6th Workshop on Collaborative Scientific Software Development and Management of Open Source Scientific Packages



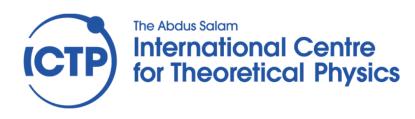
# Introduction to code testing

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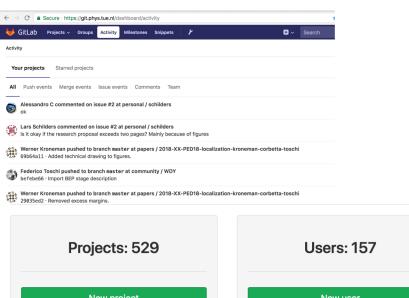


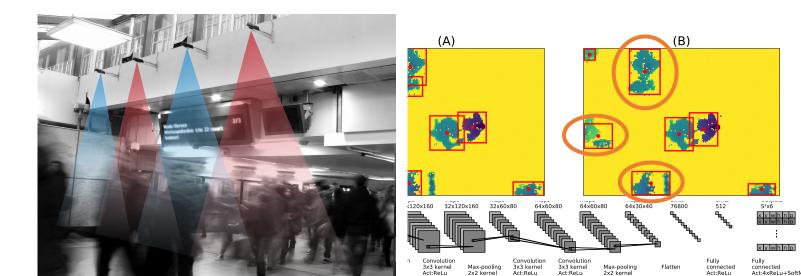


## Alessandro Corbetta

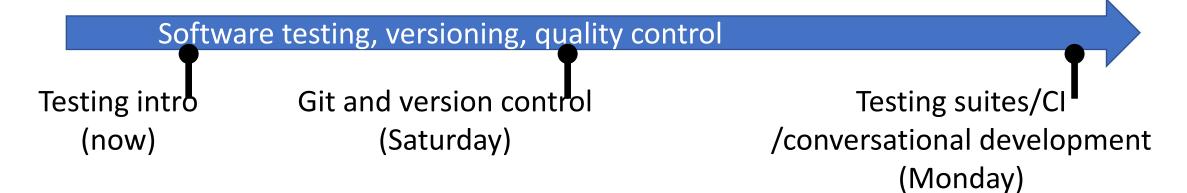
• Post-doc researcher in Applied Physics (TU Eindhoven)

- Study human crowds dynamics as fluid mechanics
- Deep learning for computer vision & physics
- PhD in Applied Mathematics, PhD in Structural Engineering
- Admin of a Git(Lab) server since 2014 Supported/Designed most of project testing/CI



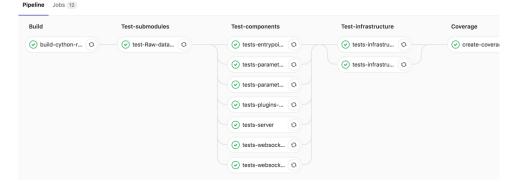


# My Lectures



#### This afternoon:

Floating point arithmetic (exercises will connect with testing)



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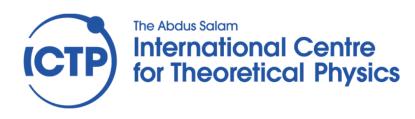
# Introduction to code testing

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## Testing: main question

1. Does my code **work**?

(...broad question...)

## Testing: main question

- 1. Does my code **work**?
  - (...broad question...)

- Does my code have the expected features and functionalities?
   [e.g. "client" request; in science: "do I match the analytic solution?"]
- 3. Does my code **still work**?

[e.g. after a modification of myself, collaborators,...]

..as in..

# This lecture

- Testing: introduction to the concept
  - Contemporary testing as in the scientific method
  - Scales of testing
  - Contemporary vs. traditional testing
  - Unit testing heuristics/best practices
- Testing in python
  - Naïve approach
  - nosetests
  - More advanced nose (fixture options, coverage reports)

## Contemporary testing anatomy: Key idea

We **ASSERT** that our software satisfies a given requirement The test is **passed** if the assertion is satisfied; it **fails** otherwise

The validity of our assertions is checked through programs and scripts.

