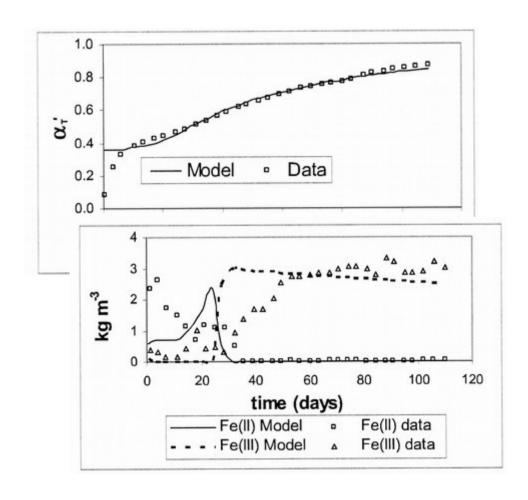
# Python tools to help you manage your simulations

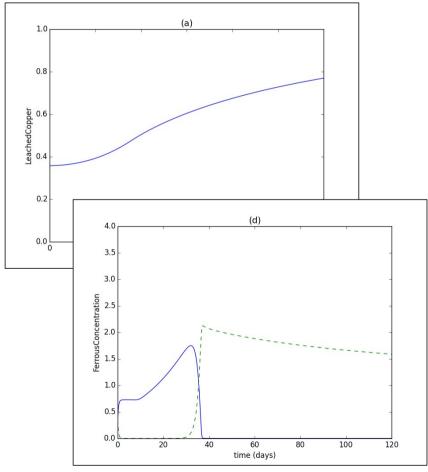
#### **Outline**

- Motivation
- Existing solutions
- Development
  - Main iterations
  - Dictionary features
- The Jinja2 Template Engine
- Example Application
- Conclusion

