### Writing Scientific Software

### Lessons from the Software Engineering Community

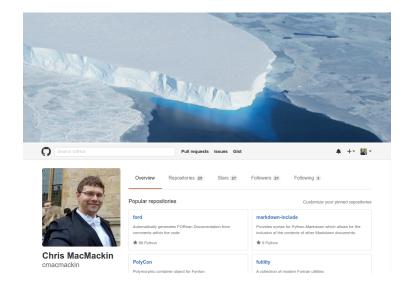
#### Christopher MacMackin

Atmospheric, Oceanic, and Planetary Physics University of Oxford Oxford, UK

christopher.macmackin@physics.ox.ac.uk cmacmackin.github.io

4 November 2016

## Glaciologist by day...



### Scientists are not Programmers

#### Problem:

- Science relies on increasingly large codes
- Large codes become complex, difficult to maintain
- Improving or altering codes becomes more time consuming

These problems can be mitigated by good design. But,

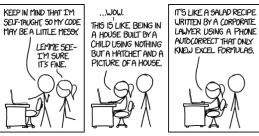
- Scientists not taught software design
- Code often written quickly, is unmaintainable
- Can end up costing more time in the long run

## (Real) Example

#### A magneto-hydrodynamics code:

- 130 thousand lines long
- All in one file
- No procedure has name longer than 8 characters
- All important variables global

Only maintainable if you have worked with it for years.





### Outline

- 1 Modern Programming Paradigms
  - Object Oriented Programming
  - Interfaces, not Implementations
  - Unified Modelling Language
- 2 Design Patterns for Scientific Code
  - The Abstract Calculus Pattern
  - The Puppeteer Pattern
- 3 Case Study: Ice Shelf Model
- 4 Conclusion

### Object Oriented Programming

OOP is now the dominant programming paradigm.

- Define "classes", like new data-types
- Classes contain data, have associated procedures
- Variables of these types are "objects"

Object oriented languages feature:

- Encapsulation controlling what data can be seen by different procedures
- Inheritance "Is-a-type-of" relationship, giving subclasses access to parent's methods
- Polymorphism Ability to run code without knowing exact type of an object

## Why OOP?

Object oriented programming has following advantages:

- Useful way to organise data
- Can use one object as argument, rather than many
- Increases code-reuse via inheritance
- Conceptually convenient way to partition code
- Define an interface, independent of implementation

However (e.g. arithmetic), some things best accomplished through other paradigms.

### Program to an Interface

Changing one part of the code, shouldn't force you to change other parts. Can do this is by defining an API.

#### Definition

API: Application Programming Interface

- Create procedures stubs provide desired functionality
- Prevent direct access to any non-constant variables
- Write procedure bodies
- 4 If making changes, don't alter names, arguments, return values of publicly accessible procedures

## But I Really Need to Change It!

Would you like it if a new version of PETSc changed so it no longer worked with your code?

### Strategies:

- Add optional arguments
- Add new procedures, overload old ones
- Design it well in the first place









### Describing Your Software

When designing code, can be useful to have way to easily represent its structure, relationships.

*Unified Modelling Language* (UML): standardised collection of graphical elements to do that.

Examples of free software to produce UML:



Dia (GUI)

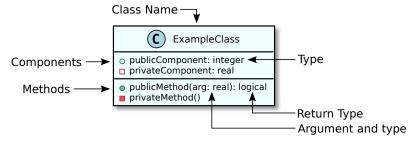


PlantUML (language)

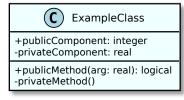
Will use UML in this presentation. (Pay attention!)

### UML Class Diagrams

Can describe contents of a class/derived type:

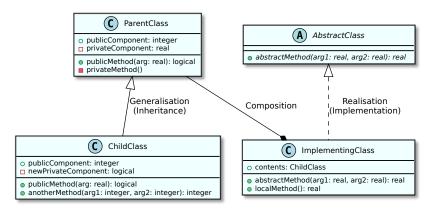


Note that public/private also specified with "+"/"-":



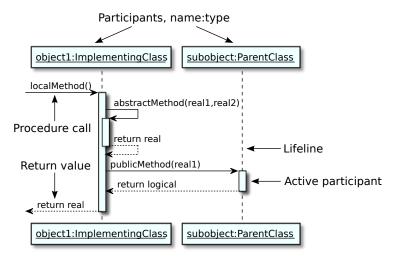
### UML Class Relationships

Can also show how classes inherit from or contain others.