In general:

**1 Test** = piece of software that checks **1** ASSERT

# Scientific method analogy

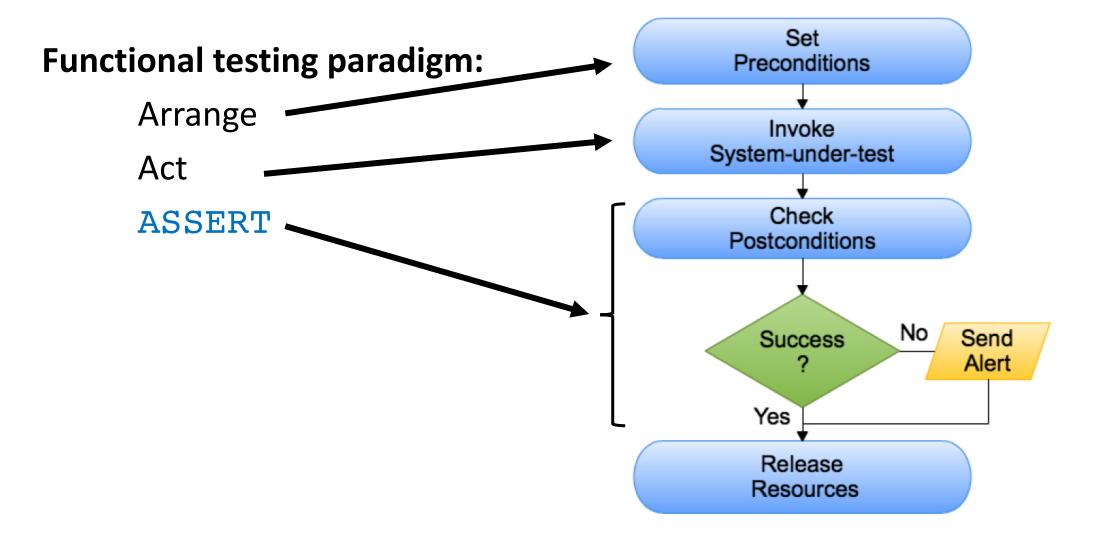
#### Scientific method:

We run experiments to invalidate (or "prove/hinting correctness of") an hypothesis. A test is like an experiment

#### **Functional testing paradigm:**

Arrange  $\rightarrow$  preparation of e.g. script that checks for feature Act  $\rightarrow$  run the test ASSERT  $\rightarrow$  if fails an issue is found

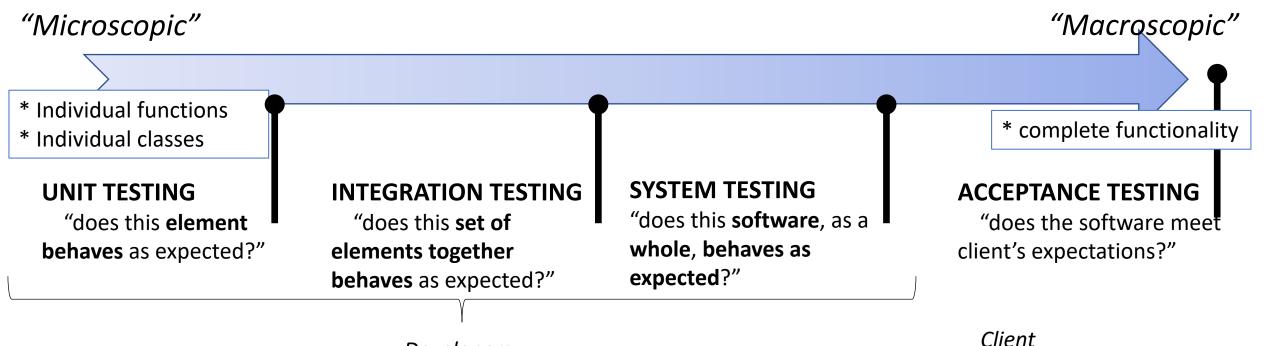
## Scientific method analogy



# Scales of testing

Good modern software comes as a collection of <u>weakly</u> coupled modules operated together to deliver a result.