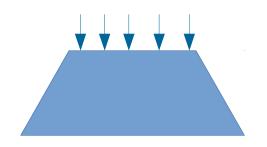
### Motivation

• Example 1: a "quick" simulation

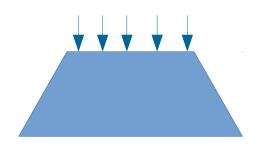




bioleach2d-2-slow.diml
 -fast.diml

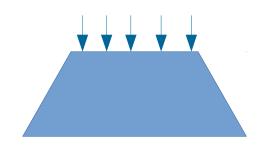


bioleach2d - 2 - slow.diml
-fast.diml



#### <del>bioleach2d-2-slow.diml</del>

-fast.diml

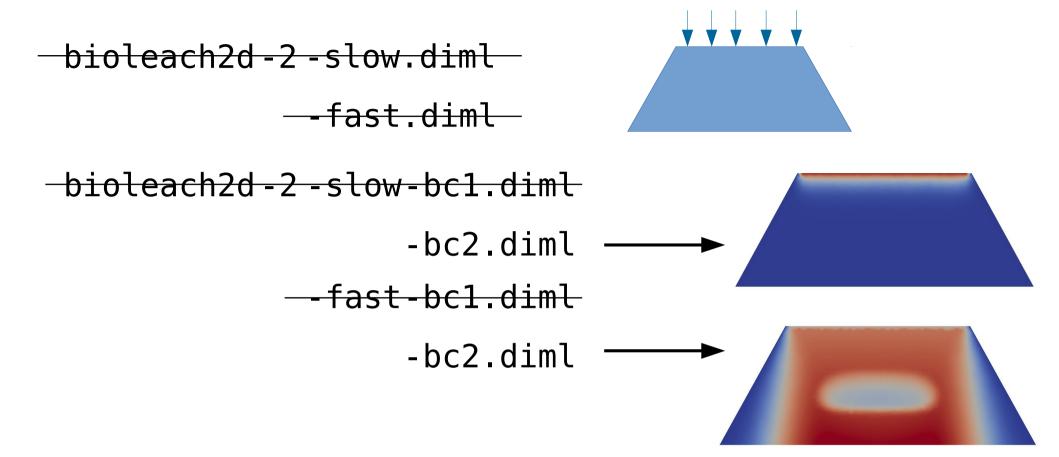


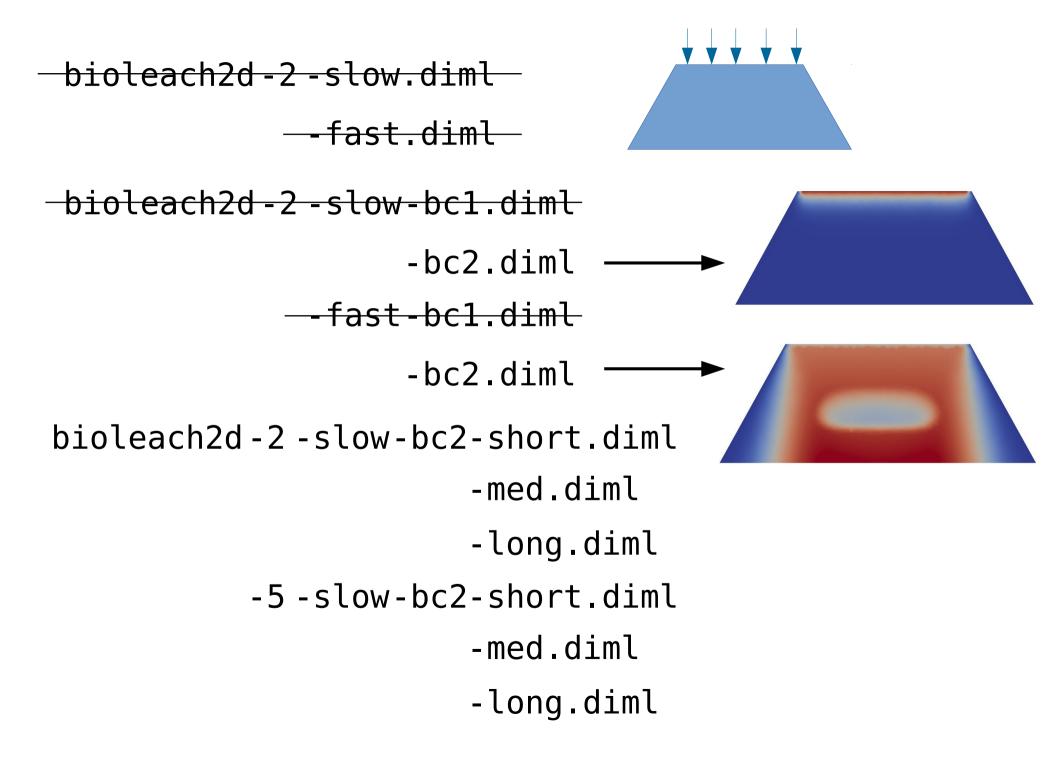
bioleach2d - 2 - slow - bc1.diml

-bc2.diml

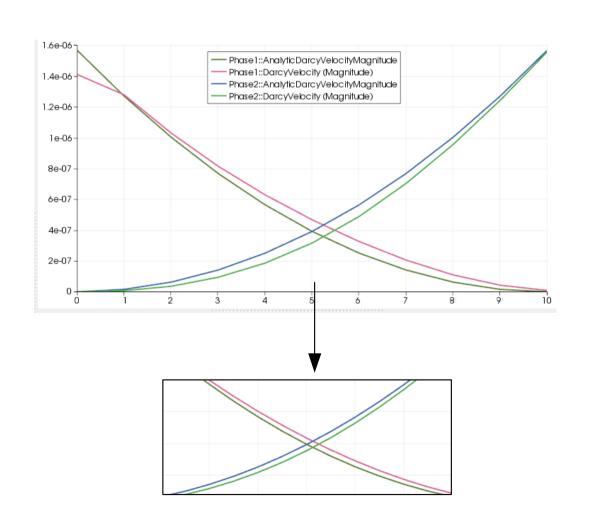
-fast-bc1.diml

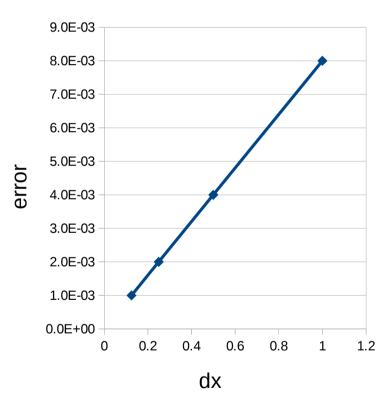
-bc2.diml





#### Example 2: convergence tests





# ...repeat for different domain dimensions, solver controls...

```
darcy impes p1 2phase coreyrelperm velBCinlet strongpressoutlet p1satdiag
 Compare Numerical To Analytic 1d.py
 Linear Interp 1D.py
 Makefile
 Run Compare Numerical To Analytic 1d Multiple.py
 darcy_impes_p1_2phase_..._p1satdiag.xml
 darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_1d_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_2d_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_3d_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_relpermupwind_ld_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_relpermupwind_2d_A.diml
 darcy impes pl 2phase ... plsatdiag relpermupwind 3d A.diml
 mesh data/
     cube A.geo
     cube A.msh
     cube B.geo
  reference solution/
```

# ...repeat for different domain dimensions, solver controls...

```
darcy impes pl 2phase coreyrelperm velBCinlet strongpressoutlet plsatdiag
 Compare Numerical To Analytic 1d.py
 Linear Interp 1D.py
 Makefile
 Run_Compare_Numerical_To_Analytic_1d_Multiple.py
 darcy_impes_p1_2phase_..._p1satdiag.xml
 darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_1d_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_2d_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_3d_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_relpermupwind_1d_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_relpermupwind_2d_A.dim
 darcy_impes_p1_2phase_..._plsatdiag_relpermupwind 3d kdiml
 mesh data/
     cube A.geo
     cube A.msh
     cube B.geo
  reference solution/
```

# ...repeat for different domain dimensions, solver controls...

```
darcy impes pl 2phase coreyrelperm velBCinlet strongpressoutlet plsatdiag
  Compare Numerical To Analytic 1d.py
 Linear Interp 1D.py
 Makefile
 Run Compare Numerical To Analytic 1d Multiple.py
 darcy_impes_p1_2phase_..._p1satdiag.xml
  darcy impes pl 2phase ... plsatdiag modrelpermupwind satfesweby 1d A.diml
  darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_2d_A.diml
  darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_3d_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_relpermupwind_1d_A.diml
 darcy_impes_p1_2phase_..._p1satdiag_relpermupwind_2d_A.dim
 darcy impes pl 2phase ... plsatdiag relpermupwind 3d 🔭 diml
 mesh data/
     cube A.geo
     cube A.msh
     cube B.geo
  reference solution/
```

#### ...model options...

```
darcy impes p1 2phase quadraticrelperm velBCinlet strongpressoutlet p1satdiag
  darcy impes pl 2phase quadraticrelperm velBCinlet strongpressoutlet withgravity updip
   darcy impes pl 2phase coreyrelperm velBCinlet strongpressoutlet plsatdiag
     Compare_Numerical_To_Analytic_1d.py
     Linear Interp 1D.py
     Makefile
     Run Compare Numerical To Analytic 1d Multiple.py
     darcy_impes_p1_2phase_..._p1satdiag.xml
     darcy_impes_pl_2phase_..._plsatdiag_modrelpermupwind_satfesweby_ld_A.diml
     darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_2d_A.diml
     darcy_impes_p1_2phase_..._p1satdiag_modrelpermupwind_satfesweby_3d_A.diml
     darcy_impes_p1_2phase_..._p1satdiag_relpermupwind_ld_A.diml
     darcy impes pl 2phase ... plsatdiag relpermupwind 2d A.dim
     darcy_impes_p1_2phase_..._p1satdiag_relpermupwind_3d_kdiml
     mesh data/
         cube A.geo
         cube A.msh
         cube B.geo
     reference solution/
```