### **UML** Sequence Diagrams

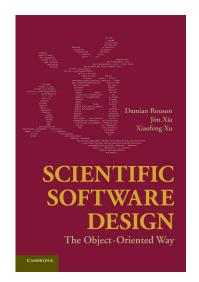
UML diagrams can also describe call sequence.



### Design Patterns

Writing software, common problems frequently reoccur. Canonical solutions have been developed called *design* patterns.

Many general-purpose patterns can be relevant to scientific software. Will focus here on domain-specific patterns introduced by Rouson, Xia, and Xu (2011).



### The Abstract Calculus Pattern

#### The Problem

Physics and mathematics use high level representations of concepts which can not be simply expressed in code.

Consider integration using the forward Euler method,

$$T(x, t + \Delta t) = T(x, t) + \Delta t \frac{\partial T(x, t)}{\partial t}.$$

But code will look quite different and much messier than this. Also somewhat difficult to reuse. (Even worse for coupled equations.)

### Abstract Calculus to the Rescue!

We can take advantage of operator overloading to provide a nice syntax:



«abstract calculus» Integrand

- assignment=(rhs: Integrand)
- operator+(rhs: Integrand): Integrandoperator\*(rhs: real): Integrand
- t(): Integrand

```
subroutine integrate(T, dt) class(integrand), intent(inout) :: T real, intent(in) :: dt ! Forward Euler integration: ! T^{n+1} = T^n + T_t \Delta t T = T + T%t()*dt end subroutine integrate
```

## The Why and Wherefore

Using an abstract integrand type facilitates reuse of integration code, which is agnostic towards:

- Type of problem
- Storage pattern of data
- Precision of data
- Size of computational domain

Elegance of syntax useful for higher-order methods. Can also apply pattern to, e.g., vector calculus:

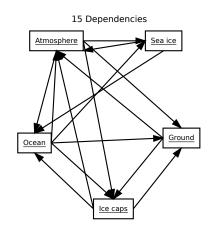
$$\mathbf{g} = -
abla \phi \quad o \quad \mathbf{g} = - \ ext{.grad. phi}$$

### The Puppeteer Pattern

Often it is impractical to package entire program together. E.g., "multiphysics" problems have many components.

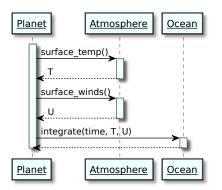
N components  $\Rightarrow N(N+1)$  interdependencies.

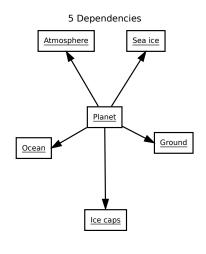
Complexity/fragility grows quickly. Also becomes harder to maintain data-hiding.



### Puppeteers to the Rescue!

Can use a single class to manage interactions between all others. Only the one class needs to know the interfaces of the others





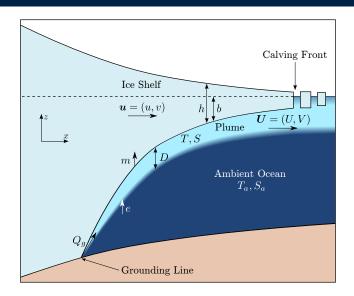
## The Why and Wherefore

This provides many advantages:

- Changing component's API affects only puppeteer
- Avoids circular dependencies
- Each component designed independently from others
- Can easily turn components off, decoupling system
- Place to assemble global data (e.g. a Jacobian)

A puppeteer may be a concrete implementation of abstract calculus.

## Case Study: Ice Shelf



### Equations

$$h_t + \nabla \cdot (h\vec{u}) = -\lambda m,$$
  
$$(4\eta h u_x)_x - \chi (h^2)_x = 0.$$

$$\nabla \cdot \left( D\vec{U} \right) = e + m,$$

$$\nabla \cdot \left( D \vec{U} U \right) = D(\rho_{\mathsf{a}} - \rho) \left( b_{\mathsf{x}} - \delta D_{\mathsf{x}} \right) + \nu \nabla \cdot \left( D \nabla U \right)$$
$$- \mu |\vec{U}| U + \frac{\delta D^{2}}{2} \rho_{\mathsf{x}},$$

$$abla \cdot \left( D \vec{U} S \right) = e S_a + \nu \nabla \cdot (D \nabla S) + m S_m - \gamma_S (S - S_m),$$

$$abla \cdot \left( D \vec{U} T \right) = e T_a + \nu \nabla \cdot (D \nabla T) + m T_m - \gamma_T (T - T_m).$$