#### Testing follows these scales



Developers

## In other words

- Unit test: if fails -> a piece of your code needs to be fixed.
- Integration test: if fails -> pieces of your application are not working together as expected.
- System test: if fails -> it tells that the application is not working as expected
- Acceptance test: if fails -> the application is not doing what the customer expects it to do.

 Regression test: when it fails, it tells you that the application no longer behaves the way it used to.

> Mathias 10.3k • 6 • 41 • 88

# "Contemporary" vs. "traditional" testing

# lssues emerge with **usage** or In **production**

### • Traditional approach & pitfalls

- System tested as a whole
- High complexity (how do I build a proper test?)
- Hard to test individual components
- Hard to find sources of errors
- Testing done through print statements/debuggers/script

### Contemporary/Unit testing

- Lower complexity
- Compliance to past requirements easily checked by module
- To the limit: Test Driven Development (TDD Exercise this afternoon )
  - As a requirement is identified, tests are written before the implementation

# Black Box vs. White box testing

### **Black box**



- Tests functionality **without** knowledge of internal structure
- Cost effective: High -> can be authored by non-developers (no biases though!)
- Efficacy: low -> relies on tester's luck about triggering all internals

# White box



- Test with knowledge of internals
- Cost effective: Low -> Must be written by developers
- Efficacy: high -> all internals can be triggered

# White box testing "quality" metrics: coverage

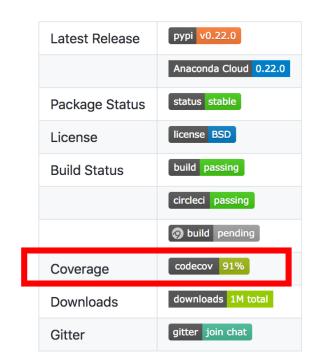
 If parts of our code are not tested (i.e. not covered by a test) bugs have higher chance to reach production
 pandas: powerful Python

#### • Line coverage

• Percentage of lines that are covered by at least one test (an if condition might be unsatisfied in all tests, thus the if-true branch remains always untested).

#### Branch coverage

 100% line coverage might still leave many branches (that grow combinatorically) unexplored.
 Branch coverage counts how many of all branches are "seen" by at least one test.



# Unit testing heuristics 1

1. Create test when object design is complete In TDD write test when interface is defined

#### 2. Design components that are testable

Make life of a tester easy: e.g. allow swappable mocks

- 3. Testing time slows down development make quick tests (at run time) make tests that are no-brainer to run
- 4. Develop tests using effective number of testing cases

Heads up: generally combinatorial explosion of inputs, cannot be matched by as many **ASSERT** 

Selecting relevant & (all) edge cases -> more practice than theory

# Unit testing heuristics 2

- If possible compare e.g. with analytic solution or even slower-butworking versions of the same algorithms (Model-based testing)
- 6. In computing: knowing about internal computing mechanisms to make relevant tests
  - **1.** respect computer arithmetic
  - 2. Avoid non-determinism/fix seed in testing
- 7. REM: a failed test means a bug is introduced, not the other way around!
- 8. Best practice: Every new bug -> new test

against future regressions (e.g. from rollbacks)

## Unit testing in Python: naïve way

```
$ python tests.py
```

```
import my_package
```

```
def test_1():
    <preparation>
    assert condition_f_1
```

```
def test_2():
    <preparation>
    assert condition_f_2
```

```
if __name__ == '__main__':
    test_1()
    test_2()
```

## Unit testing in Python: naïve way

**Issues**:

. . .

\$ python tests.py

```
import my_package
```

```
def test_1():
    <preparation>
    assert condition_f_1
```

```
def test_2():
    <preparation>
    assert condition_f_2
```

Not immediate *cannot be run without thought* Not scalable e.g. need to add calls under the if shield Output does not come as a simple report Running individual tests requires work

```
if __name__ == '__main__':
    test_1()
    test_2()
```

Common issues! Common solution: using testing frameworks..