#### Merits

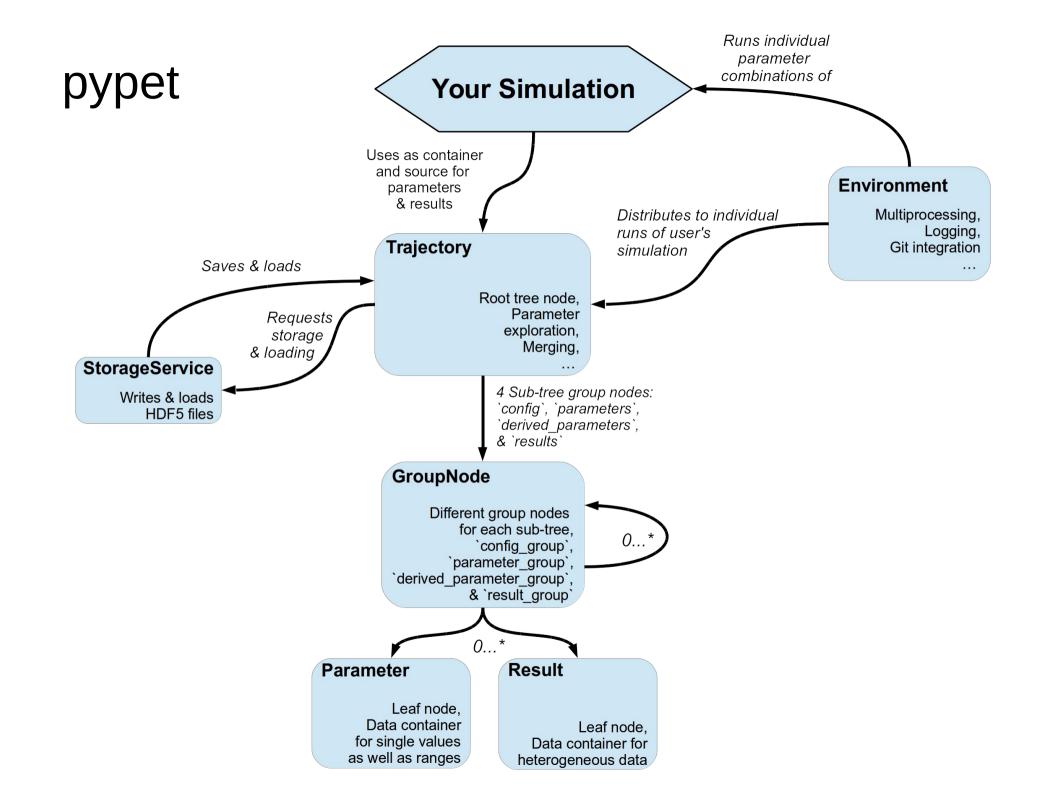
Use of sed to reduce duplication

#### **Problems**

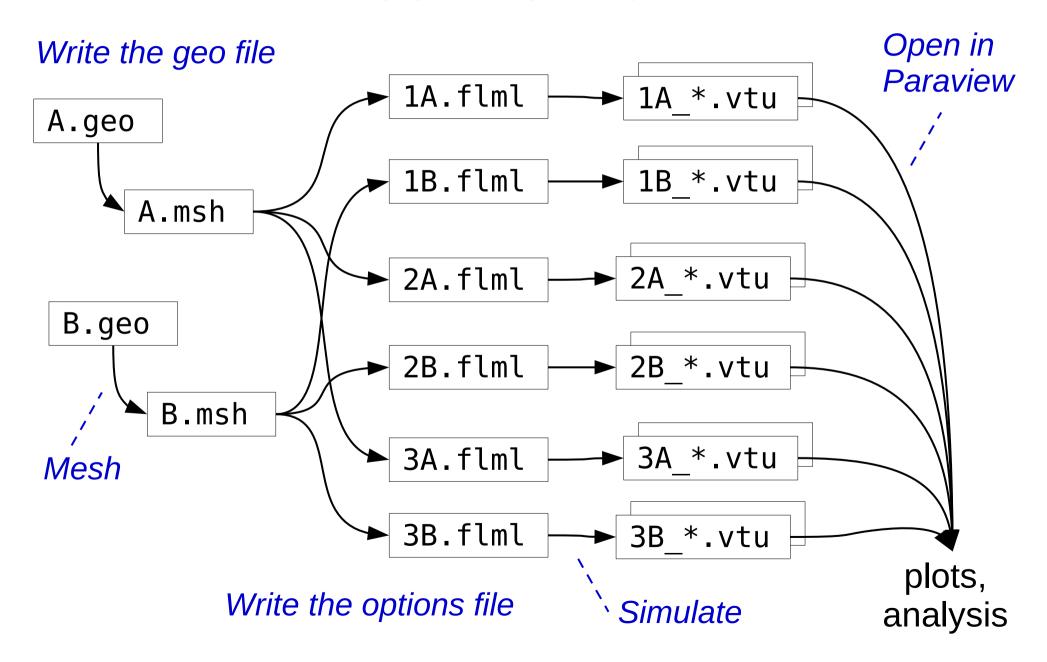
- Brittle; laborious to make changes
- Reliance on long filenames
- Lots of almost identical asserts
- Scales badly (amount of duplication ~ amount of test coverage)

# **Existing Solutions**

- create\_param\_sweep
  - Uses itertools.product to create full-factorial DOE
  - Manipulates a base options file via Spud bindings
- TreeDict / LazyRunner
  - Hierarchical Python container
  - System for caching results
- pypet...



#### Our Workflow



# Development

#### Requirements:

- General-purpose
- Low-level
  - Minimal new classes and methods
  - Maximal reuse of existing Python idioms
- Automatic filename generation
- Parallelisable

### Concept

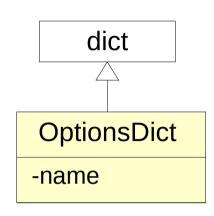
• Replace this: for element in iterable: function(element)

#### where

- element is a set of parameters
- iterable holds different sets of parameters
- function might expand a template, call
   Gmsh/Fluidity, scrape the results...

#### Iteration 1

- Enhanced dictionary
- Use a list of dictionaries to represent parameter variations



- Use itertools to create combinations of parameters
- Use a merge function/decorator to
  - join names, forming an ID
  - turn a combination of dictionaries into a single dictionary

```
water = create_node('water', {
    'density' : 1.00e3,
'dynamic_viscosity' : 0.89e-3})
 ethanol = create_node('ethanol', {
    'density' : 0.79e3,
    'dynamic viscosity' : 1.09e-3})
 fluids = create_array('fluid', [water, ethanol])
pipe_dias = create_array('pipe_dia', [0.10, 0.15])
 velocities = create array('velocity', [0.01, 0.02, 0.04])
 combos = product(fluids, pipe dias, velocities)
{'fluid': 'water',
                      {'pipe_dia': 0.10} {'velocity': 0.01}
'density': 1.00e3,
 ...}
...}
{'fluid': 'ethanol',
                    {'pipe_dia': 0.15} {'velocity': 0.04}
 ... }
```

```
water = create_node('water', {
       'density' : 1.00e3,
'dynamic_viscosity' : 0.89e-3})
    ethanol = create_node('ethanol', {
       'density' : 0.79e3,
       'dynamic viscosity' : 1.09e-3})
    fluids = create array('fluid', [water, ethanol])
   pipe dias = create array('pipe dia', [0.10, 0.15])
    velocities = create array('velocity', [0.01, 0.02, 0.04])
    combos = product(fluids, pipe_dias, velocities)
{'fluid': 'water',
                    {'pipe_dia': 0.10} {'velocity': 0.01}
'density': 1.00e3,
 ...}
                                          {'velocity': 0.02}
                                          {'velocity': 0.04} →
                     {'pipe_dia': 0.15} {'velocity': 0.01}
                                          {'velocity': 0.02}
```

```
for combo in combos:
    od = merge(combo)
    Re = od['density'] * od['velocity'] * \
        od['pipe_dia'] / od['dynamic_viscosity']
    print 'Test ID = {}, Reynolds number = {:.2e}'.\
        format(str(od), Re)
```

```
{'fluid': 'water', ..., 'pipe_dia': 0.10, 'velocity': 0.01}

{'fluid': 'water', ..., 'pipe_dia': 0.10, 'velocity': 0.01}

{'fluid': 'water', ..., 'pipe_dia': 0.10, 'velocity': 0.01}

:

{'fluid': 'ethanol', ..., 'pipe_dia': 0.15, 'velocity': 0.04}
```

```
for combo in combos:
    od = merge(combo)
    Re = od['density'] * od['velocity'] * \
        od['pipe_dia'] / od['dynamic_viscosity']
    print 'Test ID = {}, Reynolds number = {:.2e}'.\
        format(str(od), Re)
```

```
@merges_dicts
def calculate_Re(od):
    return od['density'] * od['velocity'] * \
        od['pipe_dia'] / od['dynamic_viscosity']

p = multiprocessing.Pool(4)
Reynolds_numbers = p.map(calculate_Re, combos)
```

```
{'fluid': 'water', ..., 'pipe_dia': 0.10, 'velocity': 0.01}

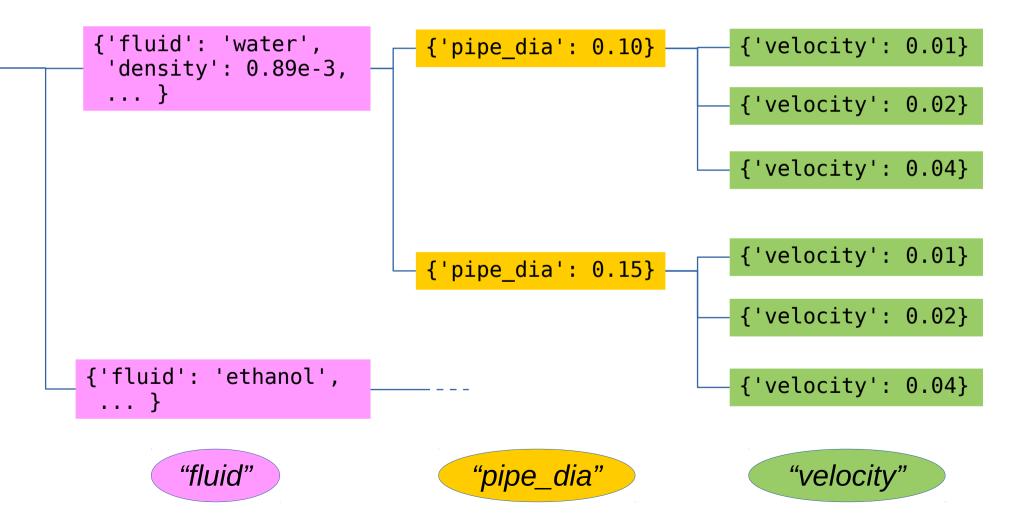
{'fluid': 'water', ..., 'pipe_dia': 0.10, 'velocity': 0.01}

{'fluid': 'water', ..., 'pipe_dia': 0.10, 'velocity': 0.01}

:
{'fluid': 'ethanol', ..., 'pipe_dia': 0.15, 'velocity': 0.04}
```

