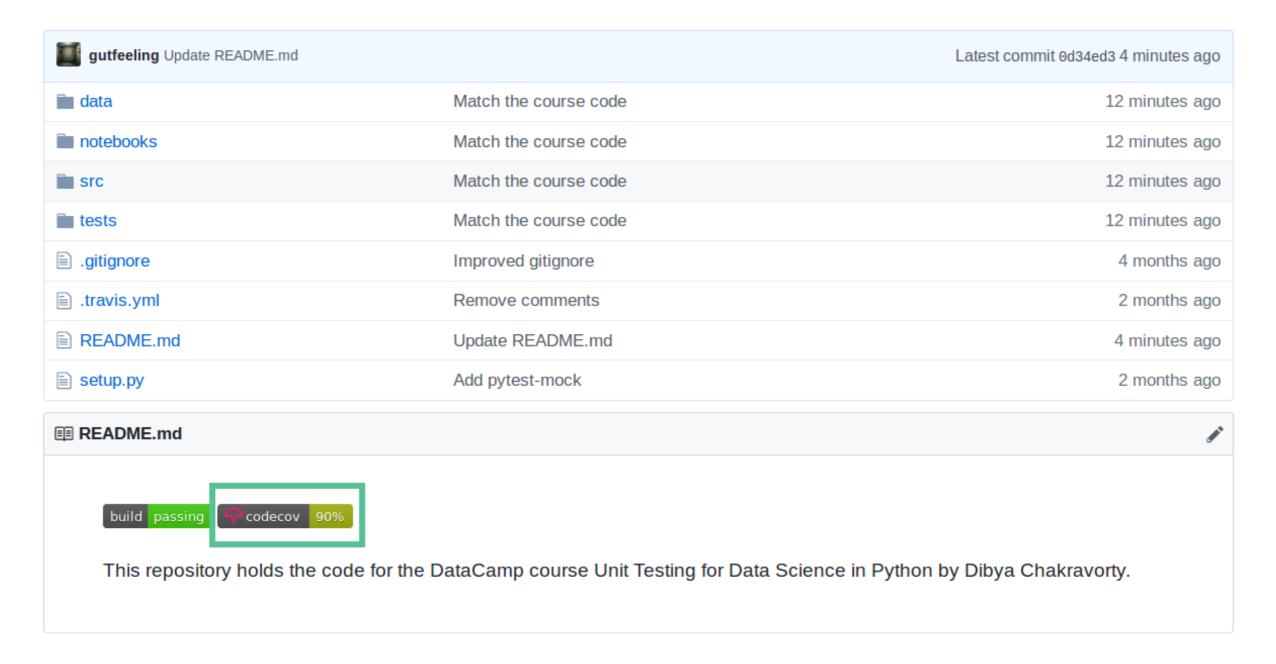




## Step 3: Showing the badge in GitHub



## Step 3: Showing the badge in GitHub



## Let's practice Cl and code coverage!

UNIT TESTING FOR DATA SCIENCE IN PYTHON