# Unit testing in Python

- Python comes with packages helping unit testing
  - Note: Unit testing libraries exist for *any* programming language.
  - Same concepts as here apply (compiler might be needed)

• E.g. Nosetest, PyTest, doctest

## Nosetest

• nose runs tests in files/directories under the cwd

( (?:\b/\_)[Tt]est )

- whose names include "test" or "Test" at a word boundary
  - (like "test\_this" or "functional\_test" or "TestClass" but not "libtest").
- Test output includes captured stdout output from failing tests, for easy debugging.
- Returns a report of pass/failures with different possible levels of verbosity
- Can return coverage report

## Nosetest - installation

- via pip or easy\_install
  - \$ easy\_install nose
  - \$ pip install nose

#### Test successful installation:

[acorbe@Alessandros-MacBook-Pro ~ \$ pwd
/Users/acorbe
[acorbe@Alessandros-MacBook-Pro ~ \$ nosetests

Call nosetests in an empty folder. The program terminates successfully with no test run.

Ran 0 tests in 0.004s

```
OK
acorbe@Alessandros-MacBook-Pro ~ $
```

Testing my\_sum.py (basics)

```
from __future__ import print_function
import sys
```

```
def sum_foo(a,b):
    return a + b
```

```
def converter(x):
    return float(x)
```

```
def main():
    a = converter(sys.argv[1])
    b = converter(sys.argv[2])
    ret = sum_foo(a,b)
    print(ret)
    return ret
```

```
I — acorbe-gpu@crowdflow2: ~/workspace/ML-for-turbulence/1D/goy_working/GOY-n
[acorbe@Alessandros-MacBook-Pro 1 [master] $ python my_sum.py 3 4
7.0
acorbe@Alessandros-MacBook-Pro 1 [master] $
```

```
if __name__ == '__main__':
    main()
```

• Testing my sum.py from \_\_future\_\_ import print\_function import sys def sum\_foo(a,b): return a + b def converter(x): return float(x) def main(): a = converter(sys.argv[1]) b = converter(sys.argv[2])  $ret = sum_foo(a,b)$ print(ret) return ret

if \_\_name\_\_ == '\_\_main\_\_':

main()

```
(basics)
```

Testing my\_sum.py

from \_\_future\_\_ import print\_function import sys def sum foo(a,b): return a + b def converter(x): return float(x) def main(): a = converter(sys.argv[1]) b = converter(sys.argv[2])  $ret = sum_foo(a,b)$ print(ret) return ret \_\_\_name\_\_ == '\_\_main ': main()