#### Iteration 2

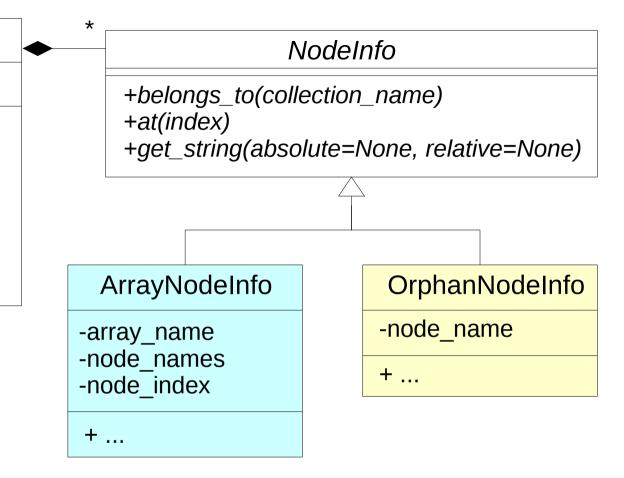
Encapsulate tree information to manage IDs

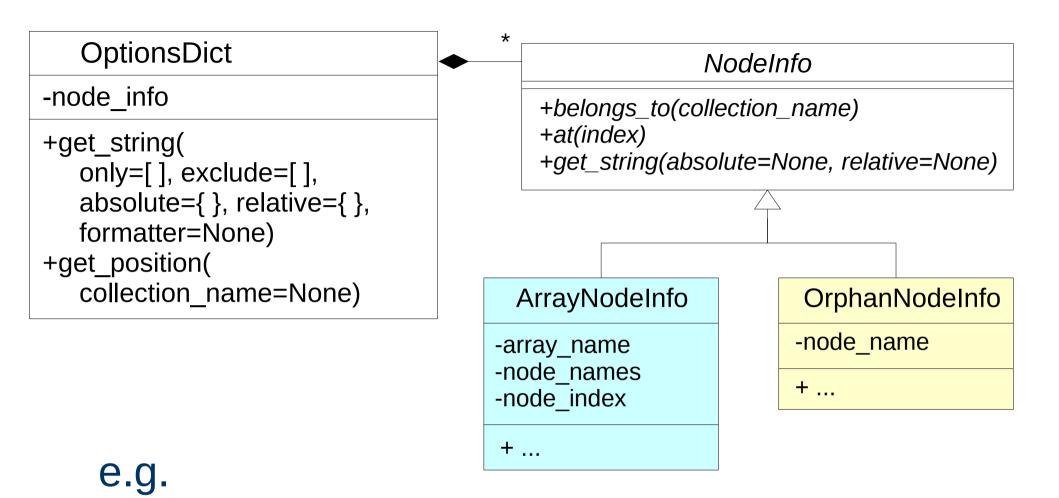


```
OptionsDict
```

```
-node_info
```

```
+get_string(
    only=[], exclude=[],
    absolute={}, relative={},
    formatter=None)
+get_position(
    collection_name=None)
```





{'fluid': 'water',
 ...,
 'pipe\_dia': 0.10,
 'velocity': 0.01}
array\_name: 'fluid'
node\_names: ['water',
 ...]
node\_index: 0

#### Example:

```
map( StudyConvergence(), combos )
```

```
{'fluid': 'water',
                           {'res': 0.01}
{'fluid': 'water',
 'density': 0.89e-3,
                                                  ...}
 ...}
                           {'res': 0.02}
                                                {'fluid': 'water',
                                                 'res' : 20,
                           {'res': 0.04}
                                                  ...}
{'fluid': 'ethanol',
                           {'res': 0.01}
  ... }
                           {'res': 0.02}
                           {'res': 0.04}
```

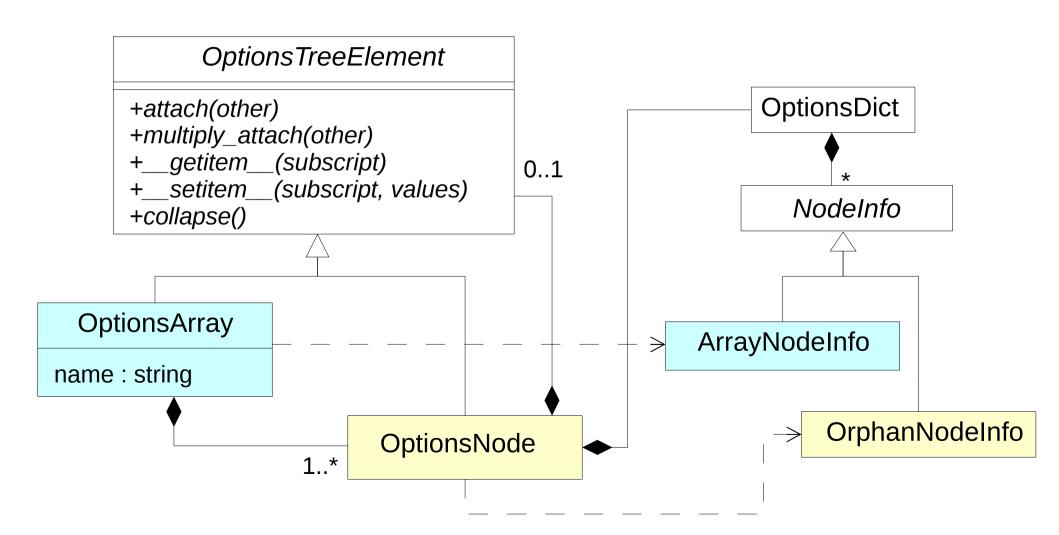
```
class StudyConvergence:
    def init (self):
        self.resolutions = {}; self.errors = {}; self.rates = {}
   @merges dicts
    def call (self, options dict):
        current id = options.get string(only=['sim'])
        current res = float(options['res'])
        current err = self.get error norm(options)
        self.resolutions[current id] = current res
        self.errors[current id] = current err
        try:
            previous_id = options.get_string(only=['sim'],
                                             relative={'res': -1})
            previous res = self.resolutions[previous id]
            previous err = self.errors[previous_id]
            self.rates[current id] = \
                 -log(current err/previous err) / \
                 log(current res/previous res)
        except:
            self.rates[current_id] = nan # on the first mesh
    def get error norm(self, options):
```

```
create node(geometry, tags=['msh'])
{'geometry': 'line',
  ...}
     {'res': 10}
     {'res': 20}
                            create_array('res', [10, 20, 40],
                                         tags=['msh', 'sim'])
    {'res': 40}
                                       {'res': 10}
                                       {'res': 20}
       {'fluid': 'water',
        'density': 0.89e-3,
                                       {'res': 40}
         ... }
                                  create array(
       {'fluid': 'ethanol',
                                      'fluid', [water, ethanol],
         . . . }
                                      tags=['sim'])
```

```
get string(only=['msh'])
{'geometry': 'line',
  ...}
                                line 10 geo
     {'res': 10}
                              get string(only=['sim'])
     {'res': 20}
                                water 10 flml
     {'res': 40}
                                        {'res': 10}
                                 <mesh name="CoordinateMesh">
       {'fluid': 'water',
                                   <from_file file_name="line_10">
        'density': 0.89e-3,
                                     <format name="gmsh"/> /
         ...}
                                   </from file>
                                 </mesh>
       {'fluid': 'ethanol',
                                     get_string(only=['msh'])
         . . . }
```