### Breaking Down the Problem

#### Choice of numerics:

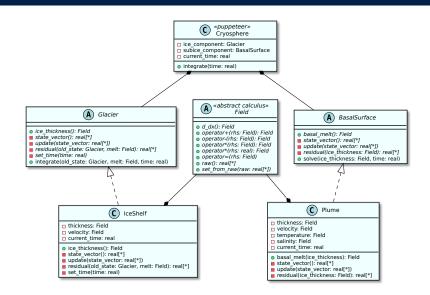
- Chebyshev pseudo-spectral spatial discretisation
- Backwards-Euler time integration

Let S(t) be state of ice shelf at time t, with  $\dot{S}(S,m)$ . The melt rate is m(S,t). Backwards-Euler requires

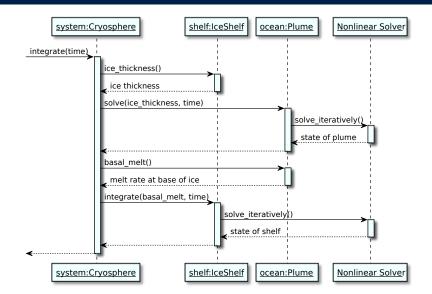
$$S(t + \Delta t) = S(t) + \dot{S}[S(t + \Delta t), m]\Delta t.$$

This requires iterative nonlinear solver. To reduce cost of this, evaluate m[S(t), t]—semi-implicit method.

### Collating our Classes



### Solution Sequence

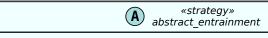


### Parameterisation Choices

Will be useful to compare results for different parameterisations of, e.g.:

- viscosity
- melting
- entrainment

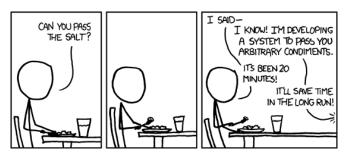
To make it easy to switch these, use the "strategy" pattern.



entrainment\_rate(velocity: Field, thickness: Field, depth: Field, time: real): Field

### Is it worth it?

"I find that when someone's taking time to do something right in the present, they're a perfectionist with no ability to prioritize, whereas when someone took time to do something right in the past, they're a master artisan of great foresight."

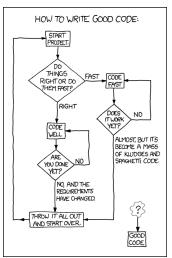


### Summary

Science is increasingly reliant on large pieces of software.

- Think before coding!
- Plan your software (e.g. with UML)
- Program to an interface
- Leverage language features for natural syntax
- Minimise inter-dependency

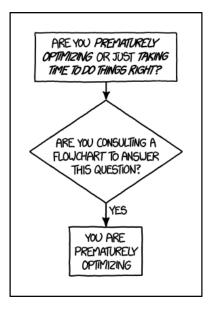
Time invested up front *can* save time later.



https://xkcd.com/844/

## Thank You

Questions?



# HOW LONG CAN YOU WORK ON MAKING A ROUTINE TASK MORE EFFICIENT BEFORE YOU'RE SPENDING MORE TIME THAN YOU SAVE? (ACROSS FIVE YEARS)

	HOW OFTEN YOU DO THE TASK					
	50/ <sub>DAY</sub>	5/DAY	DAILY	WEEKLY	MONTHLY	YEARLY
1 SECOND	1 DAY	2 Hours	30 MINUTES	4 MINUTES	1 MINUTE	5 SECONDS
5 SECONDS	5 DAYS	12 HOURS	2 HOURS	21 MINUTES	5 MINUTES	25 SECONDS
30 SECONDS	4 WEEKS	3 DAYS	12 HOURS	2 HOURS	30 MINUTES	2 MINUTES
HOW 1 MINUTE	8 WEEKS	6 DAYS	1 DAY	4 HOURS	1 HOUR	5 MINUTES
TIME 5 MINUTES	9 MONTHS	4 WEEKS	6 DAYS	21 HOURS	5 HOURS	25 MINUTES
SHAVE 30 MINUTES		6 MONTHS	5 WEEKS	5 DAYS	1 DAY	2 Hours
1 HOUR		IO MONTHS	2 MONTHS	IO DAYS	2 DAYS	5 HOURS
6 HOURS				2 MONTHS	2 WEEKS	1 DAY
1 DAY					8 WEEKS	5 DAYS