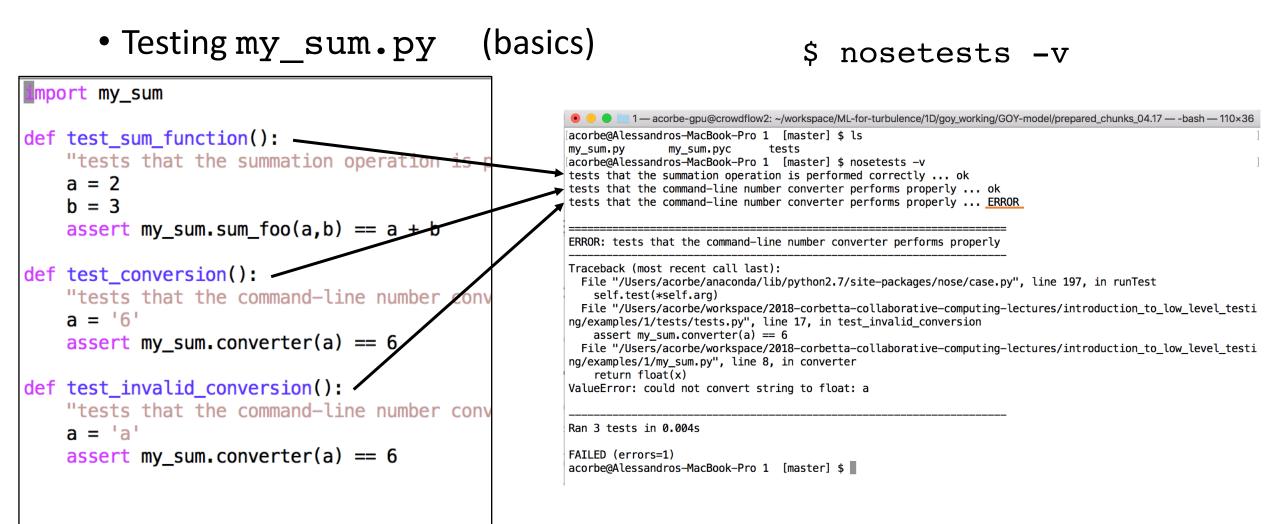
```
(basics)
```

#### tests/test.py

```
mport my_sum
def test_sum_function():
   "tests that the summation operation is performed correctly"
    a = 2
    b = 3
    assert my_sum.sum_foo(a,b) == a + b
def test conversion():
   "tests that the command-line number converter performs properly"
   a = '6'
   assert my_sum.converter(a) == 6
def test_invalid_conversion():
   "tests that the command-line number converter performs properly"
    a = 'a'
   assert my_sum.converter(a) == 6
```

• Testing my sum.py from \_\_future\_\_ import print\_function import sys def sum foo(a,b): return a + b def converter(x): return float(x) def main(): a = converter(sys.argv[1]) b = converter(sys.argv[2])  $ret = sum_foo(a,b)$ print(ret) return ret \_\_\_name\_\_ == '\_\_\_main\_\_': main()

```
(basics)
                            tests/test.py
   mport my_sum
  def test_sum_function():
      "tests that the summation operation is performed correctly"
      a = 2
                 IMPOSSIBLE TEST (just to see a failure)
      b = 3
      assert my s
  def test_conversion():
      "tests that the command-line number converter performs properly"
      a = '6'
      assert my sum converter(a) == 6
  def test_invalid_conversion():
      "tests that the command-line number converter performs properly"
      a = 'a'
      assert my_sum.converter(a) == 6
```



- Previous tests: unit tests
- One scale up: integration (here also system test)
- We fake command line parameters, we expect the sum
  - Issue: we need to hijack sys.argv parameters
  - Fixture: we temporarily change the sys.argv state.
- Fixture (in general)
  - pre-test setup + post-test teardown
  - Turn module, class, package to favorable fake state

• Fixture example: naïve implementation.

```
def test():
     setup_test()
     try:
           do test()
           make test assertions()
     finally:
           cleanup after test()
```

A lot of tests with similar structure

Common issue -> nose helps

System-level testing

```
from __future__ import print_function
import sys
def sum foo(a,b):
    return a + b
def converter(x):
    return float(x)
def main():
    a = converter(sys.argv[1])
    b = converter(sys.argv[2])
    ret = sum_foo(a,b)
    print(ret)
    return ret
   ____name___ == '___main ':
    main()
```

```
from nose.tools import with_setup
import sys
import my_sum
```

```
argv_copy = []
def setup_function():
    argv_copy[:] = [x for x in sys.argv]
```

```
def teardown_function():
    sys.argv[:] = [x for x in argv_copy]
```

```
@with_setup(setup_function, teardown_function)
def test_input():
    sys.argv = ["my_sum", "7", "14"]
    assert abs(my_sum.main() - 21) < (5 * sys.float_info.epsilon)</pre>
```

my\_sum.py
my\_sum.pyc
tests

1 directory, 8 files

\_\_init\_\_.py \_\_init\_\_.pyc tests.py tests.pyc

tests aggregate.py
tests\_aggregate.pyc

• System-level testing

```
from __future__ import print_function
import sys
def sum foo(a,b):
    return a + b
def converter(x):
    return float(x)
def main():
    a = converter(sys.argv[1])
    b = converter(sys.argv[2])
    ret = sum_foo(a,b)
    print(ret)
    return ret
   __name__ == '__main ':
    main()
```

#### \$ nosetests -v

Runs ALL tests

• • • • 2 — acorbe-gpu@crowdflow2: ~/workspace/ML-for-turbulence/1D/goy\_working/GO` [acorbe@Alessandros-MacBook-Pro 2 [master] \$ nosetests -v tests that the summation operation is performed correctly ... ok tests that the command-line number converter performs properly ... ok system level: hijacks argv and checks correct output ... ok

Ran 3 tests in 0.005s

OK acorbe@Alessandros-MacBook-Pro 2 [master] \$

Runs easily SPECIFIC tests \$ nosetests -v tests.tests\_aggregate

🚽 👅 🔤 z — acorbe-gpu@crowunowz. ~/workspace/wit-ror-turbulence/rb/goy\_working/GOT-model/prep