#### Iteration 3

Introduce composite; add "collapse" method



# Operator overloading

#### Multiplication

```
fluids = OptionsArray('fluid', [water, ethanol])
resolutions = OptionsArray('res', [10, 20, 40])
fluids * resolutions
```

fluid: water

res: 10

res: 20

res: 40

fluid: ethanol

res: 10

res: 20

res: 40

### Operator overloading

#### Addition

## Operator overloading

#### Node setting/getting

```
dims = OptionsArray(
                                            dim: 1d
    'dim', [onedim, twodim, threedim],
                                              res: 10
    names=['1d', '2d', '3d'])
                                              res: 20
resolutions = OptionsArray(
                                              res: 40
    'res', [10, 20, 40, 80])
                                              res: 80
                                            dim: 2d
dims[0] *= resolutions[0:4]
                                               res: 10
dims[1] *= resolutions[0:3]
                                               res: 20
dims[2] *= resolutions[0:2]
                                               res: 40
                                            dim: 3d
                                              res: 10
                                               res: 20
```

Expanding geometry files	Expanding options files
darcy_impes_p1_2phase_mms	group: group1
dim: 1d	dim: 1d
res: 10 -> 1d_10.geo	res: 10 -> group1_1d_10.diml
res: 20 -> 1d_20.geo	res: 20 -> group1_1d_20.diml
res: 40 -> 1d_40.geo	res: 40 -> group1_1d_40.diml
res: 80 -> 1d_80.geo	res: 80 -> group1_1d_80.diml
dim: 2d	dim: 2d
boundary: straight	straight
reg	reg
res: 10 -> 2d_straight_reg_10.geo	res: 10 -> group1_2d_10.dim
res: 20 -> 2d_straight_reg_20.geo	res: 20 -> group1_2d_20.dim
res: 40 -> 2d_straight_reg_40.geo	res: 40 -> group1_2d_40.dim
boundary: curved	dim: 3d
irreg	straight
res: 10 -> 2d_curved_irreg_10.geo	reg
res: 20 -> 2d_curved_irreg_20.geo	res: 10 -> group1_3d_10.dim
res: 40 -> 2d_curved_irreg_40.geo	res: 20 -> group1_3d_20.dim
dim: 3d	group: group2
boundary: straight	dim: 1d
reg	•••
res: 10 -> 3d_straight_reg_10.geo	dim: 2d
res: 20 -> 3d_straight_reg_20.geo	curved
boundary: curved	irreg
irreg	res: 10 -> group2_2d_10.dim
res: 10 -> 3d_curved_irreg_10.geo	res: 20 -> group2_2d_20.dim
res: 20 -> 3d_curved_irreg_20.geo	res: 40 -> group2_2d_40.dim

...

Expanding geometry files	Expanding options files
darcy_impes_p1_2phase_mms	group: group1
dim: 1d	dim: 1d
res: 10 -> 1d_10.geo	res: 10 -> group1_1d_10.diml
res: 20 -> 1d_20.geo	res: 20 -> group1_1d_20.diml
res: 40 -> 1d_40.geo ————————————————————————————————————	res: 40 -> group1_1d_40.diml
res: 80 -> 1d_80.geo ————————————————————————————————————	res: 80 -> group1_1d_80.diml
dim: 2d	dim: 2d
boundary: straight	straight
reg	reg
res: 10 -> 2d_straight_reg_10.geo ——	res: 10 -> group1_2d_10.diml
res: 20 -> 2d_straight_reg_20.geo ——	res: 20 -> group1_2d_20.diml
res: 40 -> 2d_straight_reg_40.geo ——	res: 40 -> group1_2d_40.diml
boundary: curved	dim: 3d
irreg	straight
res: 10 -> 2d_curved_irreg_10.geo	reg
res: 20 -> 2d_curved_irreg_20.geo	➤ res: 10 -> group1_3d_10.diml
res: 40 -> 2d_curved_irreg_40.geo	res: 20 -> group1_3d_20.diml
dim: 3d	group: group2
boundary: straight	∖\\ dim: 1d
reg	\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\
res: 10 -> 3d_straight_reg_10.geo	∖∖\ dim: 2d
res: 20 -> 3d_straight_reg_20.geo	\\\ curved
boundary: curved	irreg
irreg	➤ res: 10 -> group2_2d_10.diml
res: 10 -> 3d_curved_irreg_10.geo	res: 20 -> group2_2d_20.diml
res: 20 -> 3d_curved_irreg_20.geo	res: 40 -> group2_2d_40.diml

### **Dictionary Features**

```
class fluid:
   def kinematic viscosity(self):
       return self.dynamic viscosity / self.density
class water(fluid):
   density = 1.00e3
   dynamic viscosity = 0.89e-3
                       class ethanol(fluid):
                          density = 0.79e3
                          dynamic viscosity = 1.09e-3
```

### Dictionary Features

- Class-based initialisation
- Cleaner attribute-style (dot) syntax
- Dependent items (but need to wrap functions)

```
class simulation_options:
    reference_timestep_number = 10
    preconditioner = 'mg'
    adaptive_timestepping = False

def time_step(self):
    "Maintain a constant Courant number"
    scale_factor = float(self.reference_mesh_res) /
        self.mesh_res
    return scale_factor * self.finish_time /
        self.reference_timestep_number
```

#### **Content Transformations**

Unfortunately, when doing this:

```
p = multiprocessing.Pool(nprocs)
p.map(function, iterable)
```

### This happens:

```
cPickle.PicklingError: Can't pickle <type 'function'>: attribute lookup builtin .function failed
```

because Python's serialization module chokes on localised functions.

#### **Content Transformations**

Use transform\_items(function, recursive=True)where function can be:

- unlink
- Check(test)
- Remove(test)

#### and test can be:

- missing\_dependencies
- unpicklable
- Can add these as hooks to tree elements, or in calls to front-end functions

# The Jinja2 Template Engine

```
<physical parameters>
    {% if gravity magnitude %}
   <gravity>
     <magnitude>
       <real value rank="0">{{ gravity magnitude }}</real value>
     </magnitude>
     <vector field name="GravityDirection" rank="1">
       cribed>
         <mesh name="ElementWiseMesh"/>
          <value name="WholeMesh">
            <constant>
              <real value shape="{{ dim number }}" dim1="dim"
rank="1">{{ gravity direction|join(' ') }}</real value>
            </constant>
         </value>
       </prescribed>
     </vector field>
   </gravity>
   {% endif %}
```

## The Jinja2 Template Engine

- "For" loops iterate over subcomponents
  - fields of interest
  - variables in diagnostic algorithm blocks
  - assert statements
- Macros
- Template inheritance
- Custom filters

### Example: MMS-based tests

```
class darcy_impes_2phase_mms:
   domain extents = (1.0, 1.2, 0.8)
   finish time = 1.0
   def saturations(self):
      return (1 - self.saturation2,
               self.saturation2)
   def saturation sources(self):
      results = []
      t = Symbol('t')
      # loop over phases
      for i in range(2):
         phi = self.porosity
         S = self.saturations[i]
         u = self.darcy velocities[i]
         results.append(
            diff(phi*S, t) + div(u))
      return results
```

```
class three dim:
      class two_dim:
         geometry = "rectangle"
class one dim:
   geometry = "line"
   wall ids = ()
   def saturation2(self):
      """Invented saturation
         profile"""
      x = Symbol('x')
      t = Symbol('t')
      L = self.domain_extents[0]
      T = self.finish time
      return \exp(-x/L)/(1 + t/T)
   def pressure1(self):
```

### Example: MMS-based tests

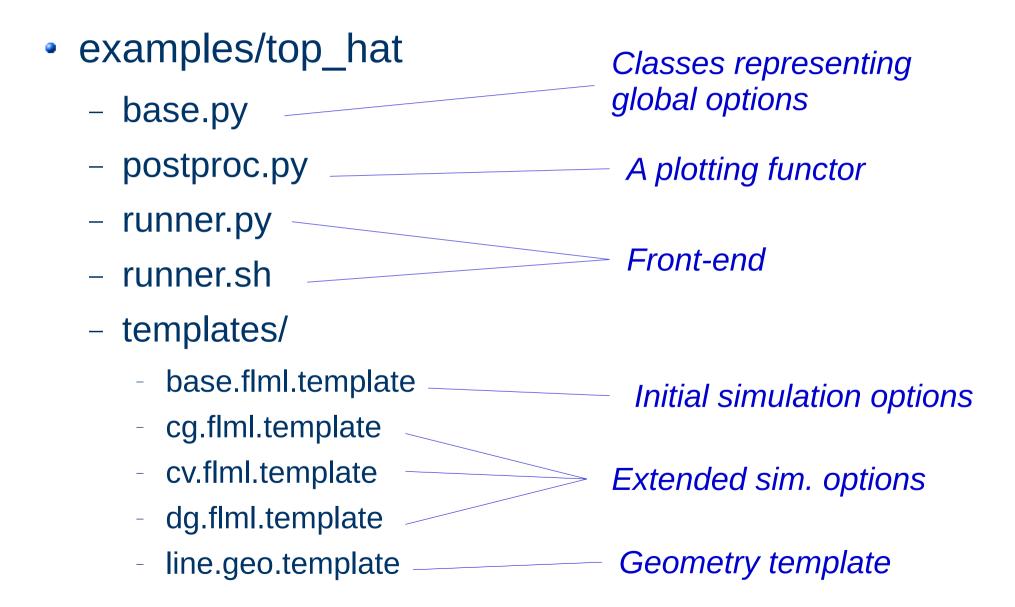
```
class darcy_impes_2phase_mms:
                                                   class three dim:
   domain extents = (1.0, 1.2, 0.8)
   finish time = 1.0
                                              class two dim:
                                                 geometry = "rectangle"
   def saturations(self):
                                        class one dim:
      return (1 - self.saturation2,
                                           geometry = "line"
               self.saturation2)
                                           wall ids = ()
   def saturation_sources(self):
                                           def saturation2(self):
      results = []
                                              """Invented saturation
      t = Symbol('t')
                                                 profile"""
      # loop over phases
                                              x = Symbol('x')
      for i in range(2):
                                              t = Symbol('t')
         phi = self.porosity
                                              L = self.domain extents[0]
         S = self.saturations[i]
                                              T = self.finish time
         u = self.darcy velocities[i]
                                              return \exp(-x/L)/(1 + t/T)
         results.append(
            diff(phi*S, t) + div(u))
                                           def pressure1(self):
      return results
```

```
{% extends "darcy_impes_base.diml.template" %}
{% block saturation1 source %}
<scalar field name="Source" rank="0">
  cribed>
    <mesh name="SaturationSourceMesh"/>
    <value name="WholeMesh">
      <python>
        <string value type="code" lines="20" language="python">
def val(X, t):
  from numpy import sqrt, pi, cos, sin, exp
  return {{    saturation_sources[0]|format_sympy }}
</string value>
      </python>
    </value>
    <stat>
      <include cv stats/>
    </stat>
  </prescribed>
</scalar field>
{% endblock %}
{% block saturation2_source %}
. . .
                               darcy_impes_p1_2phase_mms.diml.template
```

### **Example Application**

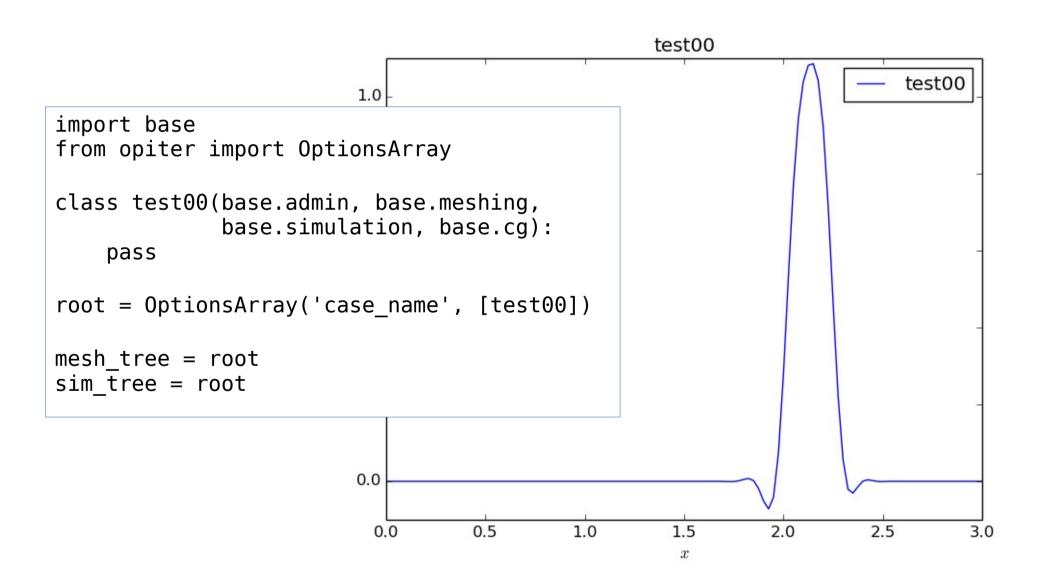
- examples/top\_hat
  - base.py
  - postproc.py
  - runner.py
  - runner.sh
  - templates/
    - base.flml.template
    - cg.flml.template
    - cv.flml.template
    - dg.flml.template
    - line.geo.template

## **Example Application**

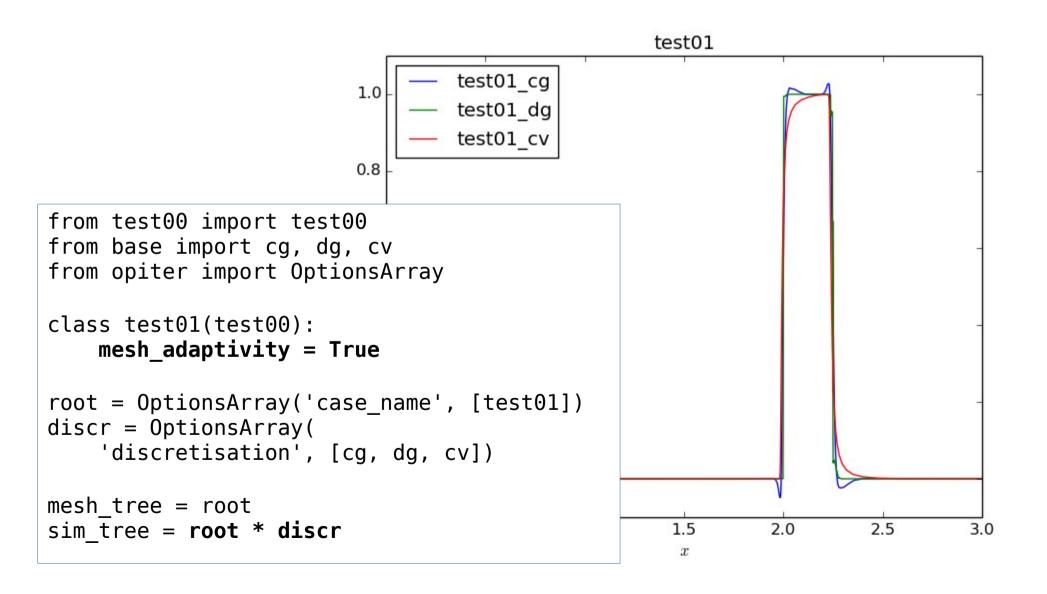


```
class Plot(SerialFunctor):
    def preamble(self, options):
        plt.clf()
    def call (self, options):
        stem = '{}/{}'.format(options.case name, options.simulation name)
        # get the last dump file
        n = 0
        while os.path.isfile(get filename(options, n + 1)):
            n += 1
        # load results and plot
        vtu_obj = vtktools.vtu(get_filename(options, n))
        x = vtu obj.GetLocations()[:,0]
        f = vtu obj.GetScalarField('Tracer')
        x, f = monotonic(x, f)
        plt.plot(x, f, label=options.simulation name)
        self.print end(options.simulation name, options)
    def postamble(self, options):
        "This gets called after iteration"
        plt.axis([0.0, 3.0, -0.1, 1.1])
        plt.xlabel('$x$')
        plt.ylabel('Tracer')
        plt.title(options.case name)
        plt.legend(loc='best')
        if show plots:
            plt.show()
        if save plots:
            plt.savefig('{}.png'.format(options.case name))
```

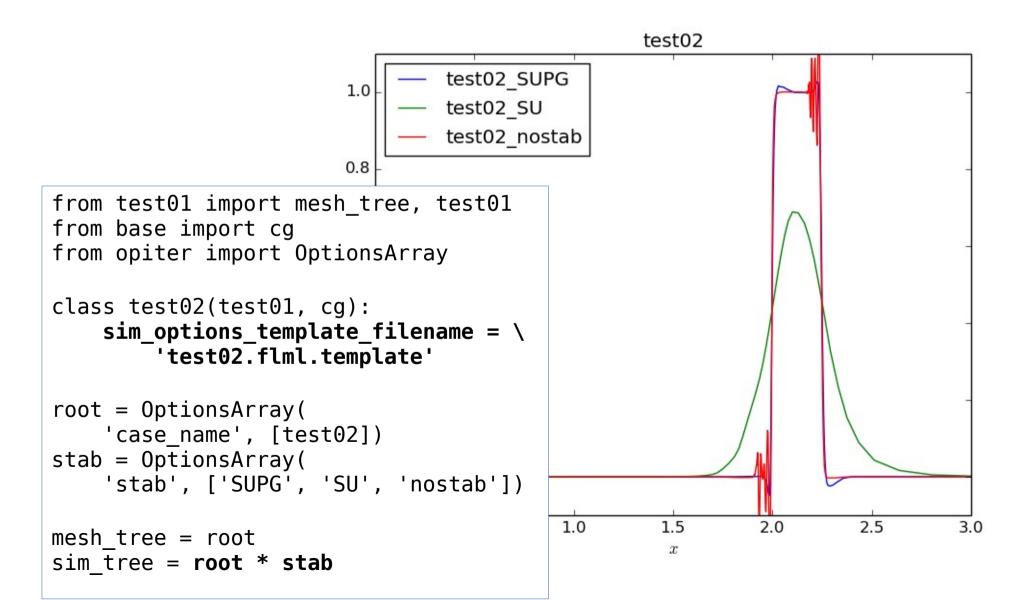
#### test00



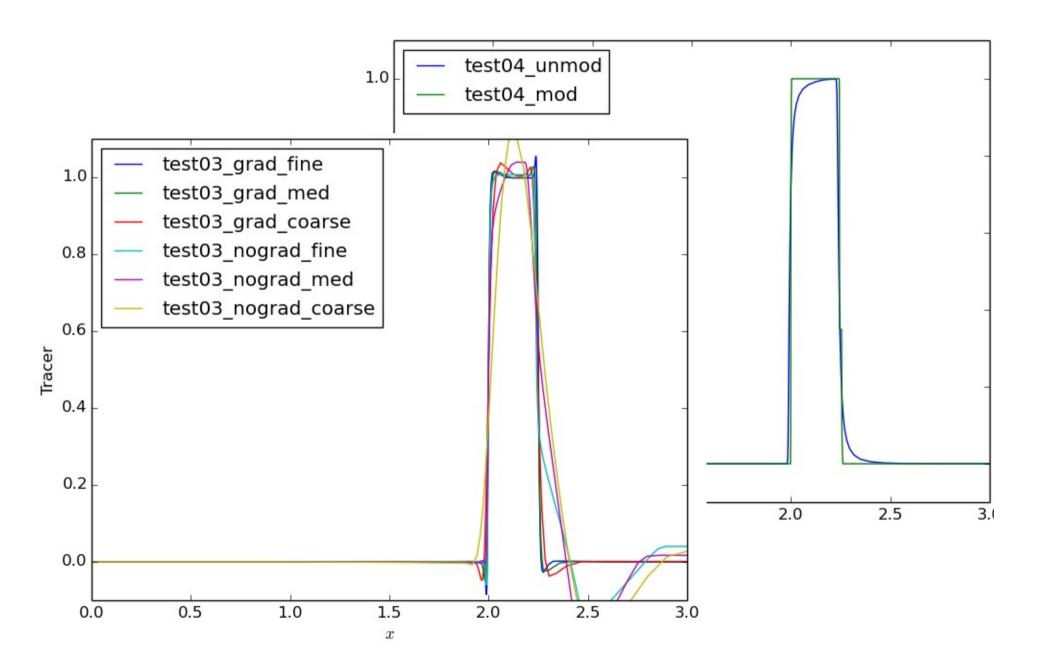
#### test01



#### test02



#### etc.

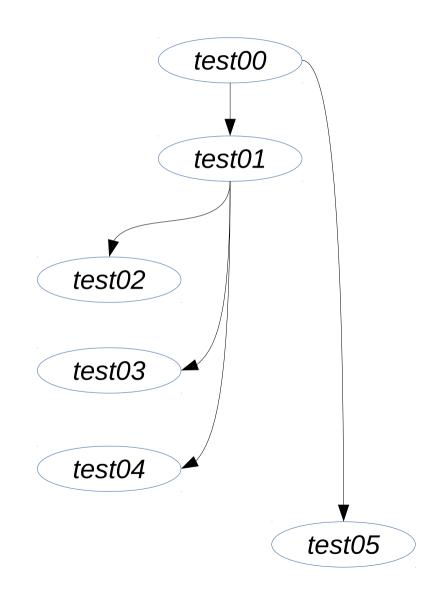


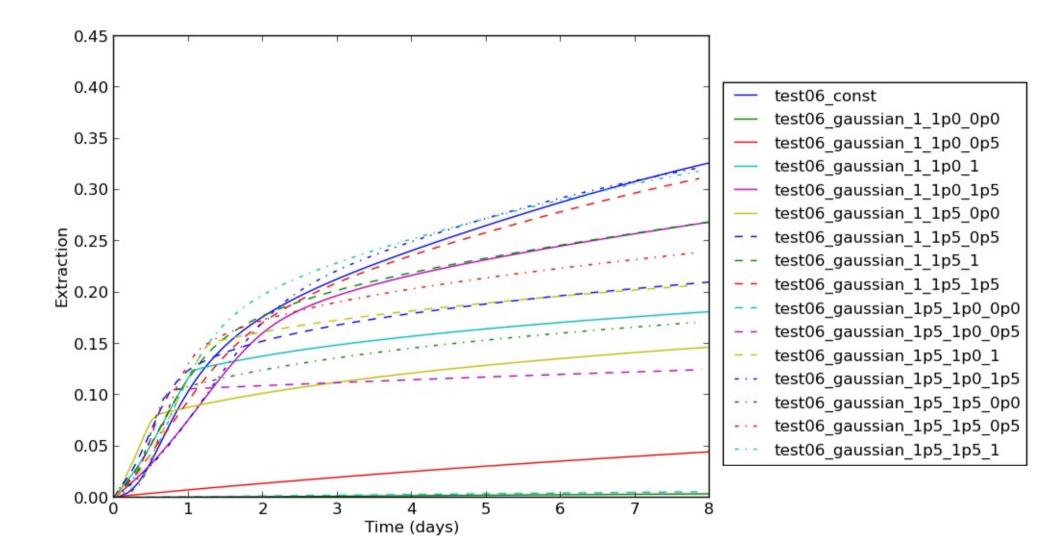
### varying both mesh and simulation

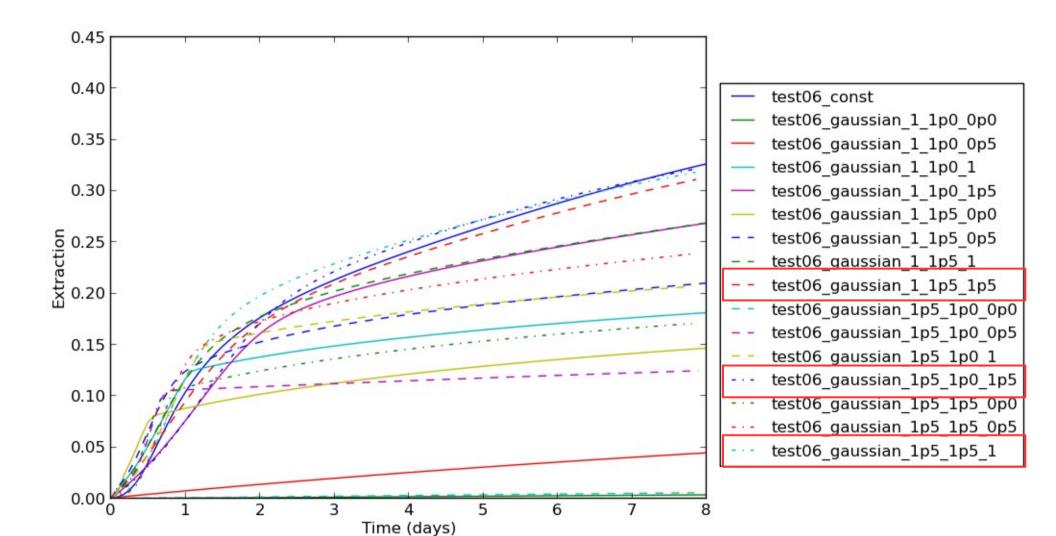
```
test05
from test00 import test00
                                      cg 0p00625
from base import cg, dg, cv
from opiter import OptionsArray
                                      _cg_0p0125
                                      cg 0p025
class test05(test00):
                                      cv 0p00625
    pass
                                      cv 0p0125
                                       cv 0p025
root = OptionsArray(
    'case_name', [test05])
discr = OptionsArray(
    'discretisation', [cg, cv])
dx = OptionsArray(
    'dx', [0.00625, 0.0125, 0.025],
    name format=lambda dx: \
        str(dx).replace('.', 'p'),
    tags=['mesh'])
mesh tree = root * dx
                                           1.0
                                                   1.5
                                                           2.0
                                                                    2.5
                                                                            3.0
sim tree = root * discr * dx
                                                    x
```

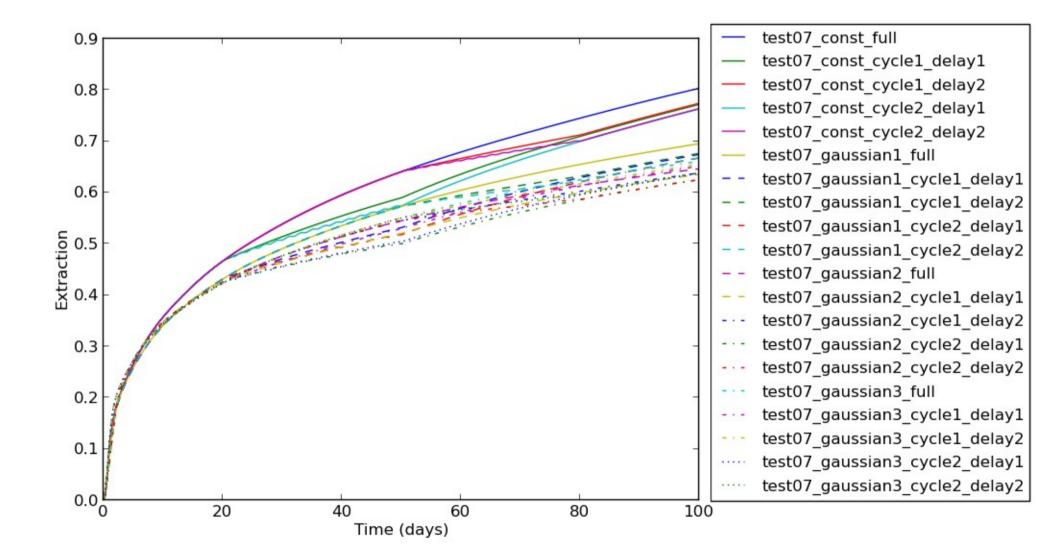
#### The General Idea

- Set up basic options, templates and any custom functors
- 2. Write a test file whose options may inherit from tests gone before
- 3. Run, plot, analyse
- 4. Decide what to vary next; insert blocks into the base template if necessary
- 5. Repeat steps (2)–(4)









#### Conclusion

- Package name: opiter ("Options Iteration")
- Licence: Lesser GPL v2.1
- Getting it:

```
git clone https://github.com/rjferrier/opiter
cd opiter
sudo python setup.cfg install
```

- Companion repository: opiter-fluidity
- Queries, feedback, ideas welcome

#### **Disclaimers**

- Does not protect against user errors
- Defers to low-level exception handling

#### Further work

- More complete documentation
- More examples
- Higher-level exception handling
- Code review and clean up

## Acknowledgements

- Stephen Neethling
- Liping Cai