[acorbe@Alessandros-MacBook-Pro 2 [master] \$ nosetests tests.tests\_aggregate -v
system level: hijacks argv and checks correct output ... ok

Ran 1 test in 0.001s

OK acorbe@Alessandros-MacBook-Pro 2 [master] \$

# NOTE: in general no strict equality checks on float ops

• System-level testing

```
from __future__ import print_function
import sys
def sum foo(a,b):
    return a + b
def converter(x):
    return float(x)
def main():
    a = converter(sys.argv[1])
    b = converter(sys.argv[2])
    ret = sum_foo(a,b)
    print(ret)
    return ret
if __name__ == '__main__':
    main()
```

```
from nose.tools import with_setup
import sys
import my_sum
```

```
argv_copy = []
def setup_function():
    argv_copy[:] = [x for x in sys.argv]
```

```
def teardown_function():
    sys.argv[:] = [x for x in argv_copy]
```

```
@with_setup(setup_function, teardown_function)
def test_input():
    sys.argv = ["my_sum", "7", "14"]
    assert abs(my_sum.main() - 21) < (5 * sys.float_info.epsilon)</pre>
```

Topic of this afternoon lecture

# Nosetest – (more) advanced usage (selected topics)

- nose supports fixtures (setup and teardown methods) at the package, module, class, and test level.
  - Module: setup\_module() and teardown\_module() are called as the package is imported
  - Package: \_\_init\_\_.py should contain setup\_package() , teardown\_package(). After setup the test in the first module start
  - test Class
    - Inherits from <u>unittest.TestCase</u> or name matching regex
    - Methods in the class that match testMatch are discovered
    - a test case is constructed to **run each method with a fresh instance** of the test class.



acorbe-gpu@crowdTIOW2: ~/WOrKSpace/ML-TOR-TUrbulence/TD/goy\_WorKINg/GOY-model/pr [acorbe@Alessandros-MacBook-Pro 2 [master] \$ nosetests -v --with-coverage -v nose.config: INF0: Ignoring files matching ['^\\.', '^\_', '^setup\\.py\$'] tests that the summation operation is performed correctly ... ok tests that the command-line number converter performs properly ... ok system level: hijacks argv and checks correct output ... ok

Name	Stmts	Miss	Cover
my_sum.py	14	1	93%
Ran 3 tests	s in 0.00	06s	

OK acorbe@Alessandros-MacBook-Pro 2 [master] \$ Just 93% What happened???

1 line is missing. Which one?

# Nosetest - hotline coverage report --with-coverage --cover-html

🖲 😑 📄 🚬 2 — acorbe-gpu@crowdflow2: ~/workspace/ML-for-turbulence/1D/goy\_working/GOY-model/prepared\_chur

[acorbe@Alessandros-MacBook-Pro 2 [master] \$ nosetests -v --with-coverage --cover-html tests that the summation operation is performed correctly ... ok tests that the command-line number converter performs properly ... ok system level: hijacks argv and checks correct output ... ok

Name	Stmts	Miss	Cover
my_sum.py	14	1	93%

Ran 3 tests in 0.008s

OK acorbe@Alessandros-MacBook-Pro 2 [master] \$

The folder "cover" with html description is generated

## Nosetest – coverage report

→ C i file:///Users/acorbe/workspace/2018-corbetta-collaborative-computing-le

#### Coverage report: 93%

Module 4	statements	missing	excluded	coverage
my_sum.py	14	1	0	93%
Total	14	1	0	93%

coverage.py v4.5.1, created at 2018-04-26 17:50

← → C (i) file:///Users/acorbe/workspace/2018-corbetta-collaborative-compu

# Coverage for my\_sum.py : 93%14 statements13 run1 missing0 excluded

```
1 from __future__ import print_function
   import sys
 2
 3
   def sum_foo(a,b):
 4
        return a + b
 5
 6
   def converter(x):
 7
        return float(x)
 8
 9
   def main():
10
       a = converter(sys.argv[1])
11
       b = converter(sys.argv[2])
12
       ret = sum_foo(a,b)
13
       print(ret)
14
        return ret
15
16
17
  if __name__ == '__main__':
18
       main()
19